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Complete List of Authors:	Nimptsch, Ulrike; Technische Universitat Berlin Fakultat Wirtschaft und Management, Structural Advancement and Quality Management in Health Care Mansky, Thomas; Technische Universitat Berlin Fakultat Wirtschaft und Management, Structural Advancement and Quality Management in Health Care
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Hospital volume and mortality for 25 types of inpatient treatment in German hospitals – Observational study using complete national data from 2009 to 2014

Ulrike Nimptsch, Thomas Mansky

Technische Universität Berlin, Department for Structural Advancement and Quality Management in Health Care, Fraunhoferstr. 33-36, 10587 Berlin, Germany Ulrike Nimptsch research scientist, Thomas Mansky professor

Correspondence to: U Nimptsch ulrike.nimptsch@tu-berlin.de

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#### **Abstract**

**Objectives** To explore the existence and strength of a relationship between hospital volume and mortality, to estimate minimum-volume thresholds and to assess the potential benefit of centralisation of services.

**Design** Observational population-based study using complete German hospital discharge data (Diagnosis-Related Group Statistics [DRG Statistics]).

**Setting** All acute care hospitals in Germany.

**Participants** All adult patients hospitalised for one out of 25 common or medically important types of inpatient treatment from 2009 to 2014.

Main outcome measure Risk-adjusted in-hospital mortality.

Results Lower in-hospital mortality in association with higher hospital volume was observed in 20 out of the 25 studied types of treatment when volume was categorized in quintiles, and persisted in 17 types of treatment when volume was analysed as a continuous variable. Such a relationship was found in some of the studied emergency conditions and low-risk procedures. It was more consistently present regarding complex surgical procedures. For example, about 22,000 patients receiving open repair of abdominal aortic aneurysm were analysed. In very high volume hospitals risk-adjusted mortality was 4.7% (95% CI 4.1 to 5.4) compared to 7.8% (7.1 to 8.7) in very low volume hospitals. The minimum volume above which risk of death would fall below the average mortality was estimated as 18 cases per year. If all hospitals providing this service would perform at least 18 cases per year one death among 104 (76 to 166) patients could potentially be prevented.

**Conclusions** Based on complete national hospital discharge data the results confirmed volume-outcome relationships for many complex surgical procedures, as well as for some emergency conditions and low-risk procedures. Following these findings, the study identified areas where centralisation would provide a benefit for patients undergoing the specific type of treatment in German hospitals and quantified the possible impact of centralisation efforts.

#### **Keywords**

Volume-outcome relationship, hospital discharge data, in-hospital mortality, Germany

# Strengths and limitations of the study

- The strength of this study is the use of current and complete national hospital discharge data, covering virtually every patient who underwent one out of the studied types of treatment during the study period.
- As hospital volumes vary widely among German acute care hospitals this is a proper setting to study volume-outcome relationships.
- In contrast to most other volume-outcome studies, the present approach includes
  the calculation of minimum volume thresholds along with an assessment of the
  possible impact of centralization efforts on the population.
- Within this observational retrospective study the statistical association between volume and outcome was tested upon administrative data.
- As information available from administrative data is limited, it is possible that unmeasured differences in disease severity, comorbidity, or appropriateness of patient selection may partly explain the association between volume and outcome.

#### Introduction

The relationship between hospital volume and patient outcomes has been widely studied. For many inpatient treatments a higher volume was found to be associated with better outcomes, such as for high-risk surgical procedures, medical conditions or elective low-risk surgery. Systematic reviews and meta analyses were conducted to aggregate results into a broader frame of knowledge. However, the heterogeneity of methods used impairs conclusions from meta analyses. In particular, the categorisation of high volume hospitals varies according to the geographical context. Solution of high volume include only samples of patients or are restricted to patients with a specific type of insurance or within a delimited geographic area. Therefore, it is often uncertain if the association of volume and outcome found in one study may be generalizable to the whole population affected, or even to populations in other countries with different health care systems. Finally, studies reporting better outcome in relation to higher volume often lack an assessment of the clinical and policy significance of their findings.

To date, the volume-outcome relationship in Germany has been studied only for few inpatient services, such as pancreatic resection, abdominal aortic aneurysm repair, hip fracture, or treatment of very low birthweight infants.<sup>17-19</sup> The German acute care hospital market is characterized by a relative overcapacity of hospital beds and high hospitalization rates.<sup>20</sup> Volumes of inpatient treatments vary widely among the about 1,600 German acute care hospitals.<sup>21</sup> In 2004, minimum volume thresholds for specific types of inpatient treatment were established. However, it has been found that many hospitals did not adhere to this regulation, and the debate about the underlying evidence remains controversial.<sup>22-24</sup>

Efforts to improve quality of care by centralisation of services need to rely on evidence that higher volume is associated with better outcome. Therefore, this study aimed to explore the relation of hospital volume and outcome in the German hospital market by using complete national hospital discharge data. For a broad range of common or medically important inpatient services the existence and strength of a relationship between volume and mortality was analysed. Where lower mortality in relation to higher volume was observed minimum volume thresholds, above which mortality would be reduced, were estimated. Impact measures were calculated to assess the potential benefit of centralisation efforts.

#### **Methods**

#### Data

German acute care hospitals are obliged to submit their inpatient discharge data annually to a nationwide database, which is available for research purposes. This database (Diagnosis-Related Group Statistics [DRG Statistics] provided by the Research Data Centres of the Federal Statistical Office and the statistical offices of the 'Länder') contains discharge information on every inpatient episode, covering patients of all types of insurance. Principal and secondary diagnoses are coded according to the German adaptation of the International Classification of Diseases (ICD-10-GM). Procedures are coded according to the German procedure coding system (OPS, Operationen- und Prozedurenschlüssel). Information on sex, age, source of admission, discharge disposition, and length of stay are also included. Based on an anonymized hospital identifier every inpatient episode can be assigned to the treating hospital.<sup>25</sup> The analyses included data of the years 2009 to 2014. Data were accessed via controlled remote data analysis.

# Patient population

To study a broad range of hospital services five groups of inpatient treatments comprising 25 single conditions or procedures were analysed:

- Common emergency conditions (6)
- Elective heart and thoracic surgery (4)
- Elective major visceral surgery (6)
- Elective vascular surgery (4)
- Elective low-risk surgery (5)

Each type of treatment was defined by specific inclusion and exclusion criteria in order to minimize confounding by differences in case-mix. Treatments for emergency conditions (e.g. acute myocardial infarction) were restricted to direct admissions by excluding patients who had been transferred-in from another acute care hospital. Elective surgical treatments were defined by restriction to certain medical indications (e.g. colorectal resection for carcinoma) or exclusion of complicated constellations (e.g. aortic valve replacement excluding combined other heart surgery). All definitions

refer to adult patients aged 20 years and older. Inclusion and exclusion criteria are listed in Appendix Table 1.

#### **Hospital volume**

Volume of patients treated by a hospital was calculated for each year of observation corresponding to the respective definition of a studied type of treatment. Aiming to compare results in the context of the current literature, hospitals were ranked into quintiles of approximately equal case numbers according to their annual volume. Additionally, hospital volume was analysed as a continuous variable.

Within a sensitivity analysis hospital volume was additionally determined on the basis of wider case definitions in order to fully consider all treatments which might enhance a hospital's experience regarding a specific condition or procedure (e.g., all colorectal resections regardless from medical indication). This approach led to a higher estimation of annual volume per hospital in most cases and resulted in a slightly different ranking of hospitals. Within this analysis restrictions in case definition, as described above, were subsequently applied for outcome measurement.

#### Outcome measure, risk adjustment and statistical analysis

In-hospital mortality, defined as death before discharge, was studied as outcome measure. Observed and risk-adjusted mortality were stratified by volume quintiles.

Risk-adjusted mortality for each volume quintile was calculated by using generalized estimating equations (GEE) with a logit link function, accounting for clustering of patients within hospitals. Using the pooled data of the entire observation period one GEE model was fitted for each studied treatment. Depending on the type of treatment, models included comorbidities, which most likely have been present on admission (e.g. diabetes, chronic liver disease), specific indicators of disease severity (e.g. ST-elevation myocardial infarction), or extension of surgery (e.g. concomitant resection of other visceral organs in patients with pancreatic resection). 5-year age groups, sex, and calendar year of treatment were considered within each model. The definitions and treatment-specific applications of covariates for risk adjustment are displayed in Appendix tables 2 and 3.

In order to estimate the independent impact of hospital volume on in-hospital mortality, hospital volume was subsequently entered into each model, taken as a categorically variable. Odds ratios for in-hospital death by hospital volume quintile were calculated.

To further explore the relationship between volume and outcome GEE models with volume as a continuous variable were fitted for each treatment. In a first step, hospital volume was taken as the only predictor (simple model). In a second step the treatment-specific covariates, as described above, were entered into the model (full model) and odds ratios for in-hospital death according to an increment of one case, as well as of 50 cases per year were calculated.

Where the regression coefficient of a one-case increment of hospital volume remained statistically significant after consideration of covariates, minimum volume thresholds were estimated from the simple model using Benders Value of Acceptable Risk Limit.<sup>26</sup> This value is calculated from the function of the logistic regression coefficient of hospital volume. It denotes the threshold where mortality is expected to fall below a predefined acceptable risk. The acceptable risk was set to the average mortality of the respective treatment during the observation period.

The clinical relevance of thresholds was assessed by the population impact number (PIN). The PIN was calculated as reciprocal of the difference between the average mortality risk in the entire patient population and the adjusted risk among patients treated by hospitals with volumes above the threshold (population-based risk difference PRD).<sup>27</sup> In the context of this study, the PIN can be interpreted as average number of patients within a treatment group among whom one death is attributable to treatment by a below-threshold volume hospital, due to excess risk of mortality in these hospitals. In other words, among this number of patients one death could hypothetically be prevented if all hospitals providing the respective inpatient service had annual volumes equal or higher than the threshold.

The level of statistical significance was set to .05. The analyses were conducted using SAS Version 9.3 (SAS Institute Inc., Cary, NC, USA).

#### Results

#### **Common emergency conditions**

Lower in-hospital mortality in association with higher hospital volume was observed in four out of the six studied types of common emergency treatment when volume was categorized in quintiles and persisted in two types of treatment when volume was analysed as a continuous variable.

From 2009 to 2014 nearly 1.1 million patients were treated for acute myocardial infarction (table 1). Risk-adjusted mortality was 8.9% (95% CI 8.8 to 9.0) in the very high volume quintile versus 11.4% (11.3 to 11.6) in the very low volume quintile (figure 1). Adjusted odds ratios of in-hospital death were significantly reduced in the low to very high volume quintiles when compared to the very low volume quintile (table 2). A statistically significant effect of volume on mortality was also observed when volume was analysed as a continuous variable. An increment of 50 cases per year was associated with reduced odds of death (figure 2). The minimum hospital volume where risk of mortality would fall below the average mortality of 9.8% was calculated as 309 cases per year. Stratification by this threshold resulted in a population-based risk difference (PRD) of 0.7% (0.7 to 0.8) and a population impact number (PIN) of 137 (127 to 149, table 3). This means that out of 137 patients hospitalized for acute myocardial infarction one death would be prevented if annual volumes in treating hospitals were at least 309.

In total, 2.3 million patients treated for heart failure were studied. Risk-adjusted mortality was 8.5% (95% CI 8.4 to 8.6) in the very high volume quintile versus 9.2% (9.1 to 9.3) in the very low volume quintile (figure 1). For volume as a continuous variable no association was found after consideration of covariates (table 3).

During the observation period 1.2 million patients were hospitalized for ischemic stroke (table 1). Adjusted mortality in the very high volume quintile was 6.9% (95% CI 6.8 to 7.0) versus 7.3% (7.2 to 7.4) in the very low volume quintile (figure 1). After consideration of covariates no measurable effect of hospital volume as a continuous variable was observed (table 3).

Among the 1.3 million patients treated for pneumonia (table 1) higher hospital volume was associated with higher in-hospital mortality. Adjusted mortality was 11.5% (95% CI 11.3 to 11.6) in the very high volume quintile, 12.3% (12.2 to 12.5) in the medium

volume quintile and 10.8% (10.7 to 10.9) in the very low volume quintile (figure 1), and the odds ratios were higher in the low to very high volume quintiles when compared to the very low volume quintile (table 2). When considered as a continuous variable hospital volume was not associated with mortality (table 3).

For the more than 1.15 million patients with chronic obstructive pulmonary disease (COPD, table 1) adjusted mortality was 3.1% (95% CI 3.0 to 3.2) in the very high volume quintile and 4.3% (4.2 to 4.4) in the very low volume quintile (figure 1). Hospital volume as a continuous variable had an independent effect on mortality (figure 2) and the minimum volume to achieve a lower-than-average risk of death was calculated as 271 patients per year. This threshold was estimated to prevent one death among 170 (158 to 185) COPD patients (table 3).

The analysis of 711,000 patients hospitalized for hip fracture (table 1) revealed slightly higher mortality in low to high volume quintiles when compared to the very low volume quintile (figure 1). Hospital volume as a continuous variable had no effect on mortality (table 3).

# Elective heart and thoracic surgery

 For each out of the four studied types of heart and thoracic surgery lower in-hospital mortality in association with higher hospital volume was observed.

From 2009 to 2014 about 52,600 patients were treated with isolated surgical aortic valve replacement (table 1). Adjusted mortality was 2.4% (95% CI 2.1 to 2.7) in the very high volume quintile versus 3.1% (2.8 to 3.4%) in the very low volume quintile (figure 1). Reduced odds of death were found in the medium to very high volume quintiles when compared to the very low volume quintile (table 2). As a continuous variable hospital volume demonstrated an independent effect on mortality (figure 2). The minimum volume to achieve a lower-than-average risk of death was calculated as 147 annual treatments. This threshold resulted in a non-significant PRD of 0.2% (-0.02 to 0.3) and a PIN of 516 (288 to 2589, table 3).

In-hospital mortality of the 50,800 patients treated with transcatheter aortic valve replacement (table 1) was 5.2% (95% CI 4.8 to 5.7) in the very high volume quintile versus 7.6% (7.1 to 8.2) in the very low volume quintile (figure 1). Hospital volume as a continuous variable revealed an independent effect on mortality (figure 2) and the

minimum volume to fall below the average mortality of 6.6% was calculated as 157 cases per year. Application of this threshold was estimated to prevent one death among 133 (101 to 193) patients (table 3). This means that among 133 patients with transcatheter aortic valve replacement one death would be prevented if all providing hospitals would perform this treatment at least 157 times per year.

184,000 patients were treated with an isolated coronary artery bypass graft (table 1). According to hospital quintiles no constant association of volume and mortality was found (figure 1, table 2). However, an independent effect of hospital volume on mortality was observed when volume was analysed as a continuous variable (figure 2) and the minimum volume to achieve a risk of death below the average of 2.1% was calculated as 475 cases per year. This threshold led to a PIN of 658 (445 to 1271, table 3).

In total, 74,000 patients with partial lung resection for carcinoma were studied (table 1). In the very high volume quintile adjusted mortality was 2.0% (95% CI 1.8 to 2.3) versus 3.8% (3.6 to 4.1) in the very low volume quintile (figure 1). The observed independent effect of hospital volume when analysed continuously resulted in a minimum volume of 108 cases per year. This threshold was estimated to prevent one death among 168 (137 to 217) patients (table 3).

#### Elective major visceral surgery

Lower mortality associated with higher hospital volume was found for all six studied types of elective visceral surgery.

During the observation period 331,000 colorectal resections for carcinoma were performed in German hospitals (table 1). Mortality was 5.2% (95% CI 5.0 to 5.4) in the very high volume quintile and 6.6% (6.4 to 6.8) in the very low volume quintile (figure 1). In comparison to the very low volume quintile odds of death were statistically significantly reduced in the medium to very high volume quintiles (table 2). Hospital volume as a continuous variable had an independent effect on mortality (figure 2). The minimum volume to achieve a risk of death below the average of 6.0% was calculated as 82 annual treatments, associated with a PIN of 197 (167 to 241, table 3).

 179,000 colorectal resections were performed for diverticulosis (table 1). Adjusted mortality was 3.1% (95% CI 2.9 to 3.3) in the very high volume quintile versus 3.9% (3.8 to 4.1) in the very low volume quintile (figure1). Hospital volume as a continuous variable had an independent effect on mortality and a minimum volume of 44 was calculated to achieve a risk of death below the average of 3.5%. This threshold was associated with a PIN of 364 (269 to 564, table 3).

During the observation period 68,000 patients with total nephrectomy for carcinoma were identified (table 1). In the very high volume quintile adjusted mortality was 1.9% (95% CI 1.7 to 2.2) and in the very low volume quintile 2.3% (2.1 to 2.6). The independent effect of hospital volume as a continuous variable demonstrated borderline statistical significance (figure 2) and the minimum volume to achieve lower-than-average mortality was calculated as 40 cases per year. Application of this threshold would prevent one death among 459 (295 to 1056) nephrectomy patients (table 3).

Adjusted mortality among the 44,000 patients receiving cystectomy for carcinoma (table 1) was 4.0% (95% CI 3.6 to 4.4) in the very high volume quintile versus 5.5% (5.0 to 6.0) in the very low volume quintile (figure 1). Continuous increment of hospital volume was independently associated with lower mortality (figure 2). This relation of volume and outcome resulted in a minimum volume of 31 cases per year to fall below the average mortality of 4.7%. Application of this threshold was associated a PIN of 227 (150 to 480, table 3).

Among the 18,000 patients with complex oesophageal surgery for carcinoma adjusted mortality was 5.8% (95% CI 5.1 to 6.6) in the very high volume quintile versus 10.5% (9.5 to 11.6) in the very low volume quintile. As a continuous variable hospital volume had an independent effect on mortality and the minimum volume to fall below the average mortality of 8.5% was calculated as 22 cases per year. If all hospitals would perform at least 22 complex oesophageal surgeries per year one death among 47 (38 to 62) patients could be prevented (table 3).

A pancreatic resection for carcinoma was performed in 35,000 patients in total (table 1). Adjusted mortality was 6.4% (95% CI 5.8 to 7.0) in the very high volume quintile versus 11.7% (10.9 to 12.5) in the very low volume quintile (figure 1). Continuous increment of hospital volume was associated with lower mortality and the minimum volume where risk of death would fall below the average mortality of 8.8% was

calculated as 29 cases per year. This threshold resulted in a PIN of 46 (39 to 58, table 3).

#### **Elective vascular surgery**

In three out of the four studied types of elective vascular surgery higher hospital volume was associated with lower in-hospital mortality.

During the observation period 247,000 patients were treated with surgical revascularization of lower extremities for atherosclerosis (table 1). Risk-adjusted mortality was 2.8% (95% CI 2.7 to 3.0) in the very high volume quintile versus 3.3% (3.2 to 3.5) in the very low volume quintile (figure 1). Odds of death were reduced in all other quintiles when compared to the very low volume quintile (table 2). The association of volume and outcome persisted when volume was analysed as continuous variable (figure 2) and the minimum volume to achieve a mortality risk below the average of 3.0% was calculated as 123 cases per year. This led to the estimation that among 561 (387 to 1024) patients one additional death was attributable to treatment by a hospital performing less than 123 of such operations (table 3).

In total, more than 22,000 patients receiving open repair of abdominal aortic aneurysm were analysed (table 1). In the very high volume quintile risk-adjusted mortality was 4.7% (95% CI 4.1 to 5.4) versus 7.8% (7.1 to 8.7) in the very low volume quintile (figure 1). When analysed continuously, higher volume was independently associated with lower mortality (figure 2). The calculated minimum volume where risk would fall below the average of 6.0% was 18 cases per year. The resulting PIN was 104 (76 to 166, table 3).

Among the 42,000 patients treated with endovascular repair of abdominal aortic aneurysm (table 1) risk-adjusted mortality was 1.6% (95% CI 1.3 to 1.9) in the very high volume quintile versus 1.7% (1.4 to 2.0) in the very low volume quintile. Highest mortality was observed in the medium volume quintile (2.1%, 1.8 to 2.4, figure 1). Odds of death were not significantly different between volume quintiles (table 2). Analysed as continuous variable no statistically significant effect of hospital volume on mortality was observed (figure 2, table 3).

From 2009 to 2014 about 162,000 patients with carotid endarterectomy were identified (table 1). Risk-adjusted in-hospital mortality was 0.75% (95% CI 0.66 to 0.86) in the very high volume quintile and 0.97% (0.87 to 1.07) in the very low volume quintile (figure 1). Continuous increment of hospital volume was independently associated with lower in-hospital mortality (figure 2). A lower-than-average risk of mortality is expected if hospitals perform at least 93 carotid endarterectomies per year. Under this threshold the estimated PIN was 1646 (886 to 12661, table 3).

## **Elective low-risk surgery**

 In three out of the five studied types of elective low-risk surgery higher hospital volume was found to be associated with lower mortality when volume was categorized in quintiles. In two types of elective low-risk surgery this relation persisted when volume was analysed as a continuous variable.

From 2009 to 2014 nearly 889,000 inpatient cholecystectomies for cholelithiasis were performed in German hospitals (table 1). Risk-adjusted mortality differed not significantly between volume quintiles (figure 1), as well as risk-adjusted odds of death (table 2). Continuous increment of hospital volume was not associated with mortality (table 3).

Among the 897,000 inpatient inguinal or femoral hernia repairs (table 1) mortality in the very high volume quintile was lower (0.07%, 95% CI 0.06 to 0.08) than in the very low volume quintile (0.10%, 0.09 to 0.12, figure 1). Yet, the independent effect of continuous increment of hospital volume was not statistically significant (table 3).

The analysis of more than 881,000 primary hip replacements for arthrosis or arthritis (table 1) revealed a constant association of hospital volume and mortality when patients were stratified by volume quintiles. Risk-adjusted in-hospital mortality was 0.10% (95% CI 0.08 to 0.11) in the very high volume quintile versus 0.23% (0.21 to 0.25) in the very low volume quintile (figure 1). In comparison to the very low volume quintile odds of death were significantly reduced in all other volume quintiles (table 2). Within the analysis of continuous increment of hospital volume an independent effect on mortality was observed (figure 2). A minimum volume of 252 cases per year was calculated to achieve a risk of mortality below the average of 0.17%. The PIN resulting from this threshold was 2747 (2186 to 3701, table 3).

 Overall 843,000 patients with primary knee replacement for arthrosis or arthritis were identified (table 1). Risk-adjusted mortality was 0.06% (95% CI 0.05 to 0.07) in the very high volume quintile versus 0.13% (0.11 to 0.14) in the very low volume quintile (figure 1). Continuous increment of hospital volume was independently associated with lower mortality (figure 2) and 228 annual cases were calculated as the minimum volume where risk of mortality would fall below the average of 0.10%. This minimum volume threshold resulted in an estimation of one preventable death among 4729 (3513 to 7269) primary knee replacement patients if all hospitals would perform at least 228 such operations per year (table3).

In total, 434,000 patients with transurethral resection of prostate were studied (table 1). No statistically significant differences in in-hospital mortality were found when patients were stratified by hospital volume quintiles (figure 1, table 2) and there was no significant association of hospital volume and mortality when volume was analysed continuously (table 3).

## Sensitivity analysis

Within the sensitivity analysis hospital volume was determined more widely by considering all those treatments or procedures, which could be regarded as technically similar to the specific treatment for which outcome was measured. The specific restrictions for the purpose of outcome measurement were applied after determining volume. Using this divergent volume definition results remained substantially unchanged in 23 out of the 25 studied types of treatments.

Different findings were observed regarding isolated coronary bypass graft, where the relation of volume and mortality was more pronounced when all related procedures (i.e., coronary bypass grafts in patients with acute myocardial infarction or combined with other heart surgery instead of elective isolated coronary operations only) were considered for determination of hospital volume. Different from the findings in the main analysis higher volume was constantly associated with lower mortality when patients were stratified by these volume quintiles.

The volume-outcome association in colorectal resections for diverticulosis diminished when hospital volume was determined by considering all colorectal resections, regardless from medical indication. In contrast to the results of the main analysis, no

statistically significant relation between volume and outcome was observed under this approach.

#### **Discussion**

Lower in-hospital mortality in association with higher hospital volume was observed in 20 out of the 25 studied types of treatment when volume was categorized in quintiles, and persisted in 17 types of treatment when volume was analysed as a continuous variable. While a volume-outcome relationship was not found in all studied emergency conditions and low-risk procedures, it was more consistently present regarding complex surgical procedures. The potential benefit of a centralisation according to the calculated minimum volume thresholds varied depending on the treatment-specific risk of death and the strength of the association between volume and mortality.

The analysis included every patient who underwent one of the studied types of inpatient treatment in a German acute care hospital during the observation period. Limitations occur from the limited information available in administrative data, including lack of information on appropriateness of patient selection for procedures. Although types of treatment and covariates for risk adjustment were defined in a sophisticated way, it is possible that unmeasured differences in disease severity, comorbidity, or appropriateness may partly explain the association between volume and outcome. However, it should be considered that the more severe patients should intentionally not be treated by low-volume hospitals. The analyses could focus hospital volume only because physician volumes are not available in German administrative data. Regarding the determination of hospital volume, a possible misclassification of multi-campus hospitals as high volume providers must be taken into account, resulting in a possible underestimation of the association between hospital volume and mortality.<sup>28</sup>

Inpatient treatments for emergency conditions revealed mixed results. Associations between higher hospital volume and lower mortality were found for treatment of acute myocardial infarction, heart failure, ischemic stroke, and chronic obstructive pulmonary disease. These results are similar to findings of previous studies from other countries. <sup>6-7, 29-34</sup> Regarding the treatment of patients with pneumonia the analysis revealed higher mortality in hospitals with higher volumes. A similar finding

 has been reported by one previous US study,<sup>35</sup> while another more recent US study found higher hospital volume being associated with lower mortality.<sup>6</sup> No constant relation between volume and outcome was observed in hip fracture patients, similar to findings from a recent US study.<sup>36</sup> However, a previous German study, which was based on national discharge data as well, but focussed an earlier time period and surgically treated hip fracture patients only, found lower mortality related to higher hospital volumes.<sup>18</sup> An Italian study observed a volume-outcome relation in hip fracture patients, too.<sup>34</sup>

An association of lower mortality and higher hospital volume was observed for each studied type of elective heart and thoracic surgery. These findings correspond to those from several European and US studies. <sup>3, 5, 14, 34, 37-39</sup> As well, the findings of an volume-outcome relation in all studied types of major visceral surgery are supported by international findings which point to the same direction. <sup>3, 11-12, 17, 30, 40-44</sup> In the case of vascular surgery, the analyses demonstrated lower mortality in association with higher hospital volume for lower extremity revascularization, carotid endarterectomy and open repair of abdominal aortic aneurysm, in accordance to findings from the international literature. <sup>3, 5, 34, 45-46</sup> A volume-outcome relation for abdominal aortic aneurysm repair (open or endovascular) had been demonstrated by a previous German study based on national discharge data. <sup>18</sup> In the present study, however, endovascular repair of abdominal aortic aneurysm was analysed separately and no significant relationship between volume and mortality was observed. This finding is in contrast to one study from the US. <sup>47</sup>

Among the studied types of elective low-risk surgery lower mortality associated with higher volume was found for primary knee and hip replacement, supported by international findings. <sup>8, 48-51</sup> However, no such relation was observed for cholecystectomy, similar to one study from England, <sup>52</sup> but in contrast to studies from Italy and Scotland, which found a modest association between volume and outcome in cholecystectomy patients. <sup>34, 53</sup> The effect of volume on mortality observed in patients undergoing inguinal or femoral hernia repair was small. Studies from the US and Sweden reported a volume-outcome relation for hernia repair, but focussed different outcomes (hernia recurrence or reoperation rates) and determined volume rather on the surgeon level. <sup>54-55</sup> Regarding transurethral resection of prostate no association between hospital volume and mortality was found. This confirms the

 findings of a Japanese study which found an association regarding complication and blood transfusion rates, but not regarding mortality.<sup>56</sup>

Overall, the results of the present study seem plausible in view of the current literature. Discrepancies to findings from other studies might be caused by differences in completeness of data or alternative methodological approaches, e.g. regarding case definitions, or volume determination. However, it is also possible that an association between volume and outcome is more or less existent in different countries, depending on characteristics of a health care system and hospital market structures.<sup>37</sup>

Minimum volume thresholds were calculated for those treatments, in which the association of volume and mortality persisted when volume was analysed as a continuous variable, which provides a strong indication that such an association truly exists. The potential for improvement by centralisation according to the thresholds might appear small in the case of treatments with a basically low risk of mortality. However, one should consider that risk of mortality is likely correlated with the occurrence of non-lethal adverse events, in particular with regard to low-risk procedures. Thus, possible improvements of patient safety by centralisation might reach beyond effects on mortality.

Yet, this retrospective observational study cannot provide evidence that an application of the calculated thresholds as minimum volumes would actually improve quality of care. Therefore, the threshold values are meant to serve as basic orientation points for policy decisions in Germany and as hypothesis-generating landmarks for further research in other countries. Although estimated rather conservatively, roughly 80 to 90% of hospitals providing a specific treatment performed annual volumes below the respective threshold, and between 50% (acute myocardial infarction) and 70% (pancreatic resection for carcinoma) of patients were treated by those hospitals. Policy decisions on centralisation of services cannot rely on testing a statistical association upon observational data, alone. As well, the regional availability and accessibility of inpatient services must be considered, in particular regarding emergency treatments. Centralisation should be pushed primarily in oversupplied geographic regions.

Experiences from the Netherlands have demonstrated that centralisation of inpatient services improved national outcome. <sup>57</sup> A previous German study concluded that full

implementation of the existing minimum volume regulation could improve the quality of hospital care in Germany.<sup>23</sup> In addition to this, the present study identified further areas where centralisation could provide a benefit for patients, and quantified the possible impact of centralisation efforts by using complete national hospital discharge data. These findings might support future policy decisions in Germany.

#### **Author's contribution**

Ulrike Nimptsch designed the study, conducted the analysis, interpreted the data and drafted the manuscript. Thomas Mansky contributed to the study design, to the interpretation of data and to revising the manuscript critically for important intellectual content. Both authors gave final approval of the version to be published and agree to be accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved.

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Table 1 No. of patients and hospitals by volume quintile

Hospital volume quintile

					,	Hospital	volume quin	tile			
		Ve	ery low		Low	M	ledium		High	Ve	ery high
COMMON EMERGENCY CONDITIONS         219,178         219,291         219,189         219,778         220,8										220 005	
Acute myocardial infarction	No. of patients No. of hospitals Median annual volume (IQR)	43	219,178 763 (20 - 71)	184	198 (154 - 215)	303	121 (274 - 331)	412	88	594	220,805 54 (534 - 732)
Heart failure	No. of patients No. of hospitals		463,352 608		463,883 263		463,283 184		464,586 136		465,401 87
	Median annual volume (IQR)  No. of patients	139	(63 - 189) 244.125	290	(260 - 321) 244,272	418	(374 - 461) 244.299	570	(518 - 613) 243,725	804	(703 - 950) 246,858
Ischemic stroke	No. of hospitals Median annual volume (IQR)	28	915 (10 - 62)	259	155 (213 - 310)	427	96 (383 - 471)	577	70 (542 - 625)	865	42 (766 - 1028)
Pneumonia	No. of patients No. of hospitals		258,016 630		257,688 255		258,010 186		258,051 140		259,391 84
Pneumonia	Median annual volume (IQR)	73	(25 - 107)	167	(150 - 183)	229	(211 - 249)	304	(279 - 331)	447	(396 - 523)
Chronic obstructive pulmonary disease	No. of patients No. of hospitals		230,629 612		230,793 264		231,093 182		230,258 125		232,476 61
paintonary discuse	Median annual volume (IQR)  No. of patients	67	(33 - 92) 142,041	144	(126 - 163) 142,082	209	(187 - 233) 141,910	299	(262 - 337) 141,658	546	(455 - 702) 143,271
Hip fracture	No. of hospitals Median annual volume (IQR)	43	609 (6 - 64)	101	232 (93 - 110)	137	172 (128 - 146)	176	133 (164 - 190)	244	88 (221 - 283)
ELECTIVE HEART AND	THORACIC SURGERY										
Isolated surgical aortic valve replacement	No. of patients No. of hospitals		10,275 33		10,238 17		10,627 14		10,066 10		11,397 7
·	Median annual volume (IQR)  No. of patients	54	(37 - 71) 9,915	100,5	(93 - 108) 10,009	132	(124 - 138) 9,926	172	(159 - 188) 9,935	246	(227 - 283) 10,980
Transcatheter aortic valve replacement	No. of hospitals Median annual volume (IQR)	31	48 (12 - 50)	98	17 (69 - 123)	141	12 (99 - 161)	169	9 (142 - 228)	286	6 (233 - 328)
Isolated coronary artery bypass graft	No. of patients No. of hospitals		35,648 48		36,967 18		36,047 14		37,221 11		37,807 8
	Median annual volume (IQR)  No. of patients	120	(1 - 230) 14,655	353	(318 - 375) 14,766	436	(407 - 465) 14,626	561	(518 - 585) 14,872	729	(669 - 824) 15,064
Partial lung resection for carcinoma	No. of hospitals Median annual volume (IQR)	5	260 (2 - 14)	49	48 (43 - 59)	89	27 (79 - 98)	137	17 (122 - 160)	272	9 (208 - 313)
ELECTIVE MAJOR VISC	ERAL SURGERY										
Colorectal resection for carcinoma	No. of patients No. of hospitals Median annual volume (IQR)	23	66,058 492 (14 - 32)	50	66,089 218 (45 - 55)	72	66,119 153 (66 - 78)	97	66,185 112 (91 - 105)	141	66,451 71 (126 - 165)
Colorectal resection for	No. of patients No. of hospitals		35,828 487		35,821 215		35,810 154		35,872 114		36,032 73
diverticulosis	Median annual volume (IQR)	13	(7 - 18)	28	(25 - 30)	39	(36 - 42)	52	(48 - 56)	74	(68 - 86)
Total nephrectomy for carcinoma	No. of patients No. of hospitals Median annual volume (IQR)	5	13,582 307 (2 - 13)	25	13,569 90 (23 - 27)	35	13,570 65	48	13,600 47 (45 - 52)	67	13,766 31 (60 - 76)
Cystectomy for	No. of patients	5	8,706	25	8,702	35	(33 - 37) 8,761	40	8,734	67	8,832
carcinoma	No. of hospitals Median annual volume (IQR)	9	177 (5 - 12)	18	78 (17 - 20)	26	56 (24 - 28)	36	39 (34 - 40)	57	24 (51 - 68)
Complex oesophageal surgery for carcinoma	No. of patients No. of hospitals		3,625 228		3,625 71		3,639 43		3,550 23		3,769 10
	Median annual volume (IQR)  No. of patients	2	(1 - 4) 6,886	8	(7 - 10) 6,915	14	(12 - 16) 6,880	25	(21 - 29) 6,854	54	(42 - 67) 7,020
Pancreatic resection for carcinoma	No. of hospitals Median annual volume (IQR)	3	322 (2 - 5)	10	117 (9 - 11)	16	71 (14 - 18)	27	41 (23 - 33)	57	17 (46 - 72)
ELECTIVE VASCULAR S	BURGERY		. ,		, ,				, ,		
Surgical lower extremity revascularization for	No. of patients No. of hospitals	0.4	49,239 348	70	49,385 113	400	49,467 79	140	49,086 57	040	49,997 37
atherosclerosis Open repair of	Median annual volume (IQR)  No. of patients	21	(7 - 39) 4,422	72	(65 - 80) 4,425	102	(95 - 112) 4,430	143	(131 - 158) 4,420	210	(185 - 243) 4,530
abdominal aortic aneurysm	No. of hospitals Median annual volume (IQR)	3	239 (1 - 4)	9	81 (7 - 10)	15	50 (13 - 17)	21	33 (19 - 25)	39	18 (33 - 46)
Endovascular repair of abdominal aortic	No. of patients No. of hospitals		8,281 219		8,338 81		8,288 52		8,309 34		8,462 20
aneurysm	Median annual volume (IQR)	6	(3 - 9)	17	(15 - 19)	26	(24 - 30)	40	(36 - 45)	64	(57 - 75)
Carotid endarterectomy	No. of patients No. of hospitals Median annual volume (IQR)	16	32,345 317 (6 - 27)	52	32,267 101 (46 - 59)	80	32,460 67 (73 - 87)	113	32,017 47 (104 - 123)	165	33,081 30 (148 - 195)

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#### **ELECTIVE LOW-RISK SURGERY** 177,346 177,411 177,199 178,752 Cholecystectomy for No. of hospitals cholelithiasis Median annual volume (IQR) (44 - 91) (118 - 137) 166 (157 - 176) 210 (196 - 224) 286 (264 - 331) No. of patients 178.992 179,169 179,285 179,338 179.911 Inquinal or femoral (45 - 86) (111 - 129) 160 (150 - 171) (194 - 224) (274 - 377) Median annual volume (IQR) 312 No. of patients 175.918 175,797 176,313 175,834 177,287 Primary hip replacement No. of hospitals for arthrosis or arthritis (25 - 71) (111 - 146) (522 - 768) 213 (190 - 242) (314 - 388) Median annual volume (IQR) 619 Primary knee No. of patients 168,312 168,479 168,415 168,015 169,623 No. of hospitals Median annual volume (IQR) 517 (36 - 75) replacement for (112 - 140) (176 - 215) (267 - 324) (421 - 632) arthrosis or arthritis 87.412 Transurethral resection of prostate (303 - 380)

No. of hospitals: Mean number of hospitals in quintile per year providing the respective inpatient service; IQR: interquartile range within the quintile (due to data protection regulations the minimum and maximum values cannot be displayed).



# Table 2 Odds ratios of in-hospital death according to volume quintile

			Hospital volume quintile									
		Very low		Low		Medium		High	٧	ery high		
COMMON EMERGENCY CONDITION												
Acute myocardial infarction	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.82 * 0.84	(0.81 to 0.87)	0.74 * 0.75	(0.72 to 0.78)	0.72 * 0.73	(0.7 to 0.76)	0.71 * 0.69	(0.66 to 0.72)		
Heart failure	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.95 0.99	(0.96 to 1.01)	0.89 * 0.96	(0.93 to 0.99)	0.87 * 0.95	(0.92 to 0.98)	0.81 * 0.91	(0.88 to 0.94)		
Ischemic stroke	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.77 * 0.90	(0.87 to 0.94)	0.70 * 0.87	(0.83 to 0.9)	0.70 * 0.94	(0.91 to 0.98)	0.72 * 0.94	(0.91 to 0.98)		
Pneumonia	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.09 1.10	(1.07 to 1.13)	1.16 1.17	(1.14 to 1.21)	1.12 1.13	(1.09 to 1.16)	1.08 1.08	(1.04 to 1.11)		
Chronic obstructive pulmonary disease	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.06 1.09	(1.06 to 1.14)	1.04 1.08	(1.04 to 1.12)	0.91 * 0.94	(0.90 to 0.98)	0.66 * 0.70	(0.65 to 0.75)		
Hip fracture	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.06 1.07	(1.03 to 1.12)	1.06 1.07	(1.03 to 1.11)	1.07 1.10	(1.06 to 1.15)	1.00 1.01	(0.97 to 1.06)		
ELECTIVE HEART AND THORACIO	SURGERY											
Isolated surgical aortic valve replacement	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.90 0.87	(0.69 to 1.10)	0.80 * 0.78	(0.62 to 0.99)	0.74 * 0.69	(0.54 to 0.87)	0.74 * 0.77	(0.61 to 0.97)		
Transcatheter aortic valve replacement	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.97 0.98	(0.69 to 1.1)	0.90 * 0.87	(0.62 to 0.99)	0.78 * 0.79	(0.54 to 0.87)	0.64 * 0.65	(0.61 to 0.97)		
Isolated coronary artery bypass graft	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.93 0.98	(0.81 to 1.17)	1.03 1.08	(0.90 to 1.28)	0.73 * 0.82	(0.68 to 0.99)	0.70 0.92	(0.76 to 1.11)		
Partial lung resection for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.71 * 0.77	(0.67 to 0.90)	0.68 * 0.73	(0.63 to 0.85)	0.52 * 0.58	(0.50 to 0.69)	0.37 * 0.49	(0.41 to 0.58)		
ELECTIVE MAJOR VISCERAL SUR	GERY											
Complex oesophageal surgery for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.83 * 0.81	(0.68 to 0.96)	0.81 0.85	(0.72 to 1.01)	0.62 * 0.67	(0.56 to 0.82)	0.51 * 0.47	(0.38 to 0.58)		
Pancreatic resection for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.76 * 0.80	(0.71 to 0.92)	0.66 * 0.68	(0.59 to 0.77)	0.52 * 0.54	(0.46 to 0.62)	0.46 * 0.46	(0.39 to 0.54)		
Colorectal resection for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.92 0.97	(0.91 to 1.02)	0.77 * 0.85	(0.80 to 0.90)	0.72 * 0.83	(0.78 to 0.88)	0.63 * 0.75	(0.70 to 0.80)		
Colorectal resection for diverticulosis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.86 * 0.87	(0.80 to 0.95)	0.77 * 0.87	(0.79 to 0.95)	0.65 * 0.80	(0.72 to 0.88)	0.60 * 0.74	(0.67 to 0.82)		
Total nephrectomy for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.92 0.95	(0.79 to 1.13)	0.87 0.89	(0.75 to 1.06)	0.75 * 0.78	(0.64 to 0.94)	0.80 * 0.80	(0.67 to 0.97)		
Cystectomy for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.85 * 0.85	(0.73 to 0.98)	0.89 0.86	(0.74 to 1.00)	0.80 * 0.80	(0.69 to 0.93)	0.70 * 0.69	(0.58 to 0.82)		
ELECTIVE VASCULAR SURGERY												
Surgical lower extremity revas- cularization for atherosclerosis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.86 * 0.88	(0.81 to 0.96)	0.80 * 0.85	(0.78 to 0.94)	0.73 * 0.82	(0.75 to 0.9)	0.75 * 0.82	(0.75 to 0.91)		
Open repair of abdominal aortic aneurysm	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.67 * 0.71	(0.59 to 0.84)	0.73 * 0.76	(0.63 to 0.91)	0.62 * 0.60	(0.50 to 0.72)	0.52 * 0.55	(0.45 to 0.68)		
Endovascular repair of abdominal aortic aneurysm	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.77 0.81	(0.63 to 1.04)	1.17 1.26	(1.00 to 1.59)	0.80 0.93	(0.72 to 1.19)	0.82 0.91	(0.68 to 1.21)		
Carotid endarterectomy	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.85 0.92	(0.77 to 1.09)	0.81 0.89	(0.75 to 1.05)	0.82 0.90	(0.76 to 1.06)	0.66 * 0.77	(0.64 to 0.93)		
ELECTIVE LOW-RISK SURGERY												
Cholecystectomy for cholelithiasis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.97 0.98	(0.87 to 1.09)	1.00	(0.95 to 1.19)	0.98 1.07	(0.95 to 1.19)	0.84 0.95	(0.85 to 1.08)		
Inguinal or femoral hernia repair	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.88 0.94	(0.77 to 1.14)	0.75 0.90	(0.72 to 1.11)	0.66 0.83	(0.66 to 1.04)	0.43 * 0.66	(0.51 to 0.86)		
Transurethral resection of prostate	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.11 1.06	(0.89 to 1.25)	1.18 1.11	(0.93 to 1.32)	1.13 1.08	(0.90 to 1.28)	0.92 0.98	(0.82 to 1.18)		
Primary hip replacement for arthrosis or arthritis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.78 * 0.87	(0.75 to 1.00)	0.56 * 0.70	(0.60 to 0.82)	0.48 * 0.67	(0.56 to 0.79)	0.27 * 0.41	(0.33 to 0.51)		
Primary knee replacement for arthrosis or arthritis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.79 0.84	(0.69 to 1.02)	0.68 * 0.76	(0.62 to 0.94)	0.59 * 0.68	(0.54 to 0.85)	0.35 * 0.45	(0.34 to 0.58)		

<sup>\*</sup> Statistically significant lower than reference category (very low volume). Covariates used for risk adjustment are displayed in Appendix table 3.

Table 3 Minimum volume threshold estimation and assessment of population impact

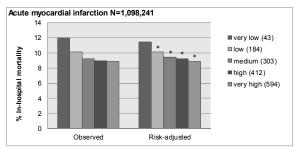
	·		gression coefficients of ospital volume		VARL Minimum volume threshold		Average mortality in	Adjusted mortality if volume ≥ VARL		L Population-based risk		PIN Population impact	
	Sillipi B	p p	β	n moder p		(95% CI)	population		(95% CI)	differe	nce (95% CI)	nu	mber (95% CI)
COMMON EMERGENCY CONDITIONS	P			- "									
Acute myocardial infarction	-0.0003	<.001	-0.0003	<.001	309	(288 to 330)	9.8%	9.1%	(9.0 to 9.2)	0.7%	(0.7 to 0.8)	137	(127 to 149)
Heart failure	-0.0001	0.001	0.0000	0.358	_	,	8.9%		,		,		,
Ischemic stroke	-0.0002	0.000	0.0000	0.025	-		6.9%						
Pneumonia	0.0000	0.003	0.0000	<.001	-		11.6%						
Chronic obstructive pulmonary disease	-0.0003	0.039	-0.0002	0.026	271	(240 to 301)	4.2%	3.6%	(3.5 to 3.6)	0.6%	(0.5 to 0.6)	170	(158 to 185)
Hip fracture	0.0000	0.138	0.0000	0.828	-	,	5.5%		, ,		, ,		, ,
ELECTIVE HEART AND THORACIC SURGERY													
Isolated surgical aortic valve replacement	-0.0014	0.001	-0.0010	0.039	147	(111 to 182)	2.6%	2.4%	(2.2 to 2.6)	0.2%	(0.0 to 0.3)	516	(288 to 2589)
Transcatheter aortic valve replacement	-0.0024	<.001	-0.0017	<.001	157	(142 to 171)	6.6%	5.8%	(5.5 to 6.2)	0.8%	(0.5 to 1.0)	133	(101 to 193)
Isolated coronary artery bypass graft	-0.0007	<.001	-0.0003	0.024	475	(430 to 521)	2.1%	2.0%	(1.9 to 2.1)	0.2%	(0.1 to 0.2)	658	(445 to 1271)
Partial lung resection for carcinoma	-0.0034	<.001	-0.0025	<.001	108	(95 to 120)	2.9%	2.3%	(2.1 to 2.5)	0.6%	(0.5 to 0.7)	168	(137 to 217)
ELECTIVE MAJOR VISCERAL SURGERY													
Colorectal resection for carcinoma	-0.0023	<.001	-0.0014	<.001	82	(76 to 88)	6.0%	5.4%	(5.3 to 5.5)	0.5%	(0.4 to 0.6)	197	(167 to 241)
Colorectal resection for diverticulosis	-0.0049	<.001	-0.0025	0.003	44	(38 to 49)	3.5%	3.2%	(3.1 to 3.4)	0.3%	(0.2 to 0.4)	364	(269 to 564)
Total nephrectomy for carcinoma	-0.0032	0.012	-0.0029	0.047	40	(24 to 56)	2.1%	1.9%	(1.7 to 2.0)	0.2%	(0.1 to 0.3)	459	(295 to 1056)
Cystectomy for carcinoma	-0.0054	<.001	-0.0055	<.001	31	(23 to 39)	4.7%	4.3%	(4.0 to 4.6)	0.4%	(0.2 to 0.7)	227	(150 to 480)
Complex oesophageal surgery for carcinoma	-0.0105	<.001	-0.0111	<.001	22	(17 to 28)	8.5%	6.3%	(5.7 to 6.9)	2.1%	(1.6 to 2.6)	47	(38 to 62)
Pancreatic resection for carcinoma	-0.0049	<.001	-0.0045	0.001	29	(21 to 37)	8.8%	6.6%	(6.2 to 7.2)	2.2%	(1.7 to 2.6)	46	(39 to 58)
ELECTIVE VASCULAR SURGERY													
Surgical lower extremity revascularization for atherosclerosis	-0.0011	<.001	-0.0007	<.001	123	(102 to 144)	3.0%	2.8%	(2.7 to 2.9)	0.2%	(0.1 to 0.3)	561	(387 to 1024)
Open repair of abdominal aortic aneurysm	-0.0129	<.001	-0.0112	<.001	18	(14 to 23)	6.0%	5.0%	(4.6 to 5.5)	1.0%	(0.6 to 1.3)	104	(76 to 166)
Endovascular repair of abdominal aortic aneurysm	-0.0031	0.014	-0.0028	0.069	-		1.7%						
Carotid endarterectomy	-0.0021	<.001	-0.0014	<.001	93	(69 to 116)	0.87%	0.81%	(0.74 to 0.88)	0.06%	(0.01 to 0.11)	1646	(886 to 12661)
ELECTIVE LOW-RISK SURGERY													
Cholecystectomy for cholelithiasis	-0.0003	0.008	-0.0001	0.425	-		0.43%						
Inguinal or femoral hernia repair	-0.0019	0.009	-0.0007	0.212	-		0.09%						
Primary hip replacement for arthrosis or arthritis	-0.0020	<.001	-0.0013	<.001	252	(227 to 278)	0.17%	0.13%	(0.12 to 0.14)	0.04%	(0.03 to 0.05)	2747	(2186 to 3701)
Primary knee replacement for arthrosis or arthritis	-0.0020	<.001	-0.0016	<.001	228	(190 to 265)	0.10%	0.07%	(0.07 to 0.08)	0.02%	(0.01 to 0.03)	4729	(3513 to 7269)
Transurethral resection of prostate	-0.0003	0.130	-0.0001	0.740	-	( )	0.36%	2.2.70		2.22,0	,	20	72,

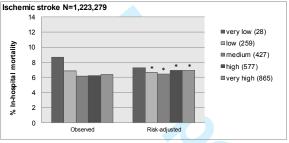
Logistic regression coefficients of hospital volume relate to an increment of 1 case per year. CI: Confidence interval.

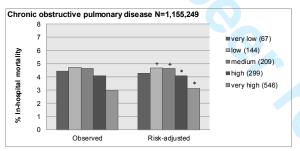
VARL: Value of acceptable risk limit (Bender 1999), calculated from the logistic regression coefficient of the simple model. It estimates a minimum volume threshold to achieve a risk of in-hospital mortality which is lower than a predefined acceptable risk. The acceptable risk for each treatment was set to the average mortality in the respective patient population during the observation period. The population impact number PIN is the reciprocal of the difference between the average mortality in the patient population and the adjusted mortality in those patients treated by hospitals with volumes above the threshold (population-based risk difference PRD). It can be interpreted as average number of the entire patient population among whom one death is attributable to treatment by a below-threshold volume hospital. Covariates used for risk adjustment are displayed in Appendix table 3.

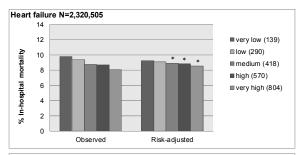
Figure 1 Observed and risk-adjusted in-hospital mortality by hospital volume quintile

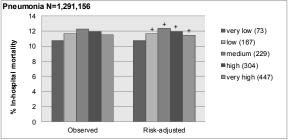
#### COMMON EMERGENCY CONDITIONS

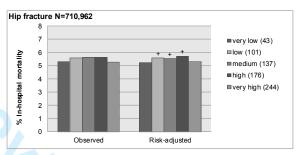




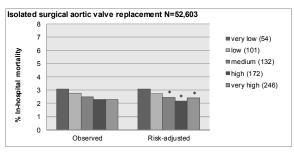


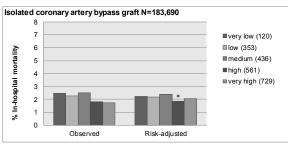


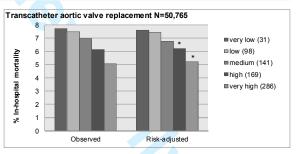


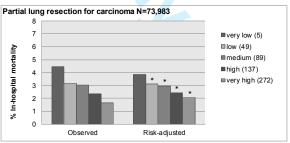


#### ELECTIVE HEART AND THORACIC SURGERY





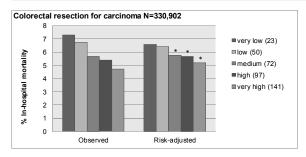


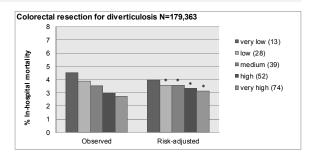


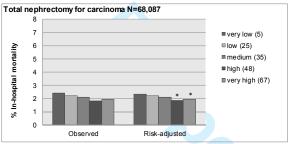
<sup>\*</sup> Statistically significant lower than very low volume quintile. + Statistically significant higher than very low volume quintile. Numbers displayed in the legend of each graph denote the median annual hospital volume within the respective volume quintile. Covariates used for risk adjustment are displayed in Appendix table 3.

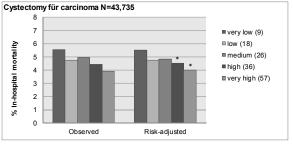
#### Figure 1 (continued)

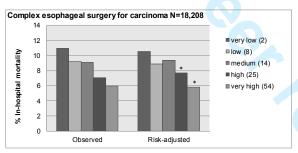
#### **ELECTIVE MAJOR VISCERAL SURGERY**

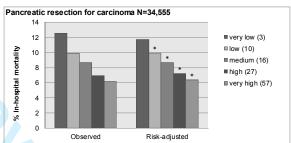




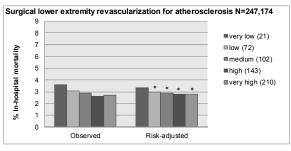


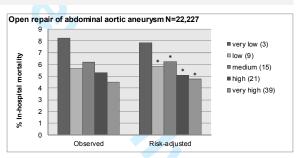


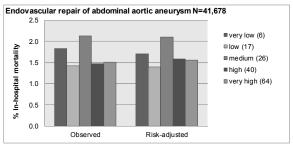


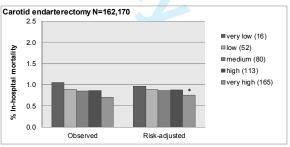


#### **ELECTIVE VASCULAR SURGERY**









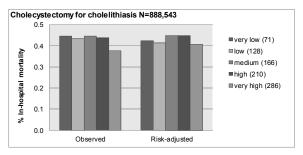
<sup>\*</sup> Statistically significant lower than very low volume quintile. + Statistically significant higher than very low volume quintile.

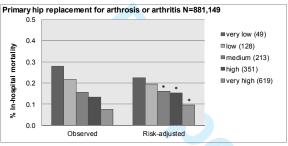
Numbers displayed in the legend of each graph denote the median annual hospital volume within the respective volume quintile.

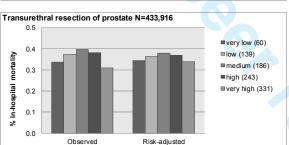
Covariates used for risk adjustment are displayed in Appendix table 3.

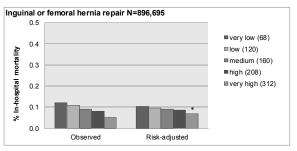
#### Figure 1 (continued)

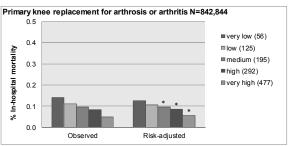
#### **ELECTIVE LOW-RISK SURGERY**





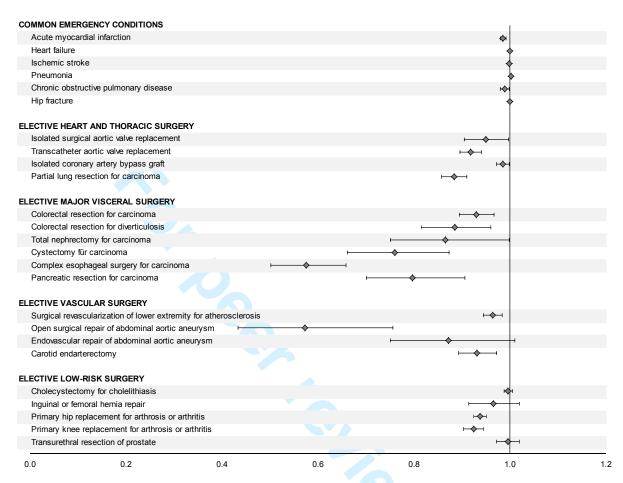






<sup>\*</sup> Statistically significant lower than very low volume quintile. + Statistically significant higher than very low volume quintile. Numbers displayed in the legend of each graph denote the median annual hospital volume within the respective volume quintile. Covariates used for risk adjustment are displayed in Appendix table 3.

Figure 2 Adjusted odds ratios of in-hospital death according to an increment of hospital volume of 50 cases per year



Whiskers indicate 95% confidence interval. Covariates used for risk-adjustment are displayed in Appendix table 3.

#### Appendix table 1 Inclusion and exclusion criteria for case definition

Inclusion	Exclusion
DD 104 100; diseast admirable	
PD A481 J100 J110 J12 J13 J14 J15 J16 J17	SD U6900 (nosocomial acquired pneumonia)
· · · · · · · · · · · · · · · · · · ·	
FD 3720 3721, direct admission	
OPS 53510	OPS 53602 53503 53504 53505 53506 53507 5350x 5350y 53511 53512 53513 53514 5351x 5351y 53521 53522 53523 5352y 53531 53532 53533 53534 53535 5353x 5353y 53541 53542 53543 53544 53545 53
OPS 535a0	
OPS 536	OPS 5350 5351 5352 5353 5354 5358 535a 5379a 5379b 538a0 538a1 538233 53823x 53845 53846 53847 5384x 5384y 538a7 538a8 538230 538232 538401 538402 53840x 538411 538412 53841x 538421 538422 53842x 53843x 538432 53843x 53843 5355 5356 5357 5359 5371 53725 53732 53733 53734 53735 53736 53737 53738 5373x 53737 5373 (other heart surgery); PD [21, I22 (acute myocardial infarction)
OPS 5321 5322 5323 5324 5325; PD or SD C34 D022	OPS 5327 5328 (pneumonectomy)
OPS 5455 5456 5458 5484 5485;	
OPS 5455 5456 5458 5484 5485;	SD C18 C19 C20 C218 D010 D011 D012 (colorectal carcinoma)
OPS 55544 55545 55546 55547 5554a 5554b	OPS 55547 55549 5555 (post mortem resection, graft resection, donor resection or transplantation of kidney)
OPS 5576 56870 56872 56873; PD or SD C67 D090 D414	
OPS 5423 5424 5425 5426 54270 54271 54380 54381 5438x; PD or SD C15 C160	
OPS 5521 5522 5523 5524 5525; PD or SD C25 C241	OPS 55253 55254 5528 (post mortem resection, graft resection, or transplantation of pancreas)
OPS 538233 53823x 53845 53846 53847	PD or SD I7104 I7105 I7106 I7107 I711 I713 I715 I718 (ruptured aortic
5384x 5384y; PD or SD I7100 I7101 I7102 I7103 I712 I714 I716 I719	aneurysm); OPS 538230 538232 53840 53841 53842 53843 53844 53848 538a7 538a8 538aa 538ab (surgical repair of thoracic aortic aneurysm); OPS 538a0 538a1 (endovascular repair of abdominal aortic aneurysm)
OPS 538a0 538a1; PD or SD I7100 I7101 I7102 I7103 I712 I714 I716 I719	PD or SD I7104 I7105 I7106 I7107 I711 I713 I715 I718 (ruptured aortic aneurysm); OPS 538230 538232 53840 53841 53842 53843 53844 53848 538a7 538a8 538aa 538ab (surgical repair of thoracic aortic aneurysm)
OPS 53805 53807 53808 53815 53817 53818 538255 538254 538255 538255 538255 538255 538255 538255 538255 538255 538255 538255 538255 538255 538255 53825	OPS 538233 53823x 53845 53846 53847 5384x 5384y 538a0 538a1 538230 53823z 53840 53841 53842 53843 53844 53848 538a5 538ab 5335 5375 5504 5528 5555 (repair of aortic aneurysm, solid organ transplantation); PD or SD 1723 1724 1728 1729 174 T823 T824 T825 T827 T828 T829 (arterial dissection, aneurysm or embolism, complication of stent prosthesis)
OPS 53800 53810 53820 53830 538c01 53950 53970	OPS 535 536 5370 5371 5372 5373 5374 5375 53791 53796 53797 53798 53799 5379a 5379b 5379c 537620 537621 537630 537631 537640 537641 537650 537651 537660 537661 537660 537661 537660 537661 537660 537661 537690 537691 537690 537691 537690 537691 537690 537691 537690 537691 537690 537691 537694 537a 538233 53823x 53845 53845 53847 5384x 5384y 538a0 538a1 538230 538252 53840 53841 53842 53843 53843 53843 53845 53805 53805 53805 53815 53817 53818 538253 538254 538255 53825x 53827 53828 538352 538353 538354 538355 53835x 53837 53838 539332 539333 539335 539336 53934x 539345 539342 539342 539343 539345 53936 53937 53952 539553 539554 53955x 53957 53958 53965 53967 53968 53975 53957 53958 53967 539687 53968 53967 53967 53967 53968 53967 53967 53967 53968 53967 53967 53967 53968 53967 53967 53967 53968 53967 53967 53968 53967 53967 53967 53968 53967 53967 53967 53968 53967 53967 53967 53967 53968 53967
	PD I21 I22; direct admission PD I50 I110 I130 I132; direct admission PD I63; direct admission PD A481 J100 J110 J12 J13 J14 J15 J16 J17 J18; direct admission PD J44; direct admission PD S720 S721; direct admission PD S720 S721; direct admission  GERY OPS 53510  OPS 5455 5456 5458 5484 5485; PD or SD C18 C19 C20 C218 D010 D011 D012 OPS 5455 5456 5458 5484 5485; PD or SD C18 C19 C20 C218 D010 D011 D012 OPS 5455 5456 5458 5484 5485; PD K572 K573 K574 K575 K578 K579 OPS 55544 55545; PD or SD C67 D090 D414 OPS 5423 5424 5425 5426 54270 54271 54380 54381 5438x; PD or SD C15 C160 OPS 5521 5522 5523 5524 5525; PD or SD C25 C241  OPS 53823 53825 53825 53825 53825 53827 53828 53845 53845 53845 53845 53845 53847 53845 53847; D or SD I7100 I7101 I7102 I7103 I712 I714 I716 I719 OPS 53805 53807 53808 53815 53817 53818 53825 538355 538355 538355 538375 53837 53836 539335 539335 539335 539336 539337 539347 539345 539345 539345 539365 539347 539345 539345 539355 53957 53958 53965 53967 53958 53957 53958 53965 53800 53810 53820 53830 53800 53801 53950

#### Appendix table 1 (continued)

ELECTIVE LOW-RISK SURGERY		
Cholecystectomy for cholelithiasis	OPS 55110 55111 55112 5511x 5511y; PD K80	SD C D0 (malign neoplasm); OPS 55113 55114 55115 (extended or simultaneously performed cholecystectomy)
Inguinal or femoral hernia repair	OPS 5530 5531; PD K40 K41	OPS 5451 5452 5453 5454 5455 5456 5458 5459 5460 5461 5462 5463 5464 5465 5466 5467 5468 5469 5484 5485 55304 55308 55314 55318 (other intestinal surgery)
Primary hip replacement for arthrosis or arthritis	OPS 582000 582001 582002 582010 582011 582012 582020 582021 582022 582030 582031 582040 582041 582060 582061 582081 582040 5820441 582060 582061 582080 582081 582082 582092 582093 582094 582095 582096 582000 582001 5820	OPS 5829c 5829g 5829n 57854d 582810 582840 582860 5829k 5829m (replacement for malign neoplasm, modular prosthesis, two-stage revision); SD M8005 M8045 M8415 M8445 M8495 M8495 M8595 M8545 M8555 M8565 M9075 M9688 Q650 Q651 S324 (osteoporosis, other osteopathy, hip fracture, congenital deformity of hip)
Primary knee replacement for arthrosis or arthritis	OPS 58221 58222 58223 58224 58226 58227 58229 5822a 5822b 5822d 5822e 5822g 5822h 5822j 5822k 58220 582201 582202; PD M05 M06 M07 M08 M170 M171 M174 M175 M179 M87	OPS 5829c 5829g 5829n 57854d 582810 582840 582860 5829k 5829m (replacement for malign neoplasm, modular prosthesis, two-stage revision); SD M8000 M8005 M8080 M8085 M8400 M8405 M8406 M8505 M8506 M8545 M8546 M8555 M8556 M8566 (osteoporosis or other osteopathy)
Transurethral resection of prostate	OPS 5601	

PD: principal diagnosis (ICD-10-GM); SD: secondary diagnosis (ICD-10-GM); OPS: procedure classification code [Operationen-und Prozedurenschlüssel]; direct admission: patient was not transferred-in from another acute care hospital.

Official classifications according to the German Institute of Medical Documentation and Information (DIMDI): <a href="http://www.dimdi.de/static/en/klassi/icd-10-gm/index.htm">http://www.dimdi.de/static/en/klassi/iogs/index.htm</a> (ICD-10-GM); <a href="http://www.dimdi.de/static/en/klassi/ops/index.htm">http://www.dimdi.de/static/en/klassi/ops/index.htm</a> (OPS).

The case definitions rely on previous work on hospital quality indicators: Mansky T, Nimptsch U, Cools A, Hellerhoff F. G-IQI | German Inpatient Quality Indicators. Version 5.0. - Band 2: Definitionshandbuch für das Datenjahr 2016. Berlin: Universitätsverlag der TU Berlin. <a href="https://depositonce.tu-berlin.de/handle/11303/5819">https://depositonce.tu-berlin.de/handle/11303/5819</a>

#### Appendix table 2 Definition of covariates used for risk adjustment

• •	
Covariate	Definition
Calendar year of treatment	2009, 2010, 2011, 2012, 2013, 2014
Demographics	
Age	5-year age groups
Female sex	
Comorbidity	
Cardiac arrhythmia	PD or SD 1442 148 Z450 Z950
Heart failure or cardiomyopathy	PD or SD I50 I110 I130 I132 I420 I426 I427 I428 I429
Chronic ischemic heart disease	PD or SD I25
Hypertension (without heart or renal failure)	PD or SD I10 I119 I129 I139 I15
Valvular disease	PD or SD I340 I342 I350 I351 I352 I050 I051 I052 I060 I061 I062 Q231 Q232 Q233
Atherosclerosis of peripheral arteries	PD or SD I702
Sequelae of cerebrovascular disease	PD or SD 169
Chronic pulmonary disease	PD or SD J41 J42 J44 J45 J47
Mucoviscidosis	PD or SD E84
Chronic liver disease	PD or SD B18 I864 I982 K70 K73 K74 K760 K761 K765 K766 K767 Q446 Q447
Chronic pancreatitis	PD or SD K860 K861
Severe renal disease or chronic renal failure	PD or SD I120 I131 I132 N03 N04 N05 N07 N08 N11 N12 N14 N15 N16 N18 N19 Z992
Diabetes mellitus	PD or SD E10 E11 E12 E13 E14
Obesity	PD or SD E66
Cachexia or malnutrition	PD or SD R64 R634 E43 E44
Coagulopathy	PD or SD D66 D67 D680 D681 D682 D684 D685 D686 D688 D689 D691 D693 D694
Malign neoplasm	PD or SD C00-C97
Metastatic cancer	PD or SD C77 C78 C79
Specific risk factors	
ST-elevation myocardial infarction	PD I210 I211 I212 I213
Cardiogenic shock	PD or SD R570
Subsequent myocardial infarction	PD 122
Heart failure NYHA classification stage IV	PD I5014
Chronic obstructive pulmonary disease FEV1 <35%	PD J4400 J4410 J4480 J4490
Fracture of neck of femur	PD S720
Complex disease of intestine	PD or SD K55 K56 K593 K630 K631
Peripheral vascular disease stage	PD or SD I + II: I7020 I7021; III: I7022; IV: I7023 I7024
Acute cholecystitis	PD K800 K810
Trans-apical aortic valve replacement	OPS 535a01 535a02
Extended colorectal resection	OPS 5458 54540 54541 54542 54543 54544 54545 54546 5501 5502 5437 5436 5454x 54549
Resection of visceral organs other than pancreas	OPS 5437 5436 5502 5501 5455 5456 54540 54541 54542 54543 54544 54545 54546 5454x

PD: principal diagnosis (ICD-10-GM); SD: secondary diagnosis (ICD-10-GM); OPS: procedure classification system [Operationen- und Prozedurenschlüssel]. Official classifications according to the German Institute of Medical Documentation and Information (DIMDI): <a href="http://www.dimdi.de/static/en/klassi/icd-10-gm/index.htm">http://www.dimdi.de/static/en/klassi/ops/index.htm</a> (ICD-10-GM); <a href="http://www.dimdi.de/static/en/klassi/ops/index.htm">http://www.dimdi.de/static/en/klassi/ops/index.htm</a> (OPS).

#### Appendix table 3 Application of covariates used to estimate risk-adjusted in-hospital mortality

												_				-				_														
	Calendar year of treatment	5-year age groups	Female sex	Cardiac arrhythmia	Heart failure or cardiomyopathy	Chronic ischemic heart disease	Hypertension (without heart or renal failure)	Se Se	Atherosclerosis of peripheral arteries	Sequelae of cerebrovascular disease	Chronic pulmonary disease	Mucoviscidosis	Chronic liver disease	Chronic pancreatitis	Severe renal disease or chronic	Diabetes mellitus	Obesity	Cachexia or malnutrition	Coagulopathy	Malign neoplasm	Metastatic cancer	ST-elevation myocardial infarction	Cardiogenic shock	Subsequent myocardial infarction	Heart failure NYHA classification stage IV	Chronic obstructive pulmonary disease FEV1 <35%	Fracture of neck of femur	Complex disease of intestine	Peripheral vascular disease stage	Acute cholecystitis	Trans-apical aortic valve replacement	Extended colorectal resection	Resection of visceral organs other than pancreas	Area under the curve (c-statistic)
COMMON EMERGENCY CONDITIONS																																		
Acute myocardial infarction Heart failure Ischemic stroke Pneumonia Chronic obstructive pulmonary disease Hip fracture	x x x x x	X X X X X	x x x x x	x x x x	x x x x	x x x x	x x x x	x x x x x	X X X X X	x	x x x	x	x x x x x		x x x x x	x x x x x	x x x x x	x x x x x	x x x x x	x x x x x		x	x	x	х	x	x							0,827 0,729 0,743 0,715 0,716 0,782
ELECTIVE HEART AND THORACIC SURGERY																																		
Isolated surgical aortic valve replacement	Х	X	х	х	х	Х	х		x		Х		Х		X	Х	х	Х	х	х														0,772
Transcatheter aortic valve replacement	Х	X	х	х	х	Х	х		X		X		Х		X	Х	х	Х	х	х											х			0,710
Isolated coronary artery bypass graft	Х	X	х	х	х		х	х	х		Х		х		X	х	х	Х	х	х														0,786
Partial lung resection for carcinoma	х	х	х	Х	х	X	Х	x	Х	<			Х		X	х	X	х	х		х													0,782
ELECTIVE MAJOR VISCERAL SURGERY																																		
Colorectal resection for carcinoma	х	х	х	x	х	х	х	х	х		х		х		x	х	х	х	х		х							х				х		0,825
Colorectal resection for diverticulosis	х	x	x	x	x	x	х	x	x		x		х		x	х	x	х	x									x				x		0,908
Total nephrectomy for carcinoma	х	x	x	x	x	x	х	x	x		x		х			X	x	х	x		x													0,826
Cystectomy for carcinoma	х	x	x	x	x	x	х	x	x		x		х		x	х	x	х	x		x													0,765
Complex oesophageal surgery for carcinoma	х	x	x	x	x	x	х	x	x		х		х		х	х	x	х	x		x													0,751
Pancreatic resection for carcinoma	х	х	х	х	х	x	х	x	х		х		х		х	х	x	x	x		х												х	0,776
ELECTIVE VASCULAR SURGERY																																		
Surgical lower extremity revascularization for atherosclerosis	х	х	х	х	х	х	х	х			х		х		х	х	х	Х	х	х									х					0,853
Open repair of abdominal aortic aneurysm	х	x	х	х	х	х	х	х	х		х		х		х	х	х	х	х	х														0,771
Endovascular repair of abdominal aortic aneurysm	х	x	х	x	х	x	х	х	х		х		х		х	х	X	х	х	х														0,814
Carotid endarterectomy	х	х	x	x	x	x	X	х	x		х		х		х	x	х	X	х	x														0,758
ELECTIVE LOW-RISK SURGERY																																		
Cholecystectomy for cholelithiasis	х	х	х	х	х	х	х	х	х		х		х	x	х	х	x	х	х											х				0,943
Inguinal or femoral hernia repair	х	x	x	x	x	x	х	x	x		x		х		x	x	x	х	х	х														0,938
Primary hip replacement for arthrosis or arthritis	х	x	x	x	x	x	х	x	x		x		х		x	x	x	х	х	х														0,869
Primary knee replacement for arthrosis or arthritis	х	х	х	х	х	x	х	x	х		x		х		x	х	x	х	х	х														0,820
Transurethral resection of prostate	х	x		x	x	x	x	x	x		x		х		x	x	x	х	x	x														0,868

### **BMJ Open**

## Hospital volume and mortality for 25 types of inpatient treatment in German hospitals – Observational study using complete national data from 2009 to 2014

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Hospital volume and mortality for 25 types of inpatient treatment in German hospitals – Observational study using complete national data from 2009 to 2014

Ulrike Nimptsch, Thomas Mansky

Technische Universität Berlin, Department for Structural Advancement and Quality Management in Health Care, Fraunhoferstr. 33-36, 10587 Berlin, Germany Ulrike Nimptsch research scientist, Thomas Mansky professor

Correspondence to: U Nimptsch ulrike.nimptsch@tu-berlin.de

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All authors have completed the ICMJE uniform disclosure form at www.icmje.org/coi\_disclosure.pdf and declare: no support from any organisation for the submitted work; no financial relationships with any organisations that might have an interest in the submitted work in the previous three years; the Department of Structural Advancement and Quality Management in Health Care, for which the authors work, is an endowed professorship of Helios Kliniken GmbH.

#### **Abstract**

**Objectives** To explore the existence and strength of a relationship between hospital volume and mortality, to estimate minimum-volume thresholds and to assess the potential benefit of centralisation of services.

**Design** Observational population-based study using complete German hospital discharge data (Diagnosis-Related Group Statistics [DRG Statistics]).

**Setting** All acute care hospitals in Germany.

**Participants** All adult patients hospitalised for one out of 25 common or medically important types of inpatient treatment from 2009 to 2014.

Main outcome measure Risk-adjusted in-hospital mortality.

Results Lower in-hospital mortality in association with higher hospital volume was observed in 20 out of the 25 studied types of treatment when volume was categorized in quintiles, and persisted in 17 types of treatment when volume was analysed as a continuous variable. Such a relationship was found in some of the studied emergency conditions and low-risk procedures. It was more consistently present regarding complex surgical procedures. For example, about 22,000 patients receiving open repair of abdominal aortic aneurysm were analysed. In very high volume hospitals risk-adjusted mortality was 4.7% (95% CI 4.1 to 5.4) compared to 7.8% (7.1 to 8.7) in very low volume hospitals. The minimum volume above which risk of death would fall below the average mortality was estimated as 18 cases per year. If all hospitals providing this service would perform at least 18 cases per year one death among 104 (76 to 166) patients could potentially be prevented.

**Conclusions** Based on complete national hospital discharge data the results confirmed volume-outcome relationships for many complex surgical procedures, as well as for some emergency conditions and low-risk procedures. Following these findings, the study identified areas where centralisation would provide a benefit for patients undergoing the specific type of treatment in German hospitals and quantified the possible impact of centralisation efforts.

#### Keywords

Volume-outcome relationship, hospital discharge data, in-hospital mortality, Germany

#### Strengths and limitations of the study

- The strength of this study is the use of current and complete national hospital discharge data, covering virtually every patient who underwent one out of the studied types of treatment during the study period.
- As hospital volumes vary widely among German acute care hospitals this is a proper setting to study volume-outcome relationships.
- In contrast to most other volume-outcome studies, the present approach includes
  the calculation of minimum volume thresholds along with an assessment of the
  possible impact of centralization efforts on the population.
- Within this observational retrospective study the statistical association between volume and outcome was tested upon administrative data.
- As information available from administrative data is limited, it is possible that unmeasured differences in disease severity, comorbidity, or appropriateness of patient selection may partly explain the association between volume and outcome.
- This study did not consider hospital characteristics like teaching status, type of ownership, or location.

#### Introduction

The relationship between hospital volume and patient outcomes has been widely studied. For many inpatient treatments a higher volume was found to be associated with better outcomes, such as for high-risk surgical procedures, medical conditions or elective low-risk surgery. Systematic reviews and meta analyses were conducted to aggregate results into a broader frame of knowledge. However, the heterogeneity of methods used impairs conclusions from meta analyses. In particular, the categorisation of high volume hospitals varies according to the geographical context. Solution of high volume include only samples of patients or are restricted to patients with a specific type of insurance or within a delimited geographic area. Therefore, it is often uncertain if the association of volume and outcome found in one study may be generalizable to the whole population affected, or even to populations in other countries with different health care systems. Finally, studies reporting better outcome in relation to higher volume often lack an assessment of the clinical and policy significance of their findings.

To date, the volume-outcome relationship in Germany has been studied only for few inpatient services, such as pancreatic resection, abdominal aortic aneurysm repair, hip fracture, or treatment of very low birthweight infants. The German acute care hospital market is characterized by a relative overcapacity of hospital beds and high hospitalization rates. Volumes of inpatient treatments vary widely among the about 1,600 German acute care hospitals. In 2004, minimum volume thresholds for specific types of inpatient treatment were established. However, it has been found that many hospitals did not adhere to this regulation, and the debate about the underlying evidence remains controversial. Shows the service of the serv

Efforts to improve quality of care by centralisation of services need to rely on evidence that higher volume is associated with better outcome. Therefore, this study aimed to explore the relation of hospital volume and outcome in the German hospital market by using complete national hospital discharge data. For a broad range of common or medically important inpatient services the existence and strength of a relationship between volume and mortality was analysed. Where lower mortality in relation to higher volume was observed minimum volume thresholds, above which mortality would be reduced, were estimated. Impact measures were calculated to assess the potential benefit of centralisation efforts.

#### **Methods**

#### **Data**

German acute care hospitals are obliged to submit their inpatient discharge data annually to a nationwide database, which is available for research purposes. This database (Diagnosis-Related Group Statistics [DRG Statistics] provided by the Research Data Centres of the Federal Statistical Office and the statistical offices of the 'Länder') contains discharge information on every inpatient episode, covering patients of all types of insurance. Principal and secondary diagnoses are coded according to the German adaptation of the International Classification of Diseases (ICD-10-GM). Procedures are coded according to the German procedure coding system (OPS, Operationen- und Prozedurenschlüssel). Information on sex, age, source of admission, discharge disposition, and length of stay are also included. Based on an anonymized hospital identifier every inpatient episode can be assigned to the treating hospital.<sup>26</sup> The analyses included data of the years 2009 to 2014. Data were accessed via controlled remote data analysis.

#### Patient population

To study a broad range of hospital services five groups of inpatient treatments comprising 25 single conditions or procedures were analysed:

- Common emergency conditions (6)
- Elective heart and thoracic surgery (4)
- Elective major visceral surgery (6)
- Elective vascular surgery (4)
- Elective low-risk surgery (5)

Each type of treatment was defined by specific inclusion and exclusion criteria in order to minimize confounding by differences in case-mix. Treatments for emergency conditions (e.g. acute myocardial infarction) were restricted to direct admissions by excluding patients who had been transferred-in from another acute care hospital. Elective surgical treatments were defined by restriction to certain medical indications (e.g. colorectal resection for carcinoma) or exclusion of complicated constellations (e.g. aortic valve replacement excluding combined other heart surgery). All definitions

refer to adult patients aged 20 years and older. Inclusion and exclusion criteria are listed in Appendix Table 1.

#### **Hospital volume**

Volume of patients treated by a hospital was calculated for each year of observation corresponding to the respective definition of a studied type of treatment. Aiming to compare results in the context of the current literature, hospitals were ranked into quintiles of approximately equal case numbers according to their annual volume. This ranking was done separately for each year for observation, allowing the rank of one hospital to change from one year to another, if volume changed over time.

Additionally, annual hospital volume was analysed as a continuous variable.

Within a sensitivity analysis hospital volume was additionally determined on the basis of wider case definitions in order to fully consider all treatments which might enhance a hospital's experience regarding a specific condition or procedure (e.g., all colorectal resections regardless from medical indication). This approach led to a higher estimation of annual volume per hospital in most cases and resulted in a slightly different ranking of hospitals. Within this analysis restrictions in case definition, as described above, were subsequently applied for outcome measurement.

#### Outcome measure, risk adjustment and statistical analysis

In-hospital mortality, defined as death before discharge, was studied as outcome measure. Observed and risk-adjusted mortality were stratified by volume quintiles.

Risk-adjusted mortality for each volume quintile was calculated by using generalized estimating equations (GEE) with a logit link function, accounting for clustering of patients within hospitals. Using the pooled data of the entire observation period one GEE model was fitted for each studied treatment. Depending on the type of treatment, models included comorbidities, which most likely have been present on admission (e.g. diabetes, chronic liver disease), specific indicators of disease severity (e.g. ST-elevation myocardial infarction), or extension of surgery (e.g. concomitant resection of other visceral organs in patients with pancreatic resection). 5-year age groups, sex, and calendar year of treatment were considered within each model. The

definitions and treatment-specific applications of covariates for risk adjustment are displayed in Appendix tables 2 and 3.

In order to estimate the independent impact of hospital volume on in-hospital mortality, hospital volume was subsequently entered into each model, taken as a categorically variable. Odds ratios for in-hospital death by hospital volume quintile were calculated.

To further explore the relationship between volume and outcome GEE models with volume as a continuous variable were fitted for each treatment. In a first step, hospital volume was taken as the only predictor (simple model). In a second step the treatment-specific covariates, as described above, were entered into the model (full model) and odds ratios for in-hospital death according to an increment of one case, as well as of 50 cases per year were calculated.

Where the regression coefficient of a one-case increment of hospital volume remained statistically significant after consideration of covariates, minimum volume thresholds were estimated from the simple model using Benders Value of Acceptable Risk Limit.<sup>27</sup> This value is calculated from the function of the logistic regression coefficient of hospital volume. It denotes the threshold where mortality is expected to fall below a predefined acceptable risk. The acceptable risk was set to the average mortality of the respective treatment during the observation period.

The clinical relevance of thresholds was assessed by the population impact number (PIN). The PIN was calculated as reciprocal of the difference between the average mortality risk in the entire patient population and the adjusted risk among patients treated by hospitals with volumes above the threshold (population-based risk difference PRD).<sup>28</sup> In the context of this study, the PIN can be interpreted as average number of patients within a treatment group among whom one death is attributable to treatment by a below-threshold volume hospital, due to excess risk of mortality in these hospitals. In other words, among this number of patients one death could hypothetically be prevented if all hospitals providing the respective inpatient service had annual volumes equal or higher than the threshold.

The level of statistical significance was set to .05. The analyses were conducted using SAS Version 9.3 (SAS Institute Inc., Cary, NC, USA).

#### Reporting guideline

Reporting of this analysis adheres to the RECORD (REporting of studies Conducted using Observational Routinely-collected health Data) Statement.<sup>29</sup>

#### **Results**

#### **Common emergency conditions**

Lower in-hospital mortality in association with higher hospital volume was observed in four out of the six studied types of common emergency treatment when volume was categorized in quintiles and persisted in two types of treatment when volume was analysed as a continuous variable.

From 2009 to 2014 nearly 1.1 million patients were treated for acute myocardial infarction (table 1). Risk-adjusted mortality was 8.9% (95% CI 8.8 to 9.0) in the very high volume quintile versus 11.4% (11.3 to 11.6) in the very low volume quintile (figure 1). Adjusted odds ratios of in-hospital death were significantly reduced in the low to very high volume quintiles when compared to the very low volume quintile (table 2). A statistically significant effect of volume on mortality was also observed when volume was analysed as a continuous variable. An increment of 50 cases per year was associated with reduced odds of death (figure 2). The minimum hospital volume where risk of mortality would fall below the average mortality of 9.8% was calculated as 309 cases per year. Stratification by this threshold resulted in a population-based risk difference (PRD) of 0.7% (0.7 to 0.8) and a population impact number (PIN) of 137 (127 to 149, table 3). This means that out of 137 patients hospitalized for acute myocardial infarction one death would be prevented if annual volumes in treating hospitals were at least 309.

In total, 2.3 million patients treated for heart failure were studied. Risk-adjusted mortality was 8.5% (95% CI 8.4 to 8.6) in the very high volume quintile versus 9.2% (9.1 to 9.3) in the very low volume quintile (figure 1). For volume as a continuous variable no association was found after consideration of covariates (table 3).

During the observation period 1.2 million patients were hospitalized for ischemic stroke (table 1). Adjusted mortality in the very high volume quintile was 6.9% (95% CI 6.8 to 7.0) versus 7.3% (7.2 to 7.4) in the very low volume quintile (figure 1). After

consideration of covariates no measurable effect of hospital volume as a continuous variable was observed (table 3).

Among the 1.3 million patients treated for pneumonia (table 1) higher hospital volume was associated with higher in-hospital mortality. Adjusted mortality was 11.5% (95% CI 11.3 to 11.6) in the very high volume quintile, 12.3% (12.2 to 12.5) in the medium volume quintile and 10.8% (10.7 to 10.9) in the very low volume quintile (figure 1), and the odds ratios were higher in the low to very high volume quintiles when compared to the very low volume quintile (table 2). When considered as a continuous variable hospital volume was not associated with mortality (table 3).

For the more than 1.15 million patients with chronic obstructive pulmonary disease (COPD, table 1) adjusted mortality was 3.1% (95% CI 3.0 to 3.2) in the very high volume quintile and 4.3% (4.2 to 4.4) in the very low volume quintile (figure 1). Hospital volume as a continuous variable had an independent effect on mortality (figure 2) and the minimum volume to achieve a lower-than-average risk of death was calculated as 271 patients per year. This threshold was estimated to prevent one death among 170 (158 to 185) COPD patients (table 3).

The analysis of 711,000 patients hospitalized for hip fracture (table 1) revealed slightly higher mortality in low to high volume quintiles when compared to the very low volume quintile (figure 1). Hospital volume as a continuous variable had no effect on mortality (table 3).

#### **Elective heart and thoracic surgery**

For each out of the four studied types of heart and thoracic surgery lower in-hospital mortality in association with higher hospital volume was observed.

From 2009 to 2014 about 52,600 patients were treated with isolated surgical aortic valve replacement (table 1). Adjusted mortality was 2.4% (95% CI 2.1 to 2.7) in the very high volume quintile versus 3.1% (2.8 to 3.4%) in the very low volume quintile (figure 1). Reduced odds of death were found in the medium to very high volume quintiles when compared to the very low volume quintile (table 2). As a continuous variable hospital volume demonstrated an independent effect on mortality (figure 2). The minimum volume to achieve a lower-than-average risk of death was calculated

 as 147 annual treatments. This threshold resulted in a non-significant PRD of 0.2% (-0.02 to 0.3) and a PIN of 516 (288 to 2589, table 3).

In-hospital mortality of the 50,800 patients treated with transcatheter aortic valve replacement (table 1) was 5.2% (95% CI 4.8 to 5.7) in the very high volume quintile versus 7.6% (7.1 to 8.2) in the very low volume quintile (figure 1). Hospital volume as a continuous variable revealed an independent effect on mortality (figure 2) and the minimum volume to fall below the average mortality of 6.6% was calculated as 157 cases per year. Application of this threshold was estimated to prevent one death among 133 (101 to 193) patients (table 3). This means that among 133 patients with transcatheter aortic valve replacement one death would be prevented if all providing hospitals would perform this treatment at least 157 times per year.

184,000 patients were treated with an isolated coronary artery bypass graft (table 1). According to hospital quintiles no constant association of volume and mortality was found (figure 1, table 2). However, an independent effect of hospital volume on mortality was observed when volume was analysed as a continuous variable (figure 2) and the minimum volume to achieve a risk of death below the average of 2.1% was calculated as 475 cases per year. This threshold led to a PIN of 658 (445 to 1271, table 3).

In total, 74,000 patients with partial lung resection for carcinoma were studied (table 1). In the very high volume quintile adjusted mortality was 2.0% (95% CI 1.8 to 2.3) versus 3.8% (3.6 to 4.1) in the very low volume quintile (figure 1). The observed independent effect of hospital volume when analysed continuously resulted in a minimum volume of 108 cases per year. This threshold was estimated to prevent one death among 168 (137 to 217) patients (table 3).

#### **Elective major visceral surgery**

Lower mortality associated with higher hospital volume was found for all six studied types of elective visceral surgery.

During the observation period 331,000 colorectal resections for carcinoma were performed in German hospitals (table 1). Mortality was 5.2% (95% CI 5.0 to 5.4) in the very high volume quintile and 6.6% (6.4 to 6.8) in the very low volume quintile (figure 1). In comparison to the very low volume quintile odds of death were

 statistically significantly reduced in the medium to very high volume quintiles (table 2). Hospital volume as a continuous variable had an independent effect on mortality (figure 2). The minimum volume to achieve a risk of death below the average of 6.0% was calculated as 82 annual treatments, associated with a PIN of 197 (167 to 241, table 3).

179,000 colorectal resections were performed for diverticulosis (table 1). Adjusted mortality was 3.1% (95% CI 2.9 to 3.3) in the very high volume quintile versus 3.9% (3.8 to 4.1) in the very low volume quintile (figure1). Hospital volume as a continuous variable had an independent effect on mortality and a minimum volume of 44 was calculated to achieve a risk of death below the average of 3.5%. This threshold was associated with a PIN of 364 (269 to 564, table 3).

During the observation period 68,000 patients with total nephrectomy for carcinoma were identified (table 1). In the very high volume quintile adjusted mortality was 1.9% (95% CI 1.7 to 2.2) and in the very low volume quintile 2.3% (2.1 to 2.6). The independent effect of hospital volume as a continuous variable demonstrated borderline statistical significance (figure 2) and the minimum volume to achieve lower-than-average mortality was calculated as 40 cases per year. Application of this threshold would prevent one death among 459 (295 to 1056) nephrectomy patients (table 3).

Adjusted mortality among the 44,000 patients receiving cystectomy for carcinoma (table 1) was 4.0% (95% CI 3.6 to 4.4) in the very high volume quintile versus 5.5% (5.0 to 6.0) in the very low volume quintile (figure 1). Continuous increment of hospital volume was independently associated with lower mortality (figure 2). This relation of volume and outcome resulted in a minimum volume of 31 cases per year to fall below the average mortality of 4.7%. Application of this threshold was associated a PIN of 227 (150 to 480, table 3).

Among the 18,000 patients with complex oesophageal surgery for carcinoma adjusted mortality was 5.8% (95% CI 5.1 to 6.6) in the very high volume quintile versus 10.5% (9.5 to 11.6) in the very low volume quintile. As a continuous variable hospital volume had an independent effect on mortality and the minimum volume to fall below the average mortality of 8.5% was calculated as 22 cases per year. If all hospitals would perform at least 22 complex oesophageal surgeries per year one death among 47 (38 to 62) patients could be prevented (table 3).

A pancreatic resection for carcinoma was performed in 35,000 patients in total (table 1). Adjusted mortality was 6.4% (95% CI 5.8 to 7.0) in the very high volume quintile versus 11.7% (10.9 to 12.5) in the very low volume quintile (figure 1). Continuous increment of hospital volume was associated with lower mortality and the minimum volume where risk of death would fall below the average mortality of 8.8% was calculated as 29 cases per year. This threshold resulted in a PIN of 46 (39 to 58, table 3).

#### **Elective vascular surgery**

In three out of the four studied types of elective vascular surgery higher hospital volume was associated with lower in-hospital mortality.

During the observation period 247,000 patients were treated with surgical revascularization of lower extremities for atherosclerosis (table 1). Risk-adjusted mortality was 2.8% (95% CI 2.7 to 3.0) in the very high volume quintile versus 3.3% (3.2 to 3.5) in the very low volume quintile (figure 1). Odds of death were reduced in all other quintiles when compared to the very low volume quintile (table 2). The association of volume and outcome persisted when volume was analysed as continuous variable (figure 2) and the minimum volume to achieve a mortality risk below the average of 3.0% was calculated as 123 cases per year. This led to the estimation that among 561 (387 to 1024) patients one additional death was attributable to treatment by a hospital performing less than 123 of such operations (table 3).

In total, more than 22,000 patients receiving open repair of abdominal aortic aneurysm were analysed (table 1). In the very high volume quintile risk-adjusted mortality was 4.7% (95% CI 4.1 to 5.4) versus 7.8% (7.1 to 8.7) in the very low volume quintile (figure 1). When analysed continuously, higher volume was independently associated with lower mortality (figure 2). The calculated minimum volume where risk would fall below the average of 6.0% was 18 cases per year. The resulting PIN was 104 (76 to 166, table 3).

Among the 42,000 patients treated with endovascular repair of abdominal aortic aneurysm (table 1) risk-adjusted mortality was 1.6% (95% CI 1.3 to 1.9) in the very high volume quintile versus 1.7% (1.4 to 2.0) in the very low volume quintile. Highest mortality was observed in the medium volume quintile (2.1%, 1.8 to 2.4, figure 1).

Odds of death were not significantly different between volume quintiles (table 2). Analysed as continuous variable no statistically significant effect of hospital volume on mortality was observed (figure 2, table 3).

From 2009 to 2014 about 162,000 patients with carotid endarterectomy were identified (table 1). Risk-adjusted in-hospital mortality was 0.75% (95% CI 0.66 to 0.86) in the very high volume quintile and 0.97% (0.87 to 1.07) in the very low volume quintile (figure 1). Continuous increment of hospital volume was independently associated with lower in-hospital mortality (figure 2). A lower-than-average risk of mortality is expected if hospitals perform at least 93 carotid endarterectomies per year. Under this threshold the estimated PIN was 1646 (886 to 12661, table 3).

#### **Elective low-risk surgery**

 In three out of the five studied types of elective low-risk surgery higher hospital volume was found to be associated with lower mortality when volume was categorized in quintiles. In two types of elective low-risk surgery this relation persisted when volume was analysed as a continuous variable.

From 2009 to 2014 nearly 889,000 inpatient cholecystectomies for cholelithiasis were performed in German hospitals (table 1). Risk-adjusted mortality differed not significantly between volume quintiles (figure 1), as well as risk-adjusted odds of death (table 2). Continuous increment of hospital volume was not associated with mortality (table 3).

Among the 897,000 inpatient inguinal or femoral hernia repairs (table 1) mortality in the very high volume quintile was lower (0.07%, 95% CI 0.06 to 0.08) than in the very low volume quintile (0.10%, 0.09 to 0.12, figure 1). Yet, the independent effect of continuous increment of hospital volume was not statistically significant (table 3).

The analysis of more than 881,000 primary hip replacements for arthrosis or arthritis (table 1) revealed a constant association of hospital volume and mortality when patients were stratified by volume quintiles. Risk-adjusted in-hospital mortality was 0.10% (95% CI 0.08 to 0.11) in the very high volume quintile versus 0.23% (0.21 to 0.25) in the very low volume quintile (figure 1). In comparison to the very low volume quintile odds of death were significantly reduced in all other volume quintiles (table 2). Within the analysis of continuous increment of hospital volume an independent

 effect on mortality was observed (figure 2). A minimum volume of 252 cases per year was calculated to achieve a risk of mortality below the average of 0.17%. The PIN resulting from this threshold was 2747 (2186 to 3701, table 3).

Overall 843,000 patients with primary knee replacement for arthrosis or arthritis were identified (table 1). Risk-adjusted mortality was 0.06% (95% CI 0.05 to 0.07) in the very high volume quintile versus 0.13% (0.11 to 0.14) in the very low volume quintile (figure 1). Continuous increment of hospital volume was independently associated with lower mortality (figure 2) and 228 annual cases were calculated as the minimum volume where risk of mortality would fall below the average of 0.10%. This minimum volume threshold resulted in an estimation of one preventable death among 4729 (3513 to 7269) primary knee replacement patients if all hospitals would perform at least 228 such operations per year (table3).

In total, 434,000 patients with transurethral resection of prostate were studied (table 1). No statistically significant differences in in-hospital mortality were found when patients were stratified by hospital volume quintiles (figure 1, table 2) and there was no significant association of hospital volume and mortality when volume was analysed continuously (table 3).

#### Sensitivity analysis

Within the sensitivity analysis hospital volume was determined more widely by considering all those treatments or procedures, which could be regarded as technically similar to the specific treatment for which outcome was measured. The specific restrictions for the purpose of outcome measurement were applied after determining volume. Using this divergent volume definition results remained substantially unchanged in 23 out of the 25 studied types of treatments.

Different findings were observed regarding isolated coronary artery bypass graft, where the relation of volume and mortality was more pronounced when all related procedures (i.e., coronary bypass grafts in patients with acute myocardial infarction or combined with other heart surgery instead of elective isolated coronary operations only) were considered for determination of hospital volume. Different from the findings in the main analysis higher volume was constantly associated with lower mortality when patients were stratified by these volume quintiles.

The volume-outcome association in colorectal resections for diverticulosis diminished when hospital volume was determined by considering all colorectal resections, regardless from medical indication. In contrast to the results of the main analysis, no statistically significant relation between volume and outcome was observed under this approach.

#### Discussion

Lower in-hospital mortality in association with higher hospital volume was observed in 20 out of the 25 studied types of treatment when volume was categorized in quintiles, and persisted in 17 types of treatment when volume was analysed as a continuous variable. While a volume-outcome relationship was not found in all studied emergency conditions and low-risk procedures, it was more consistently present regarding complex surgical procedures. The potential benefit of a centralisation according to the calculated minimum volume thresholds varied depending on the treatment-specific risk of death and the strength of the association between volume and mortality.

The analysis included every patient who underwent one of the studied types of inpatient treatment in a German acute care hospital during the observation period. Limitations occur from the limited information available in administrative data. including lack of information on appropriateness of patient selection for procedures. Although types of treatment and covariates for risk adjustment were defined in a sophisticated way, it is possible that unmeasured differences in disease severity, comorbidity, or appropriateness may partly explain the association between volume and outcome. However, it should be considered that the more severe patients should intentionally not be treated by low-volume hospitals. Elective types of treatment were either defined by exclusion of patients with diagnoses pointing to an emergency admission, or potential emergency diagnoses were considered within the risk adjustment models. However, this approach might not have fully separated elective admissions. The analyses could focus hospital volume only because physician volumes are not available in German administrative data. Regarding the determination of hospital volume, a possible misclassification of multi-campus hospitals as high volume providers must be taken into account, resulting in a possible

 underestimation of the association between hospital volume and mortality.<sup>30</sup> Finally, this study did not consider hospital characteristics like teaching status, type of ownership, or location.

Inpatient treatments for emergency conditions revealed mixed results. Associations between higher hospital volume and lower mortality were found for treatment of acute myocardial infarction, heart failure, ischemic stroke, and chronic obstructive pulmonary disease. These results are similar to findings of previous studies from other countries. <sup>6-7, 31-36</sup> Regarding the treatment of patients with pneumonia the analysis revealed higher mortality in hospitals with higher volumes. A similar finding has been reported by one previous US study, <sup>37</sup> while another more recent US study found higher hospital volume being associated with lower mortality. <sup>6</sup> No constant relation between volume and outcome was observed in hip fracture patients, similar to findings from a recent US study. <sup>38</sup> However, a previous German study, which was based on national discharge data as well, but focussed an earlier time period and surgically treated hip fracture patients only, found lower mortality related to higher hospital volumes. <sup>19</sup> An Italian study observed a volume-outcome relation in hip fracture patients, too. <sup>36</sup>

An association of lower mortality and higher hospital volume was observed for each studied type of elective heart and thoracic surgery. These findings correspond to those from several European and US studies. <sup>3, 5, 14, 36, 39-41</sup> In the present study, a more pronounced volume-outcome association was found for lung resection than for the studied types of heart surgery. This might be explained by an already quite high degree of centralization of heart surgery services in Germany.

The analysis of major visceral surgery treatments revealed the most pronounced associations between volume and mortality, e.g. regarding oesophageal surgery, cystectomy, or pancreatic resection for carcinoma. These results are well-supported by international evidence of a strong volume-outcome association in complex visceral surgery.<sup>3, 11-12, 17-18, 42-46</sup>

In the case of vascular surgery, the analyses demonstrated lower mortality in association with higher hospital volume for lower extremity revascularization, carotid endarterectomy and open repair of abdominal aortic aneurysm, in accordance to findings from the international literature. <sup>3, 5, 36, 47-48</sup> A volume-outcome relation for abdominal aortic aneurysm repair (open, endovascular, or totally percutaneous) had

 been demonstrated by a previous German study based on national discharge data.<sup>19</sup> In the present study, however, endovascular repair of abdominal aortic aneurysm was analysed separately and no significant relationship between volume and mortality was observed. This finding is in contrast to one study from the US,<sup>49</sup> while a more recent US study found no significant association.<sup>5</sup>

Among the studied types of elective low-risk surgery lower mortality associated with higher volume was found for primary knee and hip replacement, supported by international findings. <sup>8, 51-54</sup> However, no such relation was observed for cholecystectomy, similar to one study from England, <sup>55</sup> but in contrast to studies from Italy and Scotland, which found a modest association between volume and outcome in cholecystectomy patients. <sup>36, 10</sup> The effect of volume on mortality observed in patients undergoing inguinal or femoral hernia repair was small. Studies from the US and Sweden reported a volume-outcome relation for hernia repair, but focussed different outcomes (hernia recurrence or reoperation rates) and determined volume rather on the surgeon level. <sup>56-57</sup> Regarding transurethral resection of prostate no association between hospital volume and mortality was found. This confirms the findings of a Japanese study which found an association regarding complication and blood transfusion rates, but not regarding mortality. <sup>58</sup>

Overall, the results of the present study seem plausible in view of the current literature. Discrepancies to findings from other studies might be caused by differences in completeness of data or alternative methodological approaches, e.g. regarding case definitions, or volume determination. However, it is also possible that an association between volume and outcome is more or less existent in different countries, depending on characteristics of a health care system and hospital market structures.<sup>39</sup>

Minimum volume thresholds were calculated for those treatments, in which the association of volume and mortality persisted when volume was analysed as a continuous variable, which provides a strong indication that such an association truly exists. The highest population impact of centralisation according to the calculated thresholds was estimated for oesophageal surgery and pancreatic resection for carcinoma. Compared to this, the potential for improvement might appear small in the case of treatments with a basically low risk of mortality. However, one should consider that risk of mortality is likely correlated with the occurrence of non-lethal

adverse events, in particular with regard to low-risk procedures. Thus, possible improvements of patient safety by centralisation might reach beyond effects on mortality.

When interpreting the findings of this study, one should note that observational studies cannot proof a causal volume-outcome relation. In consequence, this retrospective observational study cannot provide evidence that an application of the calculated thresholds as minimum volumes would actually improve quality of care. Therefore, the threshold values are meant to serve as basic orientation points for policy decisions in Germany and as hypothesis-generating landmarks for further research. Although estimated rather conservatively, roughly 80 to 90% of hospitals providing a specific treatment performed annual volumes below the respective threshold, and between 50% (acute myocardial infarction) and 70% (pancreatic resection for carcinoma) of patients were treated by those hospitals. Policy decisions on centralisation of services cannot rely on testing a statistical association upon observational data, alone. As well, the regional availability and accessibility of inpatient services must be considered, in particular regarding emergency treatments. Centralisation should be pushed primarily in oversupplied geographic regions. However, experiences from the Netherlands have demonstrated that centralisation of inpatient services improved national outcome.<sup>59</sup>

A previous German study concluded that full implementation of the existing minimum volume regulation could improve the quality of hospital care in Germany.<sup>24</sup> In addition to this, the present study identified further areas where centralisation could provide a benefit for patients, and quantified the possible impact of centralisation efforts by using complete national hospital discharge data. These findings might support future policy decisions in Germany.

#### **Author's contribution**

Ulrike Nimptsch designed the study, conducted the analysis, interpreted the data and drafted the manuscript. Thomas Mansky contributed to the study design, to the interpretation of data and to revising the manuscript critically for important intellectual content. Both authors gave final approval of the version to be published and agree to be accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved.

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Table 1 No. of patients and hospitals by volume quintile

Hospital volume quintile

Common Number   Common Numbe						'	ноѕрітаі	volume quin	tile			
Part			Ve	ery low		Low	M	ledium	ı	ligh	V	ery high
Part	COMMON EMERGENCY			040.470		040.004		040 400		040 770		000 005
Heart failure   No. of hospitals   10		No. of hospitals	43	763	184	198	303	121	412	88	594	54
No. of patients   No. of pat	Heart failure	No. of hospitals	139	608	290	263	418	184	570	136	804	87
No. of patients   258,016   257,088   258,010   228,0151   299,331   44   394   394   279   394   47   394   594   275	Ischemic stroke	No. of patients No. of hospitals		244,125 915		244,272 155		244,299 96		243,725 70		246,858 42
Median annual volume (I/CR)	Pneumonia	No. of patients	28	258,016	259	257,688	421	258,010	5//	258,051	805	259,391
Chronic Obstructive   Modin annual volume (IQR)   57   361   2		Median annual volume (IQR)	73	(25 - 107)	167	(150 - 183)	229	(211 - 249)	304	(279 - 331)	447	(396 - 523)
Figure   No. of hospitals   Record		No. of hospitals	67	612	144	264	209	182	299	125	546	61
	Hip fracture	No. of hospitals	40	609	101	232	407	172	170	133	044	88
Solated surgical aortic   No. of patients   No. of pospitals   No. of pospitals   No. of pospitals   No. of patients	ELECTRIC LIEADT AND		43	(6 - 64)	101	(93 - 110)	137	(128 - 146)	1/6	(164 - 190)	244	(221 - 283)
No. of hospitals   No. of patients   No. of patients   No. of hospitals   No. of hospit				10.275		10.238		10.627		10.066		11.397
Valve replacement   No. of hospitals   48		No. of hospitals	54	33	100,5	17	132	14	172	10	246	7
Solated coronary artery bypass graft   Solated coronary   Solated coronary artery bypass graft   Solated coronary   Solated coronary artery bypass graft   Solated coronary   Solated coronary artery bypass graft   Solated coronary   Solated		No. of hospitals		48		17		12		9		6
Solated coronary artery    No. of hospitals bypass graft	·		31	. ,	98		141		169	. ,	286	. ,
Parlial fully festection for carcinoma   No. of inospitals   Section   Sec		No. of hospitals	120	48	353	18	436	14	561	11	729	8
Colorectal resection for carcinoma   No. of patients   No. of hospitals   No. of hospit		No. of hospitals	5	260	49	48	89	27	137	17	272	9
No. of hospitals	ELECTIVE MAJOR VISC	ERAL SURGERY										
No. of hospitals   No. of hosp		No. of hospitals	23	492	50	218	72	153	97	112	141	71
Total nephrectomy for carcinoma		No. of hospitals	13	487	28	215	39	154	52	114	74	73
No. of patients   No. of hospitals   No. of hospi		No. of patients No. of hospitals		13,582 307		13,569 90		13,570 65		13,600 47		13,766 31
No. of patients   Section   Sectio		No. of patients	5	8,706	25	8,702	35	8,761	48	8,734	67	8,832
No. of hospitals surgery for carcinoma   No. of hospitals surgery for carcinoma   No. of hospitals surgery for carcinoma   No. of hospitals   No			9		18		26		36		57	
Pancreatic resection for carcinoma  No. of patients No. of hospitals 322 1117 71 41 117 71 41 117 71 41 117 71 41 117 71 41 117 71 41 117 71 71 71 71 71 71 71 71 71 71 71 7		No. of hospitals		228	_	71		43		23		10
Carotinoma		No. of patients	2	6,886	8	6,915	14	6,880	25	6,854	54	7,020
Surgical lower extremity revascularization for atterescence atterescence and executarization for atterescence at			3		10		16		27		57	
revascularization for atherosclerosis         No. of hospitals Median annual volume (IQR)         348 (7-39)         113 (95-80)         79 (95-112)         143 (131-158)         210 (185-243)           Open repair of abdominal aortic aneurysm         No. of hospitals         4,422 (4,425)         4,430 (4,420)         4,420 (4,530)           Endovascular repair of abdominal aortic aneurysm         No. of hospitals         239 (1-4) (9 (7-10))         15 (13-17)         21 (19-25)         39 (33-46)           Endovascular repair of abdominal aortic aneurysm         No. of patients         8,281 (3,88)         8,288 (3,09)         8,462 (2,40)           Abdominal aortic aneurysm         No. of hospitals         219 (15-19)         81 (50)         34 (20)           Median annual volume (IQR)         6 (3-9) (15-19)         26 (24-30)         40 (36-45)         64 (57-75)           No. of patients (32,345)         32,345         32,460         32,401         33,081           Carotid endarterectomy         No. of hospitals         317         101         67         47         30	ELECTIVE VASCULAR S	BURGERY										
Open repair of abdominal aortic         No. of patients         4,422 by 323 by	revascularization for	No. of hospitals	21	348	72	113	102	79	143	57	210	37
Endovascular repair of abdominal aortic aneurysm No. of patients No. of hospitals 219 81 52 34 20 No. of hospitals 32,345 32,267 32,460 32,017 33,081 No. of hospitals 317 101 67 47 30	Open repair of	No. of patients No. of hospitals		4,422		4,425		4,430		4,420		4,530
abdominal aortic aneurysm No. of hospitals 219 81 52 34 20 aneurysm No. of patients 32,345 32,267 32,460 32,017 33,081 Carotid endarterectomy No. of hospitals 317 101 67 47 30	•	,	3		9	. ,	15	. ,	21	,	39	, ,
Carotid endarterectomy No. of hospitals 317 101 67 47 30	abdominal aortic	No. of hospitals	6	219	17	81	26	52	40	34	64	20
	Carotid endarterectomy	No. of hospitals	16	317	52	101	80	67	113	47	165	30

#### Table 1 (continued)

ELECTIVE LOW-RISK SU	JRGERY										
Cholecystectomy for cholelithiasis	No. of patients No. of hospitals Median annual volume (IQR)	71	177,346 450 (44 - 91)	128	177,411 232 (118 - 137)	166	177,835 178 (157 - 176)	210	177,199 140 (196 - 224)	286	178,752 94 (264 - 331)
Inguinal or femoral hernia repair	No. of patients No. of hospitals Median annual volume (IQR)	68	178,992 471 (45 - 86)	120	179,169 247 (111 - 129)	160	179,285 186 <i>(150 - 171)</i>	208	179,338 142 (194 - 224)	312	179,911 84 (274 - 377)
Primary hip replacement for arthrosis or arthritis	No. of patients No. of hospitals Median annual volume (IQR)	49	175,918 608 (25 - 71)	128	175,797 226 (111 - 146)	213	176,313 135 (190 - 242)	351	175,834 82 (314 - 388)	619	177,287 42 (522 - 768)
Primary knee replacement for arthrosis or arthritis	No. of patients No. of hospitals Median annual volume (IQR)	56	168,312 517 (36 - 75)	125	168,479 222 (112 - 140)	195	168,415 143 (176 - 215)	291,5	168,015 94 (267 - 324)	477	169,623 51 (421 - 632)
Transurethral resection of prostate	No. of patients No. of hospitals Median annual volume (IQR)	60	86,404 247 (23 - 92)	139	86,934 104 (128 - 150)	186	86,199 77 (172 - 199)	243	86,967 59 (227 - 262)	331	87,412 40 (303 - 380)

No. of hospitals: Mean number of hospitals in quintile per year providing the respective inpatient service; IQR: interquartile range within the quintile (due to data protection regulations the minimum and maximum values cannot be displayed).



#### Table 2 Odds ratios of in-hospital death according to volume quintile

Hospital volume quintile

						ospitai voiume	quintile			
		Very low		Low		Medium		High	٧	ery high
COMMON EMERGENCY CONDITION		4.00	0.00		0.74		0.70		0.74	
Acute myocardial infarction	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.82 * 0.84	(0.81 to 0.87)	0.74 * 0.75	(0.72 to 0.78)	0.72 * 0.73	(0.7 to 0.76)	0.71 * 0.69	(0.66 to 0.72)
Heart failure	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.95 0.99	(0.96 to 1.01)	0.89 * 0.96	(0.93 to 0.99)	0.87 * 0.95	(0.92 to 0.98)	0.81 * 0.91	(0.88 to 0.94)
Ischemic stroke	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.77 * 0.90	(0.87 to 0.94)	0.70 * 0.87	(0.83 to 0.9)	0.70 * 0.94	(0.91 to 0.98)	0.72 * 0.94	(0.91 to 0.98)
Pneumonia	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.09 1.10	(1.07 to 1.13)	1.16 1.17	(1.14 to 1.21)	1.12 1.13	(1.09 to 1.16)	1.08 1.08	(1.04 to 1.11)
Chronic obstructive pulmonary disease	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.06 1.09	(1.06 to 1.14)	1.04 1.08	(1.04 to 1.12)	0.91 * 0.94	(0.90 to 0.98)	0.66 * 0.70	(0.65 to 0.75)
Hip fracture	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.06 1.07	(1.03 to 1.12)	1.06 1.07	(1.03 to 1.11)	1.07 1.10	(1.06 to 1.15)	1.00 1.01	(0.97 to 1.06)
ELECTIVE HEART AND THORACIO	CSURGERY									
Isolated surgical aortic valve replacement	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.90 0.87	(0.69 to 1.10)	0.80 * 0.78	(0.62 to 0.99)	0.74 * 0.69	(0.54 to 0.87)	0.74 * 0.77	(0.61 to 0.97)
Transcatheter aortic valve replacement	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.97 0.98	(0.69 to 1.1)	0.90 * 0.87	(0.62 to 0.99)	0.78 * 0.79	(0.54 to 0.87)	0.64 * 0.65	(0.61 to 0.97)
Isolated coronary artery bypass graft	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.93 0.98	(0.81 to 1.17)	1.03 1.08	(0.90 to 1.28)	0.73 * 0.82	(0.68 to 0.99)	0.70 0.92	(0.76 to 1.11)
Partial lung resection for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.71 * 0.77	(0.67 to 0.90)	0.68 * 0.73	(0.63 to 0.85)	0.52 * 0.58	(0.50 to 0.69)	0.37 * 0.49	(0.41 to 0.58)
ELECTIVE MAJOR VISCERAL SUF	RGERY									
Complex oesophageal surgery for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.83 * 0.81	(0.68 to 0.96)	0.81 0.85	(0.72 to 1.01)	0.62 * 0.67	(0.56 to 0.82)	0.51 * 0.47	(0.38 to 0.58)
Pancreatic resection for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.76 * 0.80	(0.71 to 0.92)	0.66 * 0.68	(0.59 to 0.77)	0.52 * 0.54	(0.46 to 0.62)	0.46 * 0.46	(0.39 to 0.54)
Colorectal resection for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.92 0.97	(0.91 to 1.02)	0.77 * 0.85	(0.80 to 0.90)	0.72 * 0.83	(0.78 to 0.88)	0.63 * 0.75	(0.70 to 0.80)
Colorectal resection for diverticulosis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.86 * 0.87	(0.80 to 0.95)	0.77 * 0.87	(0.79 to 0.95)	0.65 * 0.80	(0.72 to 0.88)	0.60 * 0.74	(0.67 to 0.82)
Total nephrectomy for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.92 0.95	(0.79 to 1.13)	0.87 0.89	(0.75 to 1.06)	0.75 * 0.78	(0.64 to 0.94)	0.80 * 0.80	(0.67 to 0.97)
Cystectomy for carcinoma	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.85 * 0.85	(0.73 to 0.98)	0.89 0.86	(0.74 to 1.00)	0.80 * 0.80	(0.69 to 0.93)	0.70 * 0.69	(0.58 to 0.82)
<b>ELECTIVE VASCULAR SURGERY</b>										
Surgical lower extremity revas- cularization for atherosclerosis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.86 * 0.88	(0.81 to 0.96)	0.80 * 0.85	(0.78 to 0.94)	0.73 * 0.82	(0.75 to 0.9)	0.75 * 0.82	(0.75 to 0.91)
Open repair of abdominal aortic aneurysm	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.67 * 0.71	(0.59 to 0.84)	0.73 * 0.76	(0.63 to 0.91)	0.62 * 0.60	(0.50 to 0.72)	0.52 * 0.55	(0.45 to 0.68)
Endovascular repair of abdominal aortic aneurysm	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.77 0.81	(0.63 to 1.04)	1.17 1.26	(1.00 to 1.59)	0.80 0.93	(0.72 to 1.19)	0.82 0.91	(0.68 to 1.21)
Carotid endarterectomy	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.85 0.92	(0.77 to 1.09)	0.81 0.89	(0.75 to 1.05)	0.82 0.90	(0.76 to 1.06)	0.66 * 0.77	(0.64 to 0.93)
ELECTIVE LOW-RISK SURGERY										
Cholecystectomy for cholelithiasis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.97 0.98	(0.87 to 1.09)	1.00 1.06	(0.95 to 1.19)	0.98 1.07	(0.95 to 1.19)	0.84 0.95	(0.85 to 1.08)
Inguinal or femoral hernia repair	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.88 0.94	(0.77 to 1.14)	0.75 0.90	(0.72 to 1.11)	0.66 0.83	(0.66 to 1.04)	0.43 * 0.66	(0.51 to 0.86)
Transurethral resection of prostate	Crude OR Adjusted OR (95% CI)	1.00 1.00	1.11 1.06	(0.89 to 1.25)	1.18 1.11	(0.93 to 1.32)	1.13 1.08	(0.90 to 1.28)	0.92 0.98	(0.82 to 1.18)
Primary hip replacement for arthrosis or arthritis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.78 * 0.87	(0.75 to 1.00)	0.56 * 0.70	(0.60 to 0.82)	0.48 * 0.67	(0.56 to 0.79)	0.27 * 0.41	(0.33 to 0.51)
Primary knee replacement for arthrosis or arthritis	Crude OR Adjusted OR (95% CI)	1.00 1.00	0.79 0.84	(0.69 to 1.02)	0.68 * 0.76	(0.62 to 0.94)	0.59 * 0.68	(0.54 to 0.85)	0.35 * 0.45	(0.34 to 0.58)

<sup>\*</sup> Statistically significant lower than reference category (very low volume). Covariates used for risk adjustment are displayed in Appendix table 3.

Table 3 Minimum volume threshold estimation and assessment of population impact

	·	regressio hospital v le model		s of	Minimum volu		Average mortality in		sted mortality blume ≥ VARL	PRD Population-based risk	PIN Population impact
	β	р	β	р		(95% CI)	population		(95% CI)	difference (95% CI)	number (95% CI)
COMMON EMERGENCY CONDITIONS											
Acute myocardial infarction	-0.0003	<.001	-0.0003	<.001	309	(288 to 330)	9.8%	9.1%	(9.0 to 9.2)	0.7% (0.7 to 0.8)	137 (127 to 149)
Heart failure	-0.0001	0.001	0.0000	0.358	-		8.9%				
Ischemic stroke	-0.0002	0.000	0.0000	0.025	-		6.9%				
Pneumonia	0.0000	0.003	0.0000	<.001	-		11.6%				
Chronic obstructive pulmonary disease	-0.0003	0.039	-0.0002	0.026	271	(240 to 301)	4.2%	3.6%	(3.5 to 3.6)	0.6% (0.5 to 0.6)	170 (158 to 185)
Hip fracture	0.0000	0.138	0.0000	0.828	-		5.5%				
ELECTIVE HEART AND THORACIC SURGERY											
Isolated surgical aortic valve replacement	-0.0014	0.001	-0.0010	0.039	147	(111 to 182)	2.6%	2.4%	(2.2 to 2.6)	0.2% (0.0 to 0.3)	516 (288 to 2589)
Transcatheter aortic valve replacement	-0.0024	<.001	-0.0017	<.001	157	(142 to 171)	6.6%	5.8%	(5.5 to 6.2)	0.8% (0.5 to 1.0)	133 (101 to 193)
Isolated coronary artery bypass graft	-0.0007	<.001	-0.0003	0.024	475	(430 to 521)	2.1%	2.0%	(1.9 to 2.1)	0.2% (0.1 to 0.2)	658 (445 to 1271)
Partial lung resection for carcinoma	-0.0034	<.001	-0.0025	<.001	108	(95 to 120)	2.9%	2.3%	(2.1 to 2.5)	0.6% (0.5 to 0.7)	168 (137 to 217)
ELECTIVE MAJOR VISCERAL SURGERY											
Colorectal resection for carcinoma	-0.0023	<.001	-0.0014	<.001	82	(76 to 88)	6.0%	5.4%	(5.3 to 5.5)	0.5% (0.4 to 0.6)	197 (167 to 241)
Colorectal resection for diverticulosis	-0.0049	<.001	-0.0025	0.003	44	(38 to 49)	3.5%	3.2%	(3.1 to 3.4)	0.3% (0.2 to 0.4)	364 (269 to 564)
Total nephrectomy for carcinoma	-0.0032	0.012	-0.0029	0.047	40	(24 to 56)	2.1%	1.9%	(1.7 to 2.0)	0.2% (0.1 to 0.3)	459 (295 to 1056)
Cystectomy for carcinoma	-0.0054	<.001	-0.0055	<.001	31	(23 to 39)	4.7%	4.3%	(4.0 to 4.6)	0.4% (0.2 to 0.7)	227 (150 to 480)
Complex oesophageal surgery for carcinoma	-0.0105	<.001	-0.0111	<.001	22	(17 to 28)	8.5%	6.3%	(5.7 to 6.9)	2.1% (1.6 to 2.6)	47 (38 to 62)
Pancreatic resection for carcinoma	-0.0049	<.001	-0.0045	0.001	29	(21 to 37)	8.8%	6.6%	(6.2 to 7.2)	2.2% (1.7 to 2.6)	46 (39 to 58)
ELECTIVE VASCULAR SURGERY											
Surgical lower extremity revascularization for atherosclerosis	-0.0011	<.001	-0.0007	<.001	123	(102 to 144)	3.0%	2.8%	(2.7 to 2.9)	0.2% (0.1 to 0.3)	561 (387 to 1024)
Open repair of abdominal aortic aneurysm	-0.0129	<.001	-0.0112	<.001	18	(14 to 23)	6.0%	5.0%	(4.6 to 5.5)	1.0% (0.6 to 1.3)	104 (76 to 166)
Endovascular repair of abdominal aortic aneurysm	-0.0031	0.014	-0.0028	0.069	-		1.7%				
Carotid endarterectomy	-0.0021	<.001	-0.0014	<.001	93	(69 to 116)	0.87%	0.81%	(0.74 to 0.88)	0.06% (0.01 to 0.11)	1646 (886 to 12661)
ELECTIVE LOW-RISK SURGERY											
Cholecystectomy for cholelithiasis	-0.0003	0.008	-0.0001	0.425	-		0.43%				
Inguinal or femoral hernia repair	-0.0019	0.009	-0.0007	0.212	-		0.09%				
Primary hip replacement for arthrosis or arthritis	-0.0020	<.001	-0.0013	<.001	252	(227 to 278)	0.17%	0.13%	(0.12 to 0.14)	0.04% (0.03 to 0.05)	2747 (2186 to 3701)
Primary knee replacement for arthrosis or arthritis	-0.0020	<.001	-0.0016	<.001	228	(190 to 265)	0.10%	0.07%	(0.07 to 0.08)	0.02% (0.01 to 0.03)	4729 (3513 to 7269)
Transurethral resection of prostate	-0.0003	0.130	-0.0001	0.740	-		0.36%				

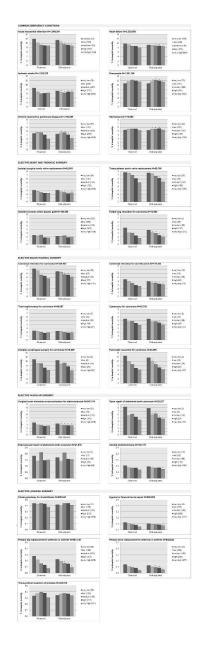
Logistic regression coefficients of hospital volume relate to an increment of 1 case per year. CI: Confidence interval.

VARL: Value of acceptable risk limit (Bender 1999), calculated from the logistic regression coefficient of the simple model. It estimates a minimum volume threshold to achieve a risk of in-hospital mortality which is lower than a predefined acceptable risk. The acceptable risk for each treatment was set to the average mortality in the respective patient population during the observation period. The population impact number PIN is the reciprocal of the difference between the average mortality in the patient population and the adjusted mortality in those patients treated by hospitals with volumes above the threshold (population-based risk difference PRD). It can be interpreted as average number of the entire patient population among whom one death is attributable to treatment by a below-threshold volume hospital. Covariates used for risk adjustment are displayed in Appendix table 3.

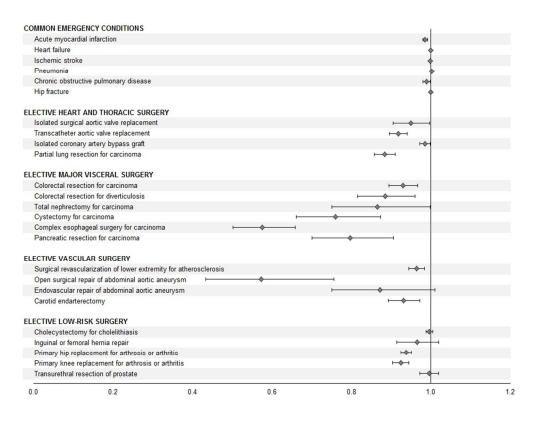
#### Figure 1 Observed and risk-adjusted in-hospital mortality by hospital volume quintile

\* Statistically significant lower than very low volume quintile. + Statistically significant higher than very low volume quintile. Numbers displayed in the legend of each graph denote the median annual hospital volume within the respective volume quintile. Covariates used for risk adjustment are displayed in Appendix table 3.





Observed and risk-adjusted in-hospital mortality by hospital volume quintile  $104 x 337 mm \; (300 \; x \; 300 \; DPI)$ 



Adjusted odds ratios of in-hospital death according to an increment of hospital volume of 50 cases per year  $80x61mm (300 \times 300 DPI)$ 

# Hospital volume and mortality for 25 types of inpatient treatment in German hospitals – Observational study using complete national data from 2009 to 2014

#### Appendix table 1 Inclusion and exclusion criteria for case definition

	Inclusion	Exclusion
COMMON EMERGENCY CONDITIONS	PD 104 100 15 4 4 5 5	
Acute myocardial infarction	PD I21 I22; direct admission	
Heart failure Ischemic stroke	PD I50 I110 I130 I132; direct admission PD I63; direct admission	
Pneumonia Pneumonia	PD A481 J100 J110 J12 J13 J14 J15 J16 J17 J18; direct admission	SD U6900 (nosocomial acquired pneumonia)
Chronic obstructive pulmonary disease	PD J44; direct admission	
Hip fracture	PD S720 S721; direct admission	
ELECTIVE HEART AND THORACIC SU	RGERY	
Isolated surgical aortic valve replacement	OPS 53510	OPS 53502 53503 53504 53505 53506 53507 5350x 5350y 53511 53512 53513 53514 5351x 5351x 5351y 53521 53522 53523 5352y 53531 53532 53533 53534 53535 5353x 5353x 5353x 5358x 5358x 5358x 5358x 5368x 5368x 5380 5380 53801 53823 53823 53823 53845 5358x 5358x 5358x 5368x 53805 5380 53801 53801 538023 53823 53845 53845 53845 53847 53848 53823 53823 53823 53840 53841 538412 53841x 53841 538422 53842x 538431 538432 53843x 53844 5355 5356 5357 5359 5371 53725 53732 53733 53734 53735 53736 53737 53738 5373x 5373x 5375 5376 (ofther heart surgery); OPS 53500 (transcatheter aortic valve replacement); PD I33 I38 I39 (endocarditis)
Transcatheter aortic valve replacement	OPS 535a0	
Isolated coronary artery bypass graft	OPS 536	OPS 5350 5351 5352 5353 5354 5358 535a 5379a 5379b 538a0 538a1 538233 53823x 53845 53846 53847 5384x 5384y 53847 538423 53823 538401 538402 53840x 538411 538412 53841x 538421 538422 53842x 538431 538432 53843x 53844 5355 5356 5357 5359 5371 53725 53732 53733 53734 53735 53736 53737 53738 5373x 5373y 5375 537a (other heart surgery); PD I21, I22 (acute myocardial infarction)
Partial lung resection for carcinoma	OPS 5321 5322 5323 5324 5325; PD or SD C34 D022	OPS 5327 5328 (pneumonectomy)
ELECTIVE MAJOR VISCERAL SURGER	YY .	
Colorectal resection for carcinoma	OPS 5455 5456 5458 5484 5485; PD or SD C18 C19 C20 C218 D010 D011 D012	
Colorectal resection for diverticulosis	OPS 5455 5456 5458 5484 5485; PD K572 K573 K574 K575 K578 K579	SD C18 C19 C20 C218 D010 D011 D012 (colorectal carcinoma)
Total nephrectomy for carcinoma	OPS 55544 55545 55546 55547 5554a 5554b 5554x 5554y; PD or SD C64 C65 C66	OPS 55547 55549 5555 (post mortem resection, graft resection, donor resection or transplantation of kidney)
Cystectomy for carcinoma	OPS 5576 56870 56872 56873; PD or SD C67 D090 D414	
Complex oesophageal surgery for carcinoma	OPS 5423 5424 5425 5426 54270 54271 54380 54381 5438x; PD or SD C15 C160	
Pancreatic resection for carcinoma	OPS 5521 5522 5523 5524 5525; PD or SD C25 C241	OPS 55253 55254 5528 (post mortem resection, graft resection, or transplantation of pancreas)
ELECTIVE VASCULAR SURGERY		
Open repair of unruptured abdominal aortic aneurysm	OPS 538233 53823x 53845 53846 53847 5384x 5384y; PD or SD I7100 I7101 I7102 I7103 I712 I714 I716 I719	PD or SD I7104 I7105 I7106 I7107 I711 I713 I715 I718 (ruptured aortic aneurysm); OPS 538230 538232 53840 53841 53842 53843 53844 53848 538a7 538a8 538a6 538ab (surgical repair of thoracic aortic aneurysm); OPS 538a0 538a1 (endovascular repair of abdominal aortic aneurysm)
Endovascular repair of unruptured abdominal aortic aneurysm	OPS 538a0 538a1; PD or SD I7100 I7101 I7102 I7103 I712 I714 I716 I719	PD or SD I7104 I7105 I7106 I7107 I711 I713 I715 I718 (ruptured aortic aneurysm); OPS 538230 538232 53840 53841 53842 53843 53844 53848 538a7 538a8 538aa 538ab (surgical repair of thoracic aortic aneurysm)
Surgical lower extremity revascularization for atherosclerosis	OPS 53805 53807 53808 53815 53817 53818 538253 538254 538255 538254 538255 538255 538255 538255 538355 538355 538355 538355 53835 538355 538355 538355 538355 538355 538355 538355 538355 538355 538355 538345 539342 539342 539343 539344 539345 539345 539347 539347 539345 539355 539555 539555 539555 539555 539555 53955 539555 539555 5395	OPS 538233 53823x 53845 53846 53847 5384x 5384y 538a0 538a1 538230 538232 53840 53841 53842 53843 53844 53848 538a7 538a8 538aa 538ab 5335 5375 5504 5528 5555 (repair of aortic aneurysm, solid organ transplantation); PD or SD 1723 1724 1728 1729 174 T823 T824 T825 T827 T828 T829 (arterial dissection, aneurysm or embolism, complication of stent prosthesis)
Carotid endarterectomy	OPS 53800 53810 53820 53830 538c01 53950 53970	OPS 535 536 5370 5371 5372 5373 5374 5375 53791 53796 53797 53798 53799 5379a 5379b 5379c 537620 537621 537630 537631 537640 537641 537650 537651 537660 537661 537660 537661 537660 537661 537660 537661 537660 537661 537690 537691 537691 537694 53763 53823 53823 53845 53845 53847 53848 53847 53848 53847 53848 53845 53845 53845 53845 53845 53845 53845 53845 53845 53845 53845 53845 53825 53

#### Appendix table 1 (continued)

ELECTIVE LOW-RISK SURGERY		
Cholecystectomy for cholelithiasis	OPS 55110 55111 55112 5511x 5511y; PD K80	SD C D0 (malign neoplasm); OPS 55113 55114 55115 (extended or simultaneously performed cholecystectomy)
Inguinal or femoral hernia repair	OPS 5530 5531; PD K40 K41	OPS 5451 5452 5453 5454 5455 5456 5458 5459 5460 5461 5462 5463 5464 5465 5466 5467 5468 5469 5484 5485 55304 55308 55314 55318 (other intestinal surgery)
Primary hip replacement for arthrosis or arthritis	OPS 582000 582001 582002 582010 582011 582012 582002 582021 582022 582030 582031 582040 582041 582060 582061 582080 582081 582080 58208	OPS 5829c 5829g 5829n 57854d 582810 582840 582860 5829k 5829m (replacement for malign neoplasm, modular prosthesis, two-stage revision); SD M8005 M8085 M8415 M8456 M8485 M8495 M8505 M8545 M8555 M8565 M9075 M9688 Q650 Q651 S324 (osteoporosis, other osteopathy, hip fracture, congenital deformity of hip)
Primary knee replacement for arthrosis or arthritis	OPS 58221 58222 58223 58224 58226 58227 58229 5822a 5822b 5822d 5822e 5822g 5822h 5822j 5822k 58220 582201 582202; PD M05 M06 M07 M08 M170 M171 M174 M175 M179 M87	OPS 5829c 5829g 5829n 57854d 582810 582840 582860 5829k 5829m (replacement for malign neoplasm, modular prosthesis, two-stage revision); SD M8000 M8005 M8080 M8085 M8400 M8405 M8406 M8505 M8506 M8545 M8546 M8555 M8556 M8565 M8566 (osteoporosis or other osteopathy)
Transurethral resection of prostate	OPS 5601	

PD: principal diagnosis (ICD-10-GM); SD: secondary diagnosis (ICD-10-GM); OPS: procedure classification code [Operationen-und Prozedurenschlüssel]; direct admission: patient was not transferred-in from another acute care hospital.

Official classifications according to the German Institute of Medical Documentation and Information (DIMDI): <a href="http://www.dimdi.de/static/en/klassi/icd-10-gm/index.htm">http://www.dimdi.de/static/en/klassi/icd-10-gm/index.htm</a> (ICD-10-GM); <a href="http://www.dimdi.de/static/en/klassi/ops/index.htm">http://www.dimdi.de/static/en/klassi/ops/index.htm</a> (ICD-10-GM);

The case definitions rely on previous work on hospital quality indicators which were modified for the purpose of this analysis: Mansky T, Nimptsch U, Cools A, Hellerhoff F. G-IQI | German Inpatient Quality Indicators. Version 5.0. - Band 2: Definitionshandbuch für das Datenjahr 2016. Berlin: Universitätsverlag der TU Berlin. <a href="https://depositonce.tu-berlin.de/handle/11303/5819">https://depositonce.tu-berlin.de/handle/11303/5819</a>

#### Appendix table 2 Definition of covariates used for risk adjustment

Covariate	Definition
Calendar year of treatment	2009, 2010, 2011, 2012, 2013, 2014
Demographics	
Age	5-year age groups
Female sex	
Comorbidity	
Cardiac arrhythmia	PD or SD 1442 148 Z450 Z950
Heart failure or cardiomyopathy	PD or SD I50 I110 I130 I132 I420 I426 I427 I428 I429
Chronic ischemic heart disease	PD or SD I25
Hypertension (without heart or renal failure)	PD or SD I10 I119 I129 I139 I15
Valvular disease	PD or SD I340 I342 I350 I351 I352 I050 I051 I052 I060 I061 I062 Q231 Q232 Q233
Atherosclerosis of peripheral arteries	PD or SD 1702
Sequelae of cerebrovascular disease	PD or SD 169
Chronic pulmonary disease	PD or SD J41 J42 J44 J45 J47
Mucoviscidosis	PD or SD E84
Chronic liver disease	PD or SD B18 I864 I982 K70 K73 K74 K760 K761 K765 K766 K767 Q446 Q447
Chronic pancreatitis	PD or SD K860 K861
Severe renal disease or chronic renal failure	PD or SD I120 I131 I132 N03 N04 N05 N07 N08 N11 N12 N14 N15 N16 N18 N19 Z992
Diabetes mellitus	PD or SD E10 E11 E12 E13 E14
Obesity	PD or SD E66
Cachexia or malnutrition	PD or SD R64 R634 E43 E44
Coagulopathy	PD or SD D66 D67 D680 D681 D682 D684 D685 D686 D688 D689 D691 D693 D694
Malign neoplasm	PD or SD C00-C97
Metastatic cancer	PD or SD C77 C78 C79
Specific risk factors	
ST-elevation myocardial infarction	PD  210  211  212  213
Cardiogenic shock	PD or SD R570
Subsequent myocardial infarction	PD 122
Heart failure NYHA classification stage IV	PD I5014
Chronic obstructive pulmonary disease FEV1 <35%	PD J4400 J4410 J4480 J4490
Fracture of neck of femur	PD S720
Complex disease of intestine	PD or SD K55 K56 K593 K630 K631
Peripheral vascular disease stage	PD or SD I + II: I7020 I7021; III: I7022; IV: I7023 I7024
Acute cholecystitis	PD K800 K810
Trans-apical aortic valve replacement	OPS 535a01 535a02
Extended colorectal resection	OPS 5458 54540 54541 54542 54543 54544 54545 54546 5501 5502 5437 5436 5454x 5454y
	OPS 5437 5436 5502 5501 5455 5456 54540 54541 54542 54543 54544 54545 54546 5454x 5454y

PD: principal diagnosis (ICD-10-GM); SD: secondary diagnosis (ICD-10-GM); OPS: procedure classification system [Operationen- und Prozedurenschlüssel]. Official classifications according to the German Institute of Medical Documentation and Information (DIMDI): <a href="http://www.dimdi.de/static/en/klassi/icd-10-gm/index.htm">http://www.dimdi.de/static/en/klassi/icd-10-gm/index.htm</a> (ICD-10-GM); <a href="http://www.dimdi.de/static/en/klassi/ops/index.htm">http://www.dimdi.de/static/en/klassi/ops/index.htm</a> (OPS).

#### Appendix table 3 Application of covariates used to estimate risk-adjusted in-hospital mortality

	Calendar year of treatment	5-year age groups	Female sex	Cardiac arrhythmia	Heart failure or cardiomyopathy	Chronic ischemic heart disease	Hypertension (without heart or renal failure)	Valvular disease	Atherosclerosis of peripheral arteries	Sequelae of cerebrovascular disease	Chronic pulmonary disease	Mucoviscidosis	Chronic liver disease	Chronic pancreatitis	Severe renal disease or chronic renal failure	Diabetes mellitus	Obesity	Cachexia or malnutrition	Coagulopathy	Malign neoplasm	Metastatic cancer	ST-elevation myocardial infarction	Cardiogenic shock	Subsequent myocardial infarction	Heart failure NYHA classification stage IV	Chronic obstructive pulmonary disease FEV1 <35%	Fracture of neck of femur	Complex disease of intestine	Peripheral vascular disease stage	Acute cholecystitis	Trans-apical aortic valve replacement	Extended colorectal resection	Resection of visceral organs other than pancreas	Area under the curve (c-statistic)
COMMON EMERGENCY CONDITIONS																																		0.007
Acute myocardial infarction Heart failure Ischemic stroke Pneumonia Chronic obstructive pulmonary disease Hip fracture	X X X X X	X X X X X	x x x x x	x x x x	x x x x	x x x x	x x x x	X X X X X	X X X X	x	x x x	x	x x x x x		x x x x x	X X X X	X X X X	x x x x x	x x x x x	X X X X		x	x	X	x	x	x							0,827 0,729 0,743 0,715 0,716 0,782
ELECTIVE HEART AND THORACIC SURGERY																																		
Isolated surgical aortic valve replacement Transcatheter aortic valve replacement Isolated coronary artery bypass graft Partial lung resection for carcinoma	x x x	x x x	x x x	x x x	x x x	x x	x x x	x x	x x x x		x x x		x x x		x x x	x x x	x x x	x x x	x x x	x x x	x										x			0,772 0,710 0,786 0,782
ELECTIVE MAJOR VISCERAL SURGERY																																		
Colorectal resection for carcinoma Colorectal resection for diverticulosis Total nephrectomy for carcinoma Cystectomy for carcinoma Complex oesophageal surgery for carcinoma Pancreatic resection for carcinoma	X X X X X	x x x x x	X X X X	X X X X	X X X X	x x x x x	X X X X	X X X X	x x x x x		x x x x x		X X X X X		x x x x	X X X X	X X X X X	x x x x x	x x x x x		x x x x							x				x x	x	0,825 0,908 0,826 0,765 0,751 0,776
ELECTIVE VASCULAR SURGERY																																		
Surgical lower extremity revascularization for atherosclerosis Open repair of abdominal aortic aneurysm Endovascular repair of abdominal aortic aneurysm Carotid endarterectomy	X X X	x x x	x x x	x x x	x x x	x x x	x x x	x x x	x x x		x x x		x x x		x x x	x x x	x x x	X X X	x x x	x x x x	7								x					0,853 0,771 0,814 0,758
ELECTIVE LOW-RISK SURGERY																																		
Cholecystectomy for cholelithiasis Inguinal or femoral hernia repair Primary hip replacement for arthrosis or arthritis Primary knee replacement for arthrosis or arthritis Transurethral resection of prostate	x x x x	x x x x	x x x	x x x x	x x x x	x x x x	x x x x	x x x x	x x x x		x x x x		X X X X	x	x x x x	x x x x	x x x x	x x x x	x x x x	x x x										x				0,943 0,938 0,869 0,820 0,868

The RECORD statement – checklist of items, extended from the STROBE statement, that should be reported in observational studies using routinely collected health data.

	Item No.	STROBE items	Location in manuscript where items are reported	RECORD items	Location in manuscript where items are reported
Title and abstrac					
	1	(a) Indicate the study's design with a commonly used term in the title or the abstract (b) Provide in the abstract an informative and balanced summary of what was		RECORD 1.1: The type of data used should be specified in the title or abstract. When possible, the name of the databases used should be included.	Title and abstract
		done and what was found	<b>A</b>	RECORD 1.2: If applicable, the geographic region and timeframe within which the study took place should be reported in the title or abstract.	Title and abstract
			Colina Co	RECORD 1.3: If linkage between databases was conducted for the study, this should be clearly stated in the title or abstract.	Not applicable
Introduction					
Background rationale	2	Explain the scientific background and rationale for the investigation being reported		Oh	Introduction (p. 3)
Objectives	3	State specific objectives, including any prespecified hypotheses		1/1_	Introduction (p. 3)
Methods					
Study Design	4	Present key elements of study design early in the paper			Introduction (p. 3)
Setting	5	Describe the setting, locations, and relevant dates, including periods of recruitment, exposure, follow-up, and data collection			Methods (p. 4-5)

Participants	6	(a) Cohort study - Give the	RECORD 6.1: The methods of study	Appendix table 1
-		eligibility criteria, and the sources	population selection (such as codes or	
		and methods of selection of	algorithms used to identify subjects)	
		participants. Describe methods of	should be listed in detail. If this is not	
		follow-up	possible, an explanation should be	
		Case-control study - Give the	provided.	
		eligibility criteria, and the sources		
		and methods of case ascertainment	RECORD 6.2: Any validation studies	Not applicable
		and control selection. Give the	of the codes or algorithms used to select	
		rationale for the choice of cases	the population should be referenced. If	
		and controls	validation was conducted for this study	
		Cross-sectional study - Give the	and not published elsewhere, detailed	
		eligibility criteria, and the sources	methods and results should be provided.	
		and methods of selection of		
		participants	RECORD 6.3: If the study involved	Not applicable
			linkage of databases, consider use of a	
		(b) Cohort study - For matched	flow diagram or other graphical display	
		studies, give matching criteria and	to demonstrate the data linkage process,	
		number of exposed and unexposed	including the number of individuals	
		Case-control study - For matched	with linked data at each stage.	
		studies, give matching criteria and	_	
		the number of controls per case		
Variables	7	Clearly define all outcomes,	RECORD 7.1: A complete list of codes	Appendix tables 2
		exposures, predictors, potential	and algorithms used to classify	and 3
		confounders, and effect modifiers.	exposures, outcomes, confounders, and	
		Give diagnostic criteria, if	effect modifiers should be provided. If	
		applicable.	these cannot be reported, an explanation	
			should be provided.	
Data sources/	8	For each variable of interest, give		Methods (p. 4-6)
measurement		sources of data and details of		
		methods of assessment		
		(measurement).		
		Describe comparability of		
		assessment methods if there is		
		more than one group		
Bias	9	Describe any efforts to address		Methods (p. 4-6)
		potential sources of bias		

Study size	10	Explain how the study size was arrived at		Not applicable
Quantitative variables	11	Explain how quantitative variables were handled in the analyses. If applicable, describe which groupings were chosen, and why		Methods (p. 5)
Statistical methods	12	(a) Describe all statistical methods, including those used to control for confounding		Methods (p. 5-6)
		(b) Describe any methods used to examine subgroups and interactions		Not applicable
		(c) Explain how missing data were addressed		Not applicable
		(d) Cohort study - If applicable, explain how loss to follow-up was addressed  Case-control study - If applicable, explain how matching of cases and controls was addressed  Cross-sectional study - If applicable, describe analytical methods taking account of sampling strategy  (e) Describe any sensitivity		Not applicable
Data access and		analyses	RECORD 12.1: Authors should	Methods (p. 5) Methods (p. 4)
cleaning methods			describe the extent to which the investigators had access to the database population used to create the study population.	Methods (p. 4)
			RECORD 12.2: Authors should provide information on the data cleaning methods used in the study.	Not applicable

Linkage				RECORD 12.3: State whether the study included person-level, institutional-level, or other data linkage across two or more databases. The methods of linkage and methods of linkage quality evaluation should be provided.	Not applicable
Results	1		1		
Participants	13	(a) Report the numbers of individuals at each stage of the study ( <i>e.g.</i> , numbers potentially eligible, examined for eligibility, confirmed eligible, included in the study, completing follow-up, and analysed) (b) Give reasons for non-participation at each stage. (c) Consider use of a flow diagram		RECORD 13.1: Describe in detail the selection of the persons included in the study ( <i>i.e.</i> , study population selection) including filtering based on data quality, data availability and linkage. The selection of included persons can be described in the text and/or by means of the study flow diagram.	Methods (p. 4) and appendix table 1
Descriptive data	14	(a) Give characteristics of study participants (e.g., demographic, clinical, social) and information on exposures and potential confounders (b) Indicate the number of participants with missing data for each variable of interest (c) Cohort study - summarise follow-up time (e.g., average and total amount)		4	Table 1  Not applicable
Outcome data	15	Cohort study - Report numbers of outcome events or summary measures over time  Case-control study - Report numbers in each exposure category, or summary measures of exposure  Cross-sectional study - Report numbers of outcome events or summary measures			Table 1

Main results	16	(a) Give unadjusted estimates and, if applicable, confounder-adjusted estimates and their precision (e.g., 95% confidence interval). Make clear which confounders were adjusted for and why they were included (b) Report category boundaries when continuous variables were categorized			Figure 1 and 2, tables 2 and 3  Table 1, figure 1
		(c) If relevant, consider translating estimates of relative risk into absolute risk for a meaningful time period			Table 3
Other analyses	17	Report other analyses done—e.g., analyses of subgroups and interactions, and sensitivity analyses	h		Results (p. 13)
Discussion					
Key results	18	Summarise key results with reference to study objectives			Discussion (p. 14)
Limitations	19	Discuss limitations of the study, taking into account sources of potential bias or imprecision. Discuss both direction and magnitude of any potential bias	16	RECORD 19.1: Discuss the implications of using data that were not created or collected to answer the specific research question(s). Include discussion of misclassification bias, unmeasured confounding, missing data, and changing eligibility over time, as they pertain to the study being reported.	Discussion (p. 14)
Interpretation	20	Give a cautious overall interpretation of results considering objectives, limitations, multiplicity of analyses, results from similar studies, and other relevant evidence			Discussion (p. 15-17)
Generalisability	21	Discuss the generalisability (external validity) of the study results			Discussion (p. 16)

Other Information						
Funding	22	Give the source of funding and the role of the funders for the present study and, if applicable, for the original study on which the present article is based			Title page	
Accessibility of protocol, raw data, and programming code				RECORD 22.1: Authors should provide information on how to access any supplemental information such as the study protocol, raw data, or programming code.	Not applicable	

<sup>\*</sup>Reference: Benchimol EI, Smeeth L, Guttmann A, Harron K, Moher D, Petersen I, Sørensen HT, von Elm E, Langan SM, the RECORD Working Committee. The REporting of studies Conducted using Observational Routinely-collected health Data (RECORD) Statement. *PLoS Medicine* 2015; in press.

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