Supplemental Material for "Development and validation of multivariable prediction models for adverse COVID-19 outcomes in IBD patients"

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References

eTable 1. List of Partnering Patient and Professional Organizations

Agrupación Chilena de Trabajo en Enfermedad de Crohn y Colitis Ulcerosa (ACTECCU)

American College of Gastroenterology (ACG)

American Gastroenterological Association (AGA)

Asian Organization for Crohn's and Colitis (AOCC)

Asia-Pacific Association of Gastroenterology (APAGE)

BRICS IBD Consortium

Canadian Association of Gastroenterology

Consultant360 Specialty Network

Crohn's and Colitis Foundation

Crohn's and Colitis Australia (CCA)

Crohn's and Colitis Canada (CCC)

Crohn's and Colitis India (CCI)

Crohn's and Colitis New Zealand (CCNZ)

Crohn's & Colitis UK

European Crohn's and Colitis Organisation (ECCO)

European Federation of Crohn's & Ulcerative Colitis Assocaitions (EFCCA)

Grupo Argentino de Estudio de Enfermedad de Crohn y Colitis Ulcerosa

Grupo de Estudio de Crohn y Colitis Colombiano

Grupo de Estudos de Doenca Inflamatória Intestinal do Brasil (GEDIIB)

Grupo uruguayo de trabajo en enfermedad inflamatoria intestinal (GUTEII)

Grupo Venezolano de Trabajo en Enfermedad Inflamatoria Intestinal

Hong Kong IBD Society (HKIBS)

ImproveCareNow

Indian Society of Gastroenterology

International Organization for the Study of Inflammatory Bowel Disease (IOIBD)

Japanese IBD Society

Korean Society for the Study of Intestinal Diseases

Malaysia Society of Gastroenterology

National Taiwan GI society

North American Society for Pediatric Gastroenterology, Hepatology and Nutrition

(NASPGHAN)

Pan American Crohn's and Colitis Organization (PANCCO)

Pediatric Inflammatory Bowel Disease Network (PIBD-NET)

Taiwan IBD society

The Gastroenterological Society of Australia (GESA)

The Gastroenterology & Hepatology Advanced Practice Providers (GHAPP)

The New Zealand Society of Gastroenterology (NZSG)

United European Gastroenterology (UEG)

eTable 2. Variables included in the model

Domain	Name of Variable	Scale	Description of the variable		
	Hospitalization+	В	A composite outcome of hospitalization, ICU		
Outcomo			admission, mechanical ventilation, or death		
Outcome variables	ICU+ B		A composite outcome of ICU admission, mechanical		
variables			ventilation, or death		
	Death	В	Indicator for outcome of death		
	Age	1	Age in years. Age is capped at 90		
	Date	1	Date of report submission.		
	Gender	С	Male or female gender		
	Race	М	Physician-reported race. Three categories were		
			included, Asian, Black, and White. were included		
			binary variables. Other race categories have		
			prevalence lower than 30 reports. One individual		
			can be assigned to more than one race category.		
	Ethnicity	В	Indicator of whether the person is Hispanic or Latino		
	Height	Χ	Height in cm		
	BMI	Х	Body Mass Index = weight (kg) / (height (m)) ²		
			Treated as missing if BMIs are above 60		
	Weight	Χ	Weight in kg. Treated as missing if BMI was above		
			60 or		
	Country	С	Countries with less than 30 entries in our dataset		
			are grouped to level "others"		
	Country income level	С	World bank income classification ¹ . Low and lower-		
			middle income countries were collapsed together		
			due to the small number of reports from low-income		
			countries.		
	US Census Division	С	Place of residence in the US according to US		
			census division, except for New York which gets its		
Predictors			own indicator. Individuals who reside in other		
			countries are assigned to the category "Other		
			county" which is excluded from the model because it		
	Diagona tuna	С	is redundant with the Country variable.		
	Disease type Disease activity	C	Crohn's disease or Ulcerative colitis Includes: remission, mild, moderate, severe. Each		
	Disease activity	C	of the activity category is recorded as a binary		
			variable.		
	Comorbidities	М	Includes: asthma, cancer, cardiovascular disease,		
	Comorbidities	IVI	chronic liver disease, chronic renal disease, COPD,		
			other chronic lung disease (not Asthma/COPD),		
			diabetes, hypertension, history of stroke and current		
			smoker. Each of the comorbidity is recorded as a		
			binary variable.		
	Count of comorbidities	N	Number of comorbidities entered		
	Medication category	М	IBD medications at time of COVID diagnosis, which		
			Includes: biologic therapy, 5-aminosalicylates,		
			immunomodulators, corticosteroids, Janus kinase		
			inhibitors (tofacitinib), other IBD medication, and no		
			IBD medication. Each of the category is recorded as		
			a binary variable. One participant can take multiple		
			medications.		
	Sulfasalazine	В	Indicator for the use of Sulfasalazine		
	Mesalamine	В	Indicator for the use of Mesalamine		

eTable 2. Variables included in the model (continued)

Domain	Name of Variable	Scale	Description of the variable
Domain	Azathioprine daily	X	Total azathioprine dosage in mg per day
	dose	_^	Total azatiliopilile dosage ili lilig pei day
	6-Mercaptopurine	Х	Total 6-mercaptopurine dosage in mg per
	daily dose	^	day
	Prednisone daily dose	Х	Effective daily prednisone dosage in mg.
	i reunisone dany dose	_^	Different medication frequencies were
			translated into a daily equivalent.
	Tumor Necrosis Factor	В	Indicator for the use of Tumor Necrosis
	inhibitor		Factor inhibitor
Predictors	Budesonide	В	Indicator for the use of Budesonide
	Oral or parenteral	В	Indicator for the use of Oral or parenteral
	steroids	-	steroids
	Anti-integrin	В	Indicator for the use of Anti-integrin
	IL 12/23 inhibitor	В	Indicator for the use of IL 12/23 inhibitor
	Immunomodulator:	В	Indicator for the use of Methotrexate as an
	Methotrexate		immunomodulator
	Immunomodulator:	В	Indicator for the use of Azathioprine or 6-
	Azathioprine or 6-		Mercaptopurine as an immunomodulator
	Mercaptopurine		
	Azathioprine daily	Х	Azathioprine daily dose divided by weight,
	dose by weight		in the unit of mg per day per kg
	6-Mercaptopurine	X	6-Mercaptopurine daily dose divided by
	daily dose by weight		weight, in the unit of mg per day per kg
	Prednisone daily dose	Х	Prednisone daily dose divided by weight, in
	by weight		the unit of mg per day per kg
	Age^2	Χ	Quadratic term of age
Transformati	Count of comorbidities		Quadratic term of the count of comorbidities
ons	^2 BMI^2	Y	Quadratic term of BMI
	Prednisone daily dose	X	Quadratic term of Bivil Quadratic term of prednisone daily dose
	^2	^	Quadratic term of prednisone daily dose
	Azathioprine daily	Х	Quadratic term of azathioprine daily dose
	dose ^2	^	Quadratic term of azatinoprine daily dose
	6-Mercaptopurine	Х	Quadratic term of 6-mercaptopurine daily
	daily dose ^2	^	dose
	Age: Gender	Х	Interaction term between age and gender
	Age: Count of	X	Interaction term between age and Count of
	comorbidities		comorbidities
	Age: BMI	Х	Interaction term between age and BMI
	Date:Country	X	Interaction term between Date Interval and
	,		country
	Cardiovascular	В	Interaction term between Cardiovascular
Interaction	disease: Diabetes		disease and Diabetes
terms	Cardiovascular	В	Interaction term between Cardiovascular
	disease: Hypertension		disease and Hypertension
	Diabetes:	В	Interaction term between Diabetes and
	Hypertension		Hypertension
	Hypertension: Chronic	В	Interaction term between Hypertension and
	renal disease		Chronic renal disease
	Current smoker: Count	N	Interaction term between Current smoker
	of comorbidities		and Count of comorbidities

eTable 2. Variables included in the model (continued)

Domain	Name of Variable	Scale	Description of the variable
	Biologic therapy: 5-	В	Interaction term between Biologic therapy
	aminosalicylates		and 5-aminosalicylates
	Biologic therapy:	В	Interaction term between Biologic therapy
	Immunomodulators		and Immunomodulators
	Biologic therapy:	В	Interaction term between Biologic therapy
	Corticosteroids		and Corticosteroids
	5-aminosalicylates:	В	Interaction term between 5-aminosalicylates
	Immunomodulators		and Immunomodulators
Interaction	5-aminosalicylates:	В	Interaction term between 5-aminosalicylates
terms	Corticosteroids		and Corticosteroids
	Immunomodulators:	В	Interaction term between
	Corticosteroids		Immunomodulators and Corticosteroids
	Oral/parenteral	Χ	Interaction term between Oral/parenteral
	steroids: Age		steroids and age
	Oral/parenteral	В	Interaction term between Oral/parenteral
	steroids: Gender		steroids and gender
	Oral/parenteral	Χ	Interaction term between Oral/parenteral
	steroids: BMI		steroids and BMI

Scales: B = binary, C = categorical, I = integers, M = multidimensional, N = count, X = continuous.

 $^{^{\}mbox{\tiny 1}}\mbox{world}$ bank classification of country by income

eTable 3. Characteristics of COVID-19 IBD Patients in the Study

e i able 3. Unaracteristics Characteristics	Training Data	Test Data	Overall
Ondi doteristics	(n=2009)	(n=700)	(n=2709)
Age, mean (SD), years	42.2 (18.2)	38.7 (17.4)	41.2 (18.0)
Missing	9 (0.4%)	4 (0.6%)	13 (0.5%)
Gender, No. (%)		,	
Female	982 (48.9%)	344 (49.1%)	1326 (48.9%)
Male	998 (49.7%)	341 (48.7%)	1339 (49.4%)
Other	1 (0.0%)	0 (0.0%)	1 (0.0%)
Missing	28 (1.4%)	15 (2.1%)	43 (1.6%)
Asiana, No. (%)	112 (5.6%)	38 (5.4%)	150 (5.5%)
Black ^a , No. (%)	138 (6.9%)	39 (5.6%)	177 (6.5%)
White ^a , No. (%)	1603 (79.8%)	547 (78.1%)	2150 (79.4%)
Hispanic/Latino, No. (%)	350 (17.4%)	115 (16.4%)	465 (17.2%)
Missing	375 (18.7%)	120 (17.1%)	495 (18.3%)
Month of entry, No. (%)			
March	195 (9.7%)	32 (4.6%)	227 (8.4%)
April	567 (28.2%)	94 (13.4%)	661 (24.4%)
May	391 (19.5%)	78 (11.1%)	469 (17.3%)
June	232 (11.5%)	47 (6.7%)	279 (10.3%)
July	258 (12.8%)	49 (7.0%)	307 (11.3%)
August	238 (11.8%)	35 (5.0%)	273 (10.1%)
September	128 (6.4%)	180 (25.7%)	308 (11.4%)
October	0 (0%)	185 (26.4%)	185 (6.8%)
Height, mean (SD), cm	169 (10.7)	169 (12.0)	169 (11.1)
Missing	375 (18.7%)	102 (14.6%)	477 (17.6%)
BMI, mean (SD)	26.0 (6.50)	25.2 (6.26)	25.8 (6.44)
Missing	398 (19.8%)	106 (15.1%)	504 (18.6%)
Weight, mean (SD), kg	74.7 (20.9)	72.4 (20.8)	74.1 (20.9)
Missing	398 (19.8%)	106 (15.1%)	504 (18.6%)
Country, No. (%)			
Argentina	38 (1.9%)	23 (3.3%)	61 (2.3%)
Belgium	43 (2.1%)	16 (2.3%)	59 (2.2%)
Brazil	65 (3.2%)	24 (3.4%)	89 (3.3%)
Canada	27 (1.3%)	11 (1.6%)	38 (1.4%)
France	95 (4.7%)	20 (2.9%)	115 (4.2%)
Germany	38 (1.9%)	12 (1.7%)	50 (1.8%)
India	23 (1.1%)	10 (1.4%)	33 (1.2%)
Iran, Islamic Republic of	55 (2.7%)	5 (0.7%)	60 (2.2%)
Israel	25 (1.2%)	12 (1.7%)	37 (1.4%)
Italy	74 (3.7%)	18 (2.6%)	92 (3.4%)
Netherlands	27 (1.3%)	21 (3.0%)	48 (1.8%)
Portugal	22 (1.1%)	10 (1.4%)	32 (1.2%)
Russian Federation	119 (5.9%)	46 (6.6%)	165 (6.1%)
Spain	235 (11.7%)	53 (7.6%)	288 (10.6%)
Turkey	30 (1.5%)	20 (2.9%)	50 (1.8%)
United Kingdom	94 (4.7%)	29 (4.1%)	123 (4.5%)
United States	800 (39.8%)	276 (39.4%)	1076 (39.7%)
Others ^b	199 (9.9%)	94 (13.4%)	293 (10.8%)

eTable 3. Characteristics of COVID-19 IBD Patients in the Study (continued)

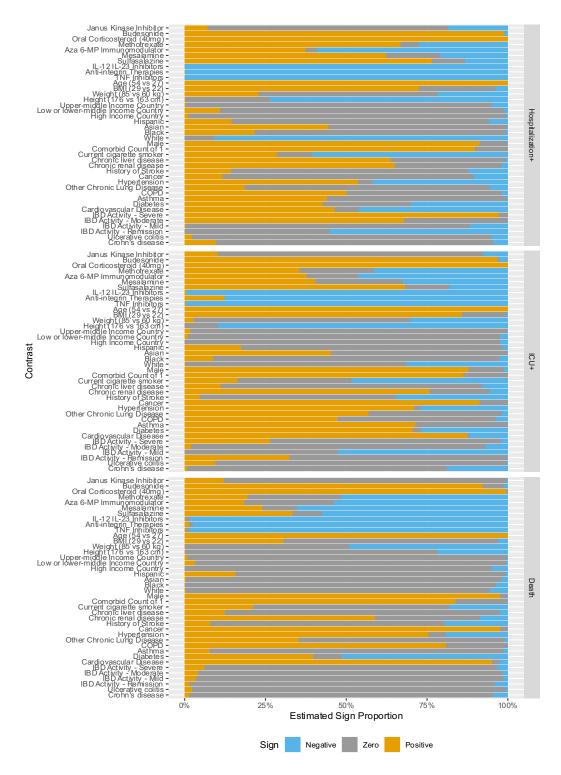
Characteristics	Training Data (n=2009)	Test Data (n=700)	Overall (n=2709)
Country income level, No. (%)			
Low or lower-middle	26 (1.3%)	14 (2.0%)	40 (1.5%)
Upper-middle	360 (17.9%)	134 (19.1%)	494 (18.2%)
High	1623 (80.8%)	545 (77.9%)	2168 (80.0%)
Missing	0 (0%)	7 (1.0%)	7 (0.3%)
US Census Division, No. (%)			
East North Central	119 (5.9%)	38 (5.4%)	157 (5.8%)
East South Central	60 (3.0%)	27 (3.9%)	87 (3.2%)
West	70 (3.5%)	28 (4.0%)	98 (3.6%)
West North Central	50 (2.5%)	28 (4.0%)	78 (2.9%)
West South Central	77 (3.8%)	21 (3.0%)	98 (3.6%)
New England	61 (3.0%)	11 (1.6%)	72 (2.7%)
Mid-Atlantic	64 (3.2%)	22 (3.1%)	86 (3.2%)
South Atlantic	117 (5.8%)	50 (7.1%)	167 (6.2%)
New York	181 (9.0%)	47 (6.7%)	228 (8.4%)
Other country	1209 (60.2%)	421 (60.1%)	1630 (60.2%)
Missing	1 (0.0%)	7 (1.0%)	8 (0.3%)
Current smoker, No. (%)	61 (3.0%)	25 (3.6%)	86 (3.2%)
Disease type, No. (%)			
Crohn's disease	1115 (55.5%)	401 (57.3%)	1516 (56.0%)
Ulcerative colitis	854 (42.5%)	278 (39.7%)	1132 (41.8%)
Missing	40 (2.0%)	21 (3.0%)	61 (2.3%)
Disease activity		(2.2.2)	(111)
Remission, No. (%)	1099 (54.7%)	411 (58.7%)	1510 (55.7%)
Mild, No. (%)	394 (19.6%)	137 (19.6%)	531 (19.6%)
Moderate, No. (%)	316 (15.7%)	101 (14.4%)	417 (15.4%)
Severe, No. (%)	118 (5.9%)	26 (3.7%)	144 (5.3%)
Missing, No. (%)	82 (4.1%)	25 (3.6%)	107 (3.9%)
Asthma, No. (%)	111 (5.5%)	21 (3.0%)	132 (4.9%)
Cancer, No. (%)	41 (2.0%)	9 (1.3%)	50 (1.8%)
Cardiovascular disease, No. (%)	133 (6.6%)	43 (6.1%)	176 (6.5%)
Chronic liver disease, No. (%)	68 (3.4%)	27 (3.9%)	95 (3.5%)
Chronic renal disease, No. (%)	44 (2.2%)	14 (2.0%)	58 (2.1%)
COPD, No. (%)	33 (1.6%)	16 (2.3%)	49 (1.8%)
Other chronic lung disease (not	31 (1.5%)	7 (1.0%)	38 (1.4%)
Asthma/COPD), No. (%)	(110,0)	(11070)	(,,,
Diabetes, No. (%)	117 (5.8%)	30 (4.3%)	147 (5.4%)
Hypertension, No. (%)	243 (12.1%)	67 (9.6%)	310 (11.4%)
History of stroke, No. (%)	26 (1.3%)	8 (1.1%)	34 (1.3%)
Count of comorbidities, mean	0.544 (0.938)	0.479 (0.879)	0.527 (0.923)
(SD)		(3.2.2)	(3.32)
Biologic therapy, No. (%)	1203 (59.9%)	437 (62.4%)	1640 (60.5%)
Tumor Necrosis Factor inhibitor,	796 (39.6%)	313 (44.7%)	1109 (40.9%)
No. (%)	((212,2)
Anti-integrin, No. (%)	213 (10.6%)	72 (10.3%)	285 (10.5%)
IL 12/23 inhibitor, No. (%)	187 (9.3%)	47 (6.7%)	234 (8.6%)
5-Aminosalicylates, No. (%)	636 (31.7%)	200 (28.6%)	836 (30.9%)
Sulfasalazine, No. (%)	64 (3.2%)	24 (3.4%)	88 (3.2%)
Mesalamine, No. (%)	561 (27.9%)	175 (25.0%)	736 (27.2%)
Immunomodulators, No. (%)	459 (22.8%)	140 (20.0%)	599 (22.1%)

eTable 3. Characteristics of COVID-19 IBD Patients in the Study (continued)

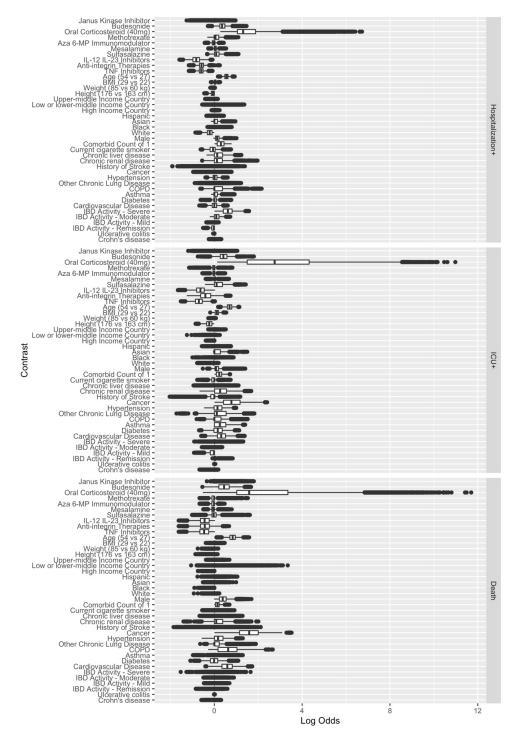
Characteristics	Training Data	Test Data	Overall
	(n=2009)	(n=700)	(n=2709)
Methotrexate, No. (%)	81 (4.0%)	24 (3.4%)	105 (3.9%)
Azathioprine or 6-	367 (18.3%)	110 (15.7%)	477 (17.6%)
Mercaptopurine, No. (%)			
Azathioprine dose among takers,	116.8 (49.2)	115.9 (51.6)	116.6 (49.6)
mean (SD), mg			
Missing	16 (0.8%)	5 (0.7%)	21 (0.8%)
6-Mercaptopurine dose among	61.5 (24.8)	60.0 (24.9)	61.0 (24.7)
takers, mean (SD), mg			
Missing	1 (0.0%)	3 (0.4%)	4 (0.1%)
Corticosteroids, No. (%)	209 (10.4%)	65 (9.3%)	274 (10.1%)
Budesonide, No. (%)	59 (2.9%)	17 (2.4%)	76 (2.8%)
Prednisone daily dose among	26.8 (18.3)	22.7 (15.2)	25.8 (17.6)
takers, mean (SD), mg/day			
Missing	76 (3.8%)	20 (2.9%)	96 (3.5%)
Oral or parenteral steroids, No.	154 (7.7%)	49 (7.0%)	203 (7.5%)
(%)			
Janus kinase inhibitors	30 (1.5%)	9 (1.3%)	39 (1.4%)
(tofacitinib), No. (%)			
Other IBD medication, No. (%)	63 (3.1%)	23 (3.3%)	86 (3.2%)
No IBD medication, No. (%)	70 (3.5%)	25 (3.6%)	95 (3.5%)
Hospitalized, No. (%)	497 (24.7%)	136 (19.4%)	633 (23.4%)
Missing	27 (1.3%)	11 (1.6%)	38 (1.4%)
Ventilator, No. (%)	74 (3.7%)	17 (2.4%)	91 (3.4%)
Missing	34 (1.7%)	14 (2.0%)	48 (1.8%)
ICU, No. (%)	95 (4.7%)	28 (4.0%)	123 (4.5%)
Missing	38 (1.9%)	13 (1.9%)	51 (1.9%)
Hospitalization+, No. (%)	499 (24.8%)	138 (19.7%)	637 (23.5%)
Missing	37 (1.8%)	17 (2.4%)	54 (2.0%)
ICU+, No. (%)	133 (6.6%)	36 (5.1%)	169 (6.2%)
Missing	49 (2.4%)	22 (3.1%)	71 (2.6%)
Death, No. (%)	57 (2.8%)	12 (1.7%)	69 (2.5%)
Missing	33 (1.6%)	14 (2.0%)	47 (1.7%)

^aIndividuals can be assigned to more than one physician-reported racial group (White, Black, Asian).

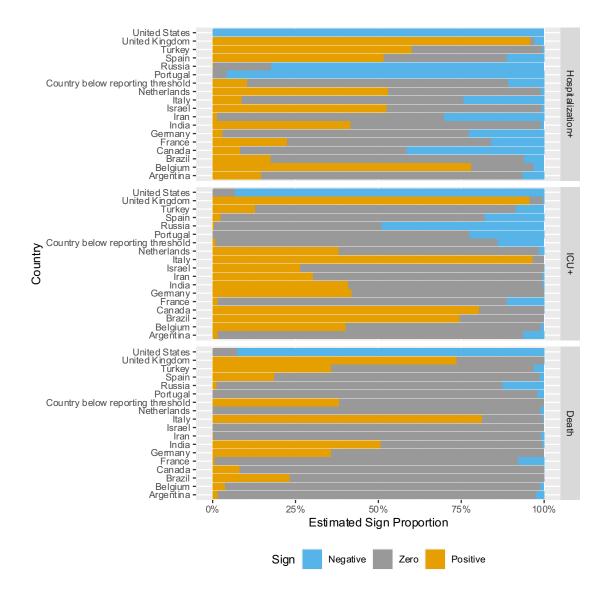
^bCountries with fewer than 30 submissions were grouped together into the Other countries category



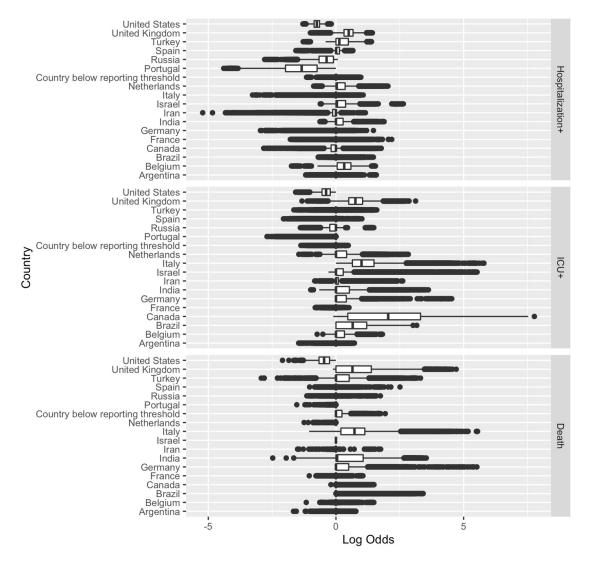
eFigure 1: Estimated Contrast Sign Distribution



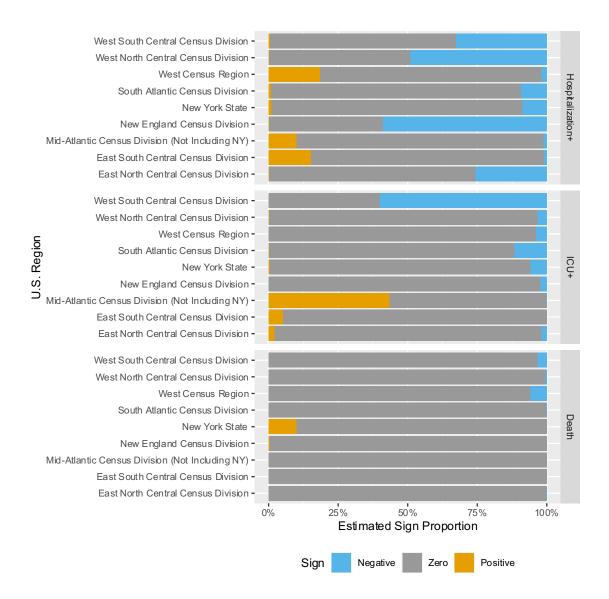
eFigure 2: Estimated Contrast Effect Size Distribution



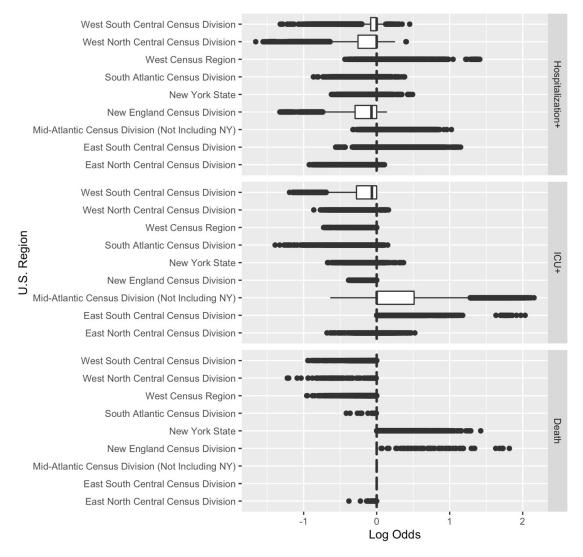
eFigure 3: Estimated Country Sign Distribution



eFigure 4: Estimated Country Effect Size Distribution



eFigure 5: Estimated U.S. Region Sign Distribution



eFigure 6: Estimated U.S. Region Effect Size Distribution

References

 The World Bank. World Bank Country and Lending Groups – World Bank Data Help Desk. Accessed December 7, 2020. https://datahelpdesk.worldbank.org/knowledgebase/articles/906519-world-bank-country-and-lending-groups