

1 **Title:** Worldwide routine immunisation coverage regressed during the first year of the  
2 COVID-19 pandemic

3  
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31  
32 **Abstract**

33 **Abstract text:** We modelled historical, country-specific routine immunisation trends using  
34 publicly available vaccination coverage data for diphtheria, tetanus and pertussis-containing  
35 vaccine first-dose (DTP1) and third-dose (DTP3) from 2000 to 2019. We evaluate changes  
36 in coverage in 2020 by comparing model predictions to WUENIC-reported coverage. We  
37 report a 3.0% (95%<sub>CrI</sub>: [2.3%; 3.7%]) global decline in DTP3 coverage, and important  
38 increases in missed immunisations in some countries with middle-income countries, and the  
39 Americas, being most affected.

40  
41 **Key words:** coronavirus; pandemic; routine immunisation; vaccination, global; coverage;  
42 Zero Dose; modelling

43  
44 **Conflict of interest:** None

45  
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51 design and conduct of this study; collection, management, analysis, and interpretation of the  
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57

## 58 **Introduction**

59 The COVID-19 pandemic has impacted society and public health infrastructures worldwide,  
60 influencing mobility [1], access to health services [2], livelihoods and poverty [3]. While  
61 COVID-19 vaccination strategies continue to receive considerable emphasis [4,5], the extent  
62 to which routine immunisation (RI) has been impacted during the first year of the pandemic  
63 remains unclear. Indeed, the World Health Organisation (WHO) pulse surveys reported  
64 disruptions in the first half of 2020 [2], and while some later studies suggested a potential  
65 recovery [6], recent observations again hinted at global coverage declines [7,8].

66

67 RI is estimated to prevent four to five million deaths worldwide every year [9]. As such, there  
68 is an urgent need for assessing potential changes in RI coverage, as declines may result in  
69 considerable added morbidity and mortality.

70

## 71 **Materials and methods**

### 72 Data collection

73 We investigated changes in RI coverage using two key indicators: diphtheria-tetanus-  
74 pertussis first-dose (DTP1) and third-dose (DTP3) vaccine coverage. DTP3 serves as a  
75 general marker for immunisation system performance, used by national and global  
76 immunisation stakeholders [10]. DTP1 is used as a proxy for inequity – quantifying Zero  
77 Dose (ZD) children, those that receive no childhood vaccinations [11]. We compiled  
78 vaccination coverage data from the WHO and United Nations Children’s Fund (UNICEF)  
79 Estimates of National Immunisation Coverage (WUENIC) [12,13] for the last 20 years, using  
80 the latest (October 2021) WUENIC data release. Countries were excluded if (a) they did not  
81 have complete time series coverage estimates for 2000-2019 inclusive to enable expected  
82 coverage modelling (three countries); or (b) they had not yet reported 2020 coverage  
83 through WUENIC (16 countries).

84

### 85 Statistical analysis

86 We used AutoRegressive Integrated Moving Average (ARIMA) modelling [14] to capture  
87 temporal trends in coverage for each country from 2000 to 2019, and predicted expected  
88 coverage levels in 2020 for each country and vaccine dose. Prior to investigating differences  
89 between expected and observed coverage, historic and predicted time series were assessed  
90 and countries were removed from analyses if they met one of three criteria – (1) large  
91 volatility in coverage estimates (over 10 percentage points) in the last decade since this  
92 may indicate high uncertainty in point estimates, (2) strong influence of most recent  
93 coverage estimates (i.e., 2018 or and 2019) contributing to model fitting, corroborated by  
94 WUENIC documentation indicating potential anomalous or rare events, and (3) ARIMA-  
95 models predict coverage improvement greater than or equal to five percentage points from  
96 WUENIC-reported 2020 levels, since this may not be programmatically feasible. See  
97 Supplementary Text for details on removed countries and contexts by dose. We additionally  
98 conducted analyses with no exclusions as a sensitivity study.

99

100 After removing countries for which reliable temporal trends could not be assessed, changes  
101 in coverage were measured as the difference between the reported and expected coverage  
102 for 2020, expressed as percentage values, for the remaining 167 countries per vaccine  
103 dose. The significance of global changes was assessed using a *t*-test against the null  
104 hypothesis of the absence of change. Heterogeneities between groups of countries (UN  
105 regions or income groups) were tested using linear models with coverage change as a  
106 response variable and the corresponding ANOVA. Differences between individual countries  
107 were assessed by comparing the 95% confidence intervals derived from the linear models.  
108 For additional validation we conducted the same analysis for Measles-Containing Vaccine  
109 first-dose (MCV1) to compare whether similar trends were seen across other vaccine doses  
110 and immunisation touchpoints (MCV1 is typically administered at age 9-months compared to  
111 six-weeks for DTP1 and 10-weeks for DPT3).

112

113 We calculated missed immunisations by combining the estimated changes in coverage with  
114 surviving infant population estimates (medium variant births minus infant deaths) of the  
115 United Nations World Population Prospects (UNWPP) for 2020 [15].

116

117 All analyses were conducted using R [16] and can be reproduced using a publicly available  
118 *reportfactory* including all required data and scripts [17].

119

## 120 **Results**

### 121 Global trends

122 After excluding countries for which reliable coverage predictions could not be obtained (see  
123 Supplementary Text for details), we were able to estimate differences between expected and  
124 observed coverage in 2020 for 167 countries for DTP1 and DTP3 – examples shown in

### 125 **Figure 1.**

126

127 The exact magnitude of coverage decline was often hard to assess for individual countries  
128 due to uncertainties in model predictions (**Figure 2, Supplementary Table 1 and 2**), but  
129 general trends remained clearly apparent.

130

131 Results suggest an average global decline in DTP3 coverage of 2·9% (95%<sub>CI</sub>: [2·2%; 3·6%]),  
132 from an expected 89·2% to a reported 86·3% across 167 reporting countries, translating to a  
133 point estimate of 4·5 M additional unimmunised children for DTP3 in 2020 in these countries.

134

135 Similar trends were seen for DTP1 - an average global coverage decline of 2·2% (95%<sub>CI</sub>:  
136 [1·6%; 2·8%]) from an expected 92·9% to a reported 90·7% across the 167 countries  
137 analysed here, equivalent to a point estimate of 4·1 M additional Zero Dose children.

138

139 We note that results hold for both DTP1 and DTP3 when no countries are excluded from  
140 analysis; and that similar trends were seen for MCV1 (an average global coverage decline of

141 2.7%, 95%<sub>CI</sub>: [2.0%; 3.4%], from an expected 88.3% to a reported 85.6% across 167  
142 countries). See Supplementary Results for more details on these sensitivity analyses.

143

#### 144 Heterogeneities

145 Patterns of RI coverage significantly varied across United Nations regions (**Figure 3A**;  
146 ANOVA:  $F = 22.4$ ,  $df = 162$ ,  $p < 2.2 \times 10^{-16}$ ), with the strongest decline observed in the  
147 Americas (6.2% decline, 95%<sub>CI</sub>: [4.6%; 7.7%]), Asia (3.5% decline, 95%<sub>CI</sub>: [2.2%; 4.8%])  
148 and Africa (2.8% decline, 95%<sub>CI</sub>: [1.6%; 4.0%]), while Europe (mean change = -0.6%;  
149 95%<sub>CI</sub>: [-2.0%; +0.7%]) and Oceania (mean change = -0.4%; 95%<sub>CI</sub>: [-2.9%; +2.2%]) did not  
150 show any significant change.

151

152 Similar heterogeneities were observed when considering income groups (**Figure 3B**;  
153 ANOVA:  $F = 22.6$ ,  $df = 163$ ,  $p < 7.1 \times 10^{-15}$ ), with stronger declines in coverage observed in lower  
154 middle income countries (LMICs; mean decline: 3.8%; 95%<sub>CI</sub>: [2.6%; 5.1%]) and in upper  
155 middle income countries (UMICs; mean decline: 4.4% ; 95%<sub>CI</sub>: [3.1%; 5.7%]), than in low  
156 income countries (LICs; mean decline: 2.4%; 95%<sub>CI</sub>: [0.7%; 4.2%]), while high income  
157 countries (HICs; mean change: -0.9%; 95%<sub>CI</sub>: [-2.2%; 0.3%]) did not show any significant  
158 change.

159

160 As UN regions and income groups are highly correlated (non-parametric Chi-square test:  $X^2$   
161 = 115.4,  $p < 10^{-5}$ ), we also tested whether heterogeneities due to one variable (regions or  
162 income groups) remained after accounting for the effect of the other one. Interestingly,  
163 regional differences remained after accounting for differences in income groups (ANOVA:  $F$   
164 = 5.67,  $df = 159$ ,  $p < 2.7 \times 10^{-4}$ ), but evidence for the converse was weak (ANOVA:  $F = 2.67$ ,  
165  $df = 159$ ,  $p = 0.05$ ).

166

#### 167 Country-level missed immunisations

168 These results on 167 countries represent ~94% of the global surviving infant population. Our  
169 results suggest a strong impact, with large additional missed immunisations versus  
170 expected, in some countries. For DTP3 29 countries (17%) and for DTP1 33 countries  
171 (20%), reported coverage significantly ( $p < 0.05$ ) different to expected in 2020. For example,  
172 in India an estimated 3.5 M children did not receive their DTP3 vaccine in 2020, of which  
173 52% (95%CI: [29%; 75%]), i.e. 1.8 M, were associated with coverage declines during the  
174 first year of the pandemic; and in Indonesia an estimated 1.1 M children missed DTP3  
175 vaccinations, of which 35% (95%CI: [10%; 60%]), i.e., 400k, were associated with coverage  
176 declines in 2020. **Table 1** details results for the 10 countries with point estimate greatest  
177 additional missed DTP3 immunisations in 2020 (see also **Figure 1**). Similar trends are seen  
178 for ZD children using DTP1 results. Detailed results for all analysed countries can be found  
179 in the **Supplementary Tables S1** (DTP1), **S2** (DTP3) and **S3** (MCV1).

180

## 181 **Discussion**

182 While the modelled decline in coverage (DTP3: 2.9% (95%CI: [2.2%; 3.6%]) may seem  
183 small, this reduced level of coverage was last observed in these countries in 2005, thus  
184 suggesting a potential 15-years setback in RI improvements. Note that global vaccination  
185 coverage has remained relatively stagnant over the last decade in many countries, so that  
186 the average decline in coverage observed here often reflects changes between 2019 and  
187 2020. The RI disruption observed in this study suggests there may be greater risk of  
188 vaccine-preventable disease outbreaks in the coming years, in the absence of multi-faceted  
189 catch-up and adaptation strategies, such as Supplementary Immunisation Activities (SIAs) to  
190 reach missed children or periodic intensification of routine immunisation [18].

191

192 The estimated changes in RI coverage reported in this study suggest a smaller global  
193 decline (approximately 1/3rd the magnitude) than previously found using alternative  
194 methodology and data [19]. We believe our findings may be more robust owing to a more  
195 comprehensive dataset including data from more countries (167 here vs. 94), plus increased

196 data from the end of 2020 (annual here vs. majority of data from January-September 2020),  
197 and the use of WUENIC-reported data (less prone to data quality and completeness issues  
198 than administrative data). The observed discrepancies are compatible with a rebound of  
199 global RI coverage in late 2020 [6].

200

201 An important contribution of this work, beyond the global trends reported, is that it offers a  
202 replicable rationale for estimating and comparing the impact of COVID-19 on RI across  
203 countries and vaccine programmes, facilitating prioritisation of interventions and resources to  
204 those most-affected. Declines in DTP1 coverage indicate increases in the quantity of ZD  
205 children in some countries – suggesting that the most vulnerable populations have been  
206 strongly impacted by the reductions in RI observed in the first year of the pandemic and  
207 reinforced existing inequities in access to healthcare. ZD populations in key ZD “hotspots”  
208 (e.g., India, Pakistan, and Indonesia) are estimated to have increased significantly in 2020,  
209 posing a genuine public health threat in the coming years. To alleviate such risks and reduce  
210 immunisation inequities, SIAs targeted specifically at these populations should be  
211 considered. Additional research is needed to investigate heterogeneities in RI decline at finer  
212 scales and identify subpopulations which may have experienced even greater losses to RI  
213 coverage.

214

215 RI disruption may be worsened by the acceleration of COVID-19 vaccination campaigns,  
216 particularly in low- and middle-income countries where absorption capacity may be  
217 challenged [20], potentially competing with RI services. Careful monitoring of the interaction,  
218 trade-offs and synergies between RI and COVID-19 vaccinations is essential. Further  
219 studies are needed to understand which factors linked to the COVID-19 crisis impacted  
220 vaccination coverage, such as changes in health-seeking behaviours or non-pharmaceutical  
221 intervention policies, in order to successfully and efficiently address pandemic-associated  
222 losses to coverage.

223



224 **Conclusions**

225 As the COVID-19 pandemic continues to affect healthcare systems globally, maintaining the  
226 appropriate balance between access to routine immunisation and pandemic response will be  
227 essential to reduce both the direct and indirect mortality and morbidity associated with  
228 COVID-19. This research provides a transparent and replicable rationale for estimating gaps  
229 in RI coverage across countries, producing an objective measure for missed immunisations  
230 and coverage disruptions. As such, it can form a basis for identifying countries most affected  
231 by declines in RI coverage and prioritising efforts to alleviate the indirect impact of COVID-  
232 19.

233

234

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249 analysis, and interpretation of the data; preparation, review, or approval of the manuscript;  
250 and decision to submit the manuscript for publication.

251

252 **DATA SHARING**

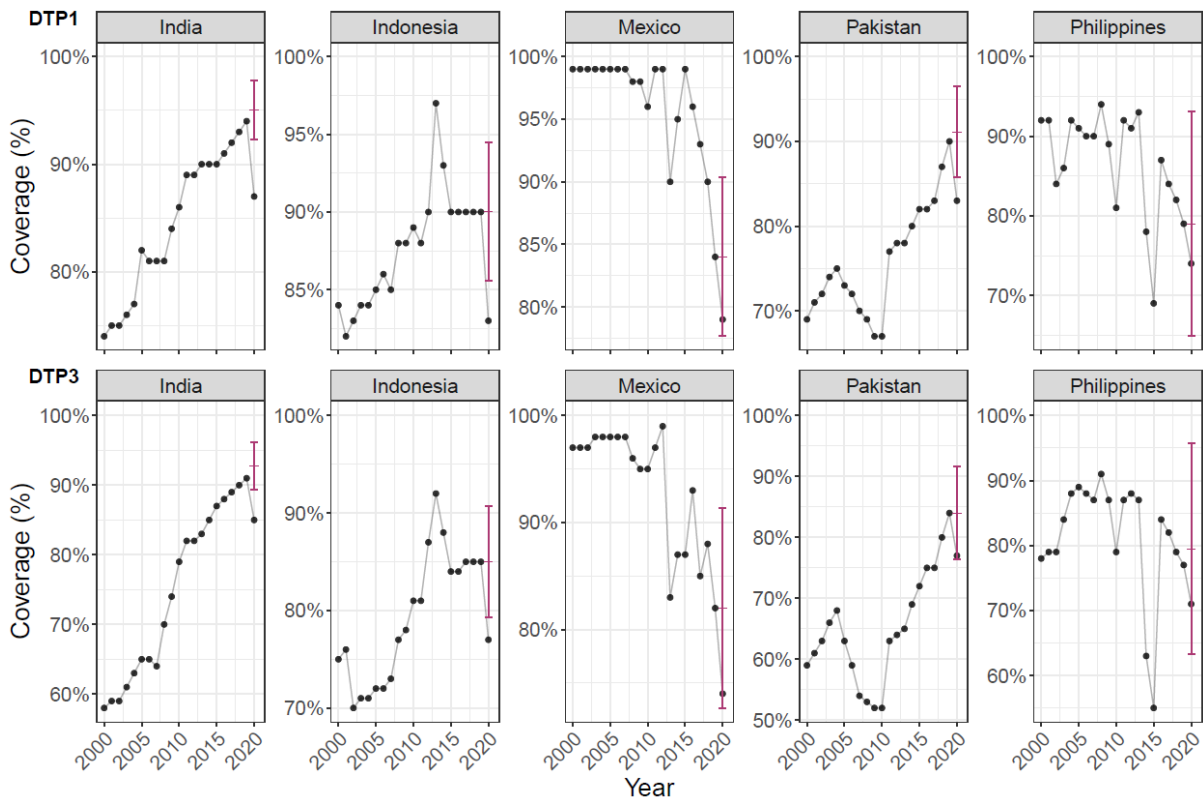
253 All analyses were conducted using free software R [16], and can be reproduced using a  
254 publicly available *reportfactory* including all required data and scripts [17] used to produce  
255 the results presented in this publication, and available on GitHub at:

256 [https://github.com/bevans249/modelling\\_covid\\_impact\\_RI](https://github.com/bevans249/modelling_covid_impact_RI)

257

258

259 **FIGURES**

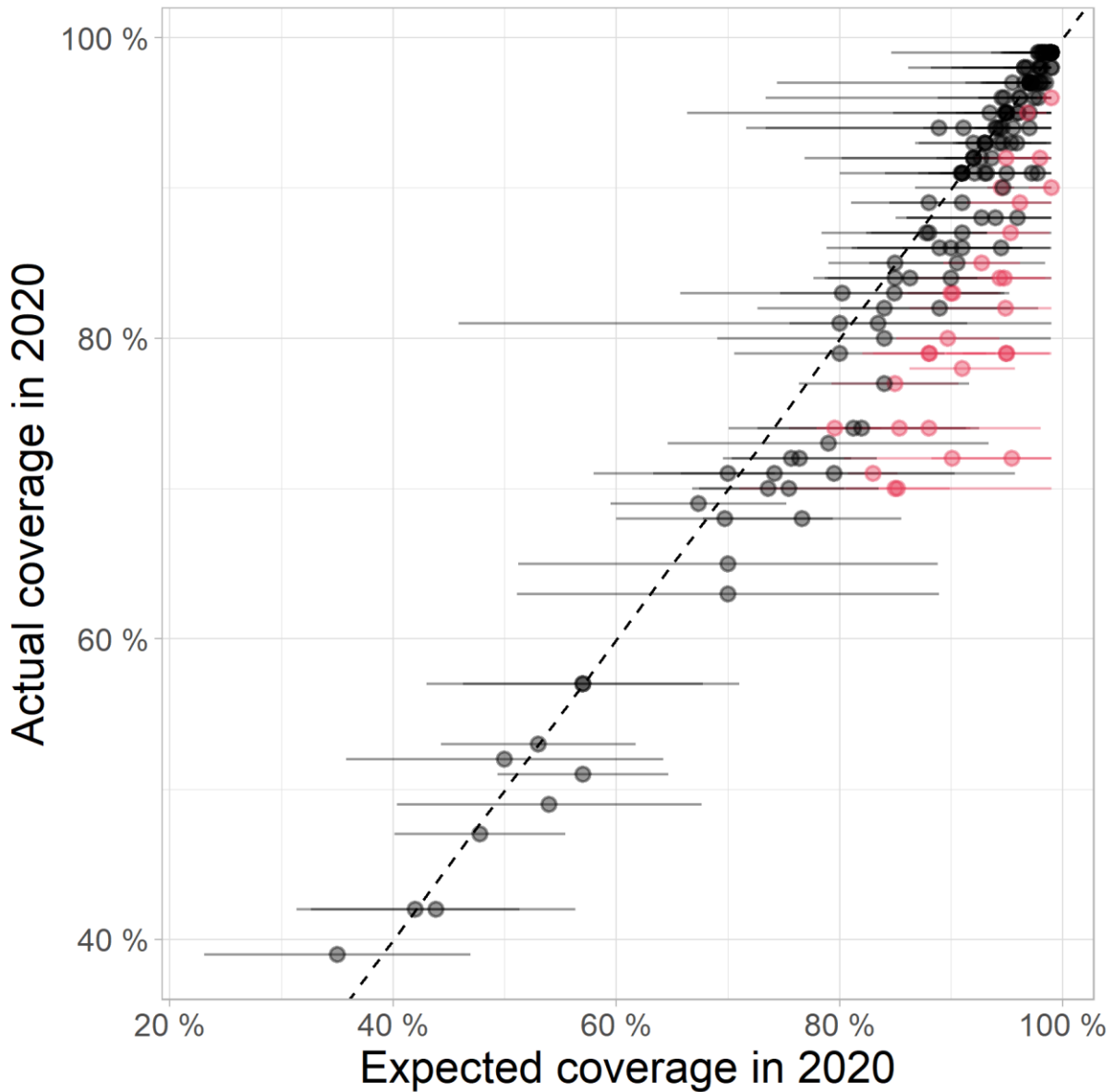


260

261 **Figure 1: Expected and reported 2020 vaccine coverage for DTP1 and DTP3: example of five**  
 262 **countries with most additional missed DTP3 immunisations in 2020.** These graphs show WUENIC-  
 263 reported coverage data (black dots) and the corresponding ARIMA predictions and the associated 95%  
 264 confidence intervals (red bars).

265

266



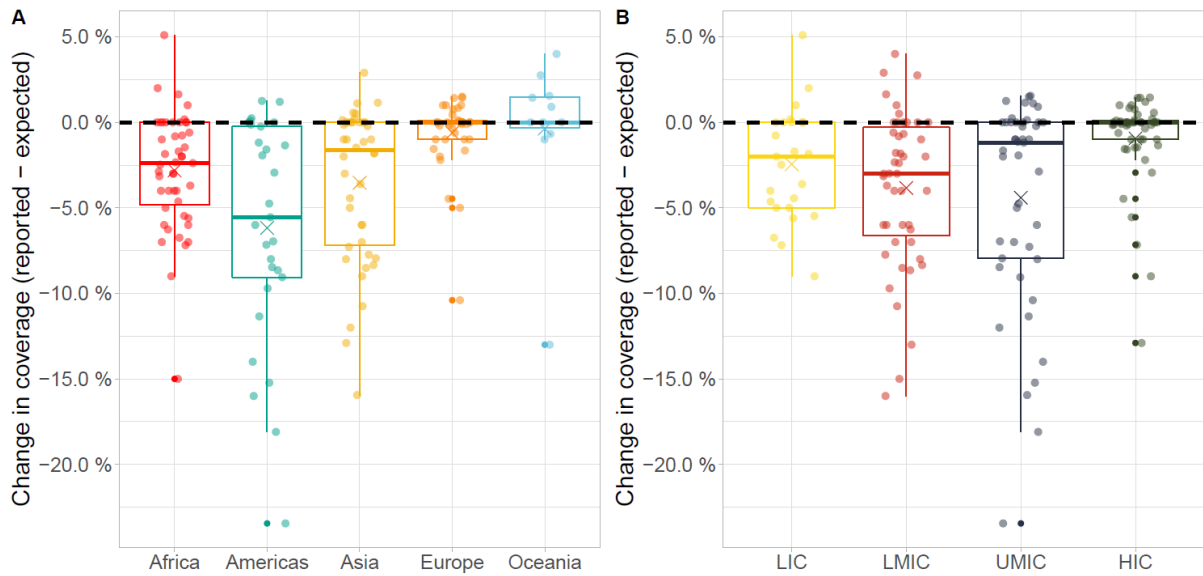
267

268 **Figure 2: Comparison between 2020 WUENIC-reported DTP3 coverage and expectations**

269 **derived from historical trends.** This scatterplot shows country coverage (WUENIC-reported actuals and  
 270 ARIMA-predicted expectations) as dots. Lines around individual points illustrate the 95% confidence intervals (CI)  
 271 of ARIMA predictions. Countries showing significant departure from expected values, *i.e.*, for which actual  
 272 coverage is outside the 95% CI of predictions, are indicated in red; countries without such significant departure  
 273 from expected results are shown in black.

274

275



276

277 **Figure 3: Differences between expected and reported DTP3 vaccine coverage in 2020 across**

278 **(A) UN regions and (B) income groups**

279 Points represent individual countries, grouped, and coloured according to (A) UN region classification and (B)

280 World Bank income groups. Country coordinates on the X-axis were jittered for visibility. Values on the y-axis are

281 indicated as absolute differences between reported and expected vaccine coverage, in percentages. Boxes show

282 the median (50%), upper (75%) and lower (25%) quartile changes in coverage for each group, with whiskers

283 extending to either the minimum/ maximum changes or the quartile value plus 1.5 times the interquartile range,

284 and crosses indicating the average. The black dashed horizontal lines indicate no change in coverage. LIC: Low-

285 income Country. LMIC: Lower-middle-income Country. UMIC: Upper-middle-income Country. HIC: High-income

286 Country

287

288

## 289 TABLES

290

291 Table 1: Estimated DTP3 coverage declines and missed immunisations for 10 countries with

292 most additional missed immunisations

Country	ISO code	UN region	Income group	ARIMA modelled DTP3 expected 2020 coverage [95% CI]	WUENIC reported 2020 DTP3 coverage	Change in DTP3 coverage (mean)	Total missed immunisations 2020	Additional missed immunisations 2020 (mean)
India	IND	Asia	LMIC	<b>92.7%</b> [ <b>89.3%</b> ; <b>96.2%</b> ]	<b>85.0%</b>	<b>-7.7%</b>	3,505,350	1,808,022
Pakistan	PAK	Asia	LMIC	84.0% [76.4%; 91.6%]	77.0%	-7.0%	1,309,160	398,439
Indonesia	IDN	Asia	LMIC	<b>85.0%</b> [ <b>79.3%</b> ; <b>90.7%</b> ]	<b>77.0%</b>	<b>-8.0%</b>	1,078,470	375,119
Philippines	PHL	Asia	LMIC	79.5% [63.3%; 95.7%]	71.0%	-8.5%	621,470	182,408
Mexico	MEX	Americas	UMIC	82.0% [72.7%; 91.3%]	74.0%	-8.0%	562,380	173,039
Uganda	UGA	Africa	LIC	<b>96.2%</b> [ <b>91.4%</b> ; <b>99.0%</b> ]	<b>89.0%</b>	<b>-7.2%</b>	176,000	114,949
Peru	PER	Americas	UMIC	<b>90.1%</b> [ <b>80.4%</b> ; <b>99.0%</b> ]	<b>72.0%</b>	<b>-18.1%</b>	159,040	102,807
Mozambique	MOZ	Africa	LIC	<b>88.0%</b> [ <b>82.0%</b> ; <b>94.0%</b> ]	<b>79.0%</b>	<b>-9.0%</b>	230,160	98,639
Argentina	ARG	Americas	UMIC	85.3% [78.9%; 91.7%]	74.0%	-11.3%	193,700	84,529
Iraq	IRQ	Asia	UMIC	81.3% [70.1%; 92.5%]	74.0%	-7.3%	288,600	80,770

293 Numbers displayed in bold font indicate significant differences between expected and observed coverage. LIC:

294 Low-income Country. LMIC: Lower-middle-income Country. UMIC: Upper-middle-income Country.

295

296

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359

## 360 **Conflict of interest**

361 The authors have no conflicts of interest to declare.