

1 **Incidence of HIV-positive admission and inpatient mortality in Malawi (2012-2019): a population**  
2 **cohort study**

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37  
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39  
40 **Key words**

41 HIV, epidemiology, hospital, mortality, ART, temporal trends  
42

43 **Abstract**

44

45 **Objective**

46 To investigate trends in population incidence of HIV positive hospital admission and risk of in-hospital  
47 death among adults living with HIV between 2012 and 2019 in Blantyre, Malawi.

48

49 **Design**

50 Population cohort study using an existing electronic health information system ('SPINE') at Queen  
51 Elizabeth Central Hospital and Blantyre census data.

52

53 **Methods**

54 We used multiple imputation and negative binomial regression to estimate population age- and sex-  
55 specific admission rates over time. We used a log-binomial model to investigate trends in risk of in-  
56 hospital death.

57

58 **Results**

59 Of 32,814 adult medical admissions during Q4.2012-Q3.2019, HIV status was recorded for 75.6%. HIV-  
60 positive admissions decreased substantially between 2012 and 2019. After imputation for missing  
61 data, HIV positive admissions were highest in Q3.2013 (173 per 100,000 adult Blantyre residents) and  
62 lowest in Q3.2019 (53 per 100,000 residents). An estimated 10,818 fewer than expected people living  
63 with HIV (PLHIV) (95%CI 10,068-11,568) were admitted during 2012-2019 compared to the  
64 counterfactual situation where admission rates stayed the same throughout this period. Absolute  
65 reductions were greatest for women aged 25-34 years (2,264 fewer HIV-positive admissions, 95%CI  
66 2,002-2,526). In-hospital mortality for PLHIV was 23.5%, with no significant change over time in any  
67 age-sex group, and no association with ART use at admission.

68

69 **Conclusions**

70 Rates of admission for adult PLHIV decreased substantially, likely due to large increases in community  
71 provision of HIV diagnosis, treatment and care. However, HIV-positive in-hospital deaths remain  
72 unacceptably high, despite improvements in ART coverage. A concerted research and implementation  
73 agenda is urgently needed to reduce inpatient deaths among PLHIV.

74

75 **Introduction**

76

77 The Joint United Nations Programme on HIV/AIDS (UNAIDS), national country HIV programmes and  
78 many other actors in the HIV community share a common goal to end AIDS as a public health problem  
79 by 2030. In sub-Saharan Africa, great progress has been made towards goals of achieving 95% of  
80 people living with HIV knowing their status, 95% of those who know their status to be taking  
81 antiretroviral therapy (ART), and 95% of those of those taking ART to have undetectable HIV viral loads.  
82 Malawi is one of countries worst affected by the HIV epidemic, with estimated adult HIV prevalence  
83 in 2019 of 8.9% nationwide and 17.7% in Blantyre City.<sup>1</sup> In the past two decades the Malawi national  
84 HIV programme has made excellent progress in providing HIV testing, ART and other HIV care services;  
85 in 2019, 90% of all PLHIV in Malawi knew their HIV status, 88% of those who knew their status were  
86 taking ART and 92% of those on ART were virally suppressed.<sup>2</sup>

87

88 Despite increasing population ART coverage, the number of PLHIV becoming unwell and attending  
89 hospital has remained high in several countries in Southern and Eastern Africa. For example, 60% of  
90 hospital admissions to a general hospital in South Africa were related to HIV in 2012-13, despite  
91 widespread ART availability in the community at that time.<sup>3</sup> Similarly, 50% and 42% of admissions to  
92 hospital in Lilongwe, Malawi between 2011 and 2012 and Kweneng East District, Botswana between  
93 2015 and 2016, respectively, were related to HIV.<sup>4,5</sup> Another study found that 83% and 97% of PLHIV  
94 admitted to hospitals in Kenya and DRC respectively had advanced immunosuppression (CD4 <200  
95 cells/mm<sup>3</sup>).<sup>6</sup> In general, hospital epidemiological data related to HIV in Southern and Eastern Africa is  
96 sparse. In Johannesburg, South Africa, 39% of people initiating ART in 2017 had CD4 <200, indicating  
97 that advanced HIV remains a persistent challenge.<sup>7-9</sup>

98

99 We used routine hospital data and city census data to investigate changes in HIV-positive hospital  
100 admissions to adult medical wards over time in Blantyre, Malawi, where there is only one public  
101 hospital serving the population, acting as both District General hospital and a tertiary referral hospital.  
102 The primary objective was to assess time trends in the incidence (i.e. number of hospital admissions  
103 per 100,000 population) of HIV-positive hospital admission for Blantyre residents between 2012 and  
104 2019. The secondary objective was to investigate whether hospital admission outcomes (died vs.  
105 discharged from hospital alive) for people living with HIV (PLHIV) have changed over time.

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111 **Methods**

112

113 *Setting*

114 Blantyre district contains the second largest city in Malawi (Blantyre City) and it's surrounding  
115 periurban / rural area. At the 2018 census, Blantyre district had a population of approximately 1.2  
116 million people with a median age 17 years.<sup>10</sup> One main government hospital (Queen Elizabeth Central  
117 Hospital, QECH) provides free secondary and tertiary care to the population of Blantyre, including  
118 inpatient medical care. There are some smaller private (including private-not-for-profit) hospitals  
119 accessed by a small sub-set of the population who can afford the fees, but the vast majority of people  
120 living in Blantyre rely on QECH exclusively for inpatient care. QECH provides a range of general medical  
121 services, HIV testing (provider-initiated testing and counselling [PITC]) and ART. QECH has 120 general  
122 adult medical beds and this capacity hasn't substantially changed between 2012 and present.

123

124 *Population and data sources*

125 Since late 2009 adult medical admissions to QECH have been recorded in in an electronic surveillance  
126 system (Surveillance Programme of IN-patients and Epidemiology [SPINE]) by data clerks working on  
127 both of the medical admissions wards.<sup>11</sup> For all patients admitted to the ward, data clerks recorded:  
128 sex, age, neighbourhood of residence, date of admission, HIV status, ART status and outcome  
129 (discharge from hospital alive vs. died prior to discharge). Individual patients are not linked over time,  
130 and results of CD4 cell counts or HIV viral load tests are not recorded. ART status was ascertained from  
131 medical notes or patient-held record ("health passport") during admission. Quality is assured by  
132 reconciling admissions with government paper ledgers, nurses' paper records and data clerks  
133 physically walking around bed spaces each morning. There was some interruption to SPINE data  
134 collection in 2011–2012, so we included medical admissions recorded by SPINE from October 2012 to  
135 September 2019. We removed duplicate records, records for people under 15 years old and records  
136 for inpatients who reported residing outside of Blantyre. We assumed that those with missing location  
137 data lived in Blantyre.

138

139 The government of Malawi conducted population censuses in 2008 and 2018. Mid-quarter population  
140 estimates for Blantyre (combining "Blantyre urban" and "Blantyre rural" districts) for each quarter  
141 between October 2012 and September 2019 were calculated by linear interpolation and  
142 extrapolation, by 10-year age group and sex.

143

144 *Statistical analysis*

145 Characteristics of patients admitted to QECH medical wards were summarised using percentages, and  
146 compared to interpolated Blantyre census data. Where data on HIV status, ART and outcome were

147 missing in SPINE, we used multiple imputation by chained equations (using the ‘mice’ package in R)  
148 with predictive mean matching to impute missing data.<sup>12</sup> Variables used for imputation were HIV  
149 status, age group, quarter-year, sex and outcome. Missing ART status for the small number of people  
150 who reported being HIV positive was also imputed based on above variables. Since ART status  
151 missingness is conditional on HIV status missingness, we did not impute ART status for people who  
152 had missing or unknown HIV status in SPINE. For the secondary outcome assessing associations with  
153 in-hospital death we assumed that everyone who was HIV positive (based in imputation) but had an  
154 unknown or missing HIV status in SPINE was not taking ART – this was not relevant for the primary  
155 outcome of incidence of admission. We imputed 25 datasets (reflecting the ~25% missingness of ART  
156 status), and combined model outputs across all 25 datasets using Rubin’s rules.<sup>13–15</sup> Sensitivity  
157 analyses were performed by conducting complete case analysis; for HIV-related admission incidence  
158 analysis, complete case analysis is equivalent to assuming all participants with unknown HIV status  
159 were HIV-negative.

160

161 We estimated the incidence of HIV-positive and HIV-negative admission to hospital among Blantyre  
162 residents per quarter-year between Q4.2012 and Q3.2019 overall, and separately for each age group-  
163 sex-quarter strata. To investigate trends in admission over time, we fitted a negative binomial  
164 regression model (because the data were overdispersed) with interactions between age group, sex  
165 and quarter, and a natural cubic spline term with three knots for annual quarter. Age group and sex  
166 were included as interaction variables in the models *a priori* because there are sex and age-group  
167 specific differences in HIV incidence, prevalence, and access to testing and ART services. We  
168 performed sensitivity analyses using the Poisson and gamma response distributions, and separately  
169 without spline terms.

170

171 To quantify the magnitude of change in admissions over the study period overall, and for each age  
172 group-sex strata, we calculated the expected number of admissions under the counterfactual  
173 condition where the incidence of HIV positive admission remained constant as the model predicted  
174 for Q4.2012 (ie. the first quarter of observation) over the entire study period, and subtracted from the  
175 model-predicted number of admissions. Confidence intervals were estimated using parametric  
176 bootstrap resampling.

177

178 Temporal trends in the risk of inpatient death were analysed using a generalised linear model with  
179 log-binomial link function to approximate risk of death. Age group and sex were included as  
180 interaction variables *a priori*. We investigated whether adding ART use at admission (including ART

181 used as an interaction variable with age, sex and quarter-year) improved model fit using Akaike  
182 information criteria.

183

#### 184 *Ethical approval, funding and data sharing*

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186 Use of anonymous electronic data (from SPINE project) was approved by QECH hospital research  
187 committee. Individual patient consent for anonymised secondary analysis was not sought.

188

189 All code for analyses, Blantyre census dataset, datapoints from figures and a ‘synthetic’ (i.e. artificial  
190 data that mimics properties of real data) dataset for hospital admissions are available online at  
191 <https://rachaelmburke.github.io/hivhospital/>. Synthetic data was created using synthpop package.<sup>16</sup>

192 Further details including how to access real data are included in data sharing statement.

193

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196 206575/Z/17/Z, respectively).

197

## 198 **Results**

199

200 During the 28 quarters between October 2012 and September 2019, there were 32,814 medical  
201 admissions to QECH among adults (age  $\geq$  15 years) who resided in Blantyre (median quarterly  
202 admissions 154 per 100,000 people). There were a further 5,511 people admitted to QECH who  
203 reported residing outside of Blantyre, and their data were excluded from this analysis. Fifty percent  
204 (16,408) of these were known to be HIV-positive, and in 24% (7,996) of admissions, HIV status was  
205 unknown (Table 1).

206

#### 207 *Incidence of HIV related admission*

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209 The median number of known HIV-positive admissions (i.e. before imputation for missing HIV status)  
210 to QECH per quarter-year was 592 (80 per 100,000 Blantyre population). It was highest in Q3 2014  
211 (767 known-HIV admissions, 110 per 100,000) and lowest in Q2.2019 (343 known HIV admissions, 44  
212 per 100,000) in Q2 2019. In contrast, known HIV-negative admissions were at their lowest towards  
213 the start of the study period, with 160 admissions (23 per 100,000 population) in Q3 2013 and highest  
214 in Q3.2019 with 482 admissions (61 per 100,000). The number of admissions with unknown or missing  
215 HIV status decreased throughout the study period, with a 695 admissions with HIV status missing or

216 unknown in Q3 2017 (102 per 100,000) and 104 HIV unknown admissions in Q1.2017 (13 per 100,000).  
 217 The proportion of people currently taking ART among known PLHIV admitted to hospital increased  
 218 from 66% (363/550) in Q4 2012 to 94% in Q3 2019 (372/402); the denominator includes those who  
 219 knew their HIV status prior to admission and those newly diagnosed in hospital, but not those who  
 220 had missing or unknown HIV status recorded. Supplementary Figures 1A-C show HIV status, absolute  
 221 number and population incidence of admissions over time. The adult Blantyre mid-year census  
 222 population was 577,893 in 2008 and was 764,323 in 2018. The estimated population in February 2016  
 223 (i.e. the mid study period) was 722,377 (Supplementary Table 1B).

224

225 **Table 1** Characteristics of adult medical admissions to Queen Elizabeth Central Hospital, Malawi, Q4  
 226 2012 – Q3 2019, and population demographics of Blantyre in Feb 2016 (midpoint Q3 2012 – Q3 2019)

	<b>Adult medical admissions Oct 2012 to Sept 2019 (N=32,814)</b>	<b>Blantyre population estimates Feb 2016 (N=722,377)</b>
<b>Age (years)</b>		
15-24	4,808 (14.7%)	270,260 (37.4%)
25-34	8,404 (25.6%)	197,589 (27.4%)
35-44	8,161 (24.9%)	131,376 (18.2%)
45-54	4,074 (12.4%)	60,267 (8.3%)
55-64	2,968 (9.0%)	32,416 (4.5%)
65+	4,399 (13.4%)	30,469 (4.2%)
<b>Sex</b>		
Females	16,618 (50.6%)	361,988 (50.1%)
Males	16,196 (49.4%)	360,389 (49.9%)
<b>HIV status</b>		
Negative	8,410 (25.6%)	
Positive	16,408 (50.0%)	
Missing or unknown	7,996 (24.4%)	
<b>ART status (HIV positive only)</b>		
Currently taking ART	13,074 (79.7%)	
Not currently taking ART	3,050 (18.6%)	
Missing or unknown	284 (1.7%)	
<b>Outcome from hospital admission</b>		
Alive	24,056 (73.3%)	
Dead	6,071 (18.5%)	
Missing or unknown	2,687 (8.2%)	

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230 *Multiple imputation and modelling trends in incidence of HIV-related hospital admission*

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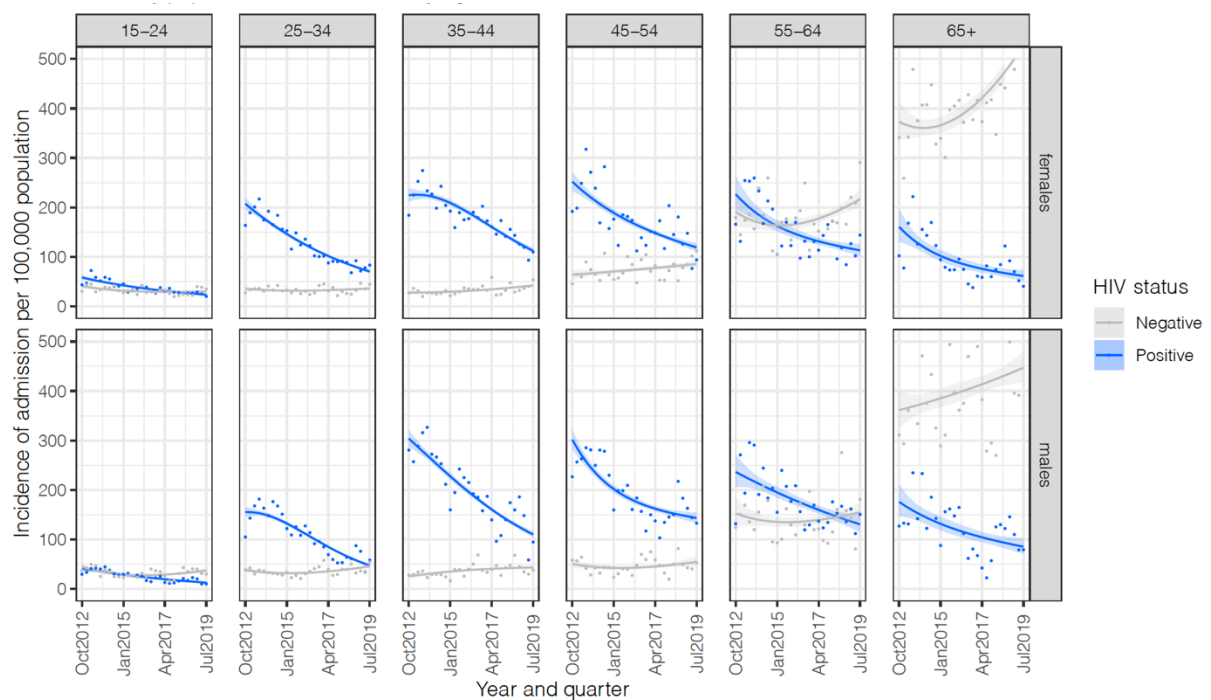
232 After using multiple imputation to impute HIV status for the 24% (7,996/32,814) of people where it  
233 was unknown, estimated true HIV positive admissions were highest in Q3.2013 with 1169 admissions  
234 (173 per 100,000) and lowest in Q2.2019 with 417 admissions (53 per 100,000). If we assume that all  
235 those with missing or unknown HIV status in SPINE but who were HIV positive based on imputation  
236 were not taking ART, then ART coverage increased from 48% in Q4.2012 to 76% in Q3.2019.

237

238 Using regression modelling with parameters averaged across 25 multiply-imputed datasets, we  
239 estimate that the true number of HIV-positive hospital admissions between Q4.2012 and Q3.2019  
240 (inclusive) was 21,170 (95% confidence interval [CI] 20,411–21,928). Between October 2012 and  
241 September 2019, the modelled trend of incidence of HIV-positive hospital admission in Blantyre  
242 decreased in all age and sex groups (Figure 2). In sensitivity analysis, this overall finding was robust to  
243 reclassification of missing HIV data (Table 2 and Supplementary Figures 2A and 2B), and to model  
244 specification (Supplementary Figures 3A-3D).

245

246 **Figure 1:** Population incidence of hospital admission to medical wards QECH by HIV status Q3 2012 –  
247 Q3 2019.



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250 If the age group- and sex-specific incidence of HIV related hospital admissions had stayed the same  
251 throughout the period October 2012–September 2019 as it was in Q4.2012, then we would have



252 expected to see 31,988 (95% CI 31,229–32,746) HIV-positive admissions, taking into account the  
253 increasing population of Blantyre. Therefore, we estimate that there were 10,818 (95% CI, 10,060–  
254 11,577) fewer HIV-positive admissions during this period than there would have been under  
255 counterfactual scenario where incidence of admission had remained constant during this period  
256 (Table 2). This is equivalent to 33.8% fewer HIV-positive admissions (95% CI 32.3% to 35.4%).

257

258 The greatest reductions in absolute numbers of admissions compared to expected number of  
259 admissions had there been no change in population incidence of admission were in women aged 25–  
260 34 years old and men aged 35–44 years old. The smallest magnitude of absolute decline in admissions  
261 were in men aged 55–64 years old and men age 65+ (Figure 2 and Supplementary Table 2).

262

263 These estimates were robust to reclassification of missing HIV status. If all admissions with missing  
264 HIV status were considered to be HIV-negative we estimate there would have been 3,854 (95% CI:  
265 3,453 to 4,255) fewer HIV-positive admissions (equivalent to a 19.0% decrease), and if all admissions  
266 with unknown HIV status were considered HIV-positive, there would have been 13,865 (95% CI: 13,050  
267 to 14,681) fewer admissions (equivalent to a 36.2% decrease). In the sensitivity analysis scenario  
268 where all patients with missing HIV status were classified as HIV-negative, while overall HIV-positive  
269 admissions decreased, but there was no decrease in admissions among women aged 45 years or older,  
270 nor among men aged 65 years or older (Supplementary Table 2 and Supplementary Figure 2B).

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272 During this period the incidence of HIV negative hospital admissions stayed the same or increased in  
273 all age and sex groups (Figure 2) and increased substantially among those 65 years or older.

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276 **Table 2:** Estimates of magnitude of reduction of HIV-related admissions

Scenario	Model predicted HIV-related admissions (Q4. 2012 – Q3. 2019), 95% confidence interval			
	Number of HIV-related admissions predicted if incidence was the same throughout period as it was in Q4.2012 (A)	Estimated number of HIV-related admissions from regression model (B)	Absolute number fewer HIV-related admissions (A-B) *	Relative percentage decline in HIV related admissions (A-B / A) *
HIV status imputed when missing	31,988 (31,268 to 32,708)	21,170 (21,109 to 21,230)	10,818 (10,093 to 11,544)	33.8% (32.3 to 35.4%)
All HIV unknown / missing positive	38,270 (37,457 to 39,082)	24,404 (24,344 to 24,465)	13,865 (13,050 to 14,681)	36.2% (34.8 to 37.6%)
All HIV unknown / missing negative	20,262 (19,863 to 20,660)	16,408 (16,372 to 16,443)	3,854 (3,453 to 4,255)	19% (17.3 to 20.7%)

\* Compared to counterfactual if admission incidence had stayed the same as it was in Q4.2012.  
95% confidence intervals estimated through parametric bootstrapping of 25 multiply-imputed datasets

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281 *Outcomes for PLHIV admitted to QECH*

282 Overall, 18.5% (6,071/32,814) of adults admitted to QECH died during their admission, and a further  
283 8% (2,687 / 32,814) had unknown outcome or missing outcome data. After multiple imputation, we  
284 estimate the proportion of adult medical inpatients who died to be 20.3% overall and 23.5% among  
285 PLHIV (Table 3). Supplementary Table 3A and 3B show outcomes by age group and sex.

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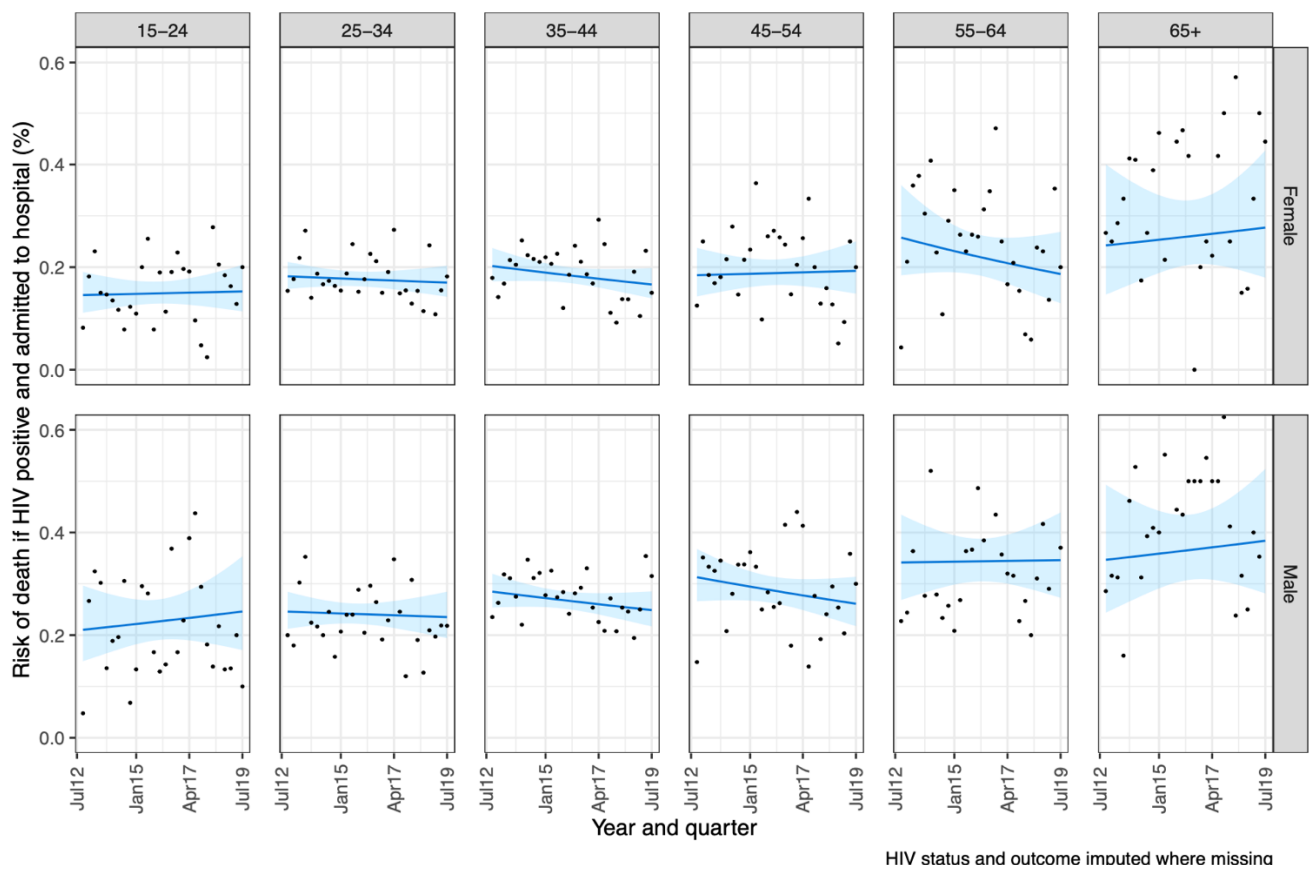
287 **Table 3:** Outcome of hospital admission (dead or discharged alive) by HIV and ART status

	Alive	Dead	Outcome missing	Overall
<b>Data without imputation</b>				
HIV negative	6767 (80.5%)	952 (11.3%)	691 (8.2%)	8410 (100%)
HIV positive (overall)	11387 (69.4%)	3276 (20.0%)	1685 (10.3%)	16408 (100%)
HIV positive, ART status unknown	177 (62.3%)	53 (18.7%)	54 (19.0%)	284 (100%)
HIV positive, not on ART	2200 (72.1%)	558 (18.3%)	292 (9.6%)	3050 (100%)
HIV positive, on ART	9070 (69.4%)	2665 (20.4%)	1339 (10.2%)	13074 (100%)
HIV status unknown or missing	5842 (73.1%)	1843 (23.0%)	311 (3.9%)	7996 (100%)
<b>TOTAL</b>	24056 (73.3%)	6071 (18.5%)	2687 (8.2%)	32814 (100%)
<b>Data with imputation (mean of 25 imputations)</b>				
HIV negative	9935 (85.4%)	1701 (14.6%)	-	11636 (100%)
HIV positive (overall)	16249 (76.7%)	4929 (23.3%)	-	21178 (100%)
HIV positive, no ART status as HIV status imputed (likely no ART)	3495 (73.3%)	1275 (26.7%)	-	4770 (100%)
HIV positive, not on ART	2482 (79.5%)	640 (20.5%)	-	3122 (100%)
HIV positive, on ART	10272 (77.3%)	3014 (22.7%)	-	13286 (100%)
<b>TOTAL</b>	26184 (79.8%)	6630 (20.2%)	-	32814 (100%)

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Risk of inpatient death did not change over the study period overall, or within any age-sex subgroups (Figure 2 and Supplementary Table 4). This finding was robust to sensitivity analyses for misclassification of HIV status and outcome (complete case analysis - Supplementary Figure 4). Reported ART use at admission did not affect the risk of in-hospital death and did not improve the model fit (Supplementary Figure 5); Akaike information criteria statistics were higher in models that included ART as a covariate in all 25 imputed datasets. Risk of death was higher for people living with HIV than people without HIV in all age and sex groups (Table 3, Supplementary Table 3, and Supplementary Figure 6).

**Figure 2:** Risk of inpatient death among PLHIV if admitted to Queen Elizabeth Central Hospital, Malawi, Q3 2012 – Q3 2019. Log-binominal model.



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306 **Discussion**

307

308 We used electronic inpatient records and national census data to show that between 2012 and 2019,  
309 per capita rates of HIV-positive medical admissions in Blantyre, Malawi decreased substantially. There  
310 were an estimated 10,818 (95% CI: 10,068 to 11,568) fewer HIV-positive admissions to the single  
311 public hospital than would have been expected if admission rates had been unchanged from the last  
312 quarter of 2012. These data were adjusted for population growth, and excluded tertiary admissions  
313 referred from districts outside of Blantyre. The likely driver was ART scale-up, with substantial  
314 increases in community ART coverage during this time, consistent with the observed increase in the  
315 proportion of HIV-positive patients already on ART at the time of admission. Once admitted, however,  
316 mortality remained extremely high with 23.5% of PLHIV dying before discharge, no obvious  
317 improvements over time, and no benefits from being on ART at the time of admission. High in-patient  
318 mortality following medical admission in Africa is a critical issue that needs to be investigated and  
319 addressed urgently.

320

321 The substantial reduction in admission rates is an encouraging finding, and is congruent with other  
322 data which indicate that the proportion of people living with HIV in Blantyre who know their status,  
323 are on treatment, and are virally suppressed and therefore not experiencing medical complications has  
324 increased considerably between 2012 and 2019,<sup>2</sup> a tremendous testament to the Malawian National  
325 HIV Programme. Alternative explanations for our findings are less likely. Queen Elizabeth Central  
326 Hospital is the single government hospital for the city, and care has remained free of charge and  
327 available to the population with no substantial changes or prolonged disruption to services during this  
328 time. Of note, this analysis ends in September 2019, before any COVID-19 related disruption.  
329 Incidence of HIV-negative hospital admissions stayed the same or increased in every age and sex group  
330 during this time, consistent with investments in health system strengthening and indicating that the  
331 decline in HIV positive admissions is not a data capture issue.

332

333 To put these results into context; estimated national adult HIV prevalence in Malawi was relatively  
334 static between 2012 and 2019, although AIDS deaths and new HIV infections fell, concurrent with  
335 rising coverage of ART.<sup>17</sup> There are limited subnational HIV estimates for Blantyre derived from Naomi  
336 / Spectrum model, with estimates available for March 2016 and December 2019 only.<sup>18,19</sup> Similar to  
337 the national picture, Blantyre adult HIV prevalence was largely unchanged: 17.0% in March 2016 and  
338 16.7% in December 2019. Blantyre ART coverage increased, from 60.1% in March 2016 to 73.6% in  
339 December 2019; which is similar to our observed ART coverage. Nationally, the peak of AIDS related  
340 deaths in Malawi was in 2004 with 71,000 deaths, several years before the SPINE database was

341 instituted. Between 2012 and 2019 (i.e. the dates of this analysis) national HIV related deaths declined  
342 from 24,000 annually to 13,000, with steeper declines at the start of this time period. There are no  
343 subnational estimates for deaths. As a rough estimate - assuming that the proportion of HIV related  
344 deaths in Blantyre vs. rest of Malawi is the same as the proportion of people living with HIV in Blantyre  
345 vs. rest of Malawi - in 2018 between one quarter and one third of all Blantyre HIV related deaths  
346 occurred in QECH and were captured in this analysis. Our hospital observations are consistent with  
347 the modelled national and subnational trends – this analysis provides a further demonstration from  
348 empiric longitudinal data (rather than modelled data) of the impact of ART on the HIV epidemic in  
349 Malawi.

350

351 Once admitted to medical wards the risk of in-hospital death remained high and unchanged  
352 throughout the seven-year study period, being 23.5% for HIV-positive medial inpatients and 14.5% for  
353 HIV-negative inpatients, once missing HIV status and outcomes were imputed. Although ART coverage  
354 among PLHIV admitted to hospital increased substantially between 2012-19 (commensurate with  
355 increasing population ART coverage), taking ART at admission did not alter risk of death. The impact  
356 of virological failure in this cohort can only be inferred, as HIV viral load measurement on admission  
357 is not currently supported by the routine medical services, and data on HIV viral loads are not routinely  
358 captured. Studies that have measured HIV virologic failure among people in hospital have shown  
359 similarly high mortality and high levels of proven HIV virologic failure among people admitted to  
360 hospital. In the STAMP trial in 2015 to 2017 in Zomba Central Hospital, Malawi (in a nearby district to  
361 Blantyre), 32% of all PLHIV admitted to hospital had confirmed HIV virologic failure and this was  
362 associated with increased risk of death.<sup>20</sup> Other African studies report a high prevalence of HIV  
363 virologic failure among PLHIV admitted to hospital; 63% and 62% in Kenya and Democratic Republic  
364 of Congo, respectively.<sup>6</sup> In a predictive model developed using STAMP data and validated on cohorts  
365 from another multi-centre trial and a cohort in Kenya, use of ART at admission to hospital was  
366 associated with increased risk of death by two months from admission.<sup>21</sup> In the present analysis, use  
367 of ART made no difference to risk of in-hospital death.

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369 At the start of the study period slightly less than half of all people with HIV were taking ART. It is  
370 possible that, for those that survived the acute illness that precipitated admission, effective ART could  
371 be started and outcomes may be relatively favourable. By the end of the study period three quarters  
372 of HIV positive people admitted to hospital were taking ART. If a substantial proportion of those on ART  
373 had HIV virologic failure and were not switched to effective ART, then they may be discharged with  
374 their acute illness treated, but the underlying immunosuppression that precipitated the illness  
375 unresolved. At present, WHO guidelines for managing confirmed or suspected HIV virologic failure do

376 not distinguish between stable ambulatory outpatients and unwell patients admitted to hospital, and  
377 recommend enhanced adherence counselling following identification of an elevated HIV viral load.<sup>22</sup>  
378 There are scant data to address this issue or provide guidance as which groups of people require  
379 urgent ART switch and in which groups of people adherence counselling and repeat viral load may be  
380 appropriate.

381  
382 In a meta-analysis of PLHIV admitted to hospital, AIDS-related conditions (including tuberculosis and  
383 cryptococcal meningitis) and severe bacterial infections were the most common causes of admission  
384 and death,<sup>23</sup> consistent with previous data from QECH about cause of admission,<sup>11</sup> and suggesting that  
385 for most people living with HIV their HIV status is not incidental to the reason for hospital admission.  
386 Two trials have shown that urine-based TB diagnostics reduce deaths of PLHIV in hospital,<sup>20,24</sup> and  
387 several trials have shown effectiveness of newer antifungal treatments for cryptococcal  
388 meningitis.<sup>25,26</sup> However, there are no trials of pragmatic management protocols (which might include  
389 a package of diagnostics), or of interventions to optimise management of virological failure among  
390 people in hospital. In the era of universal ART coverage, PLHIV admitted to hospital should be  
391 managed with great urgency, given their high risk of imminent death, and we urge more trials to  
392 produce evidence-based pragmatic management protocols similar to those recently developed for  
393 patients with low CD4 counts.<sup>27,28</sup>

394  
395 There are some limitations to this work. We do not have information on cause of admission or cause  
396 of death for those who died. Similarly, we do not have information on HIV viral loads or CD4 counts,  
397 to be able to measure prevalence of advanced HIV or HIV virologic failure directly. There was no follow  
398 up beyond length of hospital stay to ascertain mortality in the immediate period after admission.  
399 Malawi has very recently switched first-line ART to a dolutegravir-based regimen, away from reliance  
400 on non-nucleoside reverse transcriptase inhibitors (NNRTIs), including switching those who are stable  
401 on NNTRI-containing ART regimens; the switch occurred in 2019, but this is too early to observe if this  
402 will have causes any change in HIV related hospital admissions. QECH has a large outpatient ART  
403 service, so it is possible that people who were taking ART were more likely than those not on ART to  
404 be admitted to hospital (either due to emergency referral from ART clinic or from being familiar with  
405 services available at the hospital). This might mean that the proportion of inpatients taking ART is  
406 higher than the proportion of all people who are sick (but don't access QECH hospital care) who are  
407 taking ART.

408  
409 In conclusion, the incidence of HIV-positive hospital admission in Blantyre has substantially reduced  
410 in the seven years between Q4.2012 to Q3.2019, in keeping with impressive gains in coverage of HIV

411 testing, treatment and care in Malawi during this period. However, PLHIV who were admitted to  
412 hospital continued to experience extremely high in-hospital mortality that did not change throughout  
413 this period. This suggests that advanced HIV and HIV-related complications remain persistent clinical  
414 and public health challenges, even as large improvements are made in providing HIV testing and care  
415 services to the majority of community members in Malawi. Interventions to reduce deaths in PLHIV  
416 following admission to hospital, including prompt management of HIV virologic failure in unwell and  
417 unstable patients, are an urgent research priority.

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- 482
- 483

484 **List of tables and figures**

485

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495

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512

513

514 **Data sharing statement**

515

516 All code for analysis and the Blantyre Census population denominator data is freely available online  
517 at <https://rachaelmburke.github.io/hivhospital/>. Unrestricted access to the SPINE dataset cannot be  
518 provided due to risk of reidentification of individuals. Instead a “synthetic” dataset is provided,  
519 created using ‘synthpop’ package in R statistical software. Synthetic data is artificial data that mimics  
520 some properties of the real data. It is intended to be used to be able to run and understand our code,  
521 but is not suitable for use in further analyses.

522

523 The Malawi Liverpool Wellcome data department may be able to facilitate access to the real SPINE  
524 dataset and can be contacted on [data@mlw.mw](mailto:data@mlw.mw). Permission from QECH hospital is likely to be  
525 required. The first ([rachael.burke@lshtm.ac.uk](mailto:rachael.burke@lshtm.ac.uk)) and last author ([peter.macpherson@lstmed.ac.uk](mailto:peter.macpherson@lstmed.ac.uk))  
526 can also be contacted to enquire about how to access SPINE data.

527

528 The dataset used for this cannot be analysis is anonymous and contains six variables (age, date of  
529 admission, sex, HIV status, ART status and outcome). Some of these combinations of variables include  
530 only one person and there is a theoretical risk of re-identification and disclosure of HIV status.  
531 Therefore it cannot be shared without restriction.

532

533 **Pre print server**

534

535 A earlier version of this manuscript is available on SSRN pre-print server (“Preprints with the lancet”)

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537 Burke, Rachael Mary and Henrion, Marc Y. and Mallewa, Jane and Masamba, Leo and Kalua,  
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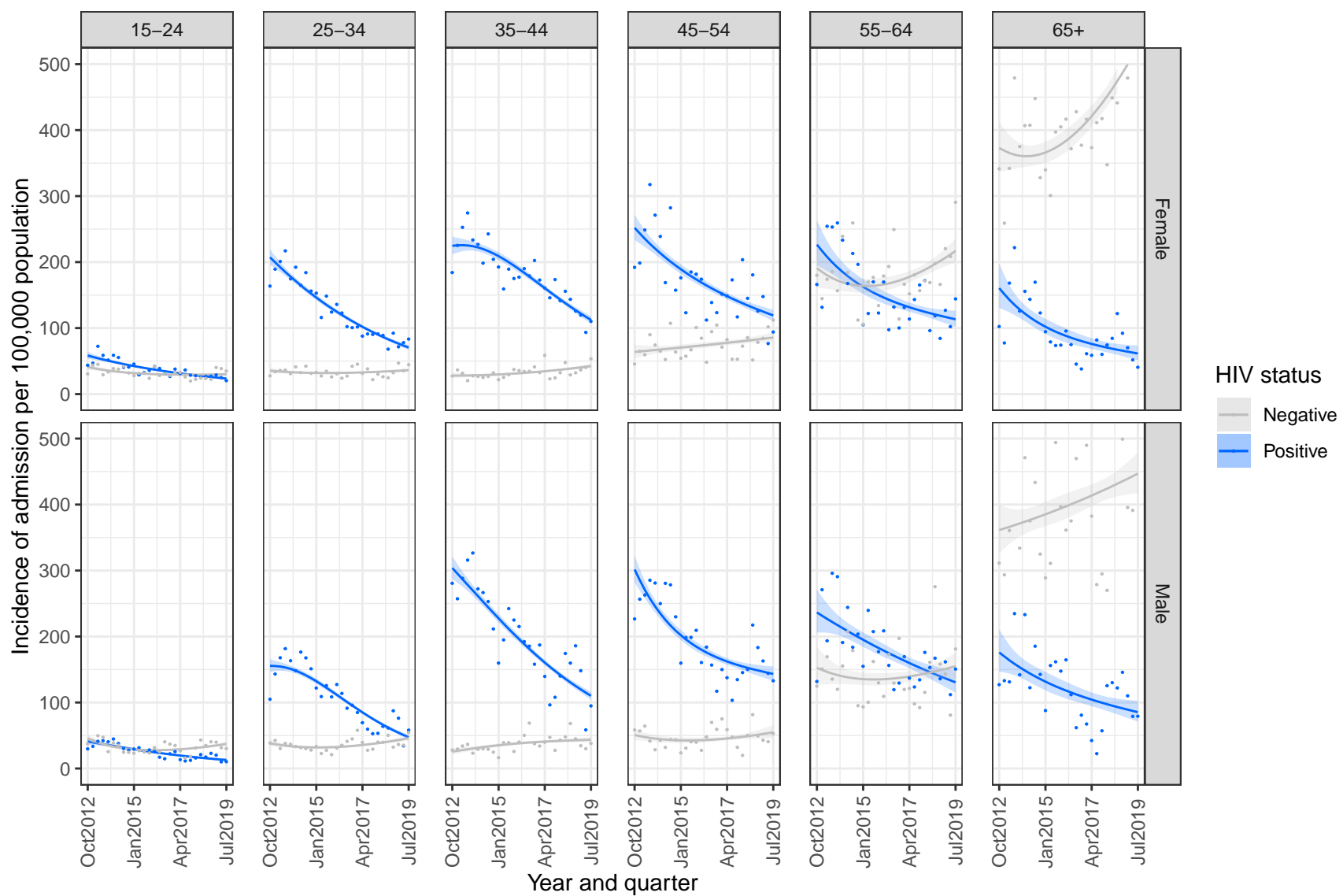
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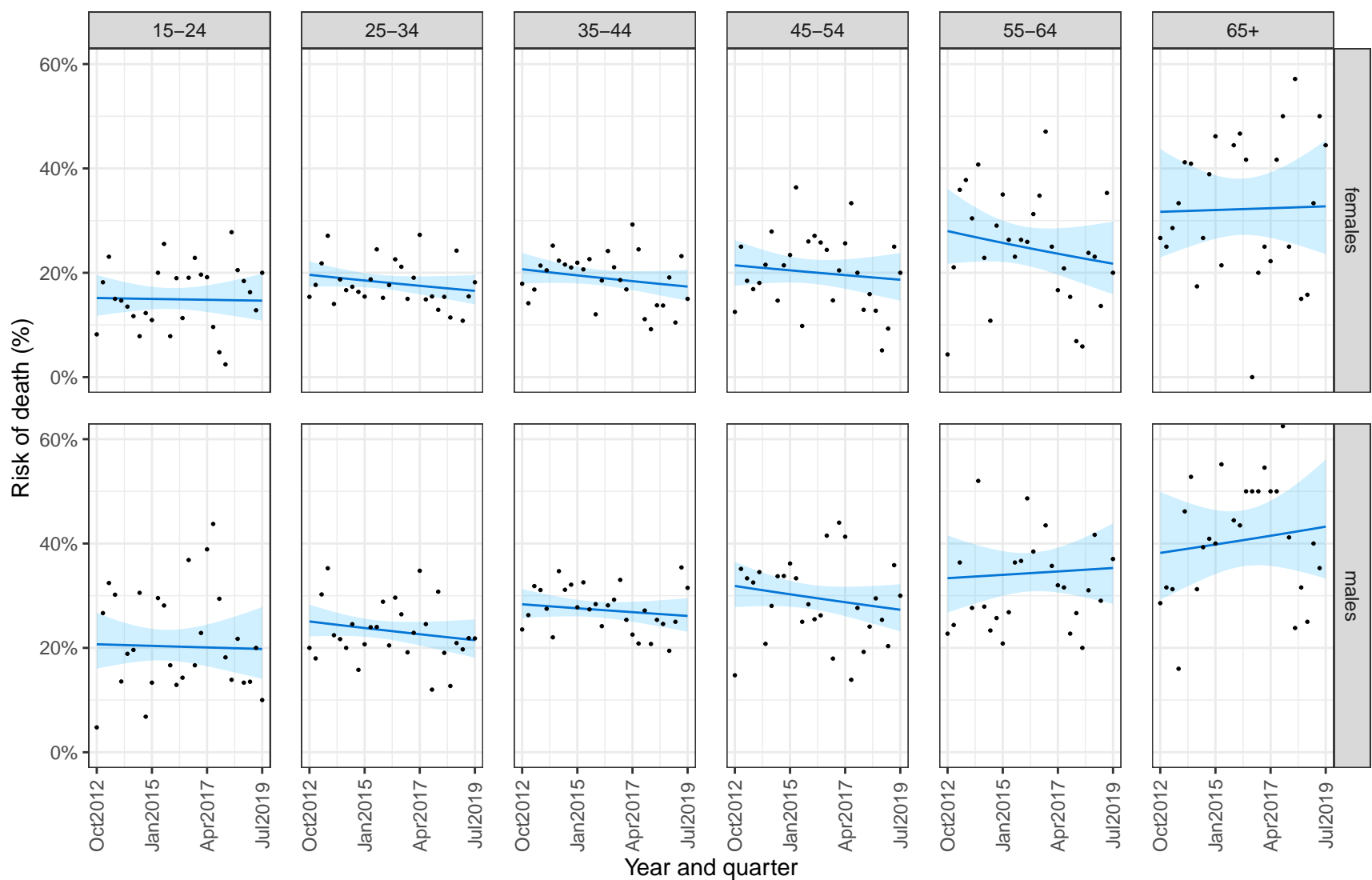
545

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547 JM, LM, CM. Performed or assisted with statistical analysis: RMB, MYRH, MK, PM. Wrote first draft:  
548 RMB, PM. Contributed to writing manuscript and putting research in context: RMB, JM, LM, AGW, JR,  
549 TK, SBG, HM. All authors approved final draft.

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551





HIV status and outcome imputed where missing