A model of COVID-19 pandemic evolution in African countries taking into account the impact of vaccination

Dephney Mathebula^{a,*}, Abigail Amankwah^b, Kossi Amouzouvi^c, Kétévi A. Assamagan^{d,*}, Somiéalo Azote^e, Jesutofunmi Ayo Fajemisin^f, Jean Baptiste Fankam Fankam^g, Aluwani Guga^h, Moses Kamwelaⁱ, Toivo S. Mabote^j, Mulape M Kanduza^k, Francisco Fenias Macucule^j, Azwinndini Muronga^h, Ann Njeri¹, Michael Oluwole^m, Cláudio Moisés Paulo^j ^aUniversity of South Africa, Department of Decision Sciences, South Africa ^bAfrican Institute for Mathematical Sciences(AIMS)-Ghana ^cKwame Nkrumah University of Science and Technology, Ghana

^dBrookhaven National Laboratory, Physics Department, Upton, New York, USA ^eUniversité de Lomé, Département de Physique, Lomé, Togo ^fUniversity of South Florida, Department of Applied Physics Tampa, Florida, USA ^gUniversity of Yaounde I, Department of Physics, Yaounde, Cameroon ^hNelson Mandela University, South Africa ⁱLusaka Apex Medical University, Zambia ^jUniversidade Eduardo Mondlane, Grupo de Astrofísica, Ciências Espaciais e Inteligência Artificial, Maputo, Mozambique ^kCancer Diseases Hospital, Lusaka, Zambia ^lUniversity of Manchester, UK ^mUniversity of Ibadan, Nigeria

Abstract

A study on the COVID-19 pandemic evolution in selected African countries was carried out in this paper. For each of the considered countries, the data of the active, recovered, and death cases were modelled simultaneously taking into account the impact of vaccination. In this study, which is a continuation of previous work reported in [9] we are using two years of data since the announcement of the first case in each country.

Keywords: COVID-19, *SIDARTHEV*, Basic Reproduction Number, SARS-CoV-2, Vaccination

Preprint submitted to Journal of Epidemiology, Elsevier

^{*}Corresponding Authors

Email addresses: mathed2@unisa.ac.za (Dephney Mathebula), ketevi@bnl.gov (Kétévi A. Assamagan)

1 1. Introduction

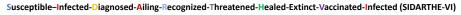
² Coronavirus disease 2019 (COVID-19) that is caused by severe acute respiratory
³ syndrome coronavirus 2 (SARS-CoV-2) continues to spread across the globe
⁴ since 2019 [1]. COVID-19 continues to spread in spite of the implementation
⁵ of different control measures such as social distancing, wearing of face masks,
⁶ sanitation, lock-down, vaccination and many more.

To Be Continued

The rest of the paper is organised as follows. In Section 2, we present the formulation of *SIDARTHEV* model taking into account infectious vaccinated individuals. In Subsection 2.1, we present the analysis of COVID-19 data taking into account the transmission dynamics of COVID-19 since the vaccination program started in each country of the following countries: Nigeria, South Africa, Mozambique, Cameroon, Ghana and Zambia considered in this study. In Section 3, we present the discussion of the analysis of COVID-19 data results followed by discussion and conclusion, respectively.

¹⁶ 2. Formulation of SIDARTHE model taking into account infectious ¹⁷ vaccinated individuals

The *SIDARTHEV* model is an extension of the SIDARTHE model that we 18 considered in the previous study [9]. With this model, we focus on the re-19 sults during the vaccination process, but relying on the SIDARTHE model for 20 those sections where vaccination data is lacking. Contrary to the SIDARTHE 21 model which is based in the assumption that all vaccinated are immunized, 22 SIDARTHEV model assumes that vaccinated, in the V compartment, can 23 still get infected and become infectious just like for non-vaccinated susceptible, 24 in the S compartment. It is observed that a few portion of the vaccinated but 25 infected, in the I_2 compartment, are threatened by the disease. The new model 26 captures this dynamics by connecting the I_2 compartment to the T compart-27 ment. This results into the diagram below 28



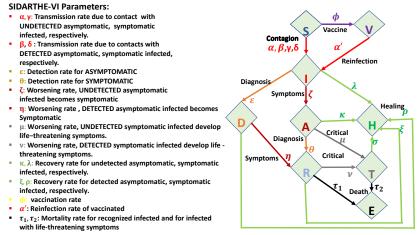


Figure 1: Flow-chart representing the *SIDARTHEV* model taking into account infectious vaccinated individuals.

- ²⁹ The addition of these new connections in the SIDARTHE model have changed
- $_{\rm 30}$ $\,$ the partial differential equations of the SIDARTHEV model to the following

$$\begin{cases} \dot{S} = -(\alpha I + \beta D + \gamma A + \delta R) S - \phi S \\ \dot{V} = -\alpha' I V + \phi S \\ \dot{I} = (\alpha I + \beta D + \gamma A + \delta R) S + \alpha' I V - (\epsilon + \lambda + \zeta) I \\ \dot{D} = \epsilon I - (\eta + \rho) D \\ \dot{A} = \zeta I - (\theta + \mu + \kappa) A \\ \dot{R} = \eta D + \theta A - (\tau_1 + \nu) R \\ \dot{T} = \mu A + \nu R - (\tau_2 + \sigma) T \\ \dot{H} = \lambda I + \kappa A + \sigma T + \xi R + \rho D \\ \dot{E} = \tau_1 R + \tau_2 T \end{cases}$$
(1)

31 2.1. The basic reproduction number

³² In mathematical epidemiology, the basic reproduction number, R_0 , plays an ³³ vital role. This R_0 , which is commonly referred in the literature as the average number of secondary cases produced by an infected individual in a population
where everyone is susceptible [8], is derived from the *SIDARTHEV* model 1
and is given by

$$R_0 = \frac{\alpha r_2 r_3 r_4 + \beta \epsilon r_3 r_4 + \delta \epsilon \eta r_3 + \delta r_2 \tau \zeta + \gamma r_2 r_4 \zeta}{r_1 r_2 r_3 r_4}, \qquad (2)$$

where $r_1 = \epsilon + \zeta + \lambda$, $r_2 = \eta + \rho$, $r_3 = \theta + \mu + \kappa$, $r_4 = \nu + \xi$. For better understanding of the R_0 derivation, [2] gives more details. From the Equation 2, can be seen that R_0 depends on the model parameters that affect pandemic evolution. The aim of this analysis was to estimate R_0 with model parameters that describe the real data [9]. Thus, it is very important to understand the model parameters and to make sure they are extracted correctly [9].

43 3. Analysis of COVID-19 data

44 3.1. Analysis of COVID-19 data of Nigeria from the emergence of 45 the disease

In Nigeria, they confirmed the first case in the Infectious Disease Centre, 46 Yaba, Lagos State, Nigeria on the 27th of February, 2020. An airline from 47 Milan, Italy arrived at the International Airport, Lagos on the 24^{th} of February, 48 2020 with an infected Italian citizen who went to his company's site in Ogun 49 State the following day. The health authorities (Nigeria Centre for Disease 50 Control) implemented containment measures by the contact tracing of 'Persons 51 of Interest' which included all persons on the manifesto of the flight and those 52 he had close contact with while in Lagos and Ogun State. After a period of two 53 weeks, cases were detected in Lagos and Abuja and this marked the emergence 54 of the spread in the country. The Federal Government restricted international 55 commercial flights into the country, effective from 23^{rd} March, 2020. 56

The Federal Government ordered the closure of schools and all the non-57 essential services (businesses and industries) and ordered cessation of all move-58 ments in Lagos State, Ogun State and the Federal Capital Territory, Abuja, 59 on 29^{th} March, 2020 for an initial period of 14 days and later extended it with 60 another 14 days on 12th April, 2020 [18, 19]. Most State Governments restricted 61 public gatherings and religious activities for over fifty (50) persons. The Federal 62 Government lifted the travel ban on domestic flights on the 20^{th} of April, 2020. 63 The Federal Government ordered a Nationwide overnight curfew from 8:00 pm 64 to 6:00 am on the 2^{nd} May, 2020 and later eased the overnight curfew to be 65 from 12:00 am to 4:00 am. The Federal Government later authorized the grad-66 ual easing of lockdown in the previously restricted states on the 4^{th} of May, 2020 67 and mandated the use of face masks in public. On the 6^{th} of May, 2020, the 68 Federal Government extended the travel ban on both International and local 69 flights to 7^{th} June, 2020. The Federal Government reopened the international 70 flight for operations on 29th August, 2020 [17]. On the 27th of January, 2021, 71 the President signed six COVID-19 Health Protection Regulations 2021, with 72

restrictions on gatherings, operations of public places, mandatory compliance 73 with treatment protocols, offences and penalties, enforcement and application 74 and lastly the interpretation and citations of the regulations [21]. After the first 75 confirmed case on 27th February, 2020, the number of confirmed cases increased 76 drastically and the total number of confirmed cases as of 27^{th} March, 2022 is 77 255,341 with a total number of 249,566 discharged cases and 2,633 active cases. 78 The first death case was on the 23^{rd} March, 2020 and have increased to a total 79 number of 3,142 death cases as of 27^{th} March, 2022. The health sector started 80 covid-19 sample test on the 8^{th} April, 2020 and on the 27^{th} March, 2022, they 81 have recorded total tests of 4,589,725. The first shipment of four million Oxford-82 AstraZeneca covid-19 vaccine arrived the country on 2^{nd} March and vaccination 83 began on 5^{th} March, 2021 with a doctor at National Hospital Abuja and the 84 President received his first dose on 6^{th} March, 2020 [20]. The country received 85 subsequent shipment of Moderna, Johnson Johnson and Pfizer Covid-19 vac-86 cines on the 1^{th} August, 2021, 12^{th} August, 2021 and on the 14^{th} October, 2021 87 respectively. Due to the single dose requirement of Johnson Johnson Covid-19 88 vaccine, the executive director of Nigeria's National Primary Health Care De-89 velopment Agency (NPHCDA), Dr. Shuaib said had-to-reach riverine, desert 90 and security compromised areas would initially be prioritised with the vaccine 91 [22]. As of 27th March, 2022, 21,049,754 persons have received their first dose 92 and 9,565,143 have received their second dose. 93

From Figure 9, the Nigeria COVID-19 plot, we have the COVID-19 data at 94 the top panel; we superimpose the modeling of the data and see good agreement 95 in the infected, active, recovered, and dead cases. As a result, the fully vaccina-96 tions are also well modeled except the data of the total vaccinations. From the 97 modeling, we derive R_0 for Nigeria as shown in the bottom panel of the plot. 98 The initial R_0 is zero and increases significantly to eight after a week because of 99 the negligence from the public on the measures. Around day 35, the R_0 dropped 100 below one mainly because of the quick reaction from the government. Another 101 increase in R_0 to a point above two was observed around day 40. Around day 102 65, it also dropped below one. The R_0 later increase around day 75 above one 103

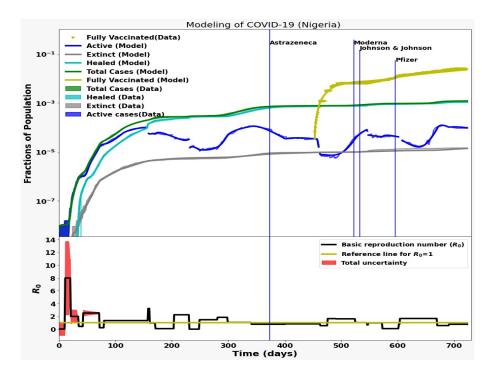


Figure 2: Graphs showing COVID-19 data and SIDARTHEV model of Nigeria taking into account the Active, Healed, Extinct, Vaccinated and Total cases over time in days since the 27^{th} of February, 2020 up to the of 27^{th} of February, 2022 over time in days are shown in the top plot. The time dependent basic reproduction number is represented in the bottom plot.

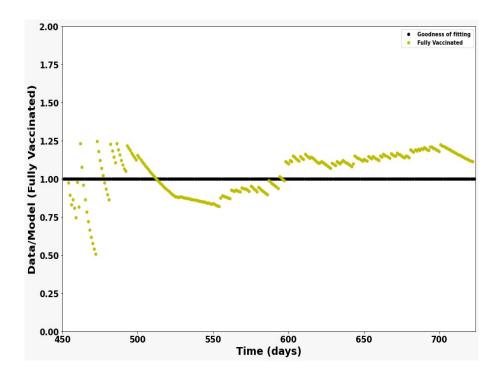


Figure 3: The plot showing the goodness-of-fit of the COVID-19 data modelling of Nigeria for fully-vaccinated individuals over time in days since the 27^{th} of February, 2020 up to the of 27^{th} of February, 2022.

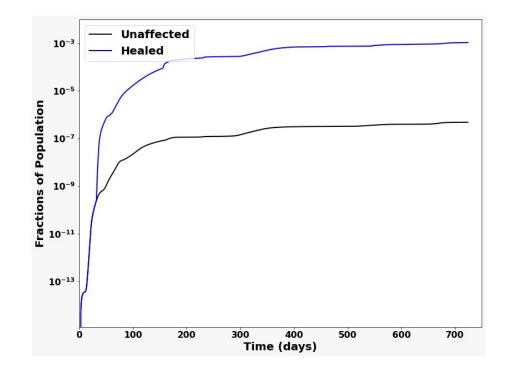


Figure 4: The model prediction of the recovered population is shown in the bottom-right plot; also shown, is the undiagnosed fraction of the people that were infected and recovered without symptoms. This fraction, called the unaffected cases, is not measured or included in the data

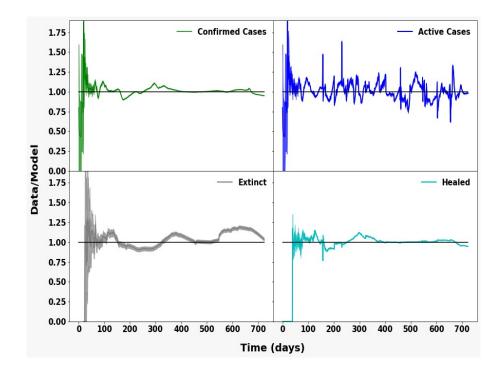


Figure 5: The plot showing the goodness-of-fit of the COVID-19 data modelling of Nigeria for confirmed cases, active cases, extinct and healed individuals over time in days since the 27th of February, 2020 up to the of 27th of February, 2022

and later rose to a point above three around day 150 due to ineffectiveness of the measures in some parts of the country. Around day 165, the R_0 dropped to zero and increased above two around day 205. Another drop occurred around day 230 to point zero after some restrictions from the government. We see that around day 250, there was an increase in R_0 above one and was about two around day 280 and even till after day 700, R_0 remains below two.

110 3.2. Analysis of COVID-19 data of South Africa

In South Africa, Covid-19 vaccination is an ongoing immunisation campaign 111 against SARS-CoV-2 which aims to vaccinate 40 million South Africans [3]. 112 There are four types of Covid-19 vaccines that have been approved for use 113 in South Africa by the South African Health Products Regulatory Authority 114 (SAHPRA), namely, Johnson Johnson, Pfizer, Sinovac and AstraZeneca [3]. 115 For South Africa Covid-19 case study, Johnson & Johnson's Janssen vaccine 116 and Pfizer vaccine are considered. (i)Johnson & Johnson's Janssen vaccine: It 117 is a viral vector vaccine based on a human adenovirus that has been modified 118 to contain the gene for making the spike protein of the SARS-CoV-2 virus that 119 causes COVID-19 [4]. The body's immune system responds to this spike protein 120 to produce antibodies [5]. This vaccine does not need to be stored frozen and 121 requires only one dose [6], [7]. Only people of the age 18 and older can take this 122 vaccine. A person is considered fully vaccinated two weeks after one shot [1]; 123 (ii) Pfizer vaccine: Only people of the age 16 and older can take Pfizer vaccine. 124 It is administered in two shots. A person is considered fully vaccinated two 125 weeks after the second shot [1]. As of the 9^{th} of June, 2022, 535, 714 COVID-19 126 hospital admissions were recorded in South Africa [11]. 127

In our previous study we covered the South African COVID-19 data up to adjusted alert level 3 that was effect from 29 December 2020 to 28 February 2021 [9]. Based on the changes of COVID-19 new cases in South Africa, the government introduced adjusted alert levels as follows: (i) from the 1st of October 2021 to the 4th of April 2022 South Africa was at adjusted alert level 1, (ii) from the 13th to the 30 September 2021 South Africa was at adjusted alert level 2, (iii) from the 26th of July to the 26th of September 2021 South Africa was at adjusted alert level 3, and (iv)from the 28th of June 2021 until 25th of July 2021,
South Africa was at adjusted alert level 4 [3]. As of 3rd of May 2022, South Africa has confirmed 3, 661, 635 recovered individuals, 100, 377 death cases and
34, 941, 461 vaccinated individuals, 3, 802, 198 positive cases [3]. The National State of Disaster in South Africa has been lifted since 5 April 2022 [10].

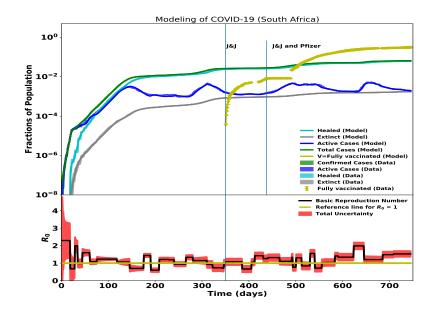


Figure 6: Graphs showing COVID-19 data and SIDARTHEV model of South Africa taking into account the Active, Healed, Extinct, Vaccinated and Total cases over time in days since the 18th of February 2021 up to the 20th of March of 2022 over time in days are shown in the top plot. The time dependent basic reproduction number is represented in the bottom plot. The analysis for the period when vaccination was not yet implemented which from the 5th of March 2020 up to the 26th of March 2021 is documented on previous study [?].

PLOTS' INTERPRETATIONS

In South Africa, the health care workers were the first group to be vaccinated which started on the 18^{th} of February 2021 (day 350) until 17^{th} of May 2021

(day 439) under phase 1 of the Sisonke Protocol.

The death case remained constant during phase 1 while the number of active, healed and total cases slightly remained constant.

Phase 2 which started on the 18^{th} of May 2021, everyone from age 16 and above was allowed to be vaccinated with the first dose of JJ and Pfizer.

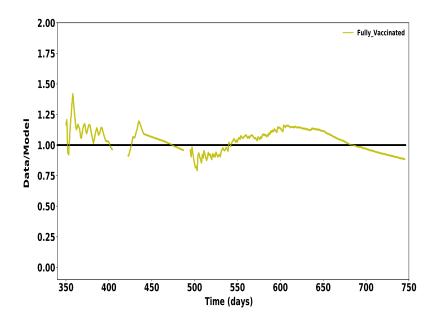


Figure 7: The plot showing the goodness-of-fit of the COVID-19 data modelling of South Africa for fully-vaccinated individuals over time in days since the 28^{th} of February 2021 up to the 20^{th} of March of 2022.

140 3.3. Analysis of COVID-19 data of Mozambique

In Mozambique, the vaccination campaign started on March 8, 2021, at the end of the first year of COVID-19 occurrence and in the period when the country was coming out of the second wave that had its peak at the end of January 2021. During the time when this vaccination campaign was implemented in the country, there was already a reduction of COVID-19 active cases which is believed that might be due to the non-pharmaceutical measures and implementation strategies from the Government [14].

Taking in consideration the actions plan of the Government, the first round of the vaccination campaign targeted health professionals with the aim of protecting this most important group where in the process of controlling the virus in the country are a very important pillar [13].

The continuity of vaccination data after the first gap (between days 350 and 500) of vaccination data is seen at the peak of the third wave where we can see a reduction in active cases and an increase in recovered cases without much variation in the dead data.

The fourth wave (omicron wave) was the most infectious wave, having an initial growth close to 90 percent but which did not take long period of time compared to other waves, and return to stability compared to the other waves, where the concept of booster dose was introduced which has the function of re-immunising people and should be administered 6 months after the last immunization [14].

¹⁶¹ Figure ?? represents the following data sets: total data infected (green), active

(blue), recovered (light blue), dead (gray), fully vaccinated (yellow) which are 162 people who received two doses or one dose of Johnson Johnson-that already 163 guarantees immunity, vaccinated with one dose that does not guarantee immu-164 nity yet (red), vaccinated with the booster dose (pink) and we also have the 165 fitted model curves in the first 5 data sets described here. The first vertical bar 166 between days 300-400 (day 349) demarcates the day of vaccination initiation, 167 where the Sinopharm vaccine was administered; the second bar (day 500) de-168 marcates the introduction of the Astrazeneca vaccine and the third bar near day 169 600 (day 583) describes the day of implementation of Johnson Johnson single 170

171 dose vaccination.

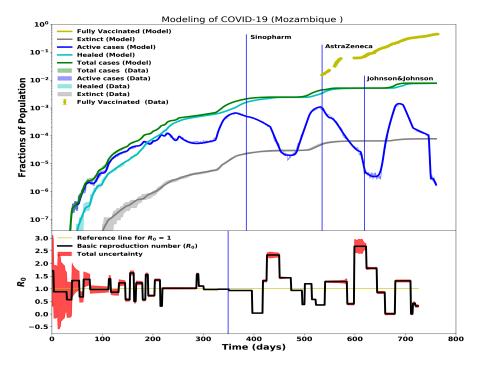


Figure 8: Graphs showing COVID-19 data and SIDARTHEV model of Mozambique taking into account the Active, Healed, Extinct, Vaccinated and Total cases over time in days since the 22^{nd} of March 2020 up to the 22^{nd} of March of 2022 over time in days are shown in the top plot. The time dependent basic reproduction number is represented in the bottom plot.

172 3.3.1. Current Situation in Mozambique

Even with a very strong vaccination campaign in the country, wave number 5 for COVID-19 started to show up from the last week of may of 2022 (see Figure 10).

¹⁷⁶ The onset of this wave coincided with the time in which the winter was bringing

very low temperatures in some regions of the country in an uncommon way andputting many people suffering from normal flu-like.

This new wave itself showed to be very small in terms of height, duration and
impact in the country compared with others (1 to 4). The rate of deaths in the

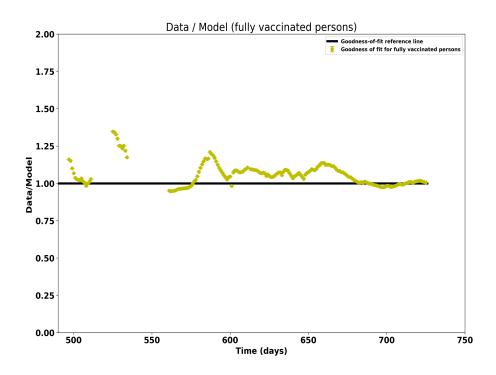


Figure 9: The plot showing the goodness-of-fit of the COVID-19 data modelling of Mozambique for fully-vaccinated individuals over time in days since the 22^{nd} of March 2020 up to the 22^{nd} of March of 2022.

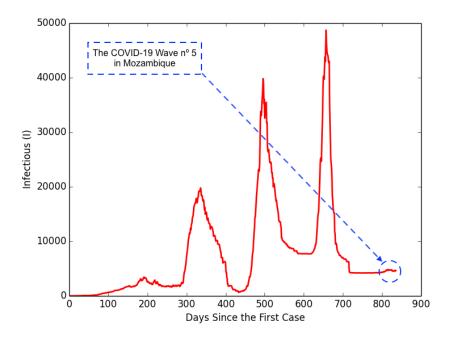


Figure 10: The plot showing the Time Series for the Population in Compartment I(t) in Mozambique.

- ¹⁸¹ wave is very small, the recovered people are too high in a small period of time,
- ¹⁸² and the number of people entering the hospital system is too small.

183 3.4. Analysis of COVID-19 data of Zambia

Zambia launched its vaccination campaign on 14th April 2021 at the Uni-184 versity Teaching Hospital, the country's largest hospital by the then Minister 185 of Health. Analysis of COVID-19 data of Zambia, the first three months of 186 COVID-19 are described in Refs. [5,34] since the first two cases of COVID-187 19 on March 18, 2020. The goal of the COVID-19 vaccination campaign was 188 to enhance the reduction of COVID-19 mortality and morbidity. COVID-19 189 Vaccination Programme was an additional pillar to the COVID-19 Response 190 Strategy for Zambia. Vaccines were distributed at the expected pace starting 191 with the Astrazenca brand followed by several others (Pfizer, Moderna, Johnson 192 and Johnson, Sinovac, and Sputinik). Variant-specific vaccine efficacy of 80% 193 of those who have had two doses of vaccine (or one dose for Johnson John-194 son) receives a third dose six months after their second dose. The first strategy 195 was based on the COVAX mechanism which included AstraZeneca and Johnson 196 and Johnson Vaccine for, at least, 20 percent of the eligible population which is 197 3.676.791 adults of the 46 percent, which is 8.438.118 eligible population aged 198 above eighteen years. The campaign for the administration of AstraZeneca's 199 second dose (fully vaccination) started on 23rd June 2021, resulting in 698-200 second doses of AstraZeneca vaccines being administered by 24th June 2021. 201 Administration of the second dose (fully vaccination) of Sinopharm vaccine in 202 Zambia with a total of 1,107 Sinopharm vaccines administered, commenced on 203 21st May 2021. Administration of the Johnson and Johnson vaccine started on 204 24th July 2021, with 3,333 doses of Johnson and Johnson being administered. 205 A total of 87,164 was cumulative of fully vaccinated from all mentioned vac-206 cines. Fully vaccinated (second doses) with Pfizer and Moderna Vaccines were 207 recorded on 2nd January 2022. Giving a cumulative (fully vaccinated) total of 208 1237873 of all mentioned vaccines as of 30th April 2022. The vertical bars in 209 the graphs indicate the introduction of a particular vaccine and the number of 210 persons vaccinated is a reflection of the combination of vaccines given on that 211 day. Cumulative totals were reported for the different variables modeled. 212

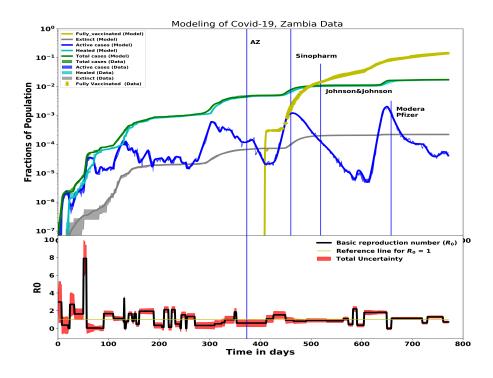


Figure 11: The model prediction of the recovered population is shown in the bottom-right plot; also shown, is the undiagnosed fraction of the people that were infected and recovered without symptoms. This fraction, called the unaffected cases, is not measured or included in the data

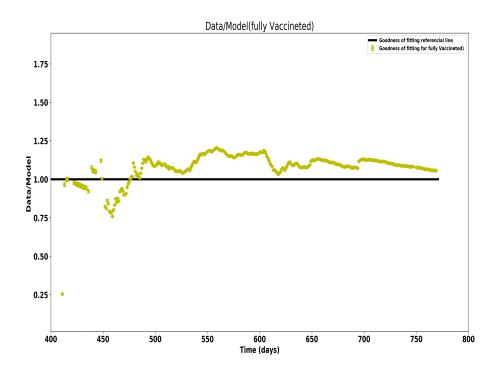


Figure 12: The plot showing the goodness-of-fit of the COVID-19 data modelling of Zambia for fully-vaccinated individuals over time in days since the \dots^{th} of February, 2020 up to the of \dots^{th} of February, 2022.

4. COVID-19 Vaccination Analysis for Kenya

Having received the first 1.12 M doses of Oxford-AstraZeneca COVID-19 214 vaccine, the vaccination drive in Kenya kicked off on March 05 2021. This was 215 exactly one year after the first case of COVID-19 was reported in the country on 216 March 12 2020. 667 doses of AstraZeneca were administered on the first day of 217 vaccination in the country to frontline healthcare workers only at the Kenyatta 218 National Hospital, Nairobi. This was then followed by other essential workers 219 such as security officers and teachers in the first few weeks of the vaccination 220 programme, followed by targeted people with higher risks of severe disease and 221 those aged 50 years and above. The administration of the second dose began 222 on May 28 2021, with 203 people receiving their second dose. 223

After 5 months of administering the AstraZeneca vaccine only, 880,460 doses 224 of Moderna vaccine were received in the country on August 23 2021 from the 225 US government via COVAX, making Moderna the second COVID-19 vaccine 226 to be offered in the country. Additionally, 141,600 doses of Johnson & Johnson 227 were received soon afterwards on September 03 2021. This was the third vaccine 228 type to be offered in the country and totaled to 4.2 M doses of vaccine received. 229 On September 17 2021, the country received 795,600 doses of the Pfizer vaccine 230 from the US government, making Pfizer the fourth vaccine to be offered in the 231 country. Shortly afterwards, on September 18 2021, the government received 232 200,000 doses of Sinopharm COVID-19 vaccine from the Chinese government, 233 making Sinopharm the fifth COVID-19 vaccine to be offered in the country. 234 The government has authorised all the five vaccines and are currently being 235 used across the country. 236

After a slow uptake of the vaccine among the population due vaccine hesitancy [?], a spike was witnessed on November 23 2021, with the highest number of vaccination doses administered to 103,506 people in a single day since the vaccination roll out in March, corresponding to the peak observed around day 550 on the (ref Kenya plot). This followed a government directive on November 21 2021 starting that anyone not vaccinated by December 21 would be refused ²⁴³ in-person government services and access to public entertainment spots such as ²⁴⁴ restaurants. By the end of 2021, 7% of the population was fully vaccinated and ²⁴⁵ $\sim 10\%$ of the population partly vaccinated. This figure slightly surpassed the ²⁴⁶ government target of 10 M people by the end of the year 2021.

Kenya is part of the WHO AFRO 20 priority African countries with a high 247 risk of slow covid-19 vaccination roll out (cite Deph's document). Therefore, the 248 WHO AFRO implemented phased COVID-19 vaccination campaigns in Febru-249 ary 2022 in order to boost vaccination rates. This entailed community outreach 250 efforts and increased number of vaccination sites from 800 to 6,000 sites. Over 251 a period of two weeks (3-17 Febrauary), the daily average increased from 70,000 252 to 200,000 people. This also raised the percentage of the population that was 253 fully vaccinated from 9.9% to 13.4%. 254

As of March 11 2022, two years after the first COVID-19 case was reported 255 in the country and one year after the mass vaccination programme roll out, 256 8.054.405 vaccine doses had been administered and $\sim 14.8\%$ (7.930,000) of the 257 total population had been fully vaccinated. So far, a total of 323,140 COVID-19 258 cases has been reported in the country and a total of 5,644 deaths. COVID-19 259 restrictions are no longer in place though the government is encouraging citizens 260 to wear masks and maintain social distancing where possible. Factors affecting 261 the vaccination programme in Kenya include; i) funding, ii) the availability of 262 vaccines, ii) storage requirements, iii) vaccine hesitancy among the population [? 263 and geographical inequalities in accessing vaccines in hard-to-reach areas [e.g., 264 ?]. The government aims to to vaccinate 15.91 M people by June 2023 in a 265 3-phased roll-out approach initially targeting 1.25 M people by June 2021 in 266 phase one. This was followed by the current phase two, July 2021 - June 2022, 267 targeting 9.76 M people including mostly the elderly and the most vulnerable 268 with underlying health conditions. The third phase will run from July 2022 -269 June 2023 and will target 4.9 M people above 18 years old, those with underlying 270 health risks and essential workers The Conversation. 271

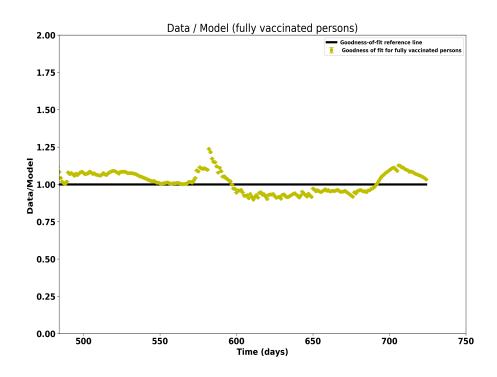


Figure 13: The plot showing the goodness-of-fit of the COVID-19 data modelling of Kenya for fully-vaccinated individuals over time in days since the \dots^{th} of February, 2020 up to the of \dots^{th} of February, 2022.

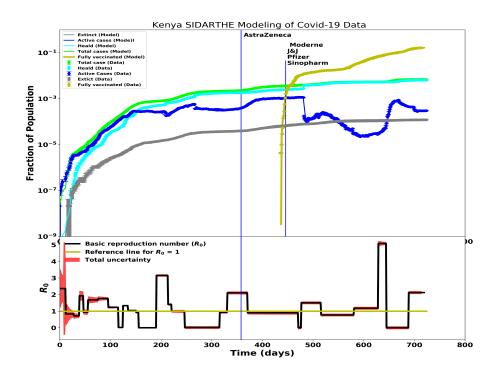


Figure 14: The model prediction of the recovered population is shown in the bottom-right plot; also shown, is the undiagnosed fraction of the people that were infected and recovered without symptoms. This fraction, called the unaffected cases, is not measured or included in the data

272 4.1. Analysis of COVID-19 data of Togo

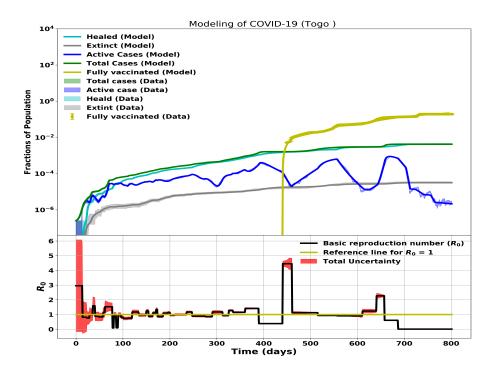


Figure 15: The model prediction of the recovered population is shown in the bottom-right plot; also shown, is the undiagnosed fraction of the people that were infected and recovered without symptoms. This fraction, called the unaffected cases, is not measured or included in the data

273 5. COVID-19 Vaccination Analysis for Ghana

In Ghana, the first official cases of COVID-19 were reported on 12 March 274 2020. As at then, 141 COVID-19 cases had been confirmed nationwide, with 5 275 fatalities [?]. The first two confirmed cases were identified as individuals having 276 returned to the country from Norway and Turkey. As at 17 April 2020, 10 out 277 of 16 regions in Ghana had COVID-19 cases. Following this, the government 278 took steps to prevent the virus from spreading. thus, from March 15, Ghana 279 government imposed restrictions on public gathering and air, sea and overland 280 travels. These response protocols led to a significant reduction in the rate of 281 infection till December 2020. As the number of COVID-19 cases in Ghana began 282 to diminish, several flaws in the initial response accumulated and consequently 283 led to the country's second wave of infections around January 5th, 2021. Among 284 the country's response approaches for the second wave targeted to break the 285 COVID-19 transmission chain are the adoption of a 14-day incubation period 286 [?] and the acquisition of COVID-19 vaccines. 287

The government of Ghana committed to acquiring COVID-19 vaccines on December 20, 2020, guaranteeing that vaccinations deployed in the country are safe and effective [?]. Ghana is the first country ro recieve COVID-19 vaccines from the COVAX initiative and begsn its first vaccine rollout on March 1st, 2021 [???] by administering AstraZeneca. Johnson & Johnson (J&J), Moderna, Pfizer, and Sputnik V are the COVID-19 vaccines also approved and administered in Ghana.

The second, third and fourth COVID-19 infection waves in Ghana were 295 caused by the emergence of novel coronavirus variants namely Alpha, Delta and 296 Omicron variants. A study conducted by [?] indicates that, the Delta lineages, 297 Alpha, Beta and Eta made up the top viral lineages within the sequenced SARS-298 CoV-2 genomes in Ghana over the period. The Beta variant is being monitored 299 in Ghana since it has the third highest frequency. During the second wave, 300 regions further from Accra, such as the Northern and Upper East, tended to 301 have different variants. These locations are still lagging behind the rest of the 302

country in the third wave and do not appear to be experiencing one [?]. The 303 Beta variety was prominent in Ghana when the airport reopened to foreign 304 travelers in September 2020, and it remained the most dominant circulating 305 lineage throughout 2020. The Alpha variant superseded Beta in January 2021 306 and became the major cause of all reported illnesses until June 2021, when Delta 307 lineages took over. The Delta lineages controlled Ghana starting in June 2021 308 and continued to do so until September 2021. Major variations such as Alpha, 309 Beta, Delta, Eta, and Kappa were found in samples from arriving tourists before 310 being seen in community instances, according to [?]. 311

According to [?], the president of Ghana and his vice were the first to 312 receive the AstraZeneca vaccine on the 1st of March 2021. By 2nd March 2022, 313 vaccination was launched in the Ashanti region and and over 10,000 people had 314 been vaccination. The second doses for the AstraZeneca vaccine commenced on 315 19 May 2021. As at 25th April 2022, 14, 268, 269 doses of these vaccines have 316 been administered. 18.3% of Ghana's population have been fully vaccinated, 317 29.9% have received at least one dose of the vaccines and 360, 201 persons have 318 received the first booster dose. Currently, there are 161, 216 COVID-19 cases in 319 Ghana. Out of this, 159,737 have recovered and discharged with 1,445 deaths 320 and 34 active cases as at 30th April 2022. Greater Accra region records the 321 highest number of COVID-19 cases at 90,826 followed by the Ashanti region 322 with 22,299 cases [?]. 323

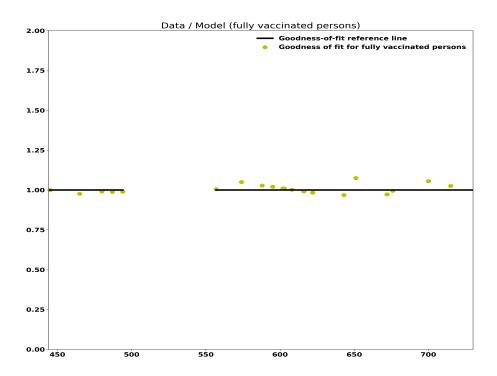


Figure 16: The plot showing the goodness-of-fit of the COVID-19 data modelling of Kenya for fully-vaccinated individuals over time in days since the \dots^{th} of February, 2020 up to the of \dots^{th} of February, 2022.

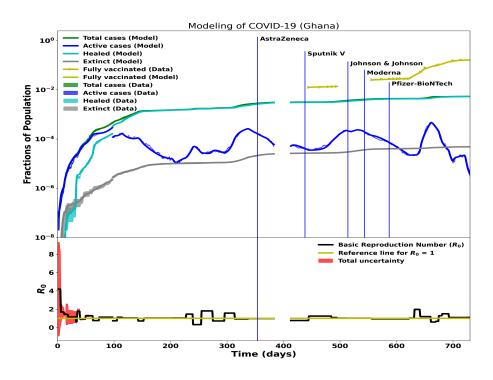


Figure 17: The model prediction of the recovered population is shown in the bottom-right plot; also shown, is the undiagnosed fraction of the people that were infected and recovered without symptoms. This fraction, called the unaffected cases, is not measured or included in the data

324 References

- [1] Wikipedia contributors. (2022, January 7). COVID-19 vaccination in
 South Africa. In Wikipedia, The Free Encyclopedia. Retrieved 17:43, January 17, 2022, from https://en.wikipedia.org/w/index.php?title=COVID-19vaccination-in-South-Africaoldid=1064267601.
- ³²⁹ [2] Giordano, G., Blanchini, F., Bruno, R., Colaneri, P., Di Filippo, A., Di
 ³³⁰ Matteo, A. and Colaneri, M., 2020. Modelling the COVID-19 epidemic and
 ³³¹ implementation of population-wide interventions in Italy. Nature medicine,
 ³³² 26(6), pp.855-860.
- ³³³ [3] https://sacoronavirus.co.za/vaccine-updates/ Date last viewed:
 ³³⁴ 2022/01/17.
- [4] EMA receives application for conditional marketing authorization of
 COVID-19 Vaccine Janssen" (Press release). European Medicines Agency
 (EMA). 16 February 2021. Archived from the original on 17 January 2022.
 Retrieved 17 January 2022.
- [5] Malcom K (8 March 2021). "COVID Vaccines: Does it Matter Which One
 You Get?". Michigan Medicine. Archived from the original on 28 March 2021.
 Retrieved 17 January 2022.
- ³⁴² [6] Fact Sheet for Healthcare Providers Administering Vaccine and EUA"
 (PDF). Janssen. Archived from the original on 13 April 2021. Retrieved 17
 January 2022.
- ³⁴⁵ [7] Johnson Johnson's Janssen COVID-19 Vaccine Information". U.S. Centers
 ³⁴⁶ for Disease Control and Prevention (CDC). 23 March 2021. Archived from
 ³⁴⁷ the original on 17 January 2022. Retrieved 17 January 2022.
- [8] Van den Driessche, P., Watmough, J. (2002). Reproduction numbers and
 sub-threshold endemic equilibria for compartmental models of disease transmission. Mathematical biosciences, 180(1-2), 29-48.

- ³⁵¹ [9] Amouzouvi, K., Assamagan, K.A., Azote, S., Connell, S.H., Fankam, J.B.F.,
- ³⁵² Fanomezana, F., Guga, A., Haliya, C.E., Mabote, T.S., Macucule, F.F. and
- Mathebula, D., 2021. A model of COVID-19 pandemic evolution in African
 countries. Scientific African, 14, p.e00987.
- ³⁵⁵ [10] https://www.gov.za/covid-19/about/about-alert-system, Date viewed:
 ³⁵⁶ 2022/04/06
- [11] https://www.nicd.ac.za/latest-confirmed-cases-of-covid-19-in-south-africa9-june-2022/, Date Accessed: 09 June 2022.
- 359

1

- [12] Government of the Republic Mozambique 2021, Declaraof 360 of Public Calamity Situation, Council tion of Ministers, Ma-361 152022, published 5march 2021,viewed February puto, 362 jhttps://www.ta.gov.mz/Legislacao/Decretos/Decreto 363
- 364

2

- [13] Government of the Republic of Mozambique 2021, Daily update of information about covid-19, Ministry of Health, published 8 march 2021, viewed 10 April 2022, ihttps://covid19.ins.gov.mz/wpcontent/uploads/2021/03/Actualizacao-Dados-Covid-19₁5.03.2021.pdf >
- ³⁶⁵ [14] Government of the Republic of Mozambique 2021, Daily update of
 ³⁶⁶ information about covid-19, Ministry of Health, published 22 january
 ³⁶⁷ 2022, viewed, viewed 23 March 2022, jhttps://covid19.ins.gov.mz/wp³⁶⁸ content/uploads/2022/01/Comunicado-de-Imprensa-COVID-19-23.01.2022³⁶⁹ VF.pdf ¿
- ³⁷⁰ [15] Government of the Republic of Mozambique 2020, Daily COVID³⁷¹ 19 Surveillance Bulletin, Ministry of Health, viewed 3 March 2022
 ³⁷² ihttps://covid19.ins.gov.mz/documentos-em-pdf/boletins-diarios/ ;
- ³⁷³ [16] Government of the Republic of Mozambique 2020, press releases, Ministry

- of Health, viewed 18 March 2022, jhttps://covid19.ins.gov.mz/documentosem-pdf/comunicacoes-diarias/ ¿
- ³⁷⁶ [17] NCDC. (n.d.). Public health protocols on covid-19. NCDC Coro ³⁷⁷ navirus COVID-19 Microsite. Retrieved March 27, 2022, from
 ³⁷⁸ http://covid19.ncdc.gov.ng/
- ³⁷⁹ [18] Oreoluwa Adebayo Ajibade S.P.A. (April 24, 2020). The covid-19 regulations 2020. Federal Government Restrictions in Nigeria. Retrieved March
 ³⁸¹ 27, 2022, from https://www.mondaq.com/nigeria/operational-impacts-and-
- $_{382}$ strategy/935324/federal-government-restrictions-in-nigeria-the-covid-19-
- regulations-2020
- [19] Proshare. (n.d.). Pursuant to quarantine act (CAP Q2 LFN 2004).
 Nigeria Covid-19 Regulations 2020. Retrieved March 27, 2022, from
 https://www.proshareng.com/report/regulators/covid-19-regulations-
- ³⁸⁷ 2020/13309idcollapseecosystem
 - [20] Wikipedia. (n.d.). COVID-19 vaccination in Nigeria. Retrieved March 27,
 2022, from https://en.m.wikipedia.org/wiki/covid-19vaccinationinNigeria
- [21] Minerva legal. (March 31, 2021). COVID-19 Health Protection Regu lations 2021. Covid-19 Resource Hub. Retrieved March 27, 2022, from
 https://mlpng.com/covid-19-health-protection-regulations-2021/
- [22] Reuters. (February 7th, 2022). Nigeria receives 2 million doses of
 JJ COVID vaccine from EU countries. Healthcare and Pharmaceuticals.
 Retrieved May 20, 2022, from https://www.reuters.com/business/healthcare pharmaceuticals/nigeria-receives-2-million-doses-jj-covid-vaccine-eu-
- ³⁹⁵ countries-2022-02-07/
- ³⁹⁶ [23] Ministry of Public Health. Response plan to The COVID-19 epidemic in
 ³⁹⁷ Cameroon for the health sector for 2021. COVID-19 preparedness and re ³⁹⁸ sponse plan Draft, March 2021.

- ³⁹⁹ [24] Ministry of Public Health. National Plan for the deployment of vaccination
 ⁴⁰⁰ against COVID-19 in Cameroon, March 2021.
- ⁴⁰¹ [25] World Health Organization. With a fast-moving pandemic, no one is safe,
 ⁴⁰² unless everyone is safe. Accessed January 26, 2022.
- ⁴⁰³ [26] World Population Clock. 2022 world population by country. Accessed Jan⁴⁰⁴ uary 26, 2022.
- [27] Ministry of Health, Republic of Zambia, NATIONAL COVID-19 VACCINE
 DEPLOYMENT STRATEGY A Plan to Roll-Out the COVID-19 Vaccine,
 April 2021.
- 408 [28] MINISTERIAL STATEMENT CORONA VIRUS DISEASE 2019 AND
 409 THE ACQUISITION OF VACCINES, 7th April, 2021, Wednesday, 7th April,
- 410 2021 National Assembly of Zambia (parliament.gov.zm)
- ⁴¹¹ @articleafriyie2020covid, title=COVID-19 pandemic in resource-poor coun-

tries: challenges, experiences and opportunities in Ghana, author=Afriyie,

⁴¹³ Daniel Kwame and Asare, George Awuku and Amponsah, Seth Kwabena

- and Godman, Brian, journal=The Journal of Infection in Developing Countries, volume=14, number=08, pages=838-843, year=2020
- ⁴¹⁶ @articleworld20202020, title=WHO; 2020. WHO coronavirus disease
 ⁴¹⁷ (COVID-19) dashboard, author=World Health Organization and World
 ⁴¹⁸ Health Organization and others, journal=World Health Organization. Avail⁴¹⁹ able at: https://covid19. who. int/(Accessed: 23 February 2021), year=2020
 ⁴²⁰ @articleodikro2020epidemiology, title=Epidemiology of COVID-19 outbreak
 ⁴²¹ in Ghana, 2020, author=Odikro, Magdalene A and Kenu, Ernest and Malm,
 ⁴²² Keziah L and Asiedu-Bekoe, Franklin and Noora, Charles L and Frimpong,
- 423 Joseph and Calys-Tagoe, Benedict and Koram, Kwadwo A, journal=Ghana
- 424 Medical Journal, volume=54, number=4s, pages=5–15, year=2020
- ⁴²⁵ @articleodikro2022strategies, title=Strategies adopted by Ghana during first
- and second waves of COVID-19 in Ghana, author=Odikro, Delia Akosua
- 427 Bandoh Magdalene Akos and Frimpong, Joseph Asamoah and Malm, Keziah

Laurencia and Asiedu-Bekoe, Franklin and Kenu, Ernest, journal=Journal
of Interventional Epidemiology and Public Health, volume=5, number=3,
year=2022

⁴³¹ @articlelamptey2021nationwide, title=A nationwide survey of the poten⁴³² tial acceptance and determinants of COVID-19 vaccines in Ghana, au⁴³³ thor=Lamptey, Emmanuel and Serwaa, Dorcas and Appiah, Anthony Baf⁴³⁴ four, journal=Clinical and Experimental Vaccine Research, volume=10, num⁴³⁵ ber=2, pages=183, year=2021, publisher=Korean Vaccine Society

⁴³⁶ @articlenonvignon2022estimating, title=Estimating the cost of COVID-19
⁴³⁷ vaccine deployment and introduction in Ghana using the CVIC tool, au⁴³⁸ thor=Nonvignon, Justice and Owusu, Richmond and Asare, Brian and Ad⁴³⁹ jagba, Alex and Aun, Yap Wei and Yeung, Karene Hoi Ting and Azeez,
⁴⁴⁰ Joycelyn Naa Korkoi and Gyansa-Lutterodt, Martha and Gulbi, Godwin and
⁴⁴¹ Amponsa-Achiano, Kwame and others, journal=Vaccine, volume=40, num⁴⁴² ber=12, pages=1879–1887, year=2022, publisher=Elsevier

⁴⁴³ @articlemorang2022genetic, title=Genetic diversity of SARS-CoV-2 infec⁴⁴⁴ tions in Ghana from 2020-2021, author=Morang'a, Collins M and Ngoi, Joyce
⁴⁴⁵ M and Gyamfi, Jones and Amuzu, Dominic SY and Nuertey, Benjamin D and
⁴⁴⁶ Soglo, Philip M and Appiah, Vincent and Asante, Ivy A and Owusu-Oduro,
⁴⁴⁷ Paul and Armoo, Samuel and others, journal=Nature Communications, vol⁴⁴⁸ ume=13, number=1, pages=1-11, year=2022, publisher=Nature Publishing
⁴⁴⁹ Group

450 @miscW.H.O, title=WHO Coronavirus (COVID-19) Dashboard , au-

thor=WHO COVID-19 Dashboard, howpublished = Retrieved from https:

452 //covid19.who.int/, year = Accessed, 2020

453 @miscG.H.S, title=GHS COVID-19 Situation Dashboard-Ghana , au-

thor=GHS COVID-19 Dashboard, howpublished = Retrieved from https:

455 //www.ghs.gov.gh/covid19/dashboardm.php, year = Accessed, 2022

⁴⁵⁶ @articleamouzouvi2021model, title=A model of COVID-19 pandemic evolu-

457 tion in African countries, author=Amouzouvi, Kossi and Assamagan, Kétévi

458 A and Azote, Somiéalo and Connell, Simon H and Fankam, Jean Bap-

tiste Fankam and Fanomezana, Fenosoa and Guga, Aluwani and Haliya, 459 Cyrille E and Mabote, Toivo S and Macucule, Francisco Fenias and oth-460 ers, journal=Scientific African, volume=14, pages=e00987, year=2021, pub-461 lisher=Elsevier 462 Samira also receive COVID-19 @miscCNR, title=Bawumia, vac-463 cine, author=Ernest Arhinful, howpublished = Retrieved from 464 https://citinewsroom.com/2021/03/bawumia-samira-also-receive-465 covid-19-vaccine-photos/, year = Accessed, March 1, 2021 466 @miscWHOGH, title= Ghana finds success in COVID-19 mass vaccina-467 tion campaigns, author=WHO Regional Office for Africa, howpublished 468 = Retrieved from https://www.afro.who.int/countries/ghana/news/ 469 ghana-finds-sucess-covid-19-mass-vaccination-campaigns, year = 470 Accessed, May 18, 2022 471 @miscBBC, title= Covax vaccine-sharing scheme delivers first doses to 472 Ghana, author=BBC News, howpublished = Retrieved from https:// 473 www.bbc.com/news/world-africa-56180161, year = Accessed, February 24, 474

475 2021