

COVID-19 in Africa: outbreak despite interventions?

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Abstract

In Africa, while most countries report some COVID-19 cases, the fraction of reported patients is low, with about 20 000 cases compared to the more than 2.3 million cases reported globally as of April 18, 2020. Few African countries have reported case numbers above one thousand, with South Africa reporting 3 034 cases being hit hardest in Sub-Saharan Africa. Several African countries, especially South Africa, have already taken strong non-pharmaceutical interventions that include physical distancing, restricted economic, educational and leisure activities and reduced human mobility options. The required strengths and overall effectiveness of such interventions, however, are debated because of simultaneous but opposing interests in most African countries: strongly limited health care capacities and testing capabilities largely conflict with pressured national economies and socio-economic hardships on the individual level, limiting compliance to intervention targets. Here we investigate implications of interventions on the COVID-19 outbreak dynamics, focusing on South Africa before and after the national lockdown enacted on March 27, 2020. Our analysis shows that initial exponential growth of existing case numbers is consistent with doubling times of about 2.5 days. After lockdown, the growth remains exponential, now with doubling times of 18 days, but still in contrast to subexponential growth reported for Hubei/China after lockdown. Moreover, a scenario analysis of a computational data-driven agent based mobility model for the Nelson Mandela Bay Municipality (with 1.14 million inhabitants) hints that keeping current levels of intervention measures and compliance until the end of April is of insufficient length and still too weak, too unspecific or too inconsistently complied with to not overload local intensive care capacity. Yet, enduring, slightly stronger, more specific interventions combined with sufficient compliance may constitute a viable option for interventions for regions in South Africa and potentially for large parts of the African continent.

EXECUTIVE SUMMARY

Evidence before this study. Several studies have analyzed the ongoing outbreak of the Corona Virus Disease 2019 (COVID-19) in China and several European countries. However, conditions in African countries are vastly different and often fragile, with conflicting limitations of both the health care system and socio-economic conditions, posing difficult challenges for decisions about enacting and lifting interventions. These countries are currently in the early stages of the outbreak and have been reporting a small but rapidly increasing number of patients diagnosed with COVID-19. Several countries have taken different intervention measures to counter a large-scale COVID-19 outbreak. In particular, in South Africa, with the largest number of cases in Sub-Saharan Africa, case numbers are known to less rapidly increase after national lockdown on March 27, 2020.

Added value of this study. This study reports a quantitative analysis of the case number dynamics reported by the World Health Organization and Johns Hopkins University until including April 18, 2020, both for Africa overall and South Africa specifically, before and after national lockdown. It also reports and analyzes results of an agent-based mobility simulation for the Nelson Mandela Bay Municipality, South Africa (1.14 million inhabitants). This case study relies on detailed large-scale mobility survey data of about 10% of the population and on estimates of the fractions by which interventions decrease specific activities. The simulational data on outbreak dynamics thus provide qualitative order of magnitude estimates of trends consistent with past data. Combined, both analyses may help to better understand the implications of interventions on and estimate the dynamics of the number of (critically) infected patients.

Implications of all the available evidence. The results suggest that current interventions are not yet sufficient to contain a larger-scale outbreak. Interventions slightly stronger than those implemented today or a higher degree of compliance to the enacted lockdown, in combination with longer-lasting measures than currently announced for South Africa may help bound the case numbers such that the number of critical patients remains at or below (and does not massively overburden) the local capacity of intensive care units. Strategies for strengthening or lifting interventions should be advised by advanced data analytics and predictive modeling estimates, for instance for evaluating necessary time intervals and required levels of interventions. Overall, the study points to a potentially viable chance for effective non-pharmaceutical countermeasures against COVID-19 epidemics in South Africa, with suggestions for Health Policy for large parts of the African continent and, generally, disadvantaged countries and regions.

INTRODUCTION

The severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) has reached more than 200 countries and territories across all continents^{1,2}. By death toll, the resulting Corona Virus Disease 2019 (COVID-19) outbreak will likely soon become the largest pandemic of the 21st century so far³. There is currently no specific medical intervention known against SARS-CoV-2 and preventive vaccination options are not yet available. The resulting vast number, broad geographical distribution, and intensity of globally enacted socio-economic interventions is unprecedented in modern human history.

Mainland China was the first region hit by the outbreak in January 2020 and had taken rapid and severe interventions including an almost complete lockdown for eleven weeks. It thereby succeeded to suppress the outbreak dynamics to subexponential growth patterns⁴ and in April 2020 is reporting a total of 83 500 cases and at most 130 new cases daily for now more than four weeks.² As of April 18th, several countries in Europe are reporting more than 100 000 cases each and the United States alone reports above 700 000 cases. At the same time, Africa as a continent with a population of 1.3 billion people as of 2018⁵ has reported only about 21 000 cases and about 1 000 (approximately 4.8%) deaths.^{2,6,7} Of those, the largest number of COVID-19 patients is reported in South Africa with 3 034 cases and 52 (about 1.7%) deaths as of April 18, 2020.^{2,8} Across all these countries, the total number of cases is rapidly increasing.

Across the African continent, national economic constraints, individual poverty, low health literacy rates, weaker health care systems and cultural practices lead to reduced option spaces on personal and governmental levels and may all contribute to more severe consequences of the COVID-19 outbreak and negatively influence containment as well as recording, testing and medical treatment⁹. Similar conditions will hold for most countries of the Global South, calling for particular attention on African countries¹⁰.

In general, health care systems in African countries feature only a small number of available intensive care units (ICUs) compared to most countries of the Global North.^{11,12} At the same time, African countries are under particular pressure due to economic constraints on both national and personal levels. Besides strong repercussions on national economic productivity expected for any large-scale lockdown, a large fraction of the population is unable to fully comply with severe lockdown measures due to their personal financial situation. An African task force for coronavirus preparedness and response (AFTCOR) has been established to manage these combined and con-

flicting constraints both for the current COVID-19 outbreak and for future preparedness¹³. Their work focuses on enabling medical diagnosis and screening options, clinical treatment of COVID-19 patients, infection prevention and control in health care facilities, supply chain management, and the communication of risks to experts and the public. Qualitative and quantitative data analytics and estimates of the outbreak dynamics and evaluating containment options essentially underlie but are not in the focus of their work.

South Africa offers a comparatively high capacity of intensive care units (ICUs) to respond to outbreaks, with estimates ranging from maximally 7 195 ICU beds theoretically in existence to 2 926 practically available nationwide across both public and private sectors¹⁴. The order of magnitude of these numbers is consistent with earlier reports.¹⁵ However, the factually available ICU beds have likely declined during the past decade necessitating rationing and triage (prioritisation) decisions that have been frequently necessary in South Africa even in times before COVID-19, particularly in the publicly funded health sector.^{14,16} Moreover ICU capacity in the private sector is not readily and generally accessible.

INFLUENCE OF LOCKDOWN ON PAST CASE NUMBERS

On March 5, 2020, the first COVID-19 patient has been confirmed in South Africa and after starting with specific smaller measures from March 15 onwards, the South African government enacted a national lockdown effective March 27, 2020. This lockdown includes measures such as the complete closure of *childcare*, institutions of primary and higher *education* as well as all public *leisure* activities, severe *physical distancing* rules, an estimated 70% reduction of *shopping*, 85% of on-site *work* force and a 90% reduction in *other* activities. An initial formal reduction of shared publicly available mobility services by about 75% was, after protests, revised to about 30% reduction¹⁷ (estimates by GoMetro, South Africa). These shared mobility services provide a large fraction of transportation and constitute one of the special conditions in South Africa and many other African countries.¹⁸ For instance in South Africa, instead of formal public transit, transportation is dominated by private, semi-regulated minibus taxis with typically 15 seats.¹⁸ Due to their mass usage, usually high occupancy and the close contact between passengers in the vehicles, these mobility services may contribute substantially to the spread of COVID-19.

Fitting the number of total reported cases in South Africa before and after the national lockdown (Figure 1) indicates that the lockdown drastically reduces the relative increase in case numbers,

as quantified by the growth exponent, decreasing from $r = 0.32$ per day in the beginning of the outbreak to about $r = 0.27$ per day just before the lockdown and down to $r = 0.038$ per day after the lockdown, reflecting an increase of the doubling time from about 2.5 to about 18 days (Fig. 1, panels A and B). The immediate switch to slower growth at the date of the official lockdown may be originating from several factors that remain unknown. For instance, the number of patients tested per day has substantially increased initially^{8,19} and tests may have been delayed at the very onset. In any given region, the first person infected is likely detected only after exhibiting symptoms while later cases may be identified by preemptive contact tracing and thereby identified as they appear, ideally before showing symptoms. Other contributing factors may include stochastic small number fluctuations occurring at the onset of any epidemic outbreak, already existing awareness of the COVID-19 outbreak and many individuals taking partial countermeasures before the official national lockdown.

As the number of cases in South Africa makes up a substantial share of all reported cases throughout Africa, the effect also becomes visible in the data for the entire continent (Fig. 1A,B). For Africa as a whole, growth exponents dropped from about $r = 0.22$ to $r = 0.086$. The data for Africa suggest a further decrease of the exponent, ongoing after the South African lockdown. This downtrending may be associated with measures taken up at different points in time in the most strongly affected countries of Northern Africa, and the vastly heterogeneous case numbers, test coverage and reporting of cases across African countries, all entangling with the reduced number, but still large share of South African COVID-19 patients.

While the growth exponents have been substantially reduced, between a factor of 7.1 (South Africa) and a factor of 2.6 (all of Africa), the growth remains exponential, even three weeks into the lockdown. This is in stark contrast to the outbreak dynamics in Mainland China, where the strict containment measures of the Hubei region has led to subexponential growth²⁰ followed by a massive decrease of new case numbers within weeks after lockdown². The unbroken exponential growth trend in South Africa is also indicated by the number of newly infected people per week steeply increasing when displayed as a function of the total number of infected (Figure 1C), instead of curving down.

MODELING FUTURE SCENARIOS

The current national lockdown has been extended from an original three weeks (until April 17, 2020) with relaxations now suggested for the beginning of May, 2020. We thus ran scenario simulations to estimate future case numbers and probe responses to different intervention strengths and durations. We employed a computational data-driven, agent based transport model for the Nelson Mandela Bay Municipality (NMBM, Eastern Cape, South Africa, 1.14 million inhabitants)²¹ with lockdown fractions of work, leisure, and shopping activities and complete lockdown of childcare and educational institutions, in line with measures currently implemented in South Africa. To reflect potential non-compliance with enacted lockdown measures, the simulations took only a 85% reduction of *other* activities; for minibus taxi services we took a 50% effective reduction of passengers, to reflect the tradeoff between non-compliance and the reduction in demand due to less people required or wishing to travel caused by the other lockdown measures and the outbreak (estimates by GoMetro, South Africa).

Our simulations are consistent with the growth exponents of the total number of infected individuals both before and after national lockdown, indicating growth factors of about $r = 0.32 \pm 0.01$ and about $r = 0.04 \pm 0.02$, respectively (Figure 2A,B). The exponents cannot be specified more exactly due to the unpredictable stochastic factors in the transmission process creating substantial variations in particular at low case numbers, sampled over in simulations with ten random realizations each. Importantly, there are simulated case dynamics that display an early (within April, 2020) saturation of the total number of cases at 10 000 or below. However, the ensemble of simulations of the lockdown scenario suggests an ongoing outbreak either entirely without saturation or with early but non-persistent saturation and renewed increase in May. Figure 2C displays the same data of the dynamics in a state space characterizing the epidemics without referring to absolute time (as in Fig. 1C), thereby enabling to compare system-wide potential pathways. The results illustrate that current lockdown measures substantially slow the spread of the outbreak in all realizations, but only 1 out of 10 realizations manages to completely stop the outbreak while hundreds of thousands of people become infected in the other realizations in the Nelson Mandela Bay Municipality alone.

To evaluate the expected outbreak dynamics and the maximal number of critical patients requiring intensive care, we studied four different scenarios by agent-based simulations, again ten realizations per scenario (Figure 3). Entirely lifting the currently enacted lockdown on May 1 would

cause an immediate rise of infected patient numbers and a delayed rapid rise of critical patient numbers drastically beyond the ICU capacity available in NMBM (estimated to be 50 based on downscaling (proportional, by population size) the 267 ICU beds expected to be available in the entire Eastern Cape Province²²). Whereas the exact numbers will depend on details of the simulation, further simulations (not shown) indicate a manifold overload of ICU capacity also after varying mobility parameters. Lifting lockdown by 25% two weeks later, i.e. on May 15, still would cause massive rise in case numbers and ICU overload in early June. Maintaining current lockdown conditions strongly slows the outbreak, yet our simulations suggest that such interventions together with current compliance are marginally insufficient to contain the epidemic long term and keep the number of critical patients below ICU capacity (Fig. 3B and C), as suggested already by our data analysis of past case numbers (Figure 1). Finally a fourth scenario of slightly strengthening current interventions, either by slightly stricter, possibly even more specific lockdown regulations, by increasing compliance, or a combination both (90% reduction of shopping and other, 95% reduction of work activities and complete restriction of all other activities including public mobility in the simulations), may keep the number of critical COVID-19 patients at or below the ICU capacity and may largely contain the epidemic by end of June 2020.

DISCUSSION

The analysis of reported past case data is robust and suggests that the outbreak currently still grows too quickly to contain the number of critical COVID-19 patients significantly below available ICU capacities nation-wide. The main potential causes of errors in the analysis of past data may be biased or undersampled testing and reporting of case numbers.

Predicting future case numbers and the number of critical patients under different scenario conditions is much more difficult. The most difficult challenge is the bridging of scales between known or estimated country-wide overall conditions and specific urban level scenarios (at 1.14 million people) that are again subsampled at about 10% of the population, *not* primarily due to simulation constraints but due to the availability of socio-economic and travel data for about 100 000 people only.²¹ Combined with the COVID-19 outbreak being at an early stage, the number of infected patients is of an order of magnitude between 10^1 and 10^3 in NMBM, thereby causing strong stochastic number fluctuations that make individual predictions unreliable. We attempted to compensate for such fluctuations partially by running ensemble simulations for 10 random re-

alizations, with a random subsample of initial patients infected (and thus varying their location, household size, employment status etc.). As the results are based on limited ensemble simulations, they likely underestimate the probability of extreme outcomes such as strong increase or random decay of the outbreak.

CONCLUSION

The results reported above suggest that current lockdown levels may be just marginally insufficient to prevent a massive COVID-19 outbreak in South Africa. As the increase in case numbers is still exponential and not subexponential as reported for Mainland China²⁰, South Africa may be still in the unfortunate situation to become for the African continent what Italy has been for Europe²³, with potentially devastating consequences.

A rapid large-scale infection within weeks to a few months, the likely outcome if the national lockdown was lifted or relaxed early May⁸, implies a manifold overload of ICU capacity. Interventions slightly stronger than those implemented today, or even a higher degree of compliance to the enacted lockdown alone may constitute a viable chance for effective countermeasures for regions in South Africa and potentially for large parts of the African continent.

However, a number of boundary conditions beyond those known for past major hubs of the COVID-19 pandemic in countries like Mainland China, the United States or Italy²³ need to be taken into account simultaneously. Most African countries find themselves under much stronger socio-economic and health care system constraints than countries of the Global North.

For instance, a large fraction of the work force both is at lower-income levels and simultaneously has no fall-back option to remote work. As many of such work activities are not tagged "essential" in the sense of the lockdown, people often have zero income or immediately fall into extreme poverty. Moreover, even where remote work is possible, it comes with additional challenges²⁴. Still, South Africa is potentially in a better position than many other African countries, so the conclusions (for South Africa specifically) might be conservative in this sense.

The South African health situation includes a high risk of COVID-19 coinfections for patients with, e.g., HIV/AIDS or forms of tuberculosis (TBC) and implies additional challenges. According to the WHO 2019, South Africa ranks 4th globally in the number of TBC infections *per capita* and 3rd for those coinfecting with TBC and HIV. Moreover, the South African population infected with TBC alone is about 320 000 (0.5%, about 20 times higher rate than in Europe) and a total of

7.7 million people (13%) are infected with HIV as of 2018.^{25,26}

Therefore, regulatory decision against COVID-19 cannot only keep in mind short-term economic constraints.¹⁷ A large-scale outbreak and massive ICU overload may have drastic consequences for the country as a whole, including societal and economic but also psychological, and ethical issues (compare²⁷). Thinking of economic constraints should also imply thinking of long-term implications, for both economy and society. This perspective underlines again the coaction advocated by the United Nation's Sustainable Development Goals (SDGs), in particular Good Health and Wellbeing (SDG 3), Sustainable Cities and Transportation (SDG 11), and Reduced Inequality both within and among countries (SGD 10) in the context of COVID-19.

An integrated perspective on such goals may help paving the way to a fair and sustained solution of the COVID-19 crisis and future pandemics across African countries as well as for individuals, groups and regions in a position much more fragile than common for countries of the Global North, as also underlined by the proposed CoHERE programme.²⁸

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- [1] World Health Organization. Coronavirus disease 2019 (COVID-19) situation report – 56, 2020. https://www.who.int/docs/default-source/coronaviruse/situation-reports/20200316-sitrep-56-covid-19.pdf?sfvrsn=9fda7db2_6 (accessed April 17–20, 2020).
 - [2] Johns Hopkins Center for Systems Science and Engineering. Coronavirus covid-19 global cases, 2020. <https://coronavirus.jhu.edu> (accessed April 20, 2020).
 - [3] E. Callaway, D. Cyranoski, S. Mallapaty, E. Stoye, and J. Tollefson. The coronavirus pandemic in five powerful charts. *Nature*, 579(7800):482–483, 2020.
 - [4] B. F. Maier and D. Brockmann. Effective containment explains subexponential growth in recent confirmed covid-19 cases in china. *Science*, 2020.
 - [5] United Nations, Department of Economic and Social Affairs, Population Division. World population prospects 2019, 2019. <http://population.un.org> (accessed April 17, 2020).
 - [6] WHO. Who covid-19 dashboard. <https://covid19.who.int> (accessed April 18, 2020).
 - [7] Africa Center for Disease Control and Prevention. Outbreak brief number 13: Covid-19 pandemic. <https://africacdc.org/download/outbreak-brief-number-13-covid-19-pandemic-14-april-2020/> (accessed April 17, 2020).

- [8] National Department of Health - Republic of South Africa. COVID-19 Corona Virus South African Resource Portal. <https://sacoronavirus.co.za/> (accessed April 17, 2020).
- [9] T. P. Velavan and C. G. Meyer. The covid-19 epidemic. *Trop. Med. Int. Health*, 25(3):278–280, 2020.
- [10] J. N. Nkengasong and W. Mankoula. Looming threat of COVID-19 infection in Africa: act collectively, and fast. *The Lancet*, 395(10227):841–842, 2020.
- [11] WHO. WHO African region COVID-19 readiness status v2. <https://app.powerbi.com/view?r=eyJrIjoiMzQwODk3NDYtOTIwYy00MWRjLWJiMTUtOTgzZmJmYmJmZDcxIiwidCI6ImY2MTBjMGI3LWJkMjQtNGIzOS04MTBiLTNkYzI4MGFmYjU5MCI5ImMiOjh9> (accessed April 17, 2020).
- [12] S. Murthy, A. Leligdowicz, and N. K. J. Adhikari. Intensive care unit capacity in low-income countries: a systematic review. *PLoS ONE*, 10(1), 2015.
- [13] J. Hopman, B. Allegranzi, and S. Mehtar. Managing COVID-19 in low-and middle-income countries. *JAMA*, 2020.
- [14] A. van den Heever. Projections on SA health system and whether there are enough hospital beds to cope. *Daily Maverick COVID-19 online resource and news portal*. <https://www.dailymaverick.co.za/article/2020-03-16-projections-on-sa-health-system-and-whether-there-enough-hospital-beds-to-cope/> (accessed April 18, 2020).
- [15] S. Bhagwanjee and J. Scribante. National audit of critical care resources in South Africa—unit and bed distribution. *South African Medical Journal*, 97(12):1311–1314, 2007.
- [16] G. M. Joynt, P. D. Gopalan, A. Argent, S. Chetty, R. Wise, V. K. W. Lai, E. Hodgson, A. Lee, I. Joubert, S. Mokgokong, S. Tshukutsoane, G. A. Richards, C. Menezes, R. L. Mathivha, B. Espen, B. Levy, K. Asante, and F. Paruk. The critical care society of Southern Africa consensus statement on ICU triage and rationing (conictri). *Southern African Journal of Critical Care (Online)*, 35(1):36–52, 2019.
- [17] CNBC Africa. South Africa’s lockdown taxi regulations revised. <https://www.cnbcfric.com/news/2020/04/01/south-africas-lockdown-taxi-regulations-revised> (accessed April 18, 2020).
- [18] K. K. Govender. Exploring public transport service quality: the case of mini-bus taxi service in South Africa. *Eurasian Bus Rev.*, 6:101–116, 2016.
- [19] Wikipedia. 2020 coronavirus pandemic in South Africa. <https://en.wikipedia.org/wik>

i/2020_coronavirus_pandemic_in_South_Africa (accessed April 17, 2020).

- [20] D. Martín-Calvo, A. Aleta, A. Pentland, Y. Moreno, and E. Moro. Effectiveness of social distancing strategies for protecting a community from a pandemic with a data driven contact network based on census and real-world mobility data. Working paper, <https://covid-19-sds.github.io> (accessed April 18, 2020).
- [21] A. Bossert, M. Kersting, M. Timme, M. Schröder, A. Feki, J. Coetzee, and J. Schlüter. Limited containment options of covid-19 outbreak revealed by regional agent-based simulations for South Africa. *arXiv preprint arXiv:2004.05513*, 2020.
- [22] K. Naidoo, J. Singh, and U. Lalloo. A critical analysis of ICU/HC beds in South Africa: 2008-2009. *South African Medical Journal*, 103(10), 2013.
- [23] A. Remuzzi and G. Remuzzi. Covid-19 and italy: what next? *The Lancet*, 395(10231):1225 – 1228, 2020.
- [24] J. Watson (Jobnet Africa). How to effectively manage remote employees in Africa. <https://www.jobnetafrika.com/blog/article/95-how-to-effectively-manage-remote-employees-in-africa> (accessed April 18, 2020).
- [25] World Health Organization, Geneva. Global tuberculosis report 2019, 2019.
- [26] UNAIDS Data for South Africa. <https://www.unaids.org/en/regionscountries/countries/southafrica> (accessed April 18, 2020).
- [27] D. Ramathuba and N. Ramathuba. Ethical conflicts experienced by intensive care unit health professionals in a regional hospital, Limpopo province, South Africa. *Health SA Gesondheid – J. Interdisc. Health Sci.*, 25:9, 2020.
- [28] R. Horton. CoHERE—A call for a post-pandemic health strategy. *The Lancet*, 395:P1242, 2020.

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Contributors

MS, MT and JS conceived and designed research. MS and MT worked out and evaluated the analysis driven by past case data. AB and MK designed, set up and adapted the simulation software and ran simulations, supervised by JS. AB, MK and JS evaluated the simulation data, advised by MS and MT. MS and MT provided theoretical background and advised on general data analysis and data presentation. SA advised on health care data and provided medical background. MS and MT wrote the basic version of the manuscript. JC provided local data and advised on conditions for mobility simulations. All authors interpreted the results and contributed to revising and editing the manuscript.

Declaration of interest

We declare no competing interests.

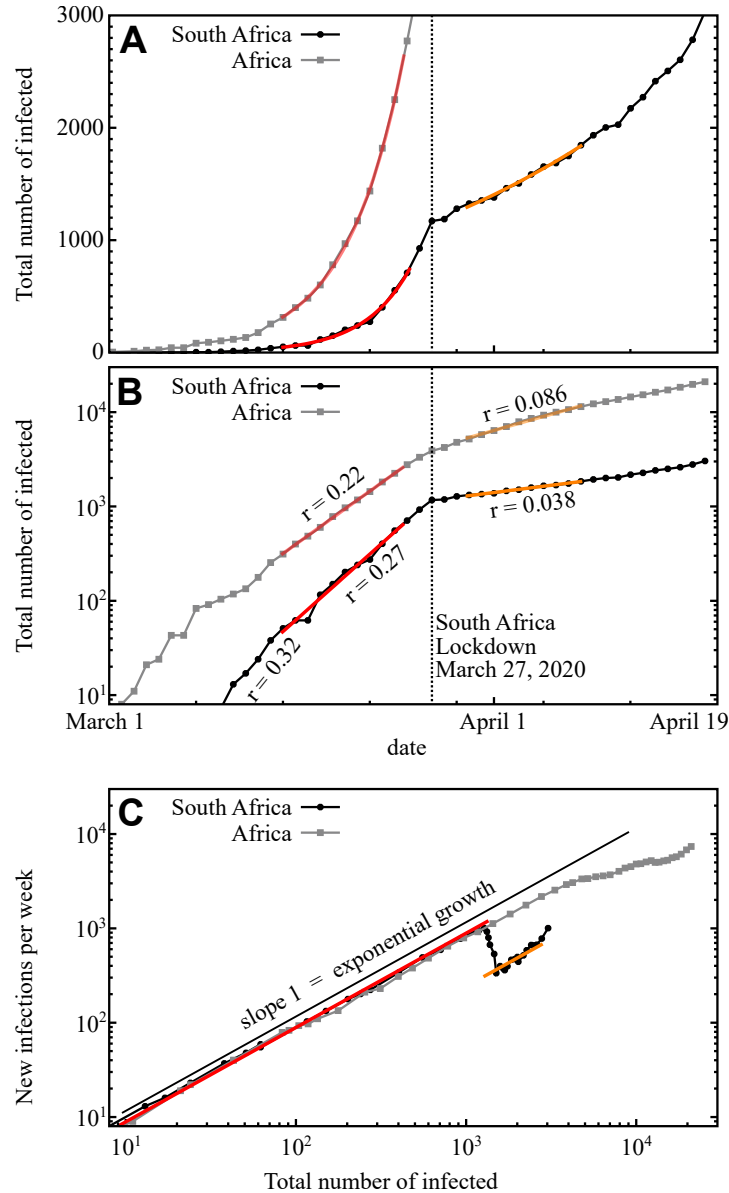


Fig. 1. COVID-19 in Africa and South Africa. (A) and (B) The number of confirmed COVID-19 patients in Africa (gray squares) and specifically South Africa (black disks) from March 1, 2020 until April 16, 2020, on (A) linear and (B) logarithmic scales. Best exponential fits (colored lines) yield growth rates r where the total number of (reported) infected patients $N \propto \exp(rt)$ where t measures time in days. (C) State space representing the number of newly reported patients as a function of the total of reported people infected (including the recovered), eliminating absolute time. Straight solid line of slope 1 indicates pure exponential growth. The impact of the lockdown executed on March 27 is clearly visible (vertical lines in panels A and B).

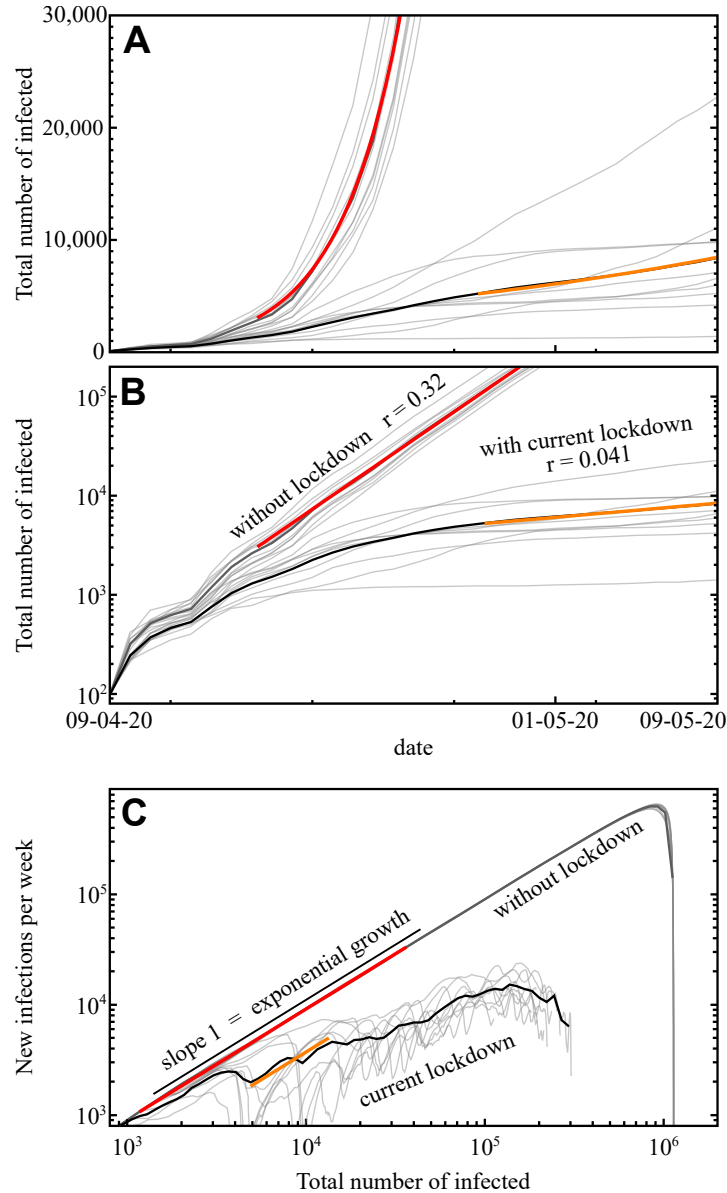


Fig. 2. Estimated COVID-19 cases for the Nelson Mandela Bay Municipality, South Africa. (A, B) Simulation of the outbreak without interventions (red fit) and with current interventions (orange fit) on (A) linear and (B) logarithmic scales. Thin grey lines represent individual simulations, the solid black lines represent their averages. Growth rates are consistent with the observations for South Africa in the beginning of the outbreak (without lockdown) and after the lockdown (compare Figure 1). (C) State space representing the number of newly reported patients as a function of the total of reported people infected (including the recovered), eliminating absolute time. While the lockdown measures slow the spread of the outbreak, the growth remains exponential for some time (compare also Figure 1C).

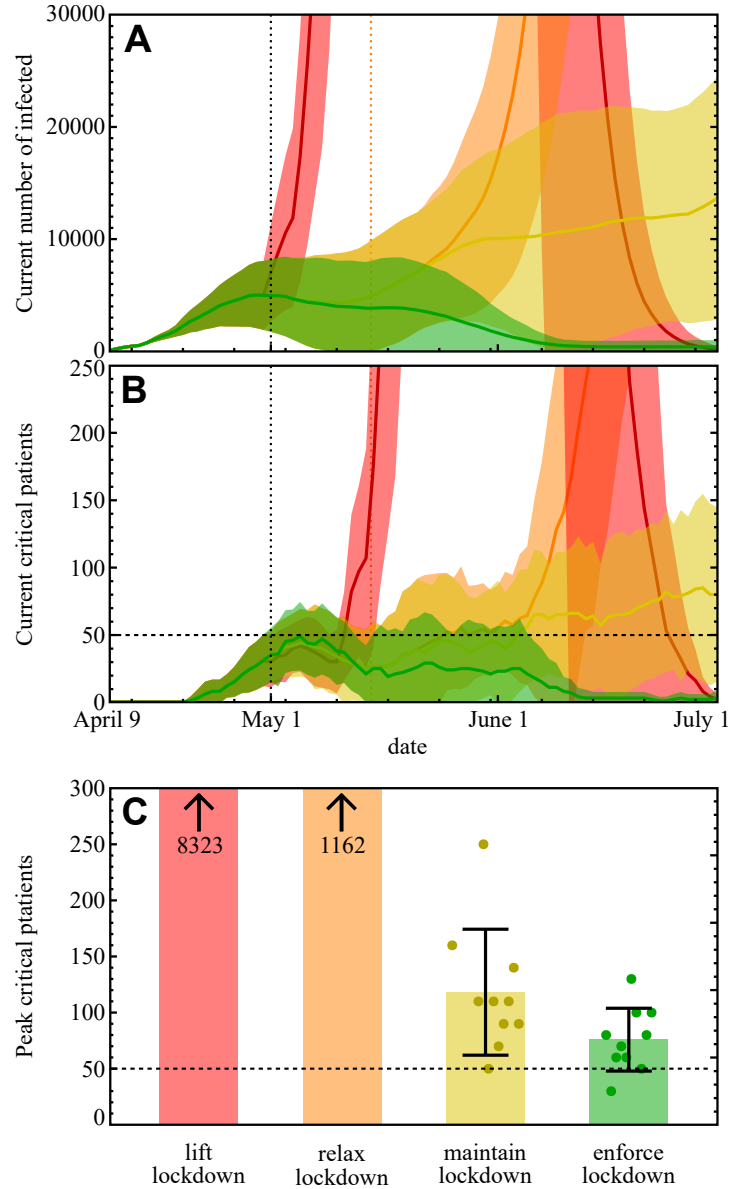


Fig. 3. Influence of intervention policies (A) Number of active infections over time. Solid lines indicate averages across realizations, shaded areas indicate standard deviation. Color encodes the four scenarios: lockdown lifted May 1st (red), lockdown relaxed by 25% on May 15 (orange), maintain current lockdown until June 30 (yellow), and enforcing lockdown or increasing compliance from May 1, 2020 (green). (B) Number of critical patients and estimated capacity available in NMBM (horizontal dotted line). Data encoding as in (A). The dashed vertical line illustrates the available ICU capacity. (C) Maximum number of patients requiring intensive care during the outbreak until end of June 2020, across scenarios (color code as before). Bars indicate averages across realizations and standard deviation, small disks individual realizations. Note that these numbers may increase after June 2020, for example when maintaining the lockdown (compare upwards trend in panel B). All data based on ten realizations of agent-based simulations for each of four scenarios for NMBM, South Africa.