

Preserving lives or livelihoods? Examining the COVID-19 pandemic policy responses in Africa

Njuguna Ndung'u

African Economic Research Consortium

Abebe Shimeles

African Economic Research Consortium

Erik Thorbecke (✉ et17@cornell.edu)

Cornell University

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Examining the COVID-19 pandemic policy responses in Africa

Abstract

Initial policy responses implemented by African governments, following the onset of the COVID-19 pandemic, are assessed, including lockdowns, restrictions of international travel, and other stringency measures (such as social distancing and contact tracing) to contain the spread of the COVID-19 pandemic from March 2020 to November 2020. Policy lessons on potential trade-offs between the economic and social consequences and the effort to save lives are drawn. We used novel data to establish causal relationships between infection rates of SARS-CoV-2 and stringency measures implemented by governments, as well as their economic and social consequences. The Instrumental Variable (IV) Method was used to identify the direction of causation. Our estimates showed that compliance with mobility restrictions led to a significant decline in infection rates, with the impact amplified in situations in which complementary measures were strong. The economic and social consequences were also very substantial, including contractions in real gross domestic product (GDP) and deterioration of household welfare. There were also a high incidence of lockdown-related violence and criminal activities. The lockdowns to fight COVID-19 could be most effective in the contexts of a strong health care system, efficient infectious disease control infrastructure, and community understanding. In other contexts, the trade-off between saving lives and preserving livelihoods could be very costly, and in extreme cases, lead to unintended consequences, such as severe hunger, violence, and permanent loss of jobs.

25 **Preserving lives or livelihoods?**

26 **Examining the COVID-19 pandemic policy responses in Africa**

27

28 As Africa braces for another wave of infections, many governments are grappling with the
29 best approach to navigate through the COVID-19 pandemic¹. The containment strategies
30 applied at the onset of the pandemic may prove difficult to enforce when facing a possible
31 new upsurge. Hence, it will be necessary to generate applicable restrictions that are consistent
32 with location, economic activity, and living conditions. The economic disruptions
33 experienced by many African countries since 2020 were largely the result of policy and
34 administrative responses needed to slow down the spread of the COVID-19 virus. These
35 included restrictions on mobility of people; closing border crossing points and air travel, both
36 within and between countries; and many other measures of lockdowns that limited mobility
37 as well as economic activities.

38

39 In this paper, we address the following research questions: how do we compare the impact of
40 the policy responses on socioeconomic conditions, in comparison to their effectiveness in
41 preventing the spread of the virus? What complementary measures are necessary for African
42 countries to effectively manage a pandemic? Some of the lessons that emerged from the
43 experiences of fighting the spread of the virus may be summarized as follows. Countries that
44 experienced a significant reduction in the mobility of people from their normal daily routines
45 had their infection rates lowered. Reductions in the mobility of people around the mean (–
46 18%) led to a reduction in daily infection rate by 1% and fatality rates by about 0.6%, which
47 is significant. Similarly, the Stringency Index around the mean (51%) could reduce daily
48 infection rates by 1.5%. Lockdowns and stringency measures need to be complemented by
49 other interventions. For instance, testing and tracing capacity had a significant role in

50 reducing fatality rates. An average testing and tracing level achieved during the covered
51 period led to reductions in daily fatality rates by 1.4%. Community understanding of the
52 pandemic could reduce infections after a certain threshold (20%). Hence, increasing
53 awareness even to the mean (40% of the population) could lead to a 1.6% reduction in daily
54 infection rates.

55

56 The socioeconomic consequences of the health-protecting measures described above were
57 severe. At the peak of the lockdown, real GDP growth declined by 5% in Africa, and a large
58 percentage of households experienced job and income losses, which had serious welfare
59 implications because of a lack of social protection programs. There was also a high incidence
60 of daily violence and of crime related to the lockdowns. Studying the trade-off caused by
61 stringency measures in Africa is of significant policy interest for two reasons. First, the
62 World Health Organization (WHO) guidelines to contain the pandemic were focused on
63 settings and conditions in developed economies and were not necessarily transferable to those
64 prevailing in developing countries. The four main elements of the WHO guidelines include
65 learning, isolating, washing, and treatment, which require access to information (radio,
66 television, phone, etc.), decent housing (rooms for isolation and social distancing), and other
67 amenities are unlikely to be met in poor countries. A recent report from the National Bureau
68 of Economic Research detailed how difficult it is for poor countries to effectively follow the
69 WHO guidelines². Hence, the efficacy of these guidelines raises concerns in relation to the
70 cost in developing nations. Secondly, unlike their counterparts in developed countries,
71 recovery from a major shock is a very difficult process for countries in Africa and their
72 households. Even short-lived shocks could lead to permanent or long-lasting damages in
73 livelihoods—hence, the need for a nuanced, nimble, and cautious approach to the
74 management of the pandemic. This includes a shift toward scaling up testing, vaccinations,

75 close follow-up of confirmed cases, and strengthening the capacity of the health system to
76 care for the sick. The role of community participation and compliance to basic guidelines
77 issued by health authorities could take countries a long way toward managing the pandemic,
78 while keeping the engine of the economy running. The rest of the paper is organized as
79 follows: Section 2 presents the method that sketches the conceptual framework, highlighting
80 the trade-off between stringency measures to contain the pandemic and the social and
81 economic consequences. It also provides the estimation model used in the analysis. Section 3
82 describes the data; Section 4 presents results; and Section 5 concludes.

83

84 **Methods**

85 **Trade-off between policy responses to contain the pandemic and economic and social**
86 **consequences.** Many African governments are confronted with the challenges of searching
87 for effective but less costly policy and administrative responses that can contain the spread of
88 the virus in the shortest time possible, without inflicting potentially ‘irreversible’ damage to
89 the economy. For example, complete lockdown can significantly reduce infection rates and
90 lessen the human cost. However, it can also lead to significant slowdown and contraction in
91 economic activities. Striking the right balance is dependent on the epidemiological
92 characteristics of the virus, socioeconomic factors, and resilience of institutions. Acemoglu
93 recently explicated this dilemma using the typical model used by epidemiologists to capture
94 spread of infectious diseases, such as COVID-19, popularly known as the SIR (Susceptibility,
95 Infection and Recovery) model³. In a fixed population, an infectious disease has three groups
96 of people. Those infected at time zero $I(t)$, susceptible to the disease, $S(t)$, and those that
97 recover after being infected, $R(t)$. The path followed over time is captured in three nonlinear
98 differential equations of the form:

$$99 \quad \frac{dS(t)}{dt} = -\beta S(t)I(t) \quad [1]$$

100
$$\frac{dI(t)}{dt} = \beta S(t)I(t) - \gamma I(t) \quad [2]$$

101
$$\frac{dR(t)}{dt} = \gamma I(t) , \quad [3]$$

102

103 where β is a constant capturing “contact rates,” and γ is the recovery rate, which under certain
104 assumptions determine the cusp of the epidemic. Epidemiologists define a crucial parameter
105 R_e , “which is the threshold value or tipping point that determines whether an infectious
106 disease will quickly die out or whether it will invade the population and cause an
107 epidemic”⁴. It is given by the ratio of the contact rates and recovery rates as:

108

109
$$R_e = \frac{\beta}{\gamma} \quad [4]$$

110

111 Since contact rates (β) is determined by the degree of interpersonal physical interactions, the
112 policies that governments put into place to maintain social distancing (θ) will have important
113 influence in curbing the epidemic and bring normalcy to society. Most researchers state the
114 impact of social distancing on spread of the disease as follows:

115

116
$$R_e = \frac{\beta\theta^2}{\gamma} \quad [5]$$

117

118 In this set-up, the actions of government authorities to enforce lockdowns and other
119 preventive measures to reduce the spread of the disease depend ultimately on “social
120 lifestyle;” the pattern of inequality in accessing health services, including protective
121 resources, such as clean water, soaps, sanitizers, masks, etc.; culture; trust in government
122 institutions; and availability of resources to protect people vulnerable to starvation, fatalities
123 and other related hazards caused by the pandemic. Hence, β and θ become, in effect,

124 socioeconomic variables of great interest, which can determine the path of the pandemic and
125 its consequent short-, medium-, and long-term impacts on the economy. Unpacking this
126 relationship, therefore, becomes relevant for understanding the macroeconomic impacts. For
127 example, Acemoglu et al., Giannitsarou et al., and Hausman and Schetter outlined an optimal
128 policy response that combines “targeted” lockdowns for high-risk groups in the population
129 while allowing “low-risk” groups to function safely without disrupting economic
130 activities^{5,6,7} This requires an elaborate information base that is beyond the reach of many
131 countries in Africa. For the purpose of this study, linear relationships between outcome
132 variables (infection rates, fatality rates and change in economic activity, proxied by monthly
133 rate of growth in nightlight illuminations) and explanatory variables (various measures of
134 lockdowns, community understanding of the virus, testing capacity, etc.) are estimated. The
135 general form of the econometric model is:

136

$$137 \quad \frac{\partial y_i}{y_i} = \alpha + \theta \frac{\delta x_i}{x_i} + \beta z_i + u_i + \epsilon_{it} , \quad [6]$$

138

139 where $\frac{\partial y_i}{y_i}$ represents the rate of change in the outcome variable, such as daily infection rates,
140 daily fatality rates, or monthly GDP in the i^{th} country. The term $\frac{\delta x_i}{x_i}$ represents daily rate of
141 reductions in mobility rates or change in the Stringency Index in the i^{th} country. z_i represent
142 other control variables, such as community understanding of the pandemic, testing, and
143 tracing capacity, subregional dummies, etc. The last two terms of Equation (6) represent
144 unobserved, country-specific, time-invariant factors and the random error term, respectively.
145 Infection rates or fatality rates are not instantaneously related with lockdowns or stringency
146 measures due to time lags needed for the policy responses to take effect. Hence, the Ordinary

147 Least Squares method is not appropriate. Specific methods of estimation are reported in the
148 Results Section.

149

150 **Data sources**

151

152 The paper used the following data sources to address the research issues. Data on the
153 Stringency Index was obtained from Oxford University, which has constructed a single index
154 with a range of 1 to 100 that aggregated about 20 indicators of government policy responses,
155 spanning containment and closure policies, economic policies, and health system policies⁸.

156 The data are available for 50 African countries. Data on mobility of people were used from
157 Google, which reported percentage change in the daily movement of people in each country
158 to specific locations, such as workplace, retail stores, parks, etc.⁹ Epidemiological data on
159 COVID-19 was obtained from Worldometer¹⁰. To capture impact on economic activity, the
160 paper utilized monthly nightly data, using the methodology by Elvidge et al. to map
161 anthropogenic lighting present on the earth's surface¹¹. The data have been used extensively
162 to proxy economic activity and measure real GDP growth, for example, by Henderson et al¹².

163 In this paper, linear relationships between outcome variables (infection rates, fatality rates
164 and change in economic activity, proxied by monthly rate of growth in nightlight
165 illuminations) and explanatory variables (various measures of lockdowns, community
166 understanding of the virus, testing capacity, etc.) is specified. Specific methods of estimation
167 are reported in the Results Section.

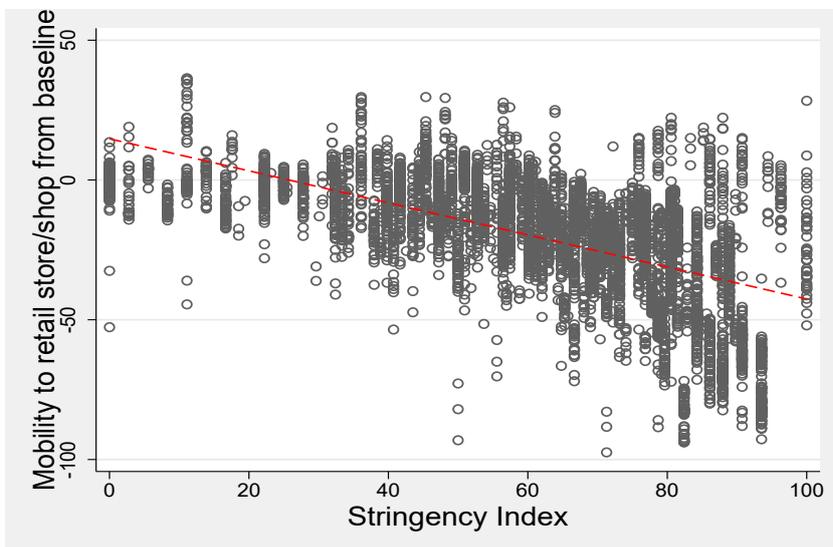
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169 **Results**

170 **Policy responses to contain the spread of COVID-19 pandemic in Africa.** Most African
171 countries have taken heed of the advisory notices released by WHO in the early stages of the

172 COVID-19 pandemic, concerned by poor health systems and health infrastructure for coping
173 with massive infections. Early in March 2020, most countries began taking serious measures
174 to contain the movement of people. They also introduced various measures to prepare the
175 health sector and assistance programs for people who could potentially be affected by the
176 lockdown measures. To capture these measures, Oxford University introduced the Stringency
177 Index that essentially measured “intentions” and “policy directives.” Not all countries,
178 however, enforced restrictions to the same degree of intensity and comprehensiveness, and
179 certainly, the compliance has not been uniformly applied. Fig. 1 suggests that compliance
180 generally has been correlated with containment directives issued by governments, as captured
181 by the Stringency Index, but the correlation is not that strong. The variance is more
182 pronounced in countries with the highest Stringency Index, where compliance on mobility
183 tends to be weak.

184



186 **Fig. 1 | Containment policies and compliance in Africa**

187 *Source:* Authors’ computations based on data provided by Google⁹ and the Stringency Index
188 by Oxford University.^{8,9}

189

190 **How effective has the policy responses been in containing the spread of the virus?** The
191 conventional wisdom is that lockdowns are helpful in slowing the spread of the virus, but
192 there is no clarity how stringent they should be and for how long. As a result, African
193 governments have taken different approaches to the lockdown from moderate to stringent
194 approaches, depending on their perception of the severity of the spread and the practicability
195 and costliness of the lockdown, and others facing political elections have been conscious of
196 the cost of lockdowns.

197

198 Stringency measures take time to yield observable shifts in infection rates due both to the
199 delays in detecting positive tests to the virus and compliance rates to the stringency policies.
200 It is also possible that governments tend to enforce stringency measures in response to rapid
201 spread of the virus. Hence, Ordinary Least Square methods yield biased and inconsistent
202 estimates. Table 1 reports results from Generalized Methods of Moments (GMM) regressions
203 in which 2-week and 10-day lags of all the explanatory variables (Stringency Index, mobility
204 of people, and community understanding of the pandemic) were used as instruments. The IV-
205 regression meets the overidentification criterion, as indicated by Sargan's test with the null
206 hypothesis that all instruments are identified. The first-stage regression of the instruments
207 also suggests that the lagged values are relevant instruments, as indicated by a high F-test.

208

209 Results show that reductions in mobility of people around the mean (-18%) could lead to
210 reduction in daily infection rates by 1% and fatality rates by about 0.6%, which is significant.
211 Similarly, the Stringency Index around the mean (51%) could reduce daily infection rates by
212 1.5%. In comparison to results from developed countries, however, the effectiveness of
213 lockdowns tends to be low. For example, in Switzerland, a 1% decrease in mobility of people
214 led to an 0.88 to 1.11% reduction in daily infections¹³ while, in our case, the figure was

215 0.05%, which is very low for making a meaningful impact in slowing down infection rates
 216 within a reasonable period. To see the difference, for the average reduction of mobility of
 217 people experienced in Africa, daily infection rates would be cut by half within around 70
 218 days. If lockdowns were as effective as in Switzerland, however, it would take only 4 days.
 219 We also note that there has been no clear agreement among experts on the effectiveness of
 220 lockdowns in stemming the COVID-19 pandemic, due to the complex factors at play,
 221 including demographic profile, living conditions, etc. See, for example, Violato et al.¹⁴

222
 223 Hence, lockdowns and stringency measures need to be complemented by other interventions.
 224 For instance, testing and tracing capacity had significant roles in reducing the fatality rate. An
 225 average testing and tracing level achieved during the period covered led to reductions in daily
 226 fatality rates by 1.4%. Community understanding of the pandemic could reduce infections
 227 after a certain threshold (20%). For example, if community understanding reaches 40% of the
 228 population, it could lead to 1.6% reduction in daily infection rates.

229
 230 **Table 1 | Impacts of lockdown measures and community understanding of COVID-19**
 231 **on daily infection (GMM estimates)**

	$\Delta \log$ daily infection rate	$\Delta \log$ daily fatality rate	$\Delta \log$ daily infection rate	$\Delta \log$ daily fatality rate
Change in mobility of people to retail stores from baseline	0.0520***	0.0237*		

	(3.59)	(-2.36)		
Stringency Index			-0.0297*	-0.0081
			(2.53)	(1.39)
Community awareness	0.131**	0.0920*	0.0977*	0.126***
	(2.6)	(2.11)	(2.32)	(3.81)
Squared community awareness	-0.00327*	-0.00263*	-0.00152	-0.00199**
	(-2.50)	(-2.26)	(-1.61)	-2.94)
Test and tracing index	-2.62	-2.36*	-1.66	0.331
	(-1.64)	(-2.35)	(-1.06)	(-0.49)
Constant	0.823	0.762	0.852	-1.02
	-0.81	-1.02	-0.9	(-1.68)
Sub-region dummies	YES	YES	YES	YES
First stage regression F-test (p-value)	0.000	0.000	0.001	0.000
Sargan's overidentification test	0.11	0.11	0.67	0.67
Number of observations	2,415	4,861	2,993	8,767

232 *Note:* t statistics in parentheses, * p<0.05, ** p<0.01, *** p<0.001. $\Delta \Rightarrow$ rate of change.

233

234 **The impact of lockdowns on economic activity and welfare in Africa.** It was expected that
235 the policy responses in the wake of the COVID-19 pandemic could cause disruptions in
236 economic activities, including loss of jobs and income, and potentially, significant human
237 suffering, including starvation, violence, and loss of learning opportunities for children. Thus

238 far, the exact impact has not yet been ascertained across Africa due to lack of data; what is
 239 available is simulations using macroeconomic models. Instead, we rely on and report in this
 240 paper actual changes in economic activity proxied by nightlight data, which recently have
 241 been used as reliable source to estimate GDP growth¹⁵. As countries develop, the source of
 242 growth in GDP per capita tends to be technology intensive rather than light intensive. Hu and
 243 Yao estimated an elasticity of around 2.5% of nightlight data growth with respect to GDP per
 244 capita for low-income countries¹⁶. It can then be inferred that during the height of the
 245 lockdown (with a decline in mobility between 40–60%), real GDP of a typical African
 246 country may have declined by 5%.

247

248 Table 2 establishes a robust relationship between lockdowns and growth in nightlight
 249 illuminations. The results from the fixed effects regression model show the impact of change
 250 in monthly mobility of people on nightlight illumination. Controlling for unobserved time-
 251 invariant factors and time fixed-effects, a 1% decrease in mobility of people could lead to a
 252 0.01% reduction in nightlight illumination, or equivalent real GDP growth. A 1-standard
 253 deviation decline in mobility (about 20%) could lead to a 2% decline in real GDP growth.

254

255 **Table 2** | Fixed effects regression of monthly rate of growth in nightlight intensity and lockdowns in
 256 Africa

Change in mobility from baseline	0.0147***	0.00778*
	0.001	−0.033
March		−1.038***
April		−0.929***
May		−1.265***

June		-1.265***
July		-1.265***
August		-1.094***
September		-1.200***
Constant	0.422***	1.301***
N	220	220
R-sq	0.157	0.571

257 *Source:* Authors' computations

258

259 The consequent impact on employment and household welfare is self-evident. Josephson et
260 al. reported, based on a high frequency phone survey, that nearly 256 million individuals in
261 Ethiopia, Malawi, Nigeria, and Uganda lived in households that have lost income during the
262 pandemic¹⁶.

263

264 Table 3 reports the percentage of households that lost their jobs and incomes at the height of
265 the COVID-19-related lockdowns in 10 African countries. Loss of jobs and income together
266 could lead to a high risk of starvation in a situation where social protection programs, or
267 safety nets, are not widely in place. The percentage of households that reduced food
268 consumption in the wake of job and income loss is very large in many cases. Many
269 households received transfers from families and friends in this time of crisis.

270

271

272

273

274 **Table 3** | Job and income loss, and coping strategies in Africa due to the COVID-19 pandemic (%)

Country	Job loss	Income loss	Food consumption reduced	Transfer received
Burkina Faso	20.78	45.12	46.08	45.92
Chad	33.05	58.65	43.67	49.43
Djibouti	34.76	17.18	43.11	14.94
Ethiopia	20.00	50.00	23.00	13.00
Kenya	12.00	NA	40.00	9.00
Malawi	25.43	67.43	49.47	67.12
Mali	58.54	51.14	49.25	38.39
Nigeria	65.10	72.90	56.87	14.22
South Africa	37.10	41.00	26.00	16.00*
Uganda	54.16	52.87	25.79	22.50

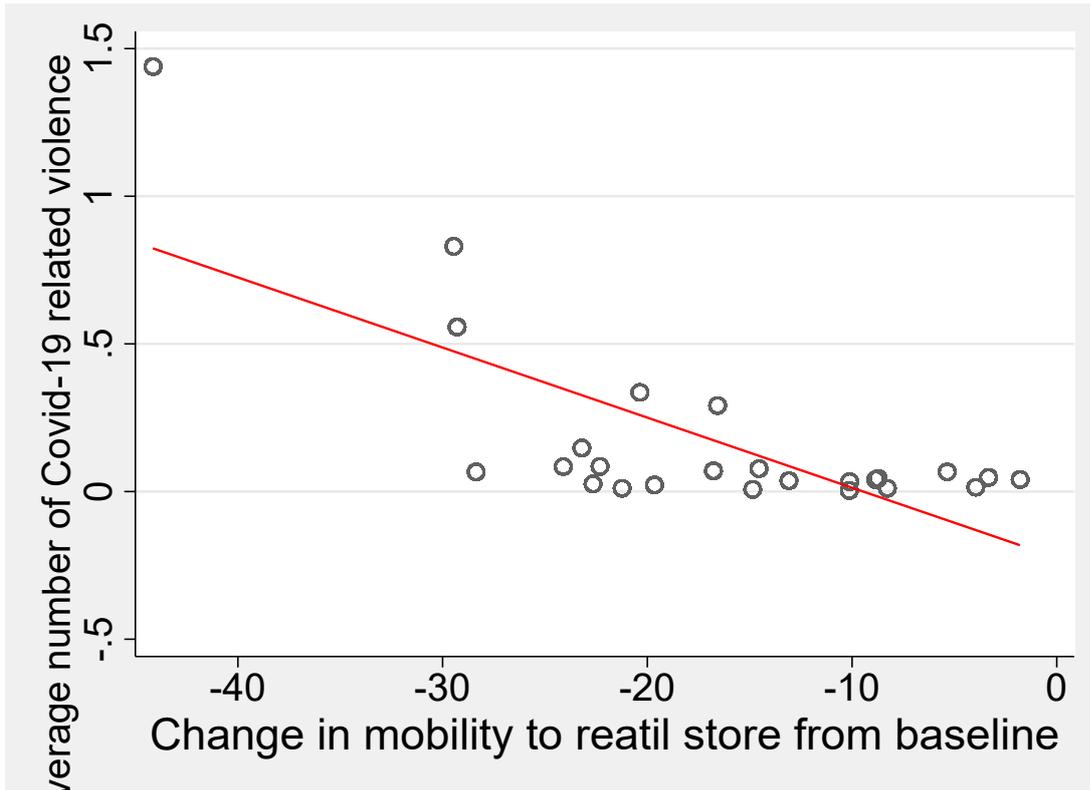
275 *Source:* Authors' computations based on the World Bank High Frequency Phone Survey

276 *Note:* *Government transfer

277

278 Finally, the lockdowns caused significant social disruptions in Africa, leading to an elevated
 279 incidence of violence (Fig. 2). The more stringent the policy measures that restricted mobility
 280 and compliance were, the higher the incidence in conflicts, which could partly reflect the
 281 institutional weakness in enforcing such large-scale responses. Law and order have not taken
 282 deep root in many countries in Africa, further suggesting the fragility of sustaining
 283 lockdowns for an extended period.

284



286 **Fig. 2 | COVID-19 pandemic-related violence and lockdowns in Africa**

287

288 **Concluding remarks**

289

290 The end to the COVID-19 pandemic is not yet in sight, and the appearance of new mutants
 291 suggests that the pandemic may continue in one form or another indefinitely. Return to the
 292 early days of stringency measures does not seem likely. There also seems to be fatigue in
 293 complying with the movement restrictions and economic lockdowns across the continent. As
 294 economic activities continue to decline, the common approaches of containment may become
 295 difficult to enforce for extended periods. Governments are hard pressed to develop
 296 approaches that would slow down the spread of the pandemic without significantly hurting
 297 the economy. The results reported in this paper showed that stringency measures and
 298 reductions in mobility of people led to significant reductions in infection and fatality rates.

299

300 However, we do know that in countries like Kenya where targeted social protection has been
301 designed and implemented during the pandemic, it has effectively reinforced the positive
302 impact of limited lockdown and slowed the infection rates in slums, while at the same time
303 protecting livelihoods. In addition, for such locations, it is the food supply chain protection
304 and preventive measures, like masks, targeted restrictions on large gatherings (funerals,
305 weddings, political rallies, etc.) and movements, and sanitization that may matter most to
306 containing the spread of the virus rather than blanket lockdowns.

307

308 The COVID-19 pandemic, unfortunate as it may be, also offers opportunities for undertaking
309 long overdue reforms in health systems, social protection schemes, resilient food security
310 strategies, health infrastructure upgrades, and community participation in public affairs. In
311 addition, the pandemic also offers an opportunity for the fragmented continent to forge ahead
312 and create a genuine Pan-African regional integration process, which could be an important
313 risk-sharing mechanism; protection of jobs and movement of goods and services as well as
314 development of markets that is needed for a speedy economic recovery. There is currently a
315 lot of discussions about taking advantage of this pandemic to reshape African economies,
316 reform institutions, and even economic management. Usually, pandemics like the present
317 one, while a heavy challenge, also offer opportunities to move toward a more sustainable and
318 inclusive economic environment. It should be noted that vaccines and their wide distribution
319 could provide an important buffer in which Africa may need to create capacity for production
320 and distribution to safeguard its population from the next pandemic.

321

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