

1 **Public events and delayed flight restrictions**
2 **were the turning point of the COVID-19**
3 **mitigation policy of Israel**

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41 **Abstract**

42 **Background:**

43 Since its emergence the impact of COVID-19 has been profound, and the
44 public health challenge seem to be the most serious regarding respiratory viruses since
45 the 1918 H1N1 influenza pandemic. In the absence of effective vaccine or biomedical
46 treatment, the basic rules of public health measures have not changed, namely public
47 distancing and personal hygiene.

48 **Methods:**

49 In this study we present the results of epidemiological data analysis and
50 modelling of one month since the onset of the outbreak in Israel. The data analyzed in
51 this study was obtained from the epidemiological investigation reports that were
52 released by the Israeli Ministry of Health. In addition to data analysis, we present an
53 expended deterministic compartment model and simulations of disease outbreak
54 scenarios emphasizing quarantine and isolation policies given their efficiency.

55 **Results:**

56 We analyze and discuss an abrupt change from controlled epidemic regime
57 (effective reproduction number R_0 of the order of half) to an exponential growth
58 regime ($R_0 = 2.18$) in light of the actual policy-makers decisions and public behavior
59 in Israel. We further discuss three different modeled scenarios of quarantine
60 efficiency: high-efficiency, medium-efficiency, and low-efficiency.

61 **Conclusions:**

62 Israel early lessons show that there is no allowance to compromise with the
63 directive of social distancing. Even before the onset of the pandemic in Israel, fine-
64 tuned but determined early decisions were taken by policy makers to control flight
65 arrival from Covid-19 affected regions and to limit public gatherings. These measures

66 have effectively decreased the value of the effective reproductive number (R_0) in the
67 first two weeks. Our analysis show that one particular holyday in Israel has shifted the
68 occurrence curve from controlled regime to exponential growing regime. This
69 outcome suggests that even a short lapse in public responsiveness can have a dramatic
70 effect on public health during pandemic outbreaks.

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74 **1. Introduction**

75 Since its emergence the impact of COVID-19 has been profound, and the
76 public health challenge seem to be the most serious seen in a respiratory virus since
77 the 1918 H1N1 influenza pandemic (Soper 1919). In this study we present the results
78 of epidemiological data and modelling of one month since the onset of the outbreak in
79 Isreal, addressing public events occurring during this period and the sensitivity to a
80 number of public health measures focusing on social distancing (quarantine and
81 isolation).

82 The epidemiological data studied, consisting of 381 laboratory confirmed
83 COVID-19 cases, has been obtained from the epidemiological investigation reports
84 that were released by the Israeli Ministry of Health (Israeli Ministry of Health, 2020).

85 In addition we present an extended deterministic SEIR (Susceptible, Exposed,
86 Infectious, and Recovered) model to simulate disease outbreak scenarios. In
87 particular, the model includes quarantine of asymptomatic suspected population
88 (exposed) and isolation of symptomatic and infectious patients. The model takes into
89 account the efficiency of the quarantine and isolation measures. We discuss three
90 different quarantine efficiency scenarios: high-efficiency, medium-efficiency, and

91 low-efficiency. The resulting analysis from the epidemiological cases data are
92 discussed in light of public events and compared to model simulations. We analyze
93 and discuss an abrupt change from controlled epidemic regime to an exponential
94 growth regime in light of policy makers decisions and public behavior.

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96 **2. Methods**

97 The dynamics of spread of epidemics as well as the quarantine-isolation
98 policy of Israel was modeled using the SEQIJR model (e.g. Gumel, et al., 2004). This
99 is a deterministic compartmental model which allows the implicit inclusion of
100 biological epidemiological phases (including incubation period) as well as
101 governmental interventions such as quarantine and their actual efficiency of
102 implementation. A successful a posteriori implementation of this model to the
103 transmission dynamics and control of the SARS epidemics in Toronto, Hong Kong,
104 Singapore and Beijing is given in Gumel, et al., 2004. The model consists of a system
105 of 7 dynamical equations and 15 parameters. For details of the model and its
106 parameters see the online supplementary information.

107 The data analyzed in this study was obtained from the epidemiological
108 investigation reports that were released by the Israeli Ministry of Health (Israeli
109 Ministry of Health, 2020). From the total of 883 PCR laboratory confirmed COVID-
110 19 cases we analyzed the 384 cases that were investigated epidemiologically. This
111 allowed us to separate the imported cases (travelers arriving from abroad) from the
112 locally infected cases. The data spans over the first month of the COVID-19 outbreak
113 in Israel, beginning in February 21st 2020 and going until March 20th. We further note
114 that during the examined period the number of PCR tests performed rose daily,

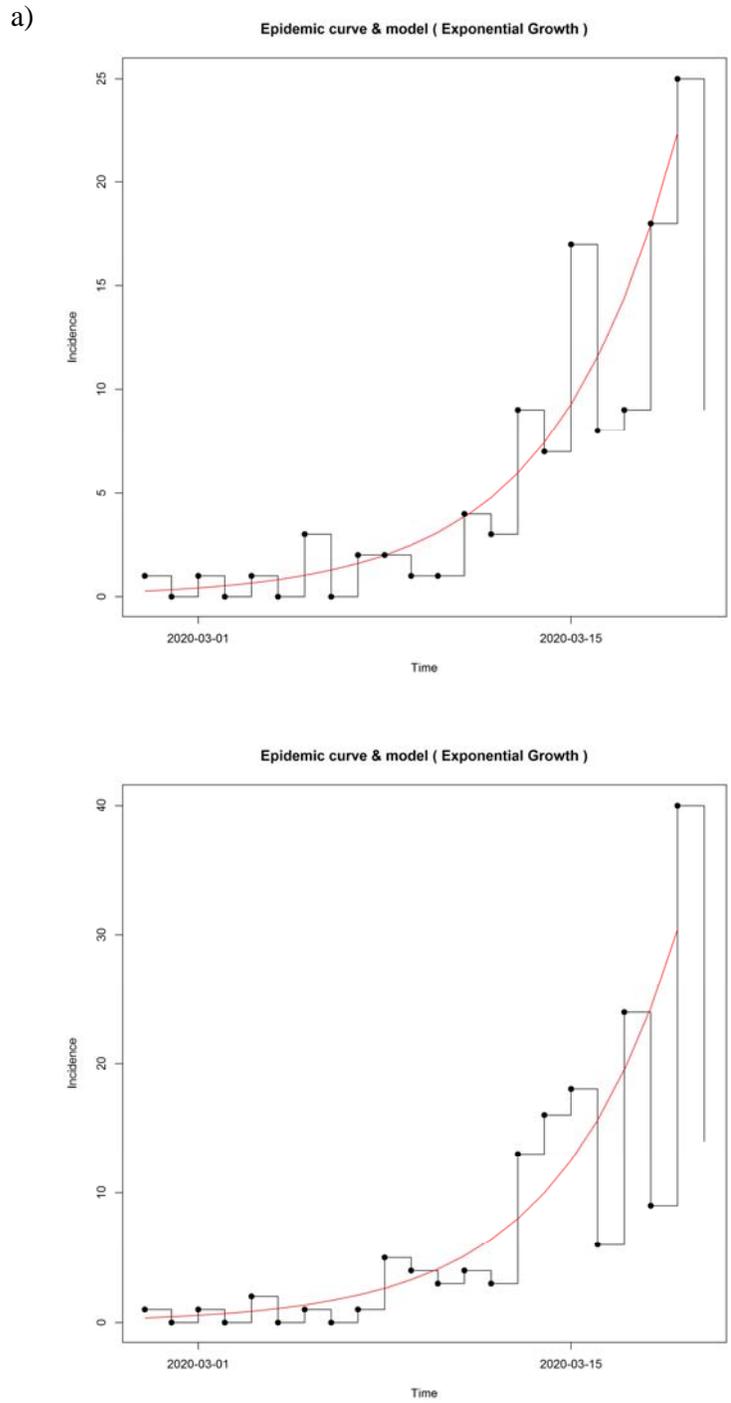
115 reaching 1869 at the end of the period. However the proportion of positive tests
116 remained approximately the same, as 7.9% (Israeli Ministry of Health, 2020).

117 The incidence curve was modelled as a fit to an exponential growth function
118 (de Silva, et al., 2009; Zhao, et al., 2020). Several serial interval distributions that
119 were estimated for COVID-19 were examined (Nishiura, et al., 2020; Tapiwa, et al.,
120 2020; Zhao, et al., 2020).

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122 **3. Results**

123 The dynamics of epidemic spread in Israel in terms of daily reported
124 confirmed cases is shown in fig. 1. There are two distinct regimes in the curve. The
125 first ended in March 8, 2020 in which the number of daily new cases was constantly
126 less than 5. The second period, from March 9, 2020 is characterized by a delayed rise
127 in the daily number of new cases (due to incubation period), which resembles to an
128 exponential growth (red line, in figure 1). Although, most of the examined period
129 was dominated by new cases of travelers arriving from abroad, near the end of the
130 period, the number of daily local infections exceeded the number of travel associated
131 cases.



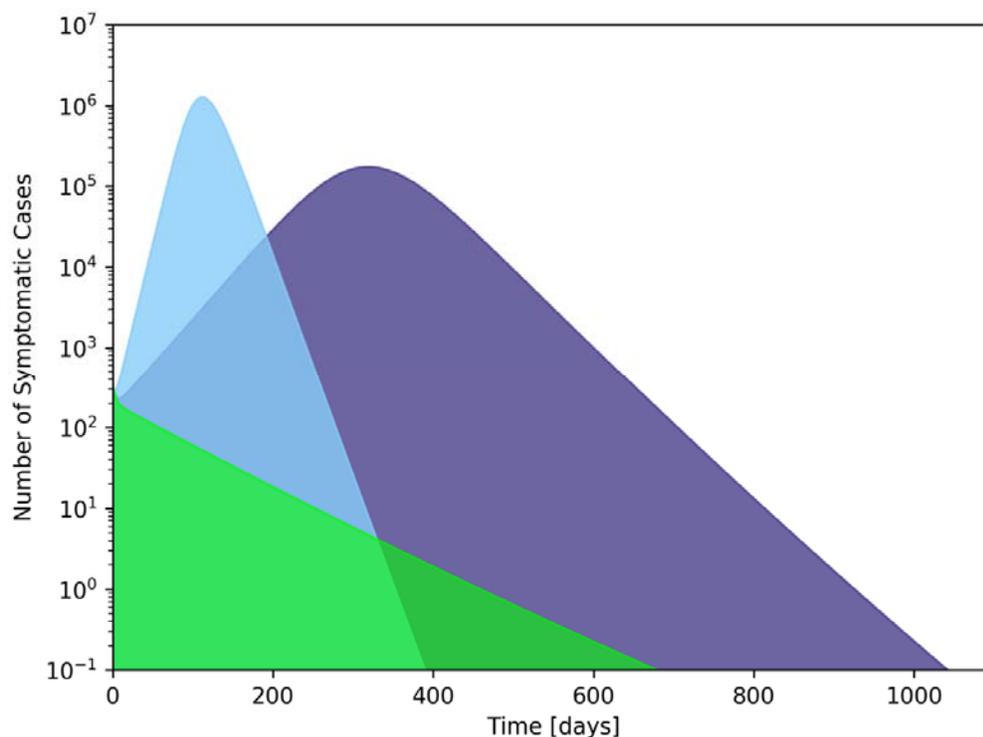
132 FIG. 1. Daily reported confirmed COVID-19 cases in Israel: a) cases of
133 travelers arriving Israel from abroad; b) cases infected locally
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135 The effective reproduction number, R_0 , was estimated for the daily new cases
136 data of the first month of the COVID-19 epidemic. The lowest estimated R_0 was 2.08
137 (95%CI 1.92-2.5) for the Gamma distributed serial interval with mean 4.4 and SD 3
138 days (Zhao, et al., 2020). The highest estimate was 2.37 for the Gamma distributed
139 serial interval with mean 5.2 and SD 2.8 days (Tapiwa, et al., 2020). The mean R_0
140 overall the serial interval distributions examined, was 2.185.

141 The SEQJR model solutions are characterized by 3 locally stable equilibrium
142 points in parameters space. These refer to the following regimes or types of dynamics
143 of epidemic spread: controlled (decaying), flattened, uncontrolled (baseline SEIR
144 model; further details can be found in the supplementary material). In this study we
145 simulated three scenarios, the first corresponding to the first equilibrium and two
146 corresponding to the second:

- 147 1. A controlled high-efficiency quarantining (decaying green curve in
148 Fig. 2). This regime is characterized by an early entry of asymptomatic
149 suspected population to home quarantine. Moreover we assume the
150 infectiousness in home quarantine is one sixth compared to free
151 asymptomatic. The efficiency of isolation is 70%.
- 152 2. A flattened for medium-efficiency quarantining (purple curve in Fig.
153 2). This regime is characterized by a late entry of asymptomatic
154 suspected population to home quarantine. Moreover we assume the
155 infectiousness in home quarantine is one third compared to free
156 asymptomatic. The efficiency of isolation is 70%.
- 157 3. A flattened for low-efficiency quarantining (light-blue curve in Fig. 2).
158 This regime is characterized by a late entry of asymptomatic suspected
159 population to home quarantine. Moreover we assume the

160 infectiousness in home quarantine is similar to free asymptomatic. The
161 efficiency of isolation is 30%.
162 As discussed above, the dynamics of epidemic spread in Israel until March 8, 2020
163 corresponds to the controlled regime characterizes with (green curve in Fig.
164 2). On the other hand after March 8, 2020 the regime corresponds to the flattened
165 regime with low-efficiency quarantining and .



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167 FIG. 2. Total number of symptomatic cases in Israel from SEQIJR model
168 simulations for 3 scenarios: green – high-efficiency quarantining, purple – medium-
169 efficiency quarantining, light-blue – low-efficiency quarantining.

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171 4. Discussion

172 Israel has begun early its mitigation policy against the COVID-19 epidemic.
173 From the beginning of February, it was decided: to close all border passages (via land,

174 sea and air) to people that are not Israeli citizens or resident that have visited China
175 recently; to stop all direct flights from Israel to China and to require Israeli citizens
176 returning from China or that were in touch with a confirmed COVID-19 patients to a
177 14 days home quarantine. A short while later, the quarantine requirement was
178 expanded to other Asian countries. The first COVID-19 patients in Israel were two
179 passengers that returned from the “Diamond Princess”, in 21 and 23 of February.
180 They entered directly to hospital isolation. A week later, a passenger from Italy was
181 diagnosed as a COVID-19 patient, and Italy was added to the list of countries that
182 require 14 days quarantine.

183 The quarantine-isolation policy succeeded in keeping the rate of daily new
184 cases small, up until March 9th. Then, 4 days later, a sudden change of regime has
185 occurred, which was manifested by the distinct change of the epidemic curve of Israel
186 towards exponential growth. March 15th marks the first time that the daily new cases
187 of locally infected were higher than the new travel associated cases.

188 The timing of this abrupt change is not of coincidence. Regarding the cases
189 arriving from abroad, a requirement for home quarantine affecting all travelers
190 arriving began on March 9th. Moreover, during the period between March 9th to 11th a
191 Jewish holiday, Purim, was celebrated. This holiday is characterized by big parades
192 organized by local municipalities, as well as religious gatherings and privately
193 organized parties. Although authorities cancelled the public parades, many privately
194 organized and religious crowding had occurred. Regrettably, these drove Israel from a
195 controlled, mitigated regime to an exponential growth, as described in the results
196 section. Therefore, despite its intense efforts, Israel’s effective R_0 for the period
197 ending in March 20th stands on around 2.185, slightly smaller than the R_0 of 2.6-3.2
198 estimated for the republic of Korea and Italy, for the period ending in March 5th.

199 Such abrupt transition based on social behavior emphasizes the fragility of mitigation
200 policies.

201 We therefore emphasize the importance of early fine-tuned but intense
202 directives for social distancing and isolation measures. This study clearly
203 demonstrates the lesson learned from the Israeli policy, that even a short lapse in
204 public responsiveness can have a dramatic effect on public health during pandemic
205 outbreak.

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