On February 21, 2020, the earliest known case of locally transmitted severe acute respiratory syndrome coronavirus 2 (SARS-COV-2) infection was reported in Italy (1; D. Cereda et al., unpub. data, https://arxiv.org/abs/2003.09320). Since then, several interventions have been deployed to control disease spread in regions with sustained transmission, including quarantine of most-affected municipalities, ban of mass gatherings, and local school closures. School closure at the national level was mandated on March 5, and a national lockdown (stay-home mandate and closure of all nonessential productive activities) was issued on March 11 (2,3), then eased after May 4, 2020 (Appendix, https://wwwnc.cdc.gov/EID/article/27/1/20-2114-App1.pdf). The aim of this study is to evaluate the impact of these interventions on SARS-CoV-2 transmissibility in Italy.

The Study

We measured SARS-CoV-2 transmissibility in terms of the basic ($R_0$) and net ($R_t$) reproduction numbers. These quantities represent the mean number of secondary infections generated by 1 primary infector in a fully susceptible population ($R_0$) and in the presence of control interventions and human behavioral adaptations ($R_t$). When $R_t$ decreases below the threshold of 1, the number of new infections begins to decline. Estimates were obtained through a Bayesian approach applied to case-based surveillance data collected by regional health authorities (Appendix).

To account for the geographic heterogeneity in contacts, healthcare organization, and timelines of interventions, $R_t$ was estimated separately for different provinces and regions. We considered all 19 regions in Italy plus the 2 autonomous provinces of Trento and Bolzano. Moreover, we considered 100 of the remaining 105 provinces for which the data were sufficiently complete. The selected provinces covered 99.1% of the population of Italy and, as of May 3, 2020, accounted for 153,558 symptomatic cases (97.9% of the total recorded in the surveillance database). To evaluate the progressive decrease of transmission, we computed $R_t$ at 3 dates: the day before lockdown (March 10) and 1 and 2 weeks after lockdown (March 18 and 25). In addition, we considered the average value of $R_t$ over the successive 3 weeks (March 26–April 15). These choices were suggested by the trend of the national $R_t$ (Appendix).

The $R_0$ range was 2.83–3.10 (Figure 1) in the 8 regions for which the estimate was possible.
On March 10, $R_t$ range was 1.79–3.36 across regions; Basilicata and Molise had an insufficient number of symptomatic cases (Figure 1). One week into lockdown, on March 18, $R_t$ had decreased consistently, but no region or autonomous province was yet below the epidemic threshold (Figure 1). As of March 25, $R_t$ was <1 in most regions and autonomous provinces (12/21) and <1 in the successive 3 weeks for all regions except Molise and Piedmont (Figure 1). The mean value of $R_t$ across the regions and autonomous provinces, weighted by the number of reported cases at the corresponding date, fell from an average of 2.03 (95% CI 1.94–2.13) on March 10 to 1.28 (95% CI 1.23–1.33) on March 18, to 0.88 (95% CI 0.84–0.91) on March 25, corresponding to an overall 62.6% reduction (range across regions 45.6%–85.0%). In the 3 weeks of March 26–April 15, $R_t$ remained stable in all regions, showing a further slight reduction at an average value of 0.76 (95% CI 0.67–0.85).

Results were consistent when analyzing estimates from the 100 selected provinces (Figure 2). As of March 10, no province had a mean estimated value of $R_t$ <1 (n = 75; the number of symptomatic cases was insufficient for the estimate in 25 provinces). One week after lockdown, on March 18, 5/93 provinces (5.4%) had an average $R_t$ <1, whereas on March 25 this figure increased to 49/96 provinces (51.0%). The fraction of provinces with $R_t$ below 1 rose to 84/100 (84.0%) when considering the average over the following 3 weeks. The mean value of the reproduction number across the provinces, weighted by the province’s number of reported cases at the corresponding date, was 2.01 (95% CI 1.83–2.22) on March 10, 1.26 (95% CI 1.15–1.38) on March 18, 0.88 (95% CI 0.79–0.97) on March 25, and 0.77 (95% CI 0.63–0.95) for the period March 26–April 15.

Conclusions

Our results suggest that the national lockdown put in place as of March 11 to limit the spread of SARS-CoV-2 in Italy brought $R_t$ below 1 in most regions and provinces within 2 weeks. Although $R_t$ had been declining steeply even before the national lockdown (3) in regions with intense interventions, we estimated that the epidemic was brought under control only after the implementation of the lockdown. Lockdown was fundamental to prevent an explosion in the number of cases in other regions in which transmission had started weeks later compared with the outbreak epicenter (Lombardy, Veneto, Emilia Romagna). The range of estimates of $R_0$ in 8 regions was 2.8–3.1, within the range of estimates obtained for other countries (4–6).

A massive and sustained scale-up of testing capacity was set up in all regions of Italy during the course of the epidemic (7); it was not accompanied by a corresponding increase of confirmed incident cases in the weeks following March 25, as indicated by the declining proportion of positive tests (Appendix). This finding suggests an increase of notification rates and thus a possible overestimation of $R_t$ (8). To compensate for possible biases, we supplemented our results by computing alternative estimates based on the
time series of hospitalized cases. Criteria for hospitalization are more homogeneous across local health systems and over time than testing criteria because they are grounded in the patient’s need for medical assistance. Furthermore, the hospitalization date is an easier piece of information to collect with respect to the symptom onset date, which requires an epidemiologic investigation and may be subject to recall bias. Results obtained with this additional method were consistent with our conclusions (Appendix).

We did not consider asymptomatic cases in our analysis. The adopted methodology is robust even in the presence of large underdetection rates, provided that these rates are constant over time or even slightly fluctuating (8,9). We did not consider imported cases either, due to the lack of data; imported cases are potential infectors, but do not contribute to the number of transmitted cases, thereby lowering estimates of reproduction numbers. In Italy, most cases were probably locally transmitted. After March 11, the ban of movement across provinces imposed by the lockdown made the role of imported cases negligible. Reproduction numbers were computed using the distribution of serial interval for Italy (10; D. Cereda et al.), which is an acceptable approximation of the generation interval (11; S. Hu et al., unpub. data, https://10.1101/2020.07.23.20160317). Both distributions are strongly influenced by country-dependent variables, such as behavior of infected persons and the adopted interventions. Estimates of the generation interval distribution are still unavailable for Italy as of October 2020.

Italy was the first country outside of Asia to impose a nationwide lockdown, rapidly followed by many countries worldwide. The effectiveness of lockdown had been proven in China, where the reproduction number was estimated to fall to $\approx 0.3$ in Wuhan (12) and 0.5 in other provinces (8); Western countries had enforced a comparatively softer version of restrictions. We have shown that these measures enabled rapid reversal of the epidemic trend within 2 weeks, although probably at higher values of the reproduction number.

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Domenica Mignuoli (Calabria), Angelo D’Argenzio (Campania), Erika Massimiliani (Emilia-Romagna), Tolinda Gallo (Friuli Venezia Giulia), Paola Scognamiglio (Lazio), Camilla Stitchi (Liguria), Daniol Cereda (Lombardia), Daniel Fiacchini (Marche), Francesco Sforza (Molise), Maria Grazia Zuccaro (P.A. Bolzano), Pier Paolo Benetollo (P.A. Trento), Donatella Tiberti (Piemonte), Maria Chironna (Puglia), Maria Antonietta Palmas (Sardegna), Salvatore Scondotto (Sicilia), Emanuela Balocchini (Toscana), Anna Tosti (Umbria), Mauro Ruffier (Valle D’Aosta), and Filippo Da Re (Veneto).


M.A. has received research funding unrelated to COVID-19 from Seqirus.

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References

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Impact of a Nationwide Lockdown on SARS-CoV-2 Transmissibility, Italy

Appendix

Timeline of Interventions

The interventions performed in Italy to control the spread of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) were initially localized in the 3 regions in which the large majority of cases had been detected (Lombardy, Veneto, Emilia Romagna), and included the creation of red zones in areas with sustained transmission, the ban of mass gatherings, and the closure of schools. School closure at the national level was mandated on March 5. On March 8, the red zone was extended to the entire region of Lombardy, and to several provinces in the regions of Emilia-Romagna, Piedmont, Veneto, and Marche. Finally, the national lockdown (stay-home mandate and closure of all nonessential productive activities) was issued on March 11, 2020. The timeline of interventions performed over the period February 23, 2020–May 4, 2020 is summarized (Appendix Table 1).

Changes in Infection Ascertainment Rates

Temporal changes in the ascertainment rate of SARS-CoV-2 infections can be indirectly evaluated by observing changes in the proportion of positive tests, given by the ratio between the number of new confirmed cases and the number of performed tests (I). A declining proportion of positive tests may derive from the combined effect of a nondecreasing prevalence of infection and an increasing number of tests being administered, thereby resulting in higher rates of cases being ascertained. A massive scale-up of the testing capacity was implemented during the course of the epidemic, resulting in a declining proportion of positive tests after March 25; however, the decline of positive tests needs to be interpreted in the context of a likely declining incidence (Rt <1) (Appendix Figure 1).
Bayesian Methods for Estimating the Basic and Net Reproduction Number

Case-based surveillance data were collected by regional health authorities and collated by the Istituto Superiore di Sanità using a secure online platform, according to a progressively harmonized track record. Data include, among other information, the place of residence, the date of symptom onset and the date of first hospital admission for laboratory-confirmed COVID-19 cases (3). In the early phase of the epidemics, the Italian regions did not report the number of cases that were imported from abroad or from other regions in the country. However, it is likely that the large majority of cases were locally transmitted, given that the epidemic was already widespread by the time of detection on February 1, 2020. After March 11, the national lockdown imposed a ban on movement across provinces except for well-documented special cases (health- or work-related), and thus the role of imported cases was probably negligible.

The distribution of the net reproduction number $R_t$ was estimated by applying a well-established statistical method (4), which is based on the knowledge of the distribution of the generation time and on the time series of cases. In particular, the posterior distribution of $R_t$ for any time point $t$ was estimated by applying the Metropolis-Hastings Markov chain Monte Carlo sampling to a likelihood function defined as follows:

$$\mathcal{L} = \prod_{t=1}^{T} P\left(C(t); R_t \sum_{s=1}^{T} \varphi(s) C(t-s) \right)$$

where

- $P(k; \lambda)$ is the probability mass function of a Poisson distribution (i.e., the probability of observing $k$ events if these events occur with rate $\lambda$)
- $C(t)$ is the daily number of new cases having symptom onset at time $t$
- $R_t$ is the net reproduction number at time $t$ to be estimated
- $\varphi(s)$ is the probability distribution density of the generation time evaluated at time $s$.

As a proxy for the distribution of the generation time, we used the distribution of the serial interval, estimated from the analysis of contact tracing data in Lombardy (D. Cereda et al., unpub. data, https://arxiv.org/abs/2003.09320), i.e., a gamma function with shape 1.87 and rate 0.28, having a mean of 6.6 days. This estimate was later confirmed by independent study on a
village (Vo’ Euganeo) in the region of Veneto (5) and is within the range estimated for other countries (6–9; S. Hu et al., unpub. data, https://10.1101/2020.07.23.20160317).

To estimate $R_0$, we estimated a constant daily reproduction number $R_t = R_0$ over a time window, defined as a period of exponential growth in the early phase of the outbreak preceding the implementation of interventions (Appendix Table 2).

Regions that were not considered for the estimation of $R_0$ did not have a clearly identifiable exponential growth window of ≥1 week before the implementation of any interventions and ≥5 symptomatic cases per day. In the early phase of the epidemic, the region of Piedmont was not able to track the date of symptom onset for a large number of cases, resulting in an epidemic curve that cannot be used to provide a reliable estimate of $R_0$.

**Trends in Country-Level Net Reproduction Number**

We estimated the net reproduction number $R_t$ from the time series of cases occurring in the whole country by date of symptom onset (Appendix Figure 2). Darker gray lines indicate the dates of March 10, 18, and 25, at which we sampled the regional and provincial estimates in the main analysis. A declining trend was visible before the lockdown (March 11), but lockdown enhanced the negative slope of the decline and brought $R_t$ below threshold. After March 25, the $R_t$ for Italy oscillated slightly around a stable value.

**Comparison of Results with Hospitalization-Derived Reproduction Number**

We performed a sensitivity analysis in which we adopted the same methodology used to estimate $R_t$, but applied to the time series of hospitalized cases (by date of hospitalization) instead of date of symptom onset (Appendix Figure 3). In particular, we estimated the reproduction number at March 25, using 2 different datasets: the time series of COVID-19 cases by date of symptom onset $C(t)$ (estimate denoted by $R_{sym}$), as shown in Figure 1; and the time series of hospitalized cases by date of hospital admission, $H(t)$ (estimate denoted by $R_{hosp}$). Because case-patients are admitted to the hospital at delayed time $D$ from their symptom onset, we computed $R_{hosp}$ using the shifted time series of hospitalized cases, $H(t+D)$. The median value of $D$ was estimated at 7 days from surveillance data, using 32,893 cases for which both the date of symptom onset and the date of hospital admission were available. Overall, $H(t)$ includes
60,439 hospitalized cases recorded in the surveillance dataset as of April 1. Estimates of $R^{\text{hosp}}$ for Piedmont could not be computed because the hospitalization data was incomplete.

**References**


Appendix Table 1. Interventions performed in Italy to prevent transmission of severe acute respiratory syndrome coronavirus 2 during February 21–May 4, 2020

<table>
<thead>
<tr>
<th>Date</th>
<th>Location</th>
<th>Interventions</th>
</tr>
</thead>
<tbody>
<tr>
<td>February 23</td>
<td>Lombardy</td>
<td>Creation of red zones in 11 municipalities of Lombardy and around the municipality of Vo’ Euganeo in Veneto; ban of mass gatherings; school closure</td>
</tr>
<tr>
<td>March 2</td>
<td>Emilia-Romagna</td>
<td>Ban of mass gatherings; school closure</td>
</tr>
<tr>
<td>March 5</td>
<td>All Italian regions</td>
<td>School closure</td>
</tr>
<tr>
<td>March 8</td>
<td>Lombardy</td>
<td>Closure of all non-essential productive activities; stay-home mandate except for well-documented special cases (health or work-related)</td>
</tr>
<tr>
<td></td>
<td></td>
<td>5 provinces in Emilia-Romagna</td>
</tr>
<tr>
<td></td>
<td></td>
<td>5 provinces in Piedmont</td>
</tr>
<tr>
<td></td>
<td></td>
<td>3 provinces in Veneto</td>
</tr>
<tr>
<td></td>
<td></td>
<td>1 province in Marche</td>
</tr>
<tr>
<td>March 11</td>
<td>All regions of Italy</td>
<td>Closure of all nonessential productive activities; stay-home mandate except for well-documented special cases (health or work-related)</td>
</tr>
</tbody>
</table>

Appendix Table 2. Regions characterized by periods of exponential growth before the national lockdown issued in Italy on March 11, 2020

<table>
<thead>
<tr>
<th>Region</th>
<th>From</th>
<th>To</th>
</tr>
</thead>
<tbody>
<tr>
<td>Campania</td>
<td>February 27</td>
<td>March 5</td>
</tr>
<tr>
<td>Emilia-Romagna</td>
<td>February 20</td>
<td>February 27</td>
</tr>
<tr>
<td>Lazio</td>
<td>February 27</td>
<td>March 5</td>
</tr>
<tr>
<td>Liguria</td>
<td>February 27</td>
<td>March 5</td>
</tr>
<tr>
<td>Lombardy</td>
<td>February 13</td>
<td>February 20</td>
</tr>
<tr>
<td>Marche</td>
<td>February 20</td>
<td>February 27</td>
</tr>
<tr>
<td>Toscana</td>
<td>February 27</td>
<td>March 5</td>
</tr>
<tr>
<td>Veneto</td>
<td>February 15</td>
<td>February 22</td>
</tr>
</tbody>
</table>

Appendix Figure 1. Number of lab tests (left) and lab-confirmed incident cases (center) per 100,000 population, and proportion of positive tests (right) in all regions and 2 autonomous provinces of Italy, as reported by the Italian Civil Protection Department (2). Note that lab-confirmed cases refer to infections occurring several days and up to few weeks before the reporting date, due to delays related to development of symptoms, seeking for medical care, execution of tests, and reporting to national authorities.
Appendix Figure 2. Estimates of the reproduction number over time, using the time series of COVID-19 cases in Italy by date of symptom onset.

Appendix Figure 3. Estimates of the reproduction number at March 25, using the time series of COVID-19 cases by date of symptom onset ($R_{sym}$) and the time series of hospitalized cases by date of hospital admission ($R_{hosp}$).