

Questioning the spatial association between the spread of COVID-19 and transit usage in Italy

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Overview

- 1 *Introduction*
- 2 *Empirical analysis*
- 3 *Conclusions*
- 4 *Appendices*

Research question

- To curb the spread of COVID-19, several governments imposed (among many other policies) restrictions on public transport.
- How dangerous is it to move around a certain territory? Does the danger depend on the mode of transport?
- We test whether places in which commuters were more prone to use public transport were more severely affected by the first wave of the pandemic in Italy.

▶ Timeline

Measuring the spread of COVID-19 and transit usage¹

$$mortality_growth_{it} = \frac{fatalities_{it}^{total(20)} - fatalities_{it}^{mean(15-19)}}{fatalities_{it}^{mean(15-19)}} \quad (1)$$

- i denotes the LLM and t denotes the day.

[▶ Trend](#)

- $transit_i$ = share of the population who commute by collective means of transport for work or study reasons.

[▶ Maps](#)

¹Source: ISTAT and 2011 national census.

Measuring commuting and other factors²

$$\text{internal_commuting}_i = \frac{p_{ii}}{\text{population}_i} \quad (2)$$

- p_{ii} measures the self-flows.

$$\text{external_commuting}_i = \frac{\sum_{j=1}^n (p_{ij} + p_{ji})}{\text{population}_i} \quad (3)$$

- p_{ij} measures the out-flows.
- p_{ji} measures the in-flows.
- Control variables = *altitude, coastal, ln_density, house_m²_pc, share_over75, hospital_beds, pm10, district.*

²Source: ISTAT and 2011 national census.

Econometric model

$$\begin{aligned} mortality_growth_{it} = & \beta_0 + \beta_m transit_i \times \delta_m \\ & + \gamma_m internal_commuting_i \times \delta_m \\ & + \eta_m external_commuting_i \times \delta_m \\ & + \omega_m Z_i \times \delta_m + \alpha_i + \delta_t + \epsilon_{it} \end{aligned} \quad (4)$$

- All explanatory variables are interacted with month dummies δ_m .
- α_i and δ_t are LMM and day fixed effects.
- ϵ_{it} are standard errors clustered at the LLM level.

Table 1: Transit usage, commuting, and mortality growth

▶ Coefplot

▶ Quantiles

	<i>mortality_growth</i>			
	(1)	(2)	(3)	(4)
<i>transit</i> × <i>March</i>	-0.945 (0.907)	-1.070 (0.830)	-1.273 (0.970)	-0.976 (0.930)
<i>transit</i> × <i>April</i>	-0.336 (0.699)	-0.537 (0.637)	-0.158 (0.663)	-0.079 (0.681)
<i>internal_commuting</i> × <i>March</i>		3.600*** (0.662)	2.183*** (0.618)	1.126* (0.611)
<i>internal_commuting</i> × <i>April</i>		2.871*** (0.433)	2.236*** (0.527)	1.815*** (0.496)
<i>external_commuting</i> × <i>March</i>		4.468*** (0.824)	3.821*** (0.845)	2.261*** (0.607)
<i>external_commuting</i> × <i>April</i>		2.652*** (0.433)	2.280*** (0.481)	1.627*** (0.443)
LLM FE	✓	✓	✓	✓
Day FE	✓	✓	✓	✓
Geographic controls × δ_m	×	×	✓	✓
Demographic controls × δ_m	×	×	✓	✓
Vulnerability controls × δ_m	×	×	×	✓
Economic controls × δ_m	×	×	×	✓
Observations	105 948	105 948	105 948	105 948
R^2	0.06	0.07	0.07	0.08

OLS estimates. *** $p < 0.01$, ** $p < 0.05$, * $p < 0.1$.

Concluding remarks

- The statistically weak association between COVID-19-related fatalities and transit usage suggests that:
 - Locations where transit was most used were not severely affected by higher excess mortality³.
 - What matters most is whether people move⁴, not how they move.
- Clearly, we cannot rule out the possibility of virus transmission on public transport.

³Askitas et al. (2021), Wielechowski et al. (2020).

⁴Cintia et al. (2020), Iacus et al. (2020), Borsati et al. (2020).

Thank you for your attention!

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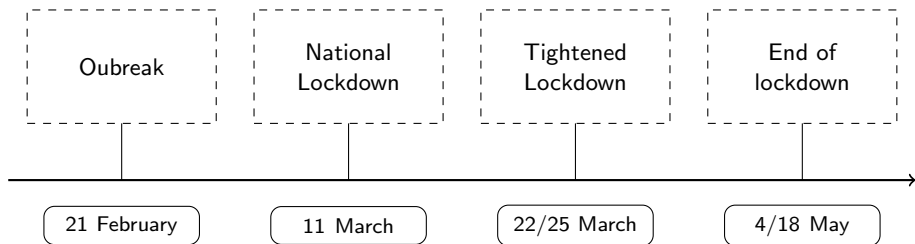
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The COVID-19 crisis

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Figure 1: Timeline of the main events



- Italy was the first Western country to be deeply affected by the disease.

Figure 2: Evolution of *mortality_growth* in Italy, by day [▶ Back](#)

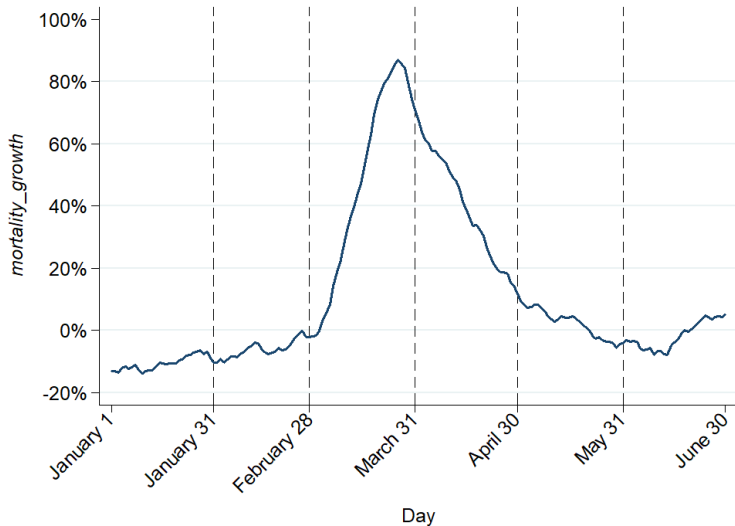


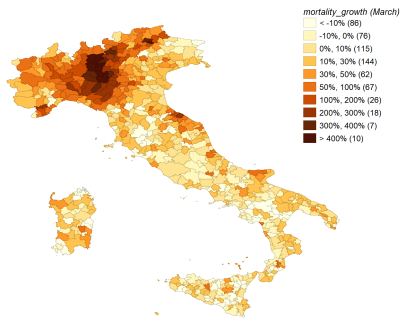
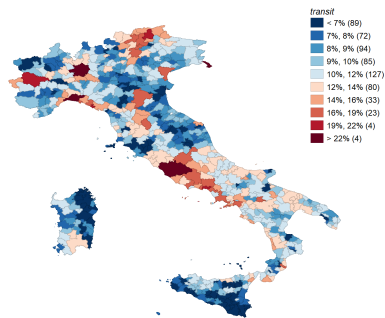
Figure 3: Descriptive evidence, by LLM [▶ Back](#)(a) Average *mortality_growth* in March(b) *transit*

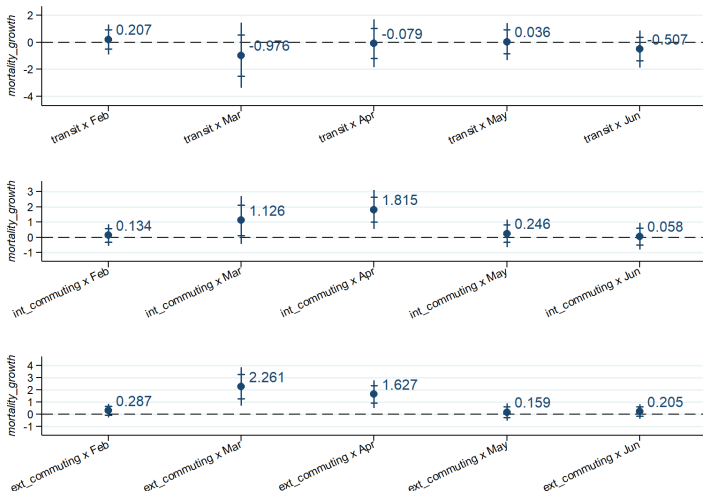
Figure 5: Estimated coefficients⁵ of transit and commuting indices[▶ Back](#)⁵With 99% and 90% confidence intervals.

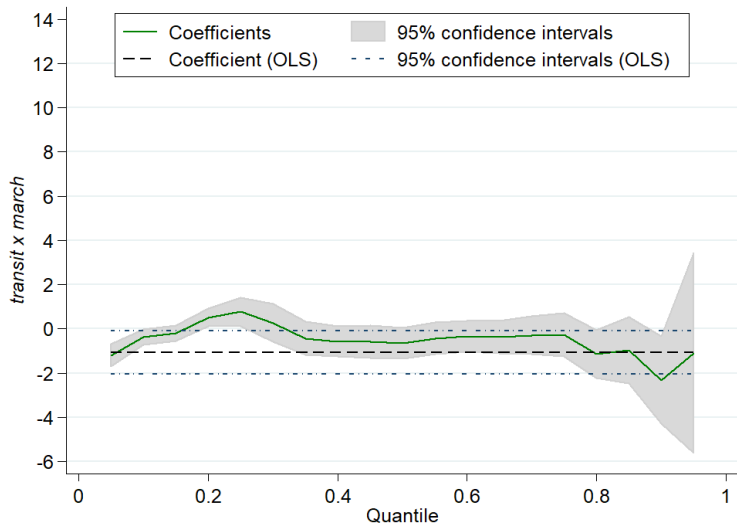
Figure 6: Quantile regression coefficients (*transit* in March) [▶ Back](#)

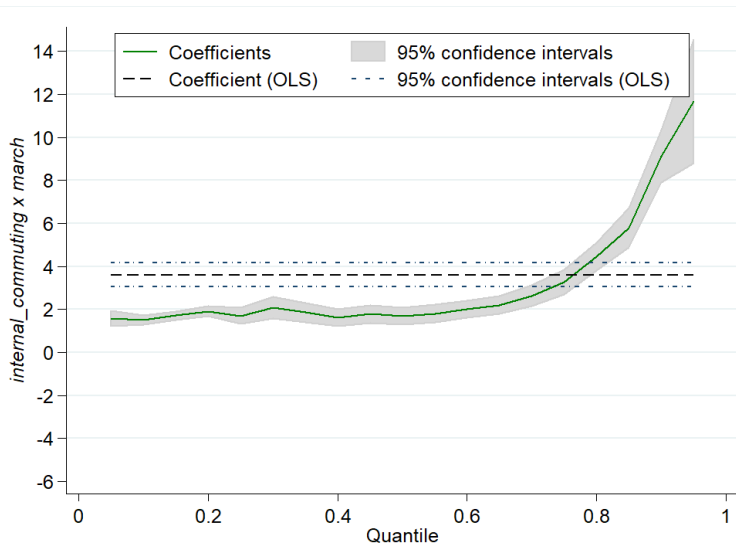
Figure 7: Quantile regression coefficients (*internal_commuting* in March)[▶ Back](#)

Figure 8: Quantile regression coefficients (*external_commuting* in March) [▶ Back](#)