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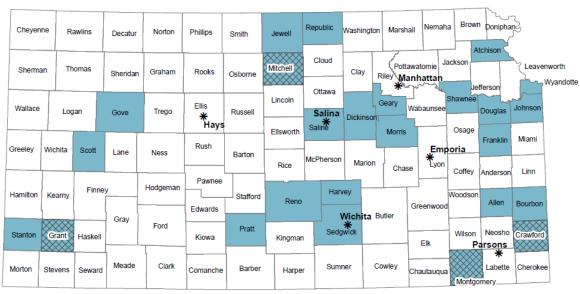
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Do Masks Work?

Mask Mandates in Kansas, by County as of August 20, 2020



Source: Institute for Policy & Social Research, The University of Kansas; data from the Kansas Chamber and Kansas Health Institute.

- Adopted (or did not rescind Governor's) mask order

 Not enforcing mask order
- No county mask mandate
- * City mask mandate

 On July 3rd, the Governor implemented a mask mandate for the state of Kansas.

- Counties could opt-out of the mandate.
- Some cities imposed a mandate but the surrounding county did not
 - Manhattan has a mask mandate but Riley County does not.



Source: IPSR

Difference-in-Differences Model

| | Before | After | |
|------------|---------------------|---------------------|-----------------------------------------------------------|
| | Change | Change | Difference |
| Treatment | Cases _{t1} | Cases _{t2} | ΔCases _t |
| (Masks) | | | = Cases _{t2} -Cases _{t1} |
| Control | Cases _{c1} | Cases _{c2} | $\Delta Cases_c$ |
| (No Mask) | | | =Cases _{c2} -Cases _{c1} |
| Difference | | | ΔΔCases |
| | | | Δ Cases _t – Δ Cases _c |

We can think of counties with a mask mandate as the treatment and counties without a mask mandate as the control. Taking the difference in the difference in cases for the treatment and control groups provides an estimate of the treatment effect of masks on cases.



Data

- Daily total number of cases per county March October 11th
 - New York Times (https://github.com/nytimes/covid-19-data)
- 2019 Population per County
 - US Census Bureau
- City and County Face mask policies
 - Kansas Health Institute
 (https://www.khi.org/assets/uploads/news/15015/40830brieffinal102320sc.pdf)
- Social Mobility Data
 - Maryland Transportation Institute
 - https://data.covid.umd.edu





Dates of County Mask Orders

New Counties

| County | Date Adopted | Enforced |
|----------|--------------|----------|
| Geary | 8/5/2020 | Υ |
| Gove | 8/3/2020 | Υ |
| Grant | 7/3/2020 | N |
| Harvey | 9/16/2020 | Υ |
| Morris | 7/10/2020 | Υ |
| Pratt | 7/16/2020 | Υ |
| Republic | 8/4/2020 | Υ |
| Saline | 7/9/2020 | Υ |
| Scott | 8/10/2020 | Υ |
| Sedgwick | 9/9/2020 | Υ |
| Stanton | 7/23/2020 | Υ |

Mask Mandates in Kansas, by County as of August 20, 2020

| Cheyen | ne | Ra | wlins | Decatu | Norton | Phillips | Smith | Jewell | Republic | Washing | gton Mars | hall | Brow | n Donipha | |
|----------|-------|------|---------|---------|----------|---------------------------|----------|-----------|------------------------|-----------------------|-----------|------------------------|---------|-----------|----------|
| Sherma | an | Tho | omas | Sherida | n Graham | Rooks | Osborne | Mitchell | Cloud | Clay | | tawatomie lanhattan | ackson | Atchison | Leavenwo |
| Wallace | | Loga | an | Gove | Trego | Ellis * Hays | Russell | Lincoln | Ottawa Salina Saline | Dickins | Geary | Wabaunsee | Shawnee | | Johnson |
| Greeley | Wichi | ita | Scott | Lane | Ness | Rush | Barton | Ellsworth | McPherson | n Mari | on Cha | Emi | ooria | Franklin | Miami |
| Hamilton | Kear | rny | Finne | ey . | Hodgeman | Pawnee Edwards | Stafford | Reno | | rvey | | Greenwood | Woodsor | Anderson | Bourbon |
| Stanton | Gra | int | Haskell | Gray | Ford | Kiowa | Pratt | Kingman | Sed | Wichita * gwick | a Butler | Elk | Wilson | Neosho | Crawford |
| Morton | Steve | ens | Seward | Meade | Clark | Comanche | Barber | Harpe | r Sun | nner | Cowley | Chautauqua | Montg | Labette | Cherokee |

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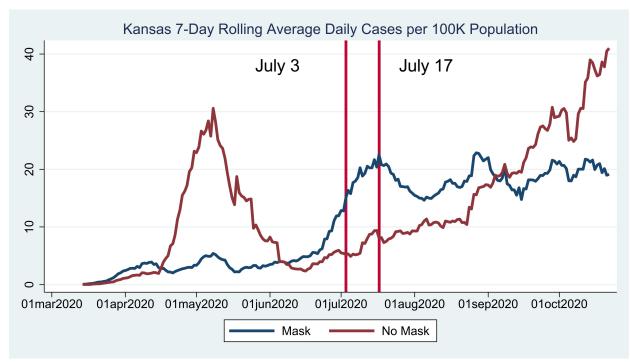
* City mask mandate



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Kansas 7-Day Rolling Average Daily Cases per 100K Population

- Counties with a mask mandate saw a decrease starting 14 days after the mandate
- New spikes afterwards despite mandate
- Mask counties held cases flat
- No-Mask counties steadily increasing

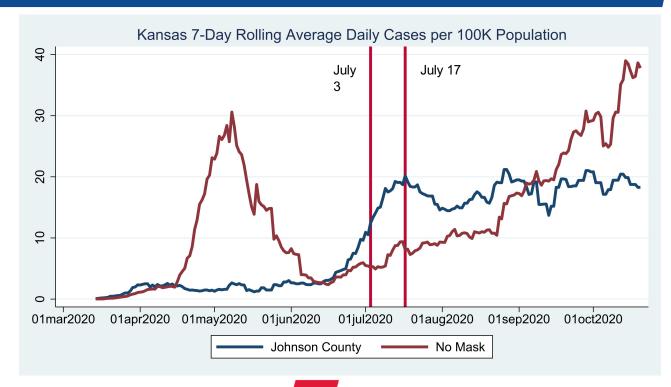






Johnson County vs. No Mask Counties 7-Day Rolling Average

- Johnson County had a decrease starting
 14 days after the mandate
- Results are not increasing over time for Johnson County
- No-Mask counties now have much higher case rates than Johnson County

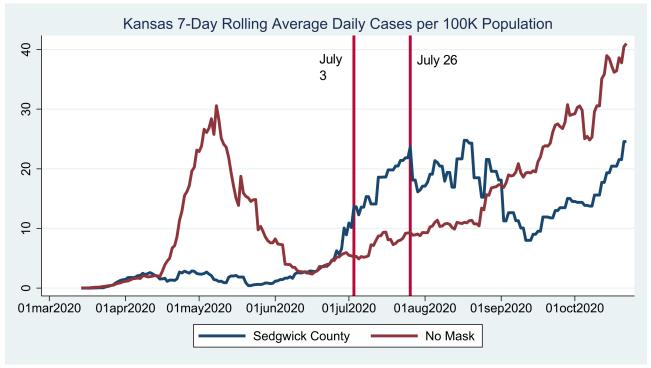






Sedgwick County vs. No Mask Counties 7-Day Rolling Average

- Sedgwick County had a decrease starting 23 days after the mandate
- No-Mask counties now have much higher case rates than Sedgwick County







Difference-in-Differences Model

What is the average effect starting 21 days after the mandate?

$$Y_{it} = \alpha + \beta MandateN_{it} + \eta X_t + \gamma_t + \delta_t + \epsilon_{it}$$

Where:

- Y_{it}: Daily cases in county i at day t
- $MandateN_{it}$: Dummy equal to one **starting N = 21 days since mask mandate** in county i, and zero otherwise
- X_t : A vector with variables controlling for social distancing behavior
- γ_t: A vector with day fixed effects
- δ_t : A vector with county fixed effects
- ϵ_{it} : Error term





Difference-in-Difference Estimates

- Mask mandate associated with an average 7 fewer cases per day in Kansas and 6.5 fewer cases in Johnson County (50% reduction)
- Sedgwick County: between 9 fewer cases (61% reduction)
- Analysis drops counties that had late mandate, no enforcement or city-only mandates.

| VARIABLES | Full S | ample | Johnson | Sedgwick | |
|---------------------------|----------|----------|---------|----------|--|
| | | | | | |
| Mask Mandate + 21 days | -7.30*** | -7.12*** | -6.49* | -9.12** | |
| | (1.13) | (1.15) | (3.88) | (4.29) | |
| Constant | -3.92 | -13.46 | -15.27 | -12.12 | |
| | (5.69) | (9.09) | (9.62) | (10.64) | |
| | | | | | |
| Observations | 11,424 | 11,424 | 9,928 | 10,074 | |
| R-squared | 0.24 | 0.24 | 0.25 | 0.23 | |
| Number of Counties | 84 | 84 | 73 | 73 | |
| Average New Daily Cases | 14.27 | | 14.99 | | |
| County FE | Υ | Υ | Υ | Υ | |
| Day FE | Υ | Υ | Υ | Υ | |

Note: Non-Enforcers, Late Adopters and Mixed Counties dropped. Standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

| INSTITUTE FOR POLICY & SOCIAL PREFARCE.

The University of Kansas

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Do Masks Work in Kansas?

- · Yes!
- We found a 50% reduction in the spread of COVID-19 in counties that had a mask mandate compared to those without.
- Masks do not eliminate COVID, but they significantly slow the spread of the disease.





Thank You!



