

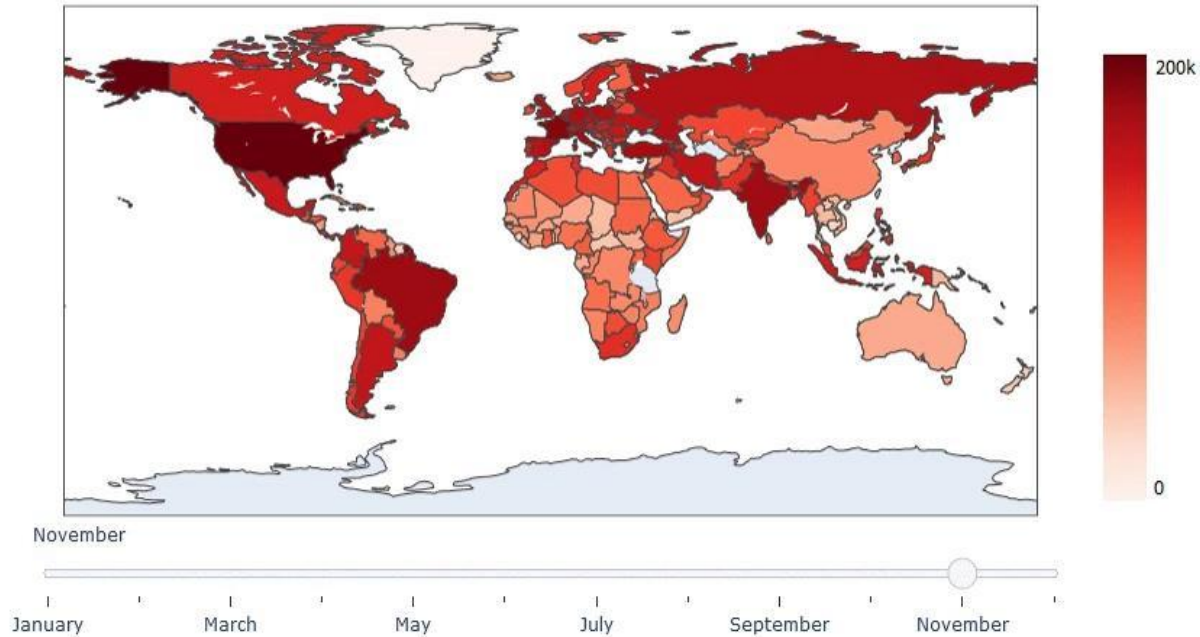


COVID-19 & Government Policies

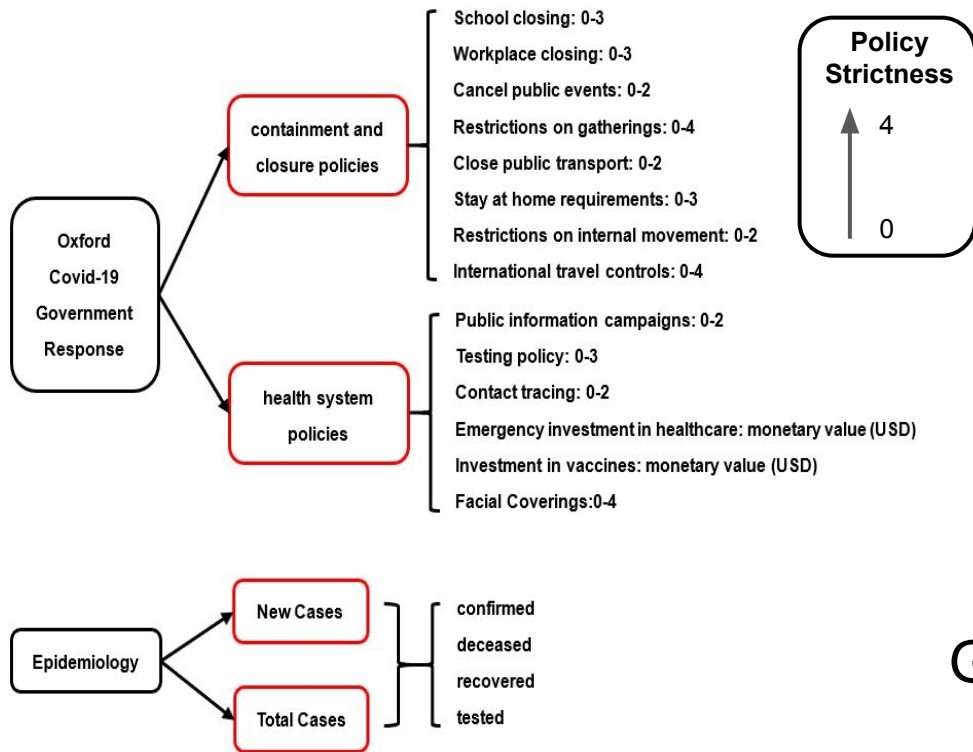
Team 24: Balaji Shankar Balachandran, David Lu, Seth Farrell, Wei Wang

COVID-19's International Impact

Average Monthly Cases Per Country



Dataset



| key | date | wikidata | datacommons | country_code | country_name | subregion1_code | subregion1_name | subregion2_code | subregion2_name |
|------------|----------------|-------------------|----------------------|----------------------------|--------------------------|---------------------------|----------------------|--------------------|---------------------|
| 0 | AD | 2020-12-07 | Q298 | country/AND | AD | Andorra | NaN | NaN | NaN |
| ... | | | | | | | | | |
| key | population | population_male | population_female | rural_population | urban_population | largest_city_population | clustered_population | population_density | population_per_sqkm |
| 0 | AD | 77142.0 | 58625.0 | 55581.0 | 9269.0 | 67673.0 | NaN | NaN | NaN |
| ... | | | | | | | | | |
| key | gdp | gdp_per_capita | human_capital_index | | | | | | |
| 0 | AD | 3.154058e+09 | 40886.0 | NaN | NaN | NaN | NaN | NaN | NaN |
| ... | | | | | | | | | |
| key | new_confirmed | new_deceased | new_recovered | new_tested | total_confirmed | total_deceased | total_recovered | total_tested | |
| ... | | | | | | | | | |
| date | | | | | | | | | |
| 1900-01-16 | CZ | NaN | NaN | 2.0 | NaN | NaN | NaN | 2.0 | NaN |
| 1900-01-15 | CZ_10 | NaN | NaN | 1.0 | NaN | NaN | NaN | 1.0 | NaN |
| ... | | | | | | | | | |
| key | school_closing | workplace_closing | cancel_public_events | restrictions_on_gatherings | public_transport_closing | stay_at_home_requirements | rest | | |
| ... | | | | | | | | | |
| 2020-01-01 | AD | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN | 2646619.0 |
| 2020-01-01 | AE | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN | 1021311.0 |
| 2020-01-01 | AF | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN | |
| 2020-01-01 | AL | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN | |
| 2020-01-01 | AO | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN | |
| ... | | | | | | | | | |
| 2020-12-06 | US_AZ | NaN | NaN | NaN | NaN | NaN | NaN | | |
| 2020-12-06 | US_MN | NaN | NaN | NaN | NaN | NaN | NaN | | |
| 2020-12-06 | VE | 3.0 | 2.0 | 2.0 | 4.0 | 1.0 | 2.0 | | |
| 2020-12-06 | XX | 1.0 | 2.0 | 2.0 | 4.0 | 1.0 | 2.0 | | |
| 2020-12-06 | ZM | 1.0 | 2.0 | 1.0 | 4.0 | 0.0 | 1.0 | | |

Google Cloud Platform dataset

Data Pre-processing

| key date wikidata datacommons country_code country_name subregion1_code subregion1_name subregion2_code subregion2_name | | | | | | | | | |
|--|-------|--------------|---------|-------------|--------|---------|-----|-----|-----|
| 0 | AD | 2503-12-07 | Q228 | country:AND | AD | Andorra | NaN | NaN | NaN |
| key population population_male population_female rural_population urban_population largest_city_population clustered_population population | | | | | | | | | |
| 0 | AD | 77142.0 | 58625.0 | 55581.0 | 9289.0 | 67873.0 | NaN | NaN | NaN |
| key gdp gdp_per_capita human_capital_index | | | | | | | | | |
| 0 | AD | 3.154058e+09 | 40886.0 | NaN | NaN | NaN | NaN | NaN | NaN |
| key new_confirmed new_deceased new_recovered new_tested total_confirmed total_deceased total_recovered total_tested | | | | | | | | | |
| date | | | | | | | | | |
| 1900-01-15 | CZ | NaN | NaN | 2.0 | NaN | NaN | NaN | 2.0 | NaN |
| 1900-01-15 | CZ_10 | NaN | NaN | 1.0 | NaN | NaN | NaN | 1.0 | NaN |
| key school_closing workplace_closing cancel_public_events restrictions_on_gatherings public_transport_closing stay_at_home_requirements rest | | | | | | | | | |
| date | | | | | | | | | |
| 2020-01-01 | AD | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN |
| 2020-01-01 | AE | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN |
| 2020-01-01 | AF | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN |
| 2020-01-01 | AL | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN |
| 2020-01-01 | AO | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | NaN |
| 2020-12-06 | US_AZ | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| 2020-12-06 | US_MN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| 2020-12-06 | VE | 3.0 | 2.0 | 2.0 | 4.0 | 1.0 | 2.0 | 2.0 | NaN |
| 2020-12-06 | XK | 1.0 | 2.0 | 2.0 | 4.0 | 1.0 | 2.0 | 2.0 | NaN |
| 2020-12-06 | ZM | 1.0 | 2.0 | 1.0 | 4.0 | 0.0 | 1.0 | 1.0 | NaN |

1. Data normalization

| date | key | testing_policy | contact_tracing |
|-------|------------|----------------|-----------------|
| 87258 | 2020-12-06 | VE | 3.0 0.0 |
| 87259 | 2020-12-06 | XK | 3.0 1.0 |
| 87260 | 2020-12-06 | ZM | 3.0 2.0 |

| date | key | testing_policy | contact_tracing |
|-------|------------|----------------|-----------------|
| 87258 | 2020-12-06 | VE | 1.0 0.0 |
| 87259 | 2020-12-06 | XK | 1.0 0.5 |
| 87260 | 2020-12-06 | ZM | 1.0 1.0 |

2. Average across time

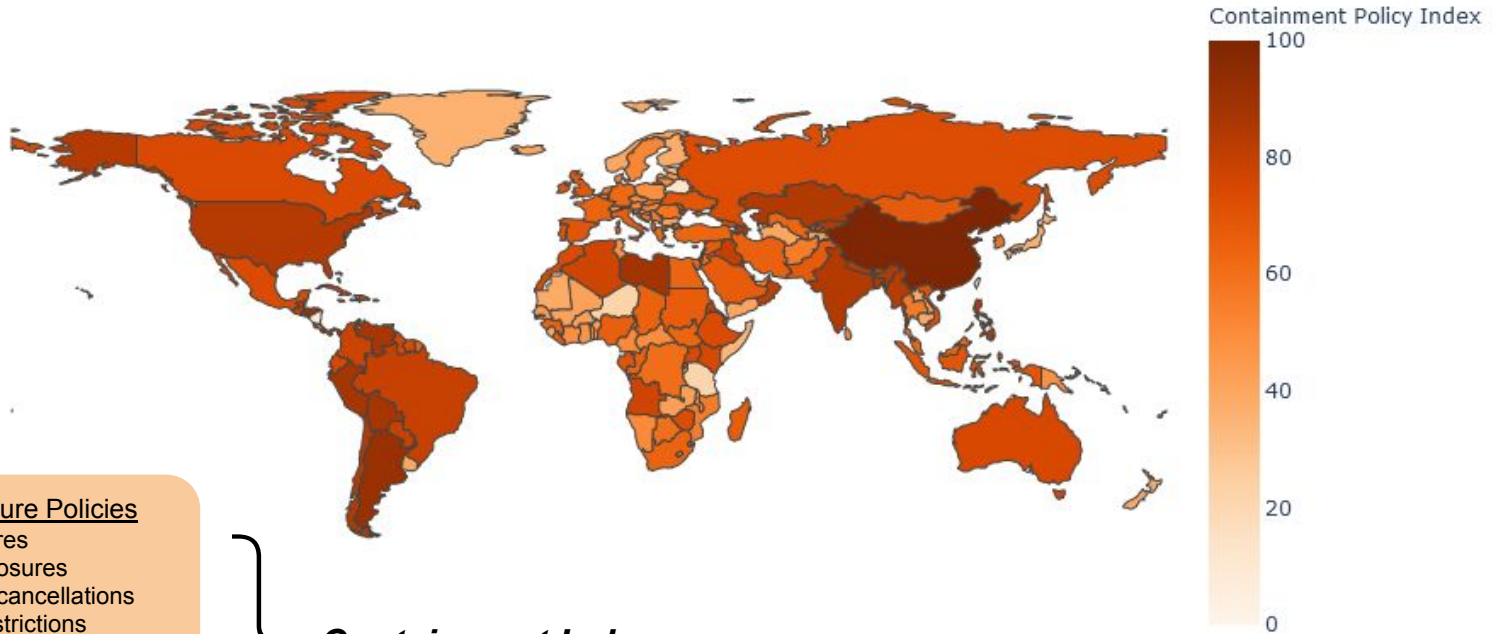
| date |
|------------|
| 2020-01-01 |
| 2020-01-02 |
| 2020-01-03 |
| 2020-01-04 |
| 2020-01-05 |
| ... |
| 2020-12-01 |
| 2020-12-02 |
| 2020-12-03 |
| 2020-12-04 |
| 2020-12-05 |

| date |
|------------|
| 2020-01-01 |
| 2020-01-02 |
| 2020-01-03 |
| 2020-01-04 |
| 2020-01-05 |
| ... |
| 2020-12-01 |
| 2020-12-02 |
| 2020-12-03 |
| 2020-12-04 |
| 2020-12-05 |

Methodology

- ❑ How can government responses be quantified?
- ❑ What strategies worked for successful countries?
- ❑ How did the US fare at the state-level?
- ❑ How should governments handle subsequent waves?

Containment Index



Containment & Closure Policies

- School closures
- Workplace closures
- Public event cancellations
- Gathering restrictions
- Public transport closures
- Stay at home requirements
- Internal border controls
- International border controls

Containment Index

Health Index



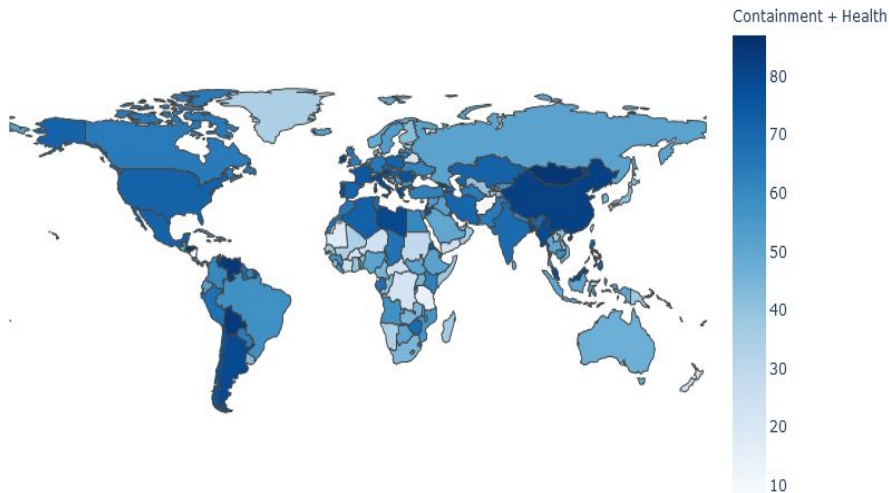
Health System Policies

- Public information campaigns
- Testing reach
- Contact tracing infrastructure
- Face covering requirements

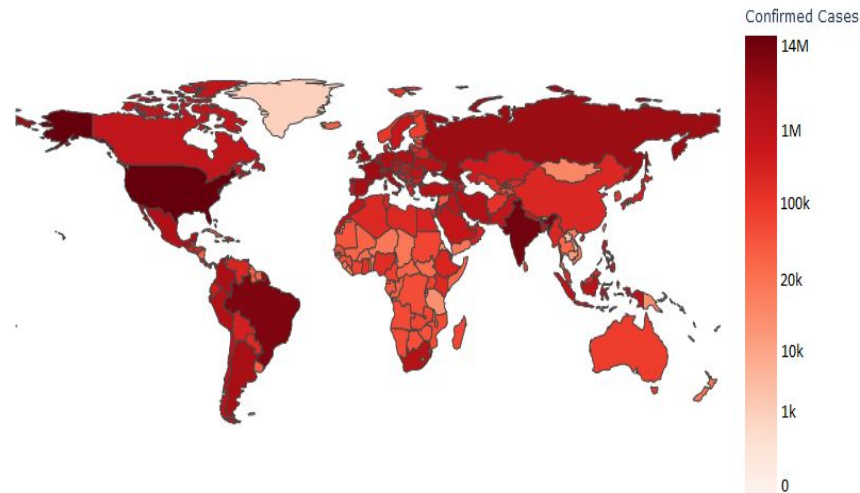
Health Index

Combined Index & Confirmed Cases

Containment + Health Index World Map

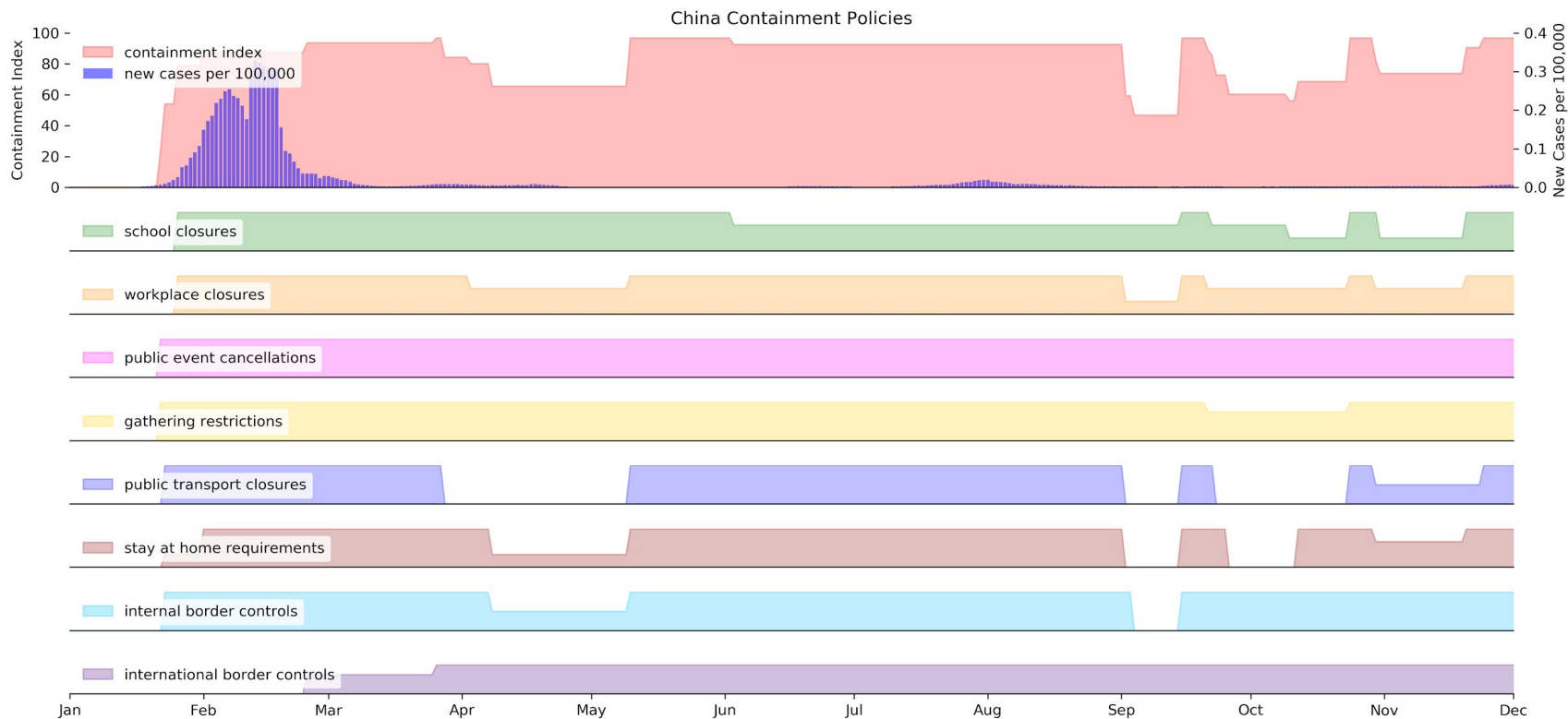


Confirmed Cases

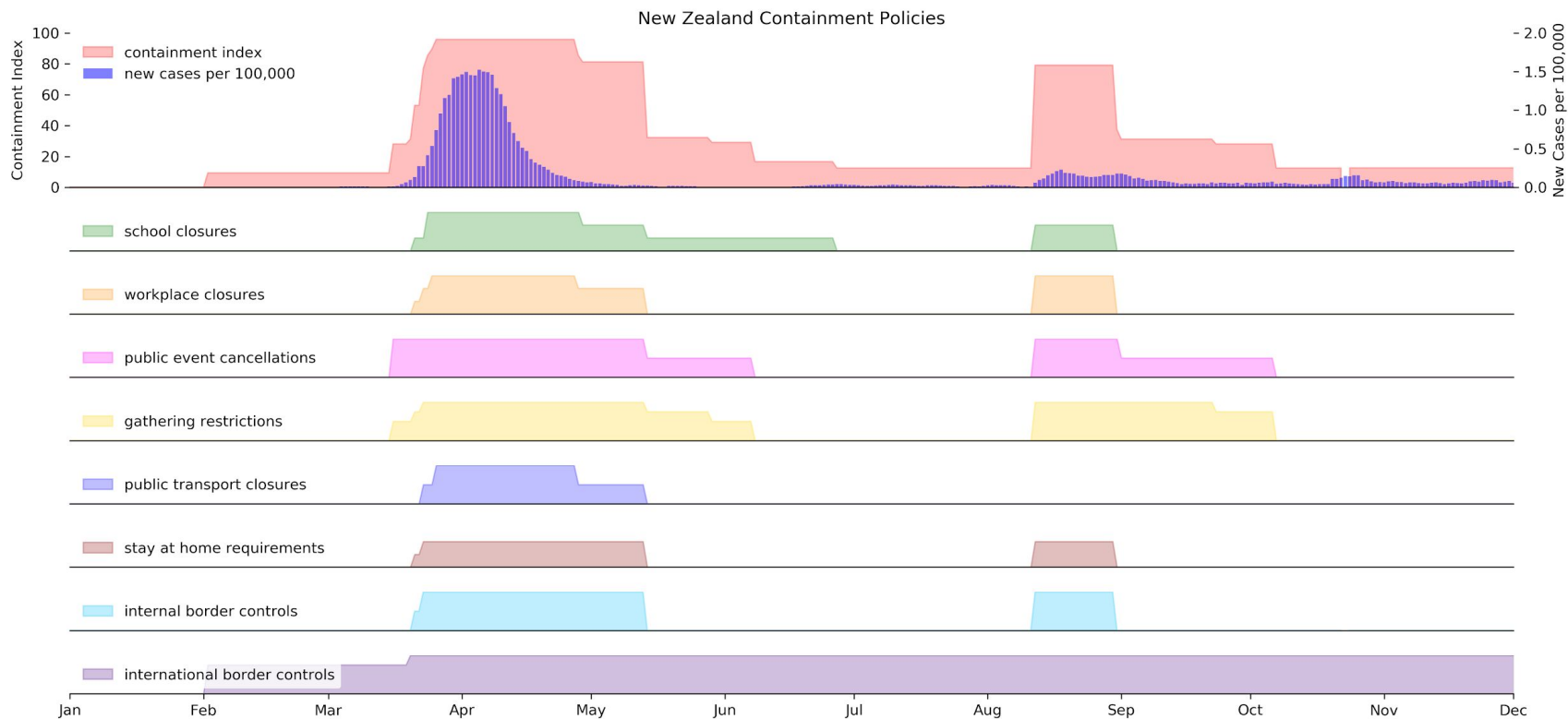


Higher Index → Fewer Cases

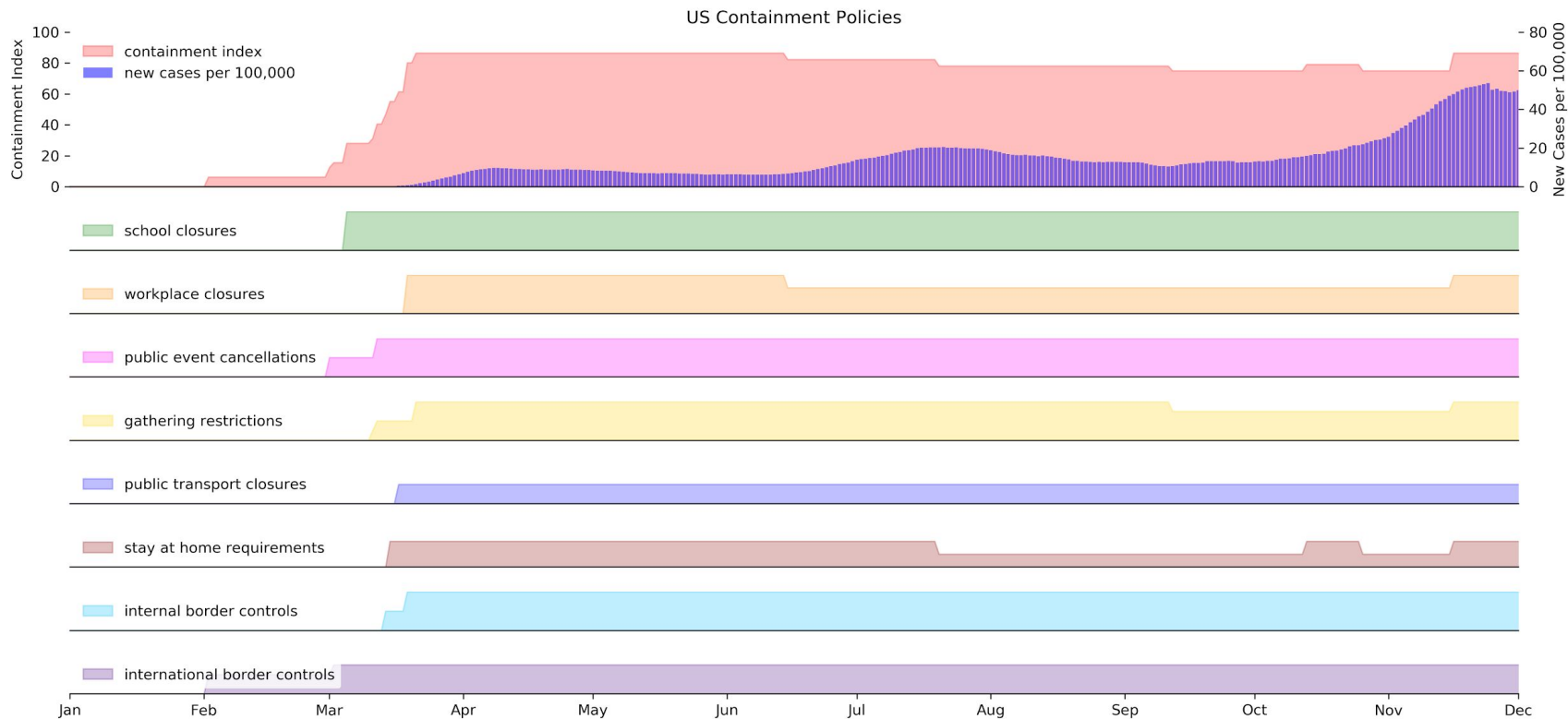
Case Study - China



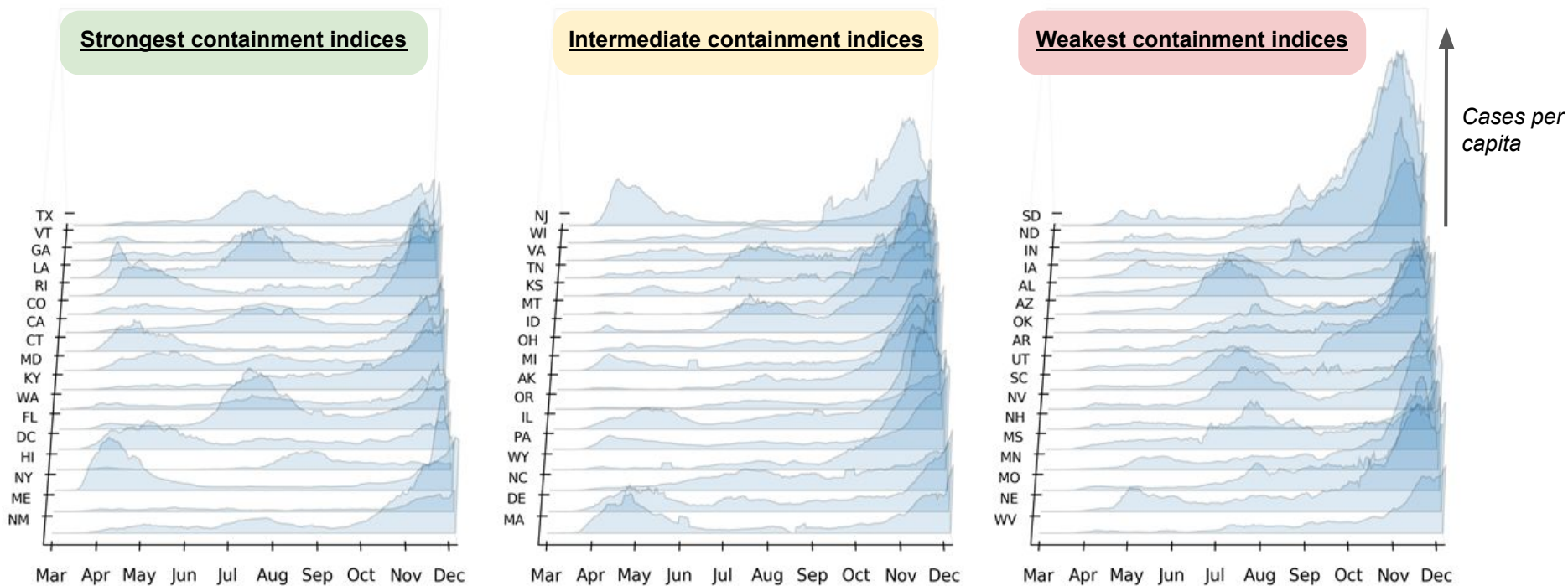
Case Study - New Zealand



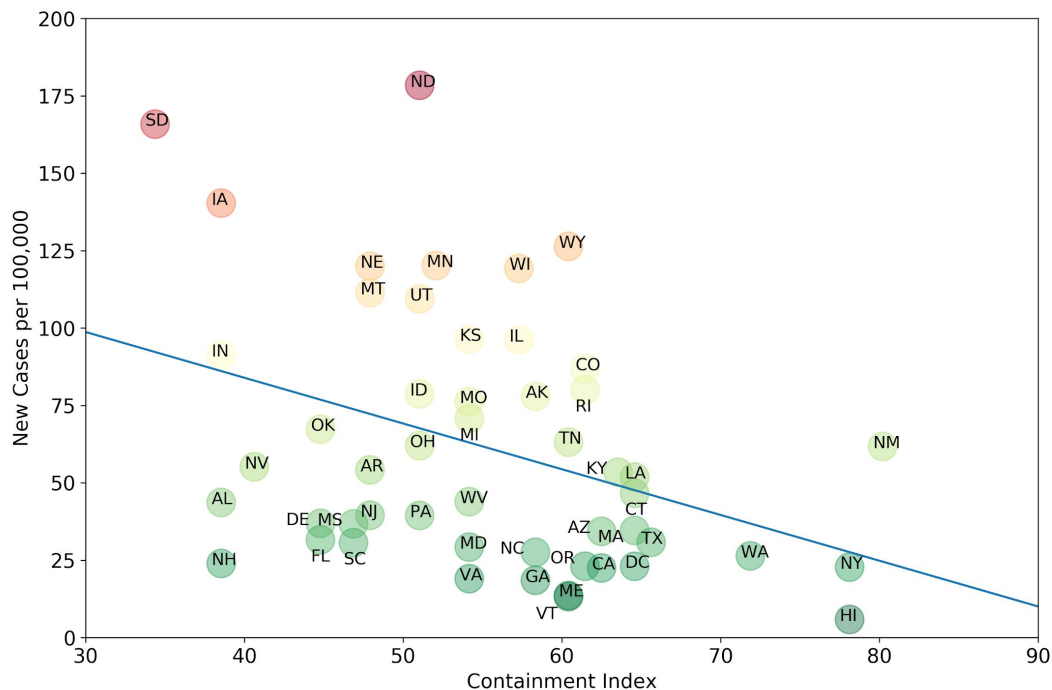
Case Study - United States



State-level Comparison

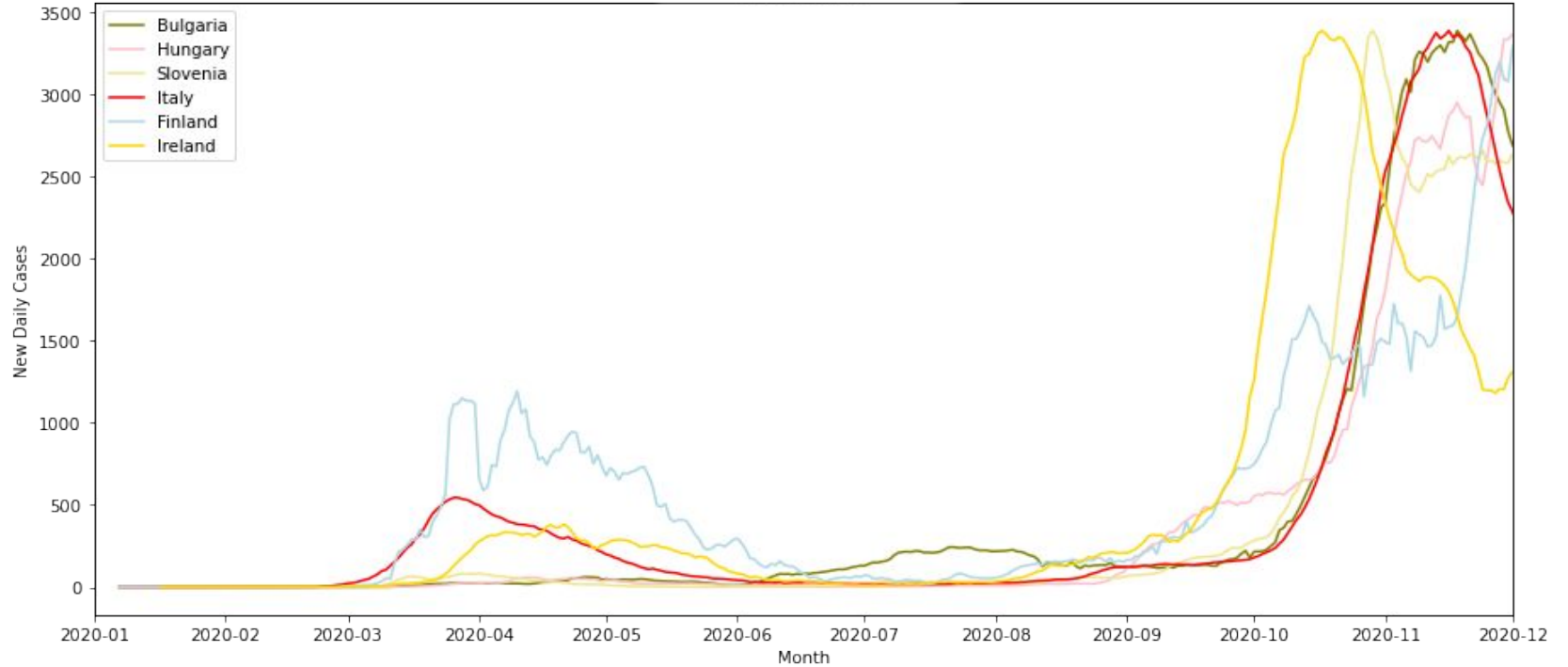


State-level Comparison

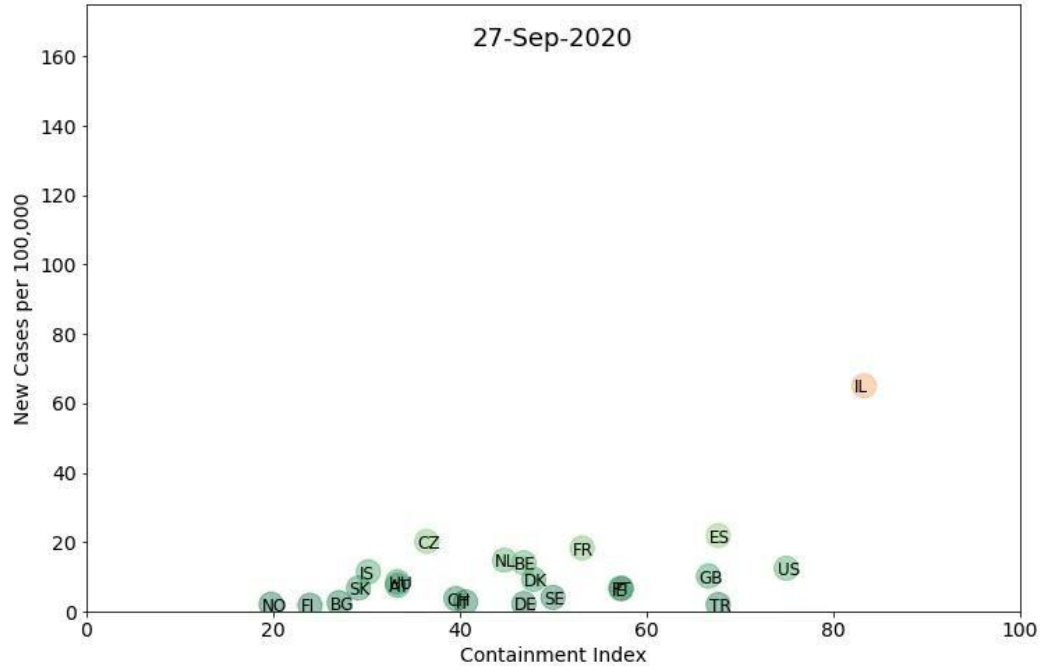


Higher Index → Fewer Cases

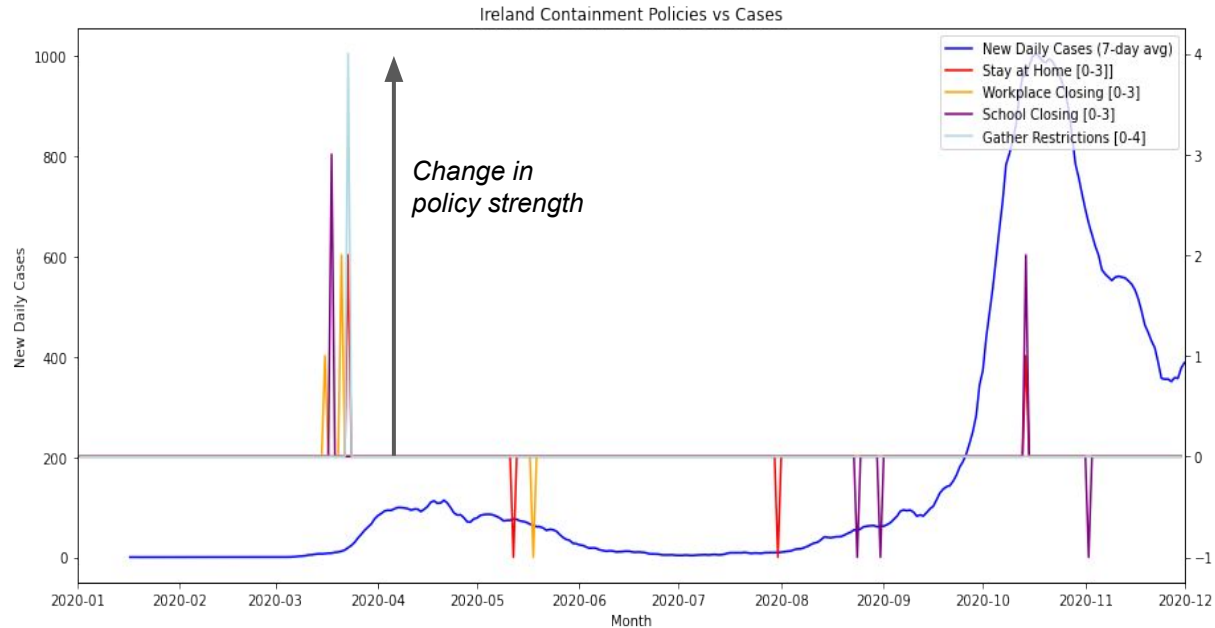
Europe's Second Wave



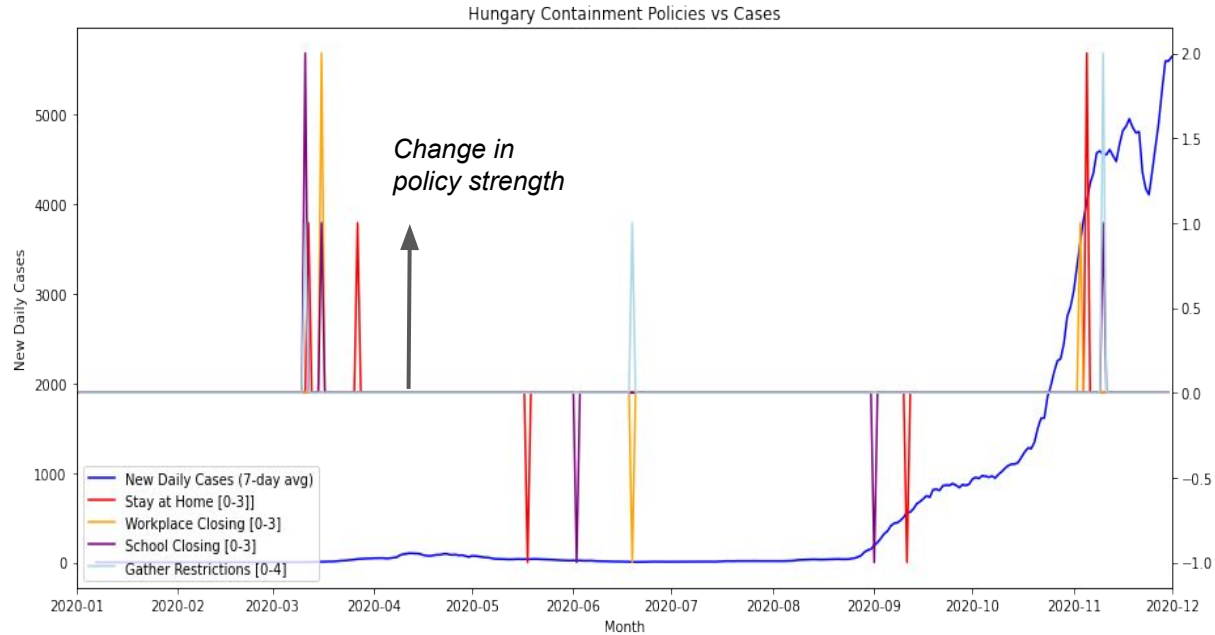
Europe's Second Wave



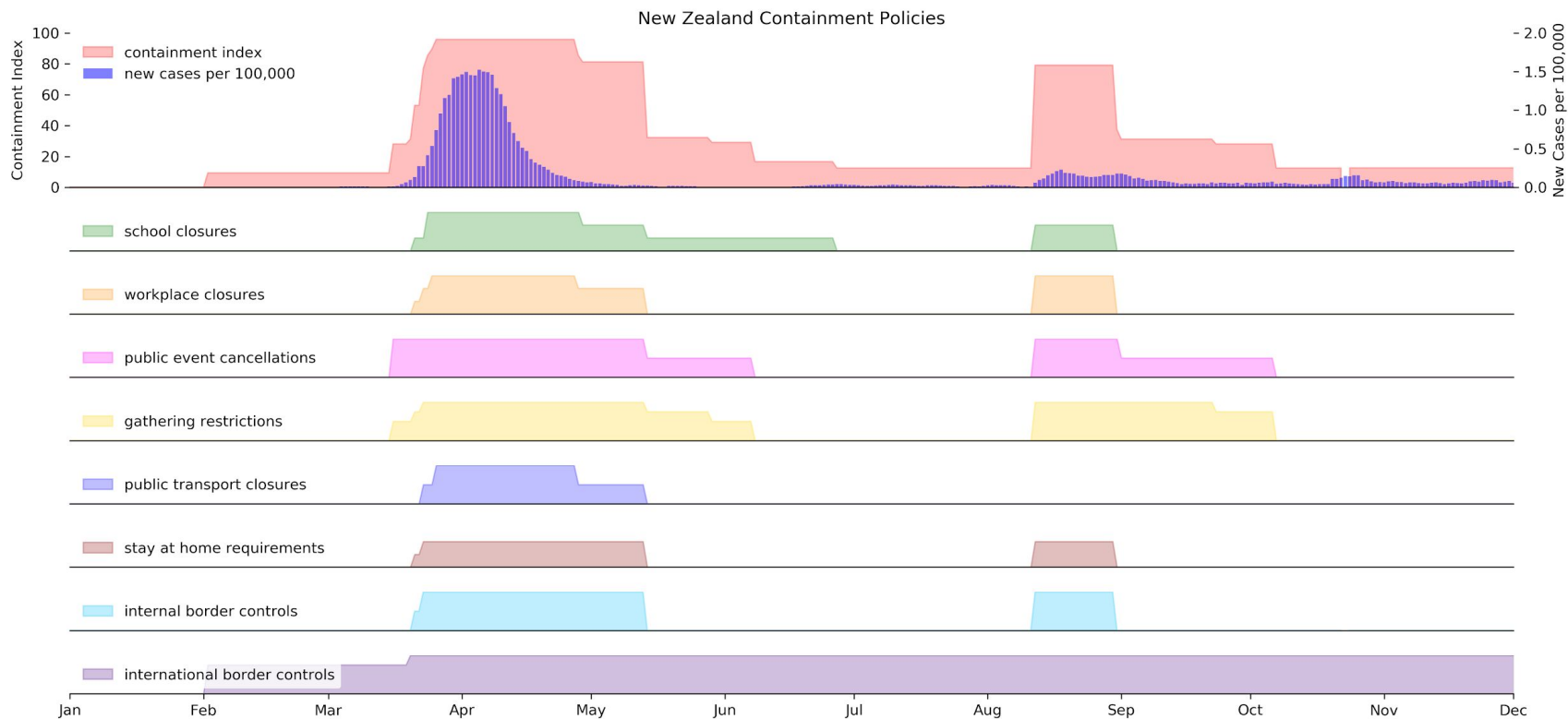
Case Study - Ireland



Case Study - Hungary



Case Study - New Zealand



Conclusions

1. Strong containment policies are effective
2. State-level analysis of the US supports the use of such measures
3. Restrictions should not be loosened until infection rates are minimal
4. Governments must be proactive in implementing strict lockdowns
5. Policy effectiveness rests on the cooperation of the people

Friendly Reminder

- Abide by your government's policies
- Don't forget your masks
- Keep physical distance
- COVID-19 doesn't know holidays!

