# Covid19 Lockdowns

Using VHR Satellite imagery to quantify impact

## Lockdown — Economic activity — Pollution

Our hypothesis is that economic activity causes pollution. Successful lockdowns have led to decrease in economic activity & pollution

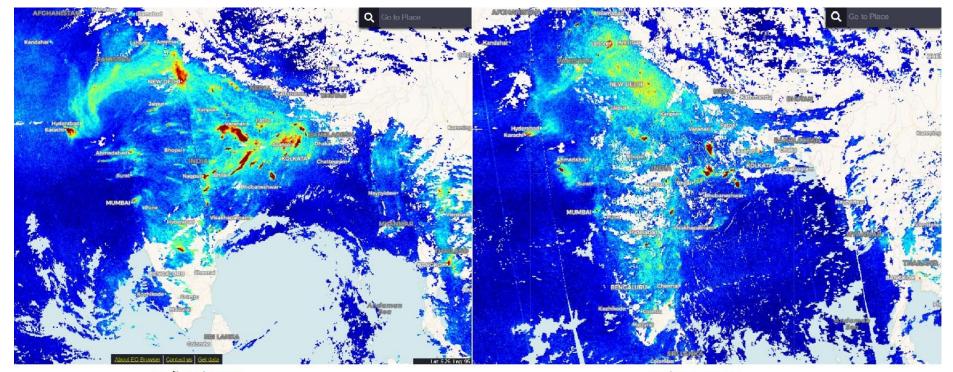
Retail sales/Economic activity can be construed from the number of cars parked in parking lots or streets near busy market places.

However vehicular traffic also leads to high NO2 levels.

We first use Sentinel-5P data to plot NO2 levels to identify any anomalies (spikes or other sudden changes) This is then collaborated with VHR imagery

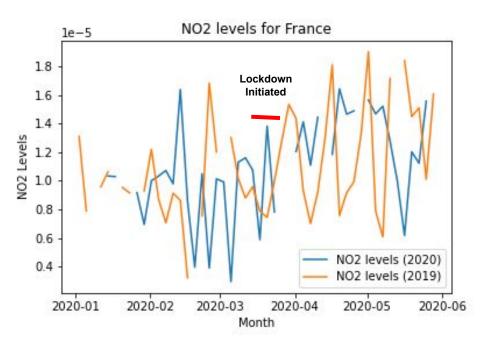
This approach basically saves costs, because we are first using Sentinel-5P data to confirm our hypothesis & then using VHR imagery to collaborate our findings.

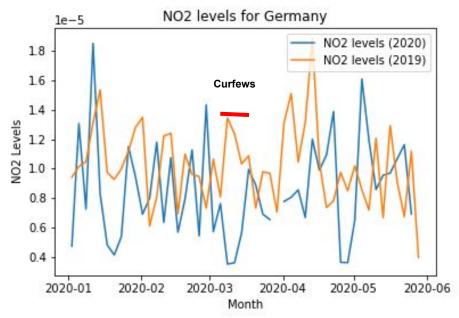
Lockdowns initiated by countries has led to a halt in economic activity Burning of fossil fuels (vehicles, factories etc.) lead to emission of NO2. So a drop in NO2 levels is an indicator of fall in economic activity



April 30th 2019 April 30th 2020

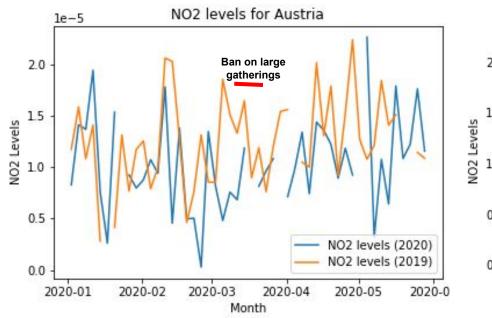
#### NO2 levels over sample European countries/territories

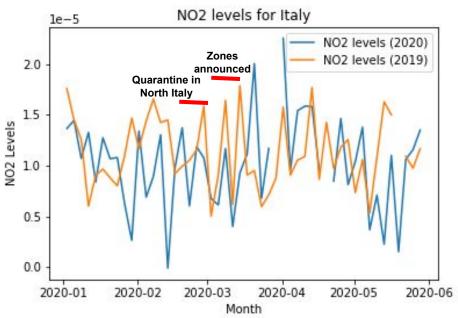




13th March - Closure of Non-essential services 16th March - Mandatory home confinements

13th March - Schools closed 22nd March - Curfew imposed in 6 states Graphs are affected by missing values. But it's easy to identify countries which were able to implement stricter quarantines vs those who couldn't! Germany vs Italy





15th-17th March - Ban on public gatherings

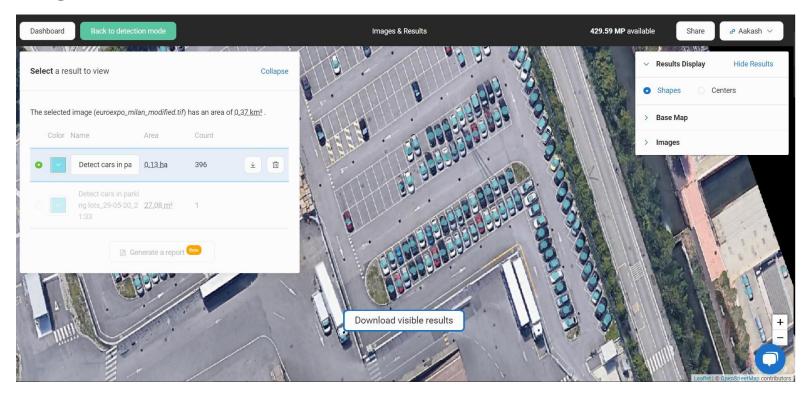
Created using EOx-JupyterHub & xcube National response to Covid-19 - Wiki entry

31st Jan - Appointment of Commissioner for Covid response

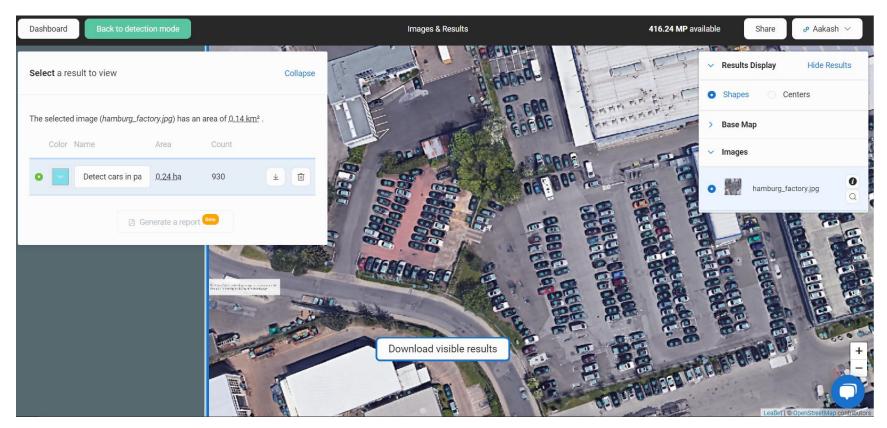
22nd Feb - Quarantine of northern Italy

1st March - Zones declared

## Using Picterra to detect vehicles



We are using off-the shelf detector algorithms to identify vehicles in VHR images Count of vehicles shows if economic activity is taking place.



Factory parking lot, Hamburg Germany (Italy) Source: Google Earth Pro

### Assumptions & Limitations

- Availability of data VHR imagery as well as NO2 sensor data
- As is observed (via the line plots) some data is missing. This is seen as gaps in the line plots
- We are basing our hypothesis on causation. Economic activity leads to pollution. So absence of pollution is equivalent to less activity. And therefore seen as a success of lockdown measures
- NO2 values are calculated using the attached python script. Please check the attached jupyter notebook
- Vehicle detection is done on sample images and snapshots attached (for ref.)