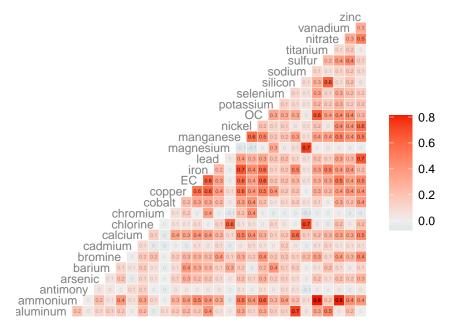
APCA 6, 7/2 - 7/6 removed

Rachel Tao

1/23/2021

```
##
          date
                      pm25
                               aluminum
                                           {\tt ammonium}
                                                         arsenic
                                                                      barium
## 0.000000000 0.003745318 0.004993758 0.004993758 0.004993758 0.004993758
                                           chlorine
       bromine
                    cadmium
                                calcium
                                                        chromium
                                                                      copper
## 0.004993758 0.004993758 0.004993758 0.002471910 0.004993758 0.004993758
##
            EC
                       iron
                                   lead
                                          magnesium
                                                      manganese
                                                                      nickel
## 0.019975031 0.004993758 0.004993758 0.004993758 0.004993758 0.004993758
            OC
                 potassium
                               selenium
                                            silicon
                                                          sodium
                                                                      sulfur
## 0.019975031 0.004993758 0.004993758 0.004993758 0.004993758 0.004993758
      titanium
                   nitrate
                               vanadium
                                               zinc
## 0.004993758 0.004993758 0.004993758 0.004993758
```

Correlation Matrix: NYC Air Pollution Dataset

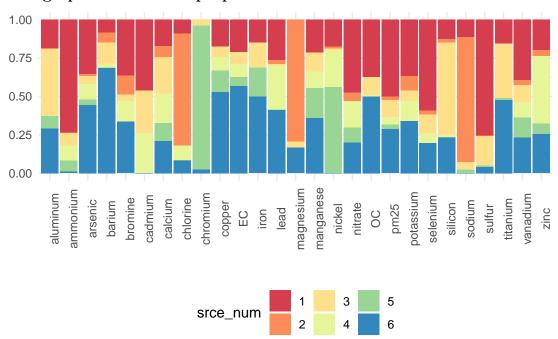


Loadings

| element | MeanConc | source_1 | source_2 | source_3 | source_4 | source_5 | source_6 | r_squared | PredConc | Pct_error |
|---------------------------|----------|----------|----------|----------|----------|----------|----------|-----------|----------|-----------|
| aluminum | 20.90 | 4.84 | -0.17 | 11.07 | -1.09 | 2.05 | 7.35 | 0.42 | 24.05 | 15.05 |
| ammonium | 869.87 | 628.42 | -8.06 | 70.88 | 81.75 | 62.09 | 8.11 | 0.90 | 843.20 | -3.07 |
| arsenic | 0.46 | 0.14 | 0.01 | 0.02 | 0.04 | 0.01 | 0.17 | 0.13 | 0.39 | -15.96 |
| barium | 2.16 | 0.31 | 0.23 | 0.50 | 0.10 | -0.05 | 2.48 | 0.29 | 3.57 | 65.14 |
| bromine | 3.03 | 1.01 | 0.34 | 0.11 | 0.38 | -0.12 | 0.92 | 0.31 | 2.64 | -12.85 |
| $\operatorname{cadmium}$ | 1.94 | 0.22 | -0.09 | 0.13 | 0.12 | -0.07 | -0.01 | 0.02 | 0.29 | -85.08 |
| $\operatorname{calcium}$ | 46.69 | 6.97 | 2.96 | 9.46 | 7.83 | 4.62 | 8.43 | 0.42 | 40.27 | -13.75 |
| chlorine | 34.68 | 6.20 | 49.87 | -4.65 | 6.24 | 0.15 | 5.66 | 0.67 | 63.48 | 83.06 |
| $\operatorname{chromium}$ | 2.51 | -0.55 | -0.18 | 0.14 | -0.36 | 3.55 | 0.09 | 0.35 | 2.71 | 8.06 |
| copper | 4.42 | 1.02 | -0.06 | 0.40 | 0.49 | 0.80 | 3.04 | 0.64 | 5.69 | 28.82 |
| EC | 650.69 | 142.28 | 0.10 | 51.58 | 57.00 | 38.48 | 378.70 | 0.68 | 668.14 | 2.68 |
| iron | 103.96 | 15.71 | -0.48 | 16.15 | 0.48 | 19.55 | 51.36 | 0.94 | 102.77 | -1.15 |
| lead | 1.78 | 0.56 | 0.06 | 0.02 | 0.61 | 0.01 | 0.88 | 0.40 | 2.13 | 19.44 |
| magnesium | 7.58 | -0.19 | 7.32 | 0.39 | -0.35 | -0.50 | 1.52 | 0.86 | 8.19 | 8.07 |
| manganese | 1.84 | 0.49 | -0.02 | 0.28 | 0.25 | 0.43 | 0.81 | 0.67 | 2.23 | 21.19 |
| nickel | 3.90 | 0.68 | 0.05 | 0.04 | 0.93 | 2.18 | -0.55 | 0.95 | 3.33 | -14.60 |
| nitrate | 1476.52 | 787.41 | 92.41 | -13.54 | 287.32 | 158.68 | 331.74 | 0.56 | 1644.02 | 11.34 |
| OC | 2568.37 | 746.82 | -44.59 | 227.16 | 19.63 | -19.07 | 987.68 | 0.77 | 1917.64 | -25.34 |
| pm25 | 9503.51 | 3956.83 | 174.16 | 895.89 | 390.83 | 223.80 | 2263.48 | 0.83 | 7904.98 | -16.82 |
| potassium | 35.98 | 13.24 | 3.44 | 2.36 | 4.68 | -0.30 | 12.18 | 0.30 | 35.60 | -1.05 |
| selenium | 0.33 | 0.16 | 0.01 | 0.03 | 0.02 | 0.00 | 0.05 | 0.18 | 0.27 | -19.02 |
| silicon | 56.87 | 7.60 | 1.33 | 35.80 | 1.15 | -0.83 | 13.92 | 0.90 | 58.98 | 3.70 |
| sodium | 91.96 | 9.32 | 65.42 | 3.54 | 0.20 | 1.90 | -1.61 | 0.94 | 78.78 | -14.33 |
| sulfur | 658.69 | 346.73 | -3.66 | 89.36 | -17.57 | 3.12 | 18.65 | 0.72 | 436.62 | -33.71 |
| titanium | 2.16 | 0.38 | -0.02 | 0.85 | -0.06 | 0.03 | 1.14 | 0.43 | 2.32 | 7.14 |
| vanadium | 2.25 | 1.18 | 0.09 | 0.34 | 0.30 | 0.40 | 0.69 | 0.32 | 2.99 | 32.99 |
| zinc | 25.27 | 5.11 | 0.95 | -1.92 | 11.19 | 1.78 | 6.46 | 0.97 | 23.56 | -6.76 |

Source proportions

Bar graph of the above proportions



This dataset includes air pollution data from 3 monitors in NYC during the years 2007-2015, excluding the dates surrounding 4th of July (7/2-7/6) from each year.

For this experiment, we have a 6-factor solution.

Sources plus notes comparing with other studies:

- 4) road dust (?)
- Masiol et al. Zinc "At first glance, the factor 9 could be interpreted as road dust."
 - mostly zinc, with moderate values of nickel, calcium, copper, manganese, and potassium
 - mainly in winter
 - zinc is a tracer for lubricating oil combustion, brake and tire wear aalong with manganese, iron, and copper
 - decided this was not road dust because as particle sizes became smaller correlatioonos increased even though mass-relevant contributions are mainly in the 1-10 range, and it was strongly correlated with SO2
 - instead thought this was a combustion source such as on-road diiesel truck traffic, ship traffic, or building heating

- Squizzato et al. road dust: Al, Si + Mg, Ca, Fe, Ti, Mn, Cu, OC, EC, sulfate, nitrate, Na, Cl
- it seems like our road dust looks different from Masiol's Zinc anyway (less zinc, more range of elements) and also different from Squizzato's road dust

2) salt

- Masiol et al. fresh sea salt: chlorine, sodium, nitrate, sulfate, ammonium, EC, OC, Fe
 - no clear seasonal/weekly patterns, but may be higher in winter due to northeasters
 - possible crustaal particles in seawater leading to Al and Si
 - watch out for one-day high peaks due to storms
- Masiol et al. sodium, Br, OC, sulfate, nitrate
 - origin from coastal areas in southeaster US
 - less chlorine than fresh salt
- Squizzato et aal. aged sea salt: Na + Mg, suflate, nitrate, OC, EC, low Cl
- Squizzato et al. road salt: Cl + OC, EC, nitrate, sulfate, Si, Ca, Fe
- Squizzato et al. fresh sea salt: Cl + Na, Ca, Mg
- our salt is really just chlorine, sodium, and magnesium but does also include Ba, Br, Ca, Ni, nitrate, K, selenium, silicon, vanadium, zinc

3) crustal

- Masiol et al. Al, Si + some K, Ca, Mn, Fe
 - no weekly cycles, higher in spring and summer
- aluminum, silicon, titanium, sulfur, vanadium, caaadmium, calcium, manganese, iron
- 1) regional/seecondary
- Masiol et al. secondary ammonium sulfate: ammonium, sulfate, Br, OC, V
 - emissions of SO2 from coal-fired power plants in upper Ohio River Valley
 - biogenic and sea salt sulfate
 - highest in summer, minimum on Saturdays (may not be a true pattern)
- Masiol et al. secondary ammonium nitrate: ammonium, nitrate, Br, NO2
 - higher concentrations in winter, no weekly patterns
- Squizzato et al. secondary sulfate: sulfate, ammonium, OC, EC, selenium, vanadium, arsenic, bromine
 - decrease over the years because of decreased coal use, also talk about residual oil here (could be combined?)
- Squizzato et al. secondary nitrate: nitrate, ammonium, sulfate, OC, EC, higher in winter
 - reductions in NYC related to less traffic (?)
- We also have a lot of selenium, pretty high arsenic, and potassium in here (not mentioned in Masiol et al.)
- 6) traffic (?)
- Masiol et al. EC and OC from primaary engine dust, V, Mn, Fe, Cu from road traffic emissions
 - weekly patterns decreased on weekends
- Squizzato et al. spark-ignition and diesel: OC, EC, Mg, Al, Si, Ca, Fe, Cu, Zn, Mn

- EC, OC + pretty much everything else except sulfur sodium and ammonium. a lot of the barium, not so much vanadium
- 5) industrial (?)
- it doesn't look like this is in the Masiol paper
- Squizzato et al. industrial: Pb, Fe, Mn, Cu, Zn, As, Se
 - Coke production: As, Zn, Se, and Pb
 - Metal/steel: Pb, Fe, Mn, Cu, Zn
- lots of chromium, copper, EC, iron, manganese, nickel, nitrate, vanadium, aluminum, ammonium, OC

Masiol et al. Biomass Burning: K, OC, Br, EC, Ca, higher in summer Squizzato et al. biomass burning: K, OC, EC, sulfate, nitrate, Na, Al, Si, Cl, Ca, Fe, Zn, Br Masiol et al. Residual oil/domestic heating: vanadium, nickel, calcium, manganese, EC, iron, higher in winter Squizzato et al. residual oil: Ni, Mn, Zn, Ca