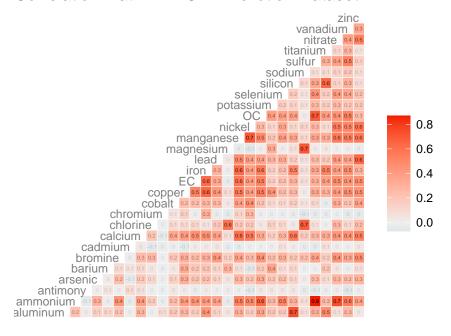
# APCA 6, 7/2 - 7/6 removed

Rachel Tao

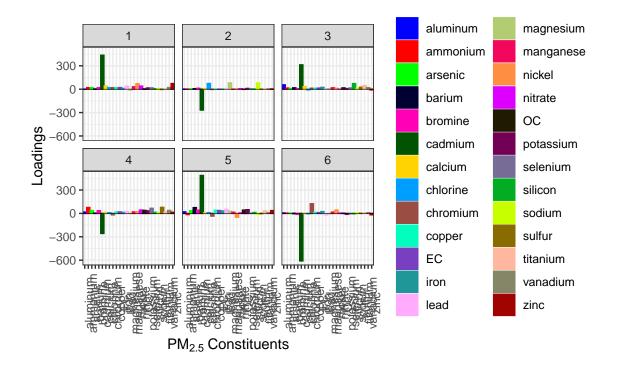
1/23/2021

## Correlation Matrix: NYC Air Pollution Dataset

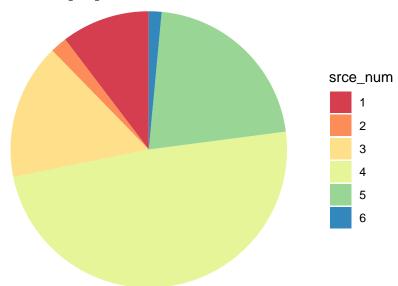


## Loadings

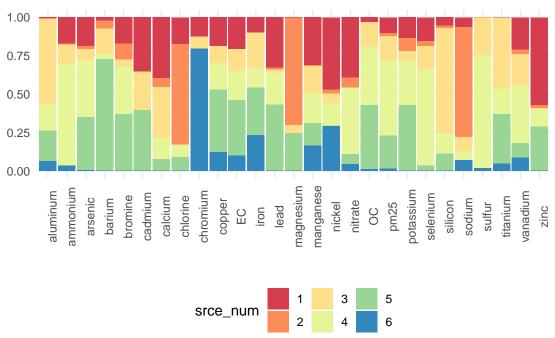
| element                   | MeanConc | source_1 | source_2 | source_3 | source_4 | source_5 | source_6 | r_squared | PredConc | Pct_error |
|---------------------------|----------|----------|----------|----------|----------|----------|----------|-----------|----------|-----------|
| aluminum                  | 22.18    | 0.13     | 0.20     | 14.69    | 4.47     | 5.33     | 1.68     | 0.44      | 26.51    | 19.51     |
| ammonium                  | 1120.78  | 205.57   | 9.02     | 153.02   | 799.87   | -154.09  | 40.46    | 0.93      | 1053.86  | -5.97     |
| arsenic                   | 0.49     | 0.07     | 0.01     | 0.03     | 0.15     | 0.14     | 0.00     | 0.16      | 0.40     | -17.98    |
| barium                    | 1.87     | 0.07     | 0.16     | 0.52     | 0.11     | 2.30     | -0.06    | 0.26      | 3.10     | 65.68     |
| bromine                   | 3.06     | 0.51     | 0.31     | 0.14     | 0.92     | 1.10     | -0.32    | 0.38      | 2.66     | -13.12    |
| cadmium                   | 1.68     | 0.12     | -0.07    | 0.09     | -0.07    | 0.13     | -0.17    | 0.01      | 0.03     | -98.37    |
| $\operatorname{calcium}$  | 51.85    | 16.07    | 2.49     | 13.58    | 5.46     | 3.11     | 0.07     | 0.56      | 40.78    | -21.35    |
| chlorine                  | 37.07    | 11.45    | 42.81    | -4.87    | 5.40     | 5.83     | -2.02    | 0.69      | 58.58    | 58.04     |
| $\operatorname{chromium}$ | 2.13     | 0.50     | -0.09    | 0.32     | -0.46    | -0.88    | 3.19     | 0.26      | 2.58     | 20.89     |
| copper                    | 4.55     | 1.07     | -0.07    | 0.63     | 0.99     | 2.33     | 0.69     | 0.67      | 5.64     | 23.87     |
| EC                        | 707.73   | 145.70   | -3.45    | 98.42    | 133.30   | 253.47   | 68.64    | 0.52      | 696.09   | -1.64     |
| iron                      | 105.50   | 11.02    | -0.32    | 24.81    | 13.89    | 33.86    | 25.18    | 0.96      | 108.45   | 2.79      |
| lead                      | 2.02     | 0.88     | 0.04     | 0.05     | 0.56     | 1.16     | -0.41    | 0.51      | 2.28     | 13.15     |
| magnesium                 | 7.12     | -0.81    | 6.30     | 0.47     | -0.02    | 2.20     | -0.30    | 0.88      | 7.84     | 10.22     |
| manganese                 | 2.10     | 0.71     | 0.01     | 0.40     | 0.44     | 0.34     | 0.38     | 0.73      | 2.28     | 8.74      |
| nickel                    | 4.94     | 2.49     | 0.13     | 0.34     | 0.78     | -1.73    | 1.55     | 0.88      | 3.55     | -28.14    |
| nitrate                   | 1613.47  | 608.43   | 101.61   | 0.31     | 670.44   | 103.38   | 66.42    | 0.56      | 1550.59  | -3.90     |
| OC                        | 2693.20  | 64.84    | -46.27   | 346.91   | 800.00   | 882.38   | 20.93    | 0.82      | 2068.79  | -23.18    |
| pm25                      | 10322.11 | 901.08   | 170.76   | 1386.50  | 4257.78  | 1867.95  | 129.58   | 0.85      | 8713.65  | -15.58    |
| potassium                 | 36.15    | 6.59     | 3.98     | 2.97     | 14.05    | 20.54    | -4.98    | 0.32      | 43.14    | 19.34     |
| selenium                  | 0.40     | 0.05     | 0.01     | 0.05     | 0.22     | 0.01     | -0.01    | 0.29      | 0.33     | -15.71    |
| silicon                   | 61.01    | 3.59     | 1.09     | 46.19    | 8.85     | 7.53     | -3.03    | 0.94      | 64.22    | 5.26      |
| $\operatorname{sodium}$   | 95.65    | 5.13     | 59.40    | 7.82     | 4.95     | -8.24    | 5.69     | 0.90      | 74.77    | -21.83    |
| $\operatorname{sulfur}$   | 788.05   | -20.40   | 2.28     | 155.69   | 477.01   | -10.82   | 10.88    | 0.83      | 614.64   | -22.01    |
| titanium                  | 2.37     | 0.02     | -0.02    | 1.23     | 0.44     | 0.86     | 0.12     | 0.48      | 2.65     | 11.89     |
| vanadium                  | 2.86     | 0.76     | 0.11     | 0.72     | 1.38     | 0.33     | 0.32     | 0.43      | 3.61     | 26.55     |
| zinc                      | 26.09    | 15.40    | 0.54     | -1.79    | 3.20     | 7.76     | -3.75    | 0.93      | 21.36    | -18.14    |



## 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:

- 1) 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
- 4) regional/seecondary
- Masiol et al. secndary 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.)
- 5) traffic (?)
- Masiol et al. EC and OC from primary 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

#### 6) 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 buring: 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