# The Effects of Transboundary Air Pollution from China on Ambient Air Quality in South Korea

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# Air pollution problem in South Korea



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## **Three potential sources**

- 1) Domestic emissions (power plants, factories, vehicles, etc)
- 2) Asian Dust Storms (ADS): Only in spring
- 3) Emissions from China that migrate to South Korea via prevailing wind patterns

### 3) Emissions from China



Figure 1. Power plant locations in China

*Source*: TIME, D. Stout. "One Map Shows You Why Pollution in China is So Awful, Dec 13, 2013; <u>http://world.time.com/2013/12/13/one-map-shows-you-why-pollution-in-china-is-so-awful/</u>

Notes: The most power plants are located at eastern China.







Figure 2. Prevailing westerly winds transport dust from deserts in west China and Inner Mongolia (i.e., Taklamakan, Gobi) and pollution from industrial cities (Beijing, Shanghai) to South Korea.

# 3) Emissions from China



# **Tripartite Environmental Ministers' Meeting**



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In the tripartite environmental ministers' meeting, they agreed to

- a) improve the forecasting accuracy for ADS
- b) reduce air pollutant emissions
- c) share knowledge to monitor and control them.

However, the level of contribution is still a subject of considerable debate.

## **Previous research**

#### • Korean Government (2013):

30-50% of ambient  $PM_{2.5}$  pollution levels in South Korea originated from Chinese deserts and cities.

#### • Li et al. (2014):

The long-range transport (LRT) of air pollutants from China is estimated to account for about 26% and 13.6% of annual contribution of  $PM_{10}$  in Korea and Japan respectively

#### • Park and Han (2014):

assert that the previous studies which estimate an annual contribution of LRT on average as around 30% might be underestimated.

# **Research goals**

Empirically test whether:

- 1. Air pollution from China affects ambient air quality in South Korea.
  - Westerly winds
- 2. The effect of the cross-border pollution is strongest in winter and spring.
  - Coal-based heating (winter)
  - Asian dust storm (spring)

3. The wind directions that affect South Korean ambient air quality are different by seasons.

## Data

Two sets of panel data used:

- daily mean data from 2006-2014 (9yrs)
- 7 metropolitan cities and 9 provinces
- 1. Air pollution data
- downloaded from the Korea Environment Corporation webpage
- PM<sub>10</sub>, SO<sub>2</sub>, NO<sub>2</sub>, CO, O<sub>3</sub>
- 257 monitors nationwide



Figure 1. Air Quality Monitoring Stations across South Korea

- 2. Weather data
- downloaded from the National Climate Data Service webpage
- precipitation, temperature, wind speed, and wind direction
- 93 monitors nationwide



Figure 2. Weather Monitoring Stations across South Korea

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#### Bivariate relationship between PM<sub>10</sub> and wind direction





Figure 3.  $PM_{10}$  concentrations by wind directions (2006-2014)

*Note*: Locally Weighted Scatterplot Smoothing (LOWESS) with bandwidth of 0.2. Left dashed line indicates the mean direction from Shanghai toward South Korea. Right dashed line indicates the mean direction from Beijing toward South Korea.

## Results

	Year round	Spring	Summer	Fall	Winter			
Precipitation	-0.098***	-0.601***	-0.089***	-0.078*	-0.031			
	(0.018)	(0.101)	(0.019)	(0.042)	(0.030)			
Temperature	0.066**	0.169**	0.296***	0.135**	-0.128			
	(0.028)	(0.075)	(0.076)	(0.068)	(0.084)			
Wind speed	-1.820***	-2.098***	-0.987**	-0.930*	-2.819***			
	(0.281)	(0.733)	(0.390)	(0.537)	(0.611)			
$1(W_D) \times W_S$	<mark>0.883***</mark>	<mark>1.737***</mark>	<mark>1.588***</mark>	<mark>0.854**</mark>	<mark>2.209***</mark>			
	<mark>(0.210)</mark>	<mark>(0.553)</mark>	<mark>(0.306)</mark>	<mark>(0.416)</mark>	<mark>(0.407)</mark>			
city-fixed effect	Yes	Yes	Yes	Yes	Yes			
time-fixed effect	Yes	Yes	Yes	Yes	Yes			
$R^2$	0.855	0.848	0.804	0.839	0.818			
Observation	7487	1872	1872	1872	1871			

Table 1. Marginal effects of the westerly wind on  $PM_{10}$  concentrations

# Results

#### WEST WIND DIRECTIONS



# **Results**

Table 2. Average effect of wind on South Korean $PM_{10}$ by wind direction							
	Wind direction	Marginal effect	Wind speed	PM <sub>10</sub>	Contribution		
			(m/s)	$(\mu g/m^3)$			
Year-round	NNW	-2.205***	2.23	46.60	-10.55		
	NW	-0.802***	2.09	49.20	-3.40		
	WNW	0.869***	2.11	53.76	3.41		
	W	2.259***	2.00	58.47	7.74		
	WSW	3.155***	1.87	59.99	9.83		
	SW	3.294***	2.02	55.71	11.93		
	SSW	3.155***	1.98	51.41	12.16		
Spring	NNW	-0.693	2.17	58.54	-2.57		
	NW	1.098	2.13	58.79	3.98		
	WNW	2.164***	2.13	<b>59.27</b>	7.77		
	W	2.375***	2.10	60.08	8.29		
	WSW	2.422***	2.09	60.60	8.34		
	SW	2.033***	2.12	60.09	7.19		
	SSW	1.409**	2.13	59.70	5.03		
Winter	NNW	1.931***	1.99	53.42	7.21		
	NW	3.019***	1.98	53.61	11.15		
	WNW	2.841***	2.00	54.27	10.48		
	W	2.419***	2.00	55.20	8.77		
	WSW	1.929***	1.98	55.34	6.91		
	SW	1.053*	2.02	54.55	3.89		
	SSW	0.204	2.00	53.90	0.76		

Notes: West-northwest wind (WNW), marked in red, and southwest wind (SW), marked in blue, correspond to the direction from Beijing and Shanghai to South Korea respectively.

# Conclusions

- Marginal effects of westerly winds
  - greatest in winter, followed by spring, summer, and fall.
- The average effect of transboundary air pollutants on Korean PM<sub>10</sub> are estimated to account for <u>3% - 12%</u> of the mean PM<sub>10</sub> depending on seasons and wind directions.
- This gives a clue that the previous estimates between 20-50% might be <u>overestimated</u>.

## **Next steps**

- Apply more detailed data (e.g. hourly maximum).
- Estimate the effect of air pollution from China on health outcomes and hospital spending in South Korea.