

Pigskin, Tailgating and Pollution: Estimating the Environmental Damage of Sporting Events

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Research Questions.

- I am exploring the environmental impacts of sporting events (specifically college football games).
- I attempt to answer 4 questions:
 - Do cities experience an increase in pollution on game days (day-of effect)?
 - Do cities also experience an increase in pollution the day before or day after game days (commuting effects)?
 - Do these effects change over the course of the regular season (September to November)?
 - Do these effects pose serious health-risks?

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Motivation / Policy Relevance.

- Why should we care?

- Health effects of pollution can be substantial.

- ★ Even if exposure is brief and the level of exposure is small (on-going examination in the literature).
- ★ Health risks include increase in daily mortality, cardiovascular death, respiratory mortality.

- Resource allocation for local governments.

- ★ How best to arrange traffic management resources.

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Sample.

- The sample was created in an attempt to minimize confounding effects from unobserved local economic activity that may in turn increase pollution levels.
- A city was included in the sample so long as the following three conditions held:
 - The city does not host a major professional sports team,
 - The city hosts at least one Football Bowl Subdivision Team (FBS; Div. 1A),
 - The city has a common measure of pollution at the day level for at least some game and non-game days from Sept. 2010 to Nov. 2010.

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Data Sources.

- Time period is from Sept. 2010 to Nov. 2010 (i.e. a single regular season).
- Daily measures of pollution (24-hour averages):
 - ▶ Air Quality System database by the EPA.
 - ▶ Most common to all cities in the sample is PM2.5.
- Weather controls (daily precipitation and mid-range temperature):
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Econometric Framework.

1 Baseline (Day-of) Model:

$$PM2.5_{ijk} = \alpha + \beta_1 Host\ Game_{ijk} + X' \beta + \xi_{ijk} \quad (1)$$

- ▶ where i denotes city, j denotes day and k denotes month; and, $\xi_{ijk} = \mu_i + \lambda_m + \varepsilon_{ijk}$.

2 Day-of and Commuting Effects:

$$PM2.5_{ijk} = \alpha + \beta_0 Day\ Before_{ijk} + \beta_1 Host\ Game_{ijk} + \beta_2 Day\ After_{ijk} + X' \beta + \xi_{ijk} \quad (2)$$

3 Month-specific Day-of and Commuting Effects:

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Summary of Results.

- After controlling for city and month fixed-effects, weather controls and city-specific time trends:
 - ① Small, generally statistically insignificant but negative effects for September:
 - ▶ PM2.5 just before, on and after game days relative to all non-game days decreases by .11, 1.14 and .98 micrograms per cubic meter of air, respectively.
 - ② Positive but statistically insignificant effects for October:
 - ▶ Relative to September, PM2.5 just before, on and after game days relative to all non-game days increases by .58, 2.28 and 1.58 micrograms per cubic meter of air, respectively.
 - ③ Positive and statistically significant effects for November:
 - ▶ Relative to September, PM2.5 just before, on and after game days relative to all non-game days increases by 2.10, 3.26 and 1.92 micrograms per cubic meter of air, respectively.

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Summary of Health Results.

- Are these marginal increases in PM2.5 hazardous?
 - ▶ Using a similar approach used by the World Health Organization hypothetical game day levels of PM2.5 required to increase the risk of cardiovascular and other mortalities from 0% to 1% are calculated.
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