

# Measuring the Long-Term Impact of Environmental Externalities

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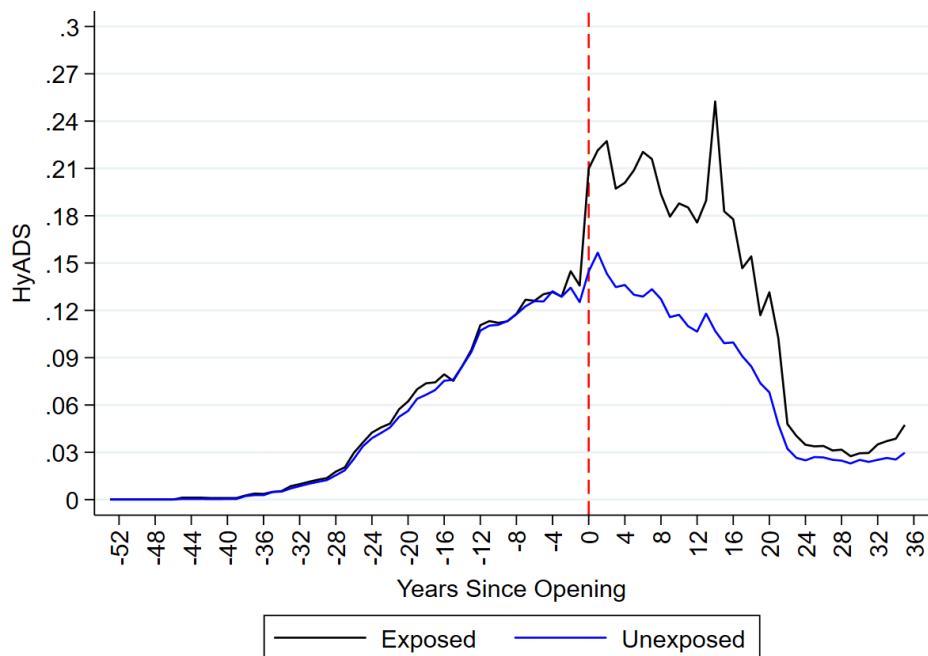
# Motivation

- The environmental and health economics literature has studied the causal relationship between short-run fluctuations in pollution and contemporaneous health outcomes (Currie, Davis, Greenstone, and Walker, 2015).
- We exploit a unique dataset in which we observe the entire Danish population from 1980 to 2018.
- We study the causal relationship between cumulative exposure to pollution and lung cancer over time.

# Empirical Strategy

- **Incinerators:** We choose incinerators as the source of pollution of interest.
- **HyADS:** We measure incinerator exposure using the Hybrid Single-Particle Lagrangian Integrated Trajectory Model (HYSPLIT). The resulting measure is HyADS. Moving of particles taking into account various factors (e.g. location, wind, height of the source of pollution).
- **Individual cumulative exposures over time.** Our model produces an individual-level proxy of cumulative exposure.
- **Openings:** In a diff-in-diff framework, we document the presence of decades-long delays between the start of exposure and the manifestation of lung cancer.
- **Closings:** In a survival analysis framework, we study effects on individuals after the end of exposure; individuals keep experiencing an excess risk of lung cancer for 10 years as a pure latency effect. Implications for future research.
- **Regulation:** We exploit an emissions cap introduced in 1991 as an exogenous shock, documenting the same pattern observed with reference to the closings.

# Openings

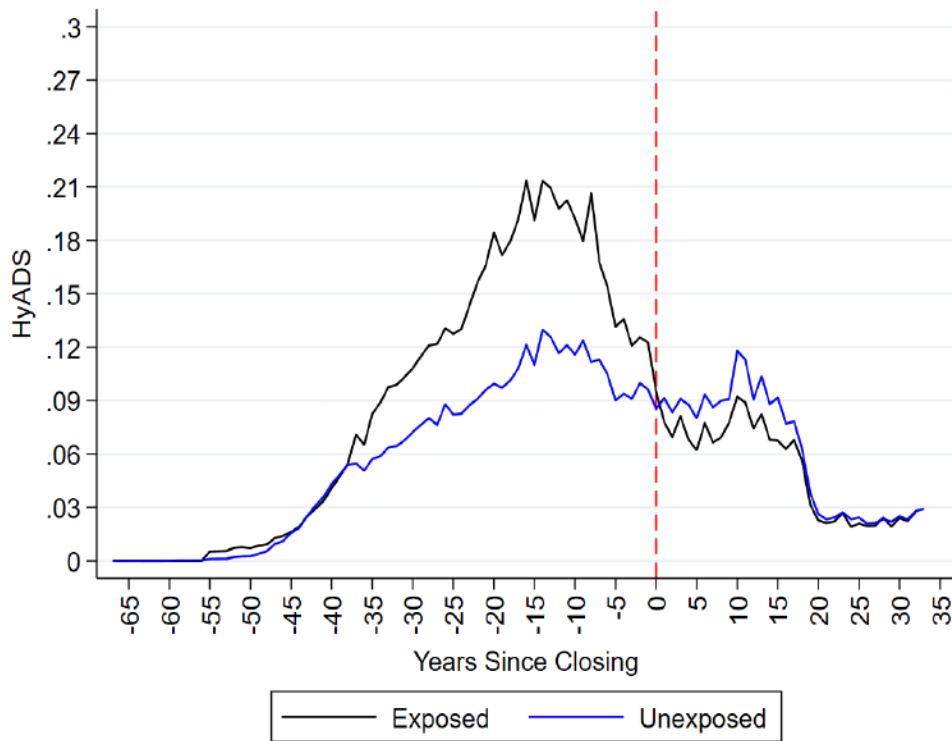


## Lung Cancer

0-4 Years Since Opening	0.357 (0.670)
5-9 Years Since Opening	-0.612 (0.730)
10-14 Years Since Opening	0.057 (0.801)
15-19 Years Since Opening	1.301 (0.904)
20-24 Years Since Opening	0.424 (1.018)
25+ Years Since Opening	2.961*** (1.125)
$R^2$	0.002
N	11,937,642

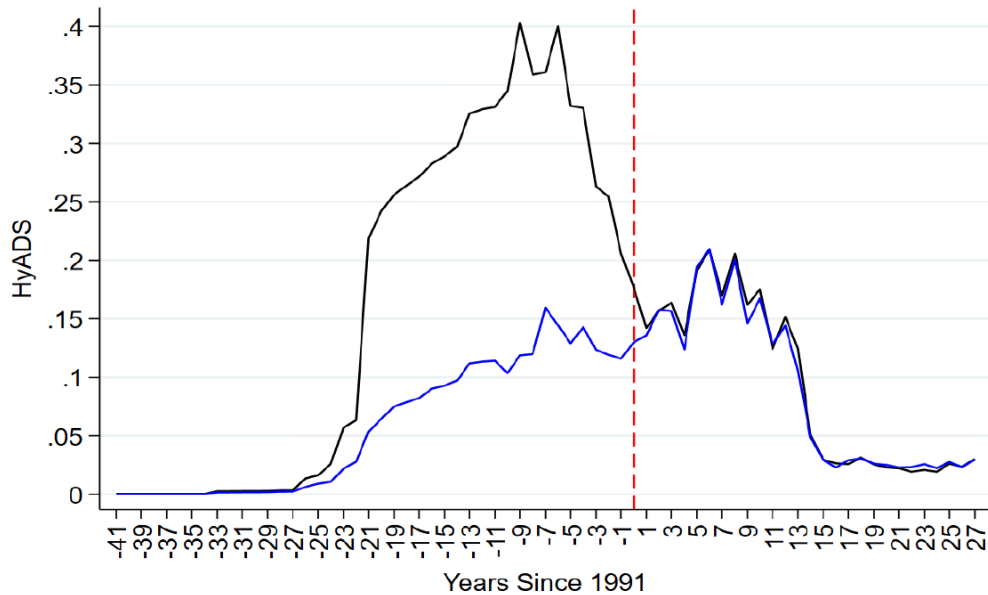
**Effect: 15% increase (3 BP yearly on a 20 BP baseline)**

# Closings



Lung Cancer	HR Per 0.3-HyADS-Year
0-4 Years Since Closing	1.0050*** (0.0014)
5-9 Years Since Closing	1.0025** (0.0013)
10-14 Years Since Closing	0.999 (0.002)
15+ Years Since Closing	0.996 (0.005)
N	4,314,653

# Regulation



Lung Cancer	HR Per 0.3-HyADS-Year
0-4 Years Since 1991	1.026*** (0.001)
5-9 Years Since 1991	1.006* (0.003)
10-14 Years Since 1991	1.007* (0.004)
15+ Years Since 1991	0.996 (0.003)
N	8,215,591