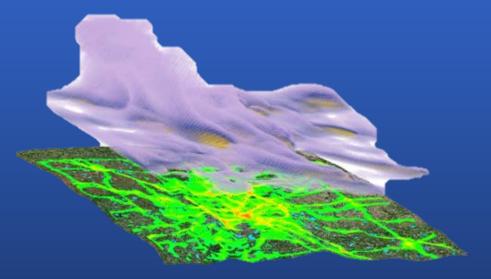


## Detection and Quantification of Urban Greenhouse Gas Emissions: Groundbased results from the INFLUX Experiment

Natasha Miles, Thomas Lauvaux, Ken Davis, Scott Richardson, Daniel Sarmiento, Kai Wu, Anna Karion, Colm Sweeney, Isaac Vimont, Jocelyn Turnbull, Michael Hardesty, Andrew Brewer, Kevin Gurney, Igor Razlivanov, Laura Iraci, Patrick Hillyard, Paul Shepson, M. Obie Cambaliza, James Whetstone



Map of road emissions from Hestia with atmospheric modeled CO2 concentration using the WRF-FDDA system (1km) on Oct 7th, 2011 at 5pm (LST)



NOAA GMD Annual Meeting, May 2014



## Goals of the Indianapolis Flux Experiment (INFLUX)

- Develop and assess methods of quantifying greenhouse gas emissions at the *urban scale*, using Indianapolis as a test bed.
- In particular:
  - Determine whole-city emissions of CO<sub>2</sub> and CH<sub>4</sub>
  - Measure emissions of CO<sub>2</sub> and CH<sub>4</sub> at 1 km<sup>2</sup> spatial resolution and weekly temporal resolution across the city
  - Distinguish biogenic vs. anthropogenic sources of CO<sub>2</sub>
  - Quantify and reduce uncertainty in urban emissions estimates

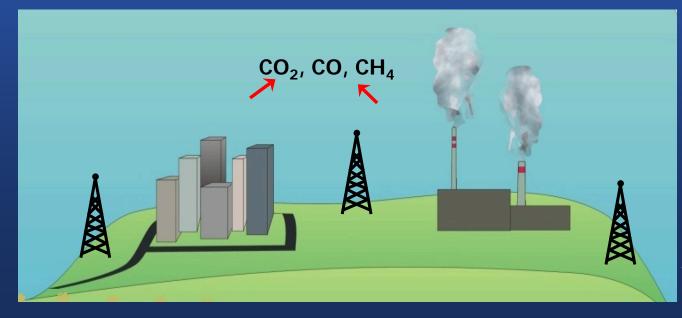


#### Atmospheric measurement of GHG emissions

- Compare to "Bottom-up" inventories using economic data and emissions factors
- Atmospheric methods have the potential to provide independent emissions estimates
- Measure GHG concentrations upwind and downwind of a source
- Steps Dodel atmospheric transport (wind, mixing depth)

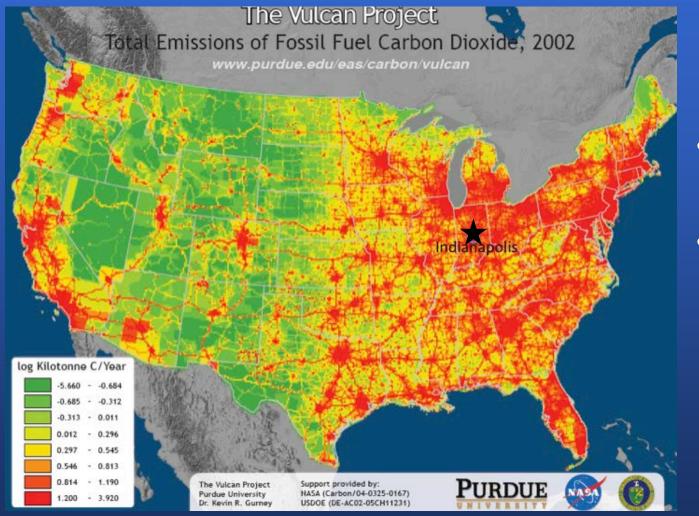
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Use an inversion to minimize the difference between modeled and observed GHG concentrations



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#### **Vulcan and Hestia Emission Data Products**



- Vulcan hourly, 10km resolution for USA
- Hestia hourly, 250 m resolution for Indianapolis, sector by sector

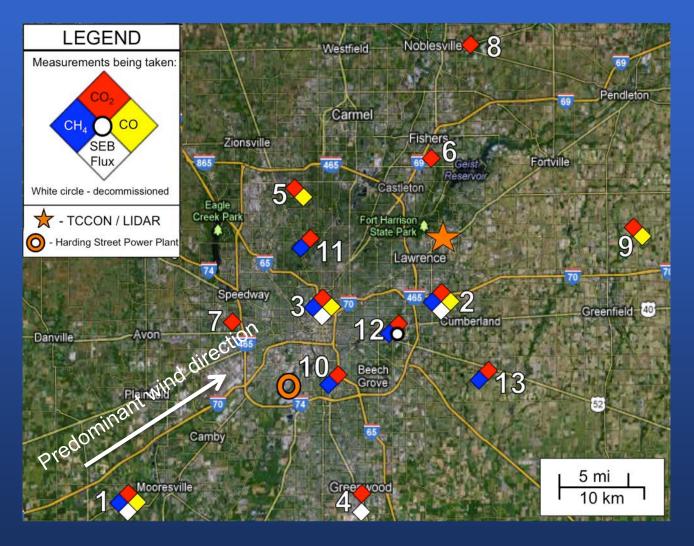
Kevin Gurney Arizona State Univ

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http://hestia.project.asu.edu/

#### INFLUX GROUND-BASED NETWORK



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- Communications towers ~100 m AGL
- Picarro, CRDS sensors
- 12 measuring CO2, 5 with CH4, and 5 with CO
- NOAA automated flask samplers
- NOAA LIDAR
- Eddy flux at 4 towers



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### High resolution inversion modeling system

- Atmospheric model WRF-Chem: 9km/3km/1km (nested mode)
- Model physics

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- Simple urban scheme within the NOAH Land Surface Model with the MYNN PBL scheme
- Coupled to Lagrangian Particle Dispersion Model (Uliasz, 1995)
- Bayesian Kalman matrix inversion
- Model assessment
  - 4 eddy flux towers
  - NOAA HALO and HURDL Doppler Lidars
  - Aircraft data
  - Radiosonde campaign: 9-17 June



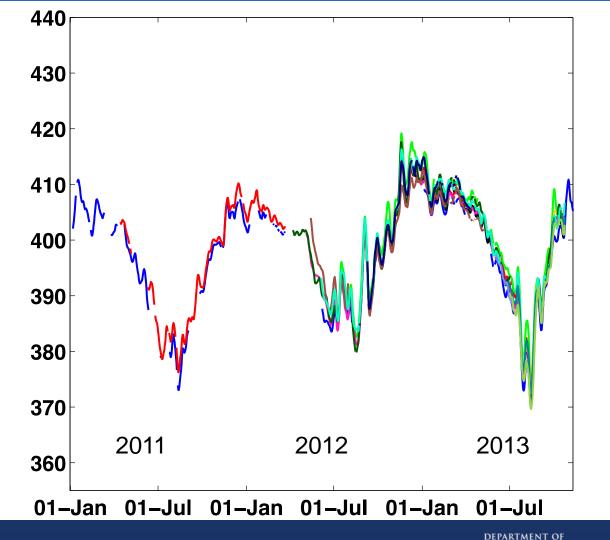
#### PENNSTATE Tower observations: [CO2] at INFLUX sites

Afternoon [CO2]
 with 21-day
 smoothing

 Seasonal and synoptic cycles are evident

Site 03 (downtown): high [CO2]

• Site 01 (background): low [CO2]



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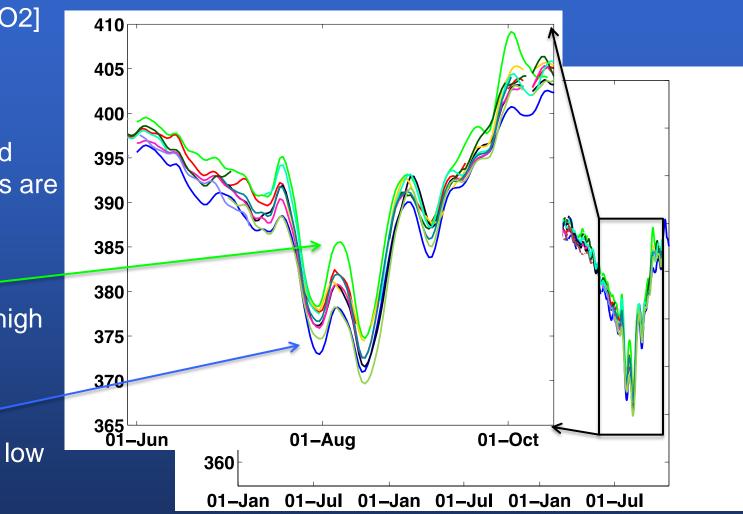
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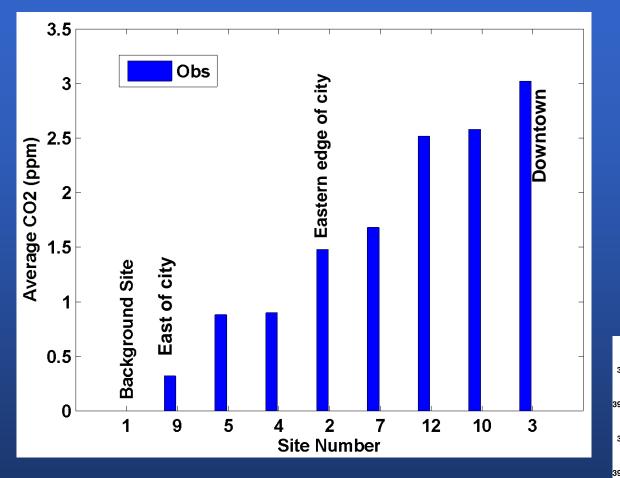
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Site 01 (background): low [CO2]



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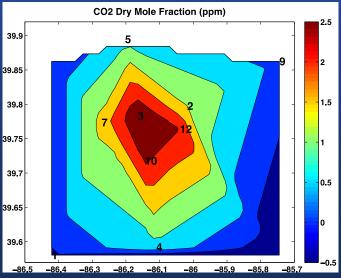
#### Spatial Structure of Urban CO2 Average [CO2] above background site



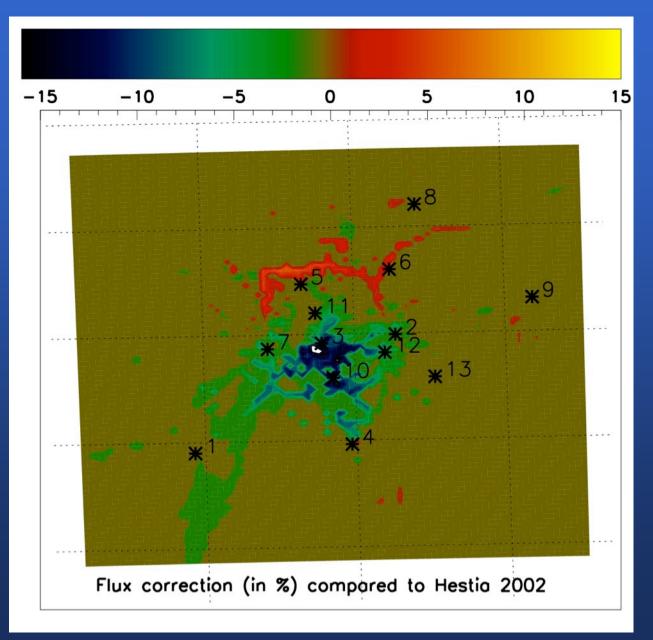
Afternoon daily values, 1 Jan – 1 April 2013

• Site 09 measures 0.3 ppm larger than Site 01 (on average; changes with wind direction)

Site 03 (downtown site) measures larger
[CO2] by 3 ppm



## PENNSTATE Inversion results: spatial pattern of flux correction



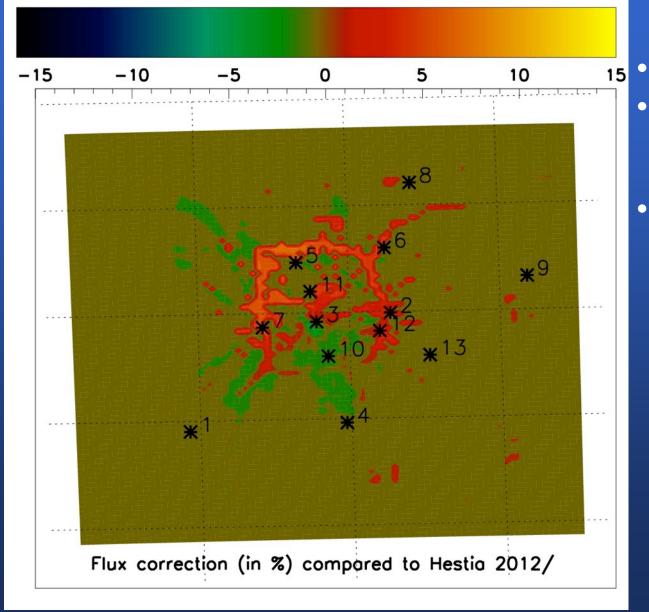
- Spatial pattern of emissions corrections (in %)
- Prior: Hestia 2002
- Tower observations for Sept Dec 2012
- Inversion decreased emissions by up to 15% compared to Hestia 2002 in downtown region

Lauvaux et al, in prep

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## **Inversion results:** spatial pattern of flux correction



#### Prior: Hestia 2012

Tower observations for Sept – Dec 2012

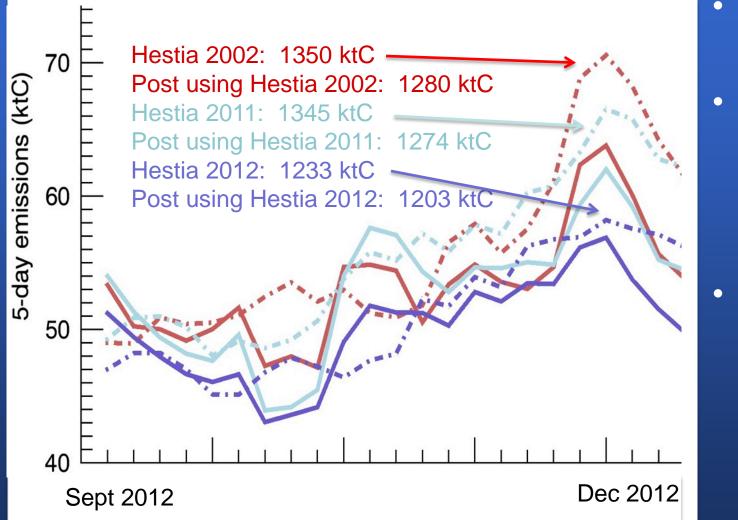
 Corrections of -5 to +5% rather than up to 15% change when using Hestia 2002/2011 as a prior

#### Lauvaux et al, in prep





# **Inversion results**



- Using 2012 tower data
- Inversion with different priors
  - Hestia 2002
  - Hestia 2011
  - Hestia 2012

Inversion converges to value towards 2012 values

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Lauvaux et al, in prep

How different is the emissions estimate using a different prior?

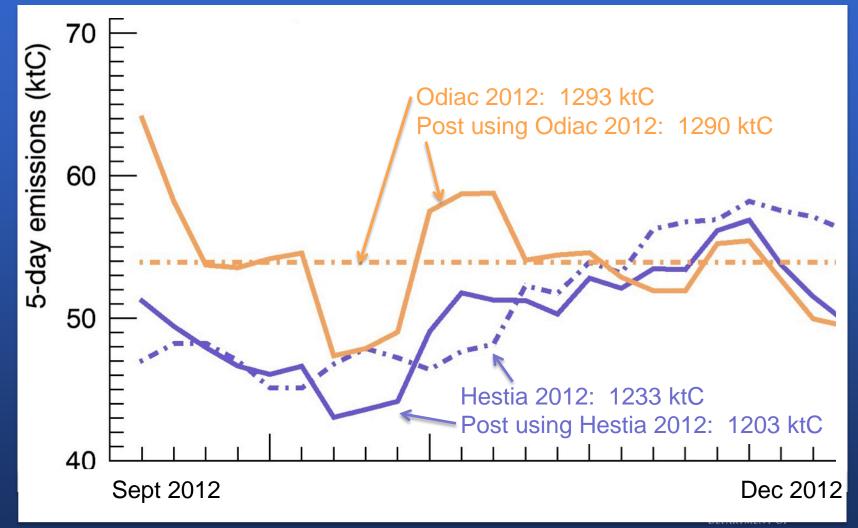
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- ODIAC nightlight-based CO2 emissions product (Tomohiro Odo)
  - Uses national petroleum and natural gas usage as total and distributes using nightlight data from satellite
  - Also incorporates power plant database
  - Available 1992 2012 worldwide





## Hestia vs CDIAC Nightlight emissions product as prior



Posterior results are the within 10% of each other throughout the period, and 7% different overall

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### Conclusions

- Tower observations detect a clear urban signal in CO2 (buried amid lots of synoptic "noise"). Differences vary greatly with weather conditions.
- Inversion converges to value towards Hestia 2012, whichever version of prior estimate is used

For more information, see <a href="http://influx.psu.edu">http://influx.psu.edu</a>









