

# Understanding Urban Carbon Flux Quantification Information Systems

SOCCR2 and beyond



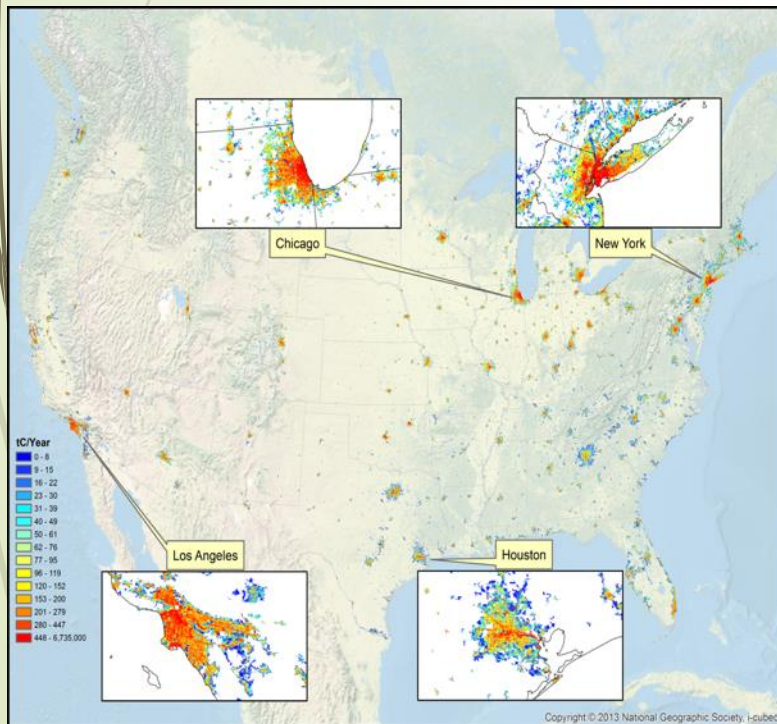
Kevin R. Gurney

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June 11, 2019

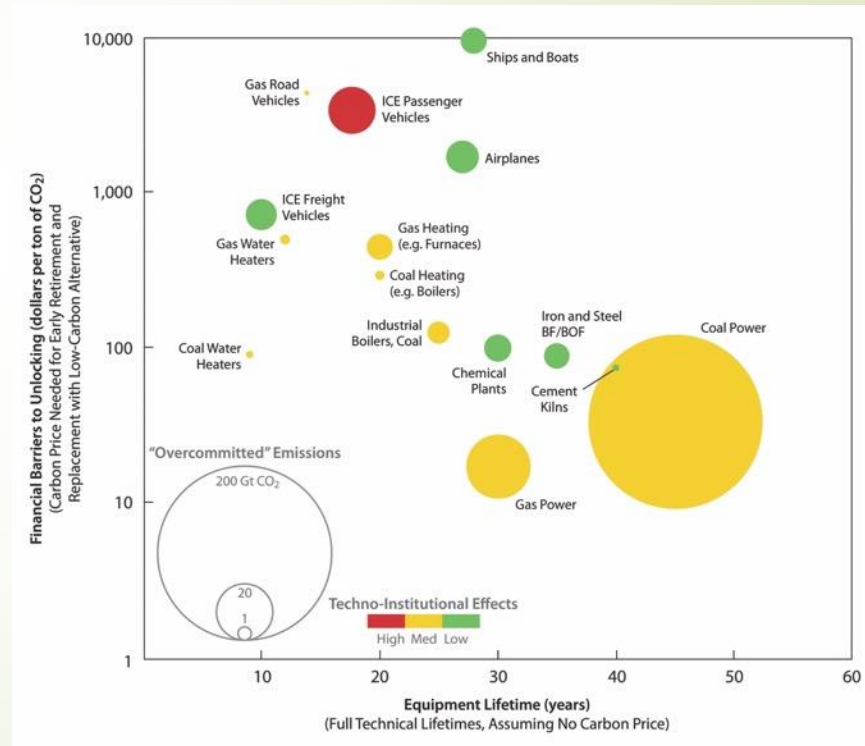
# The Urban Share

- Urban areas in North America are the **primary source** of anthropogenic carbon emissions, with cities responsible for a large proportion of **direct** emissions. These areas are also **indirect sources** of carbon through the emissions embedded in goods and services produced outside city boundaries for consumption by urban dwellers (medium confidence, likely).



# Emission “drivers”

Many **societal factors** drive urban carbon emissions, but the **urban built environment** and the regulations and policies shaping **urban form** (e.g., land-use) and **technology** (e.g., modes of transportation) play crucial roles. Such societal drivers can **lock in** dependence on fossil fuels in the absence of major technological, institutional, and behavioral change. Some fossil fuel–related infrastructure can have lifetimes up to 50 years (high confidence).





# Key Findings continued

- ▶ Key **challenges** for urban carbon flux studies are **observational design, integration, uncertainty** quantification, and **reconciliation** of the multiple carbon flux approaches to detect trends and inform emissions mitigation efforts (medium confidence, likely).
- ▶ Improvements in **air quality** and **human health** and the reduction of the **urban heat island** are important **co-benefits** of urban carbon emissions mitigation (very likely, high confidence).



# Key Findings continued

- ▶ Urban methane (CH<sub>4</sub>) emissions have been poorly characterized, but the combination of **improved instrumentation, modeling tools, and heightened interest** in the problem is defining the range of emissions rates and source composition as well as highlighting infrastructure characteristics that affect CH<sub>4</sub> emissions (medium confidence).
- ▶ Urban areas are important sites for policy- and decision making that shape carbon fluxes and mitigation. However, cities also are constrained by other **levels of government**, variations in their sources of **authority and autonomy**, capacity, competing **local priorities**, and available fiscal **resources** (high confidence).

# Ongoing work in many NA cities

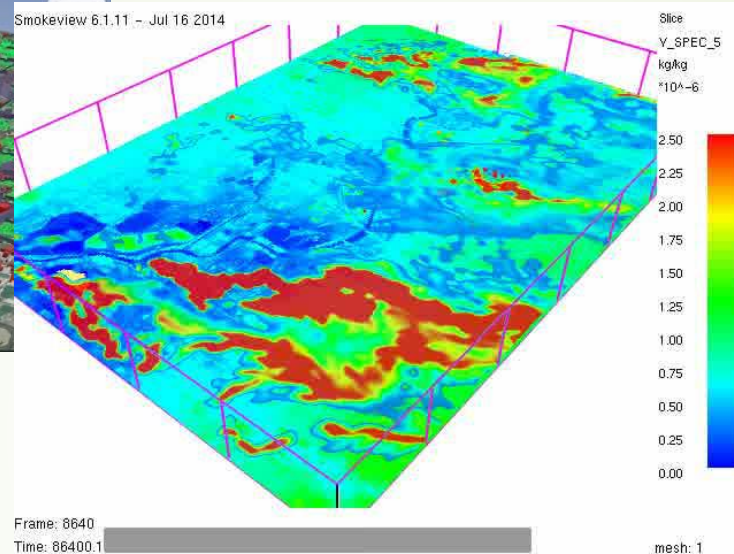
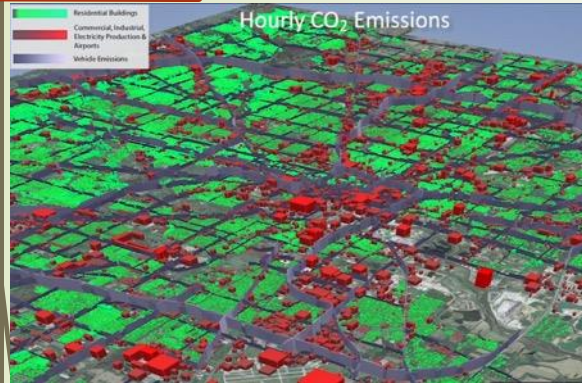
Table 4.1. Scientifically Based Urban Carbon Estimation Studies in North American Cities

Domain	Framework, Scope, Boundary <sup>a</sup>	Estimation Technique <sup>b</sup>	Sectors Estimated <sup>c</sup>	References	Notes <sup>d</sup>
Indianapolis, IN	In-boundary	Direct flux, activity-EF, and fuel statistics; airborne eddy flux measurement; isotopic atmospheric measurement; atmospheric inversion	All FF	Cambaliza et al. (2014); Gurney et al. (2012, 2017); Lauvaux et al. (2016); Turnbull et al. (2015)	Much of the work is space and time explicit; atmospheric monitoring includes <sup>14</sup> CO <sub>2</sub> , CO, and CH <sub>4</sub>
Toronto, Canada	Life cycle (scopes 1, 2)	Activity-EF	Residential	Kennedy et al. (2009); VandeWeghe and Kennedy (2007)	Annual and census tract
Los Angeles, CA	In-boundary; embedded in buildings	Atmospheric measurement; activity-EF	All FF; on-road transportation; buildings	Feng et al. (2016); Kort et al. (2012); Newman et al. (2016); Pincell et al. (2014); Porse et al. (2016); Reyna and Chester (2015); Wong et al. (2016); Wunch et al. (2009)	Some work is space and time explicit; atmospheric monitoring includes <sup>14</sup> CO <sub>2</sub> , CO, and CH <sub>4</sub>
Salt Lake City, UT	In-boundary; consumption	Atmospheric measurement; direct flux, activity-EF, and fuel statistics; forest growth modeling and eddy flux measurement	All FF; biosphere	Kennedy et al. (2009); McKain et al. (2012); Pataki et al. (2006, 2009); Patarasuk et al. (2016)	Some work is space and time explicit
Baltimore, MD	In-boundary	Eddy flux measurement	All FF; biosphere	Crawford et al. (2011)	
Denver, Boulder, Fort Collins, and Arvada, CO; Portland, OR; Seattle, WA; Minneapolis, MN; Austin, TX	Hybrid life cycle (scopes 1, 2, 3)	Activity-EF	All FF	Hillman and Ramaswami (2010)	Addition of scope 3 emissions increased total footprint by 47%

New York City, NY; Denver; Los Angeles; Toronto; Chicago, IL	Scopes 1, 2, 3	Activity-EF, fuel statistics, and downscaling	Excludes some scope 3 emissions	Kennedy et al. (2009, 2010, 2014)	
Boston, MA; Seattle; New York City; Toronto	Scope 1, 2 (some scope 3 included); scope 1 in lowland area	Activity-EF, fuel statistics and downscaling; flux chambers and remote sensing	Excludes some sectors; biosphere carbon stock change	Hutyra et al. (2011); Kennedy et al. (2012)	
Boston	In-boundary	Activity-EF; atmospheric monitoring; atmospheric monitoring and inversion	Onroad; pipeline leak; biosphere respiration	Brondfield et al. (2012); Decina et al. (2016); McKain et al. (2015); Phillips et al. (2013)	Some work is space and time explicit; includes some CH <sub>4</sub>
Washington, D.C.; New York City; Toronto	Scope 1	Activity-EF and fuel statistics	All greenhouse gases	Dodman (2009)	Mixture of methods from multiple sources
Chicago				Grimmond et al. (2002)	
Mexico City	In-boundary	Eddy flux measurement; Activity-EF	All FF; biosphere; onroad	Chavez-Baeza and Sheinbaum-Pardo (2014); Velasco and Roth (2010); Velasco et al. (2005, 2009)	Footprint of single monitoring location; whole-city inventory
Halifax, Canada	Scope 1, 2	Activity-EF	Buildings, transportation	Wilson et al. (2013)	Spatially explicit
Pittsburgh, PA	Scope 1, 2	Activity-EF, fuel statistics, and downscaling	Residential, commercial, industrial, and transportation	Hoesly et al. (2012)	
Phoenix, AZ	In-boundary	Activity-EF and soil chamber	Onroad, electricity production, airport and aircraft	Koerner and Klopatek (2002)	

Vancouver, Canada	In-boundary	Eddy flux measurement	All FF; biosphere	Crawford and Christen (2014)	
Vancouver, Edmonton, Winnipeg, Toronto, Montreal, and Halifax, Canada	Scopes 1, 2	Activity-EF	Residential building stock	Mohareb and Mohareb (2014)	
20 U.S. cities	In-boundary; consumption; hybrid	Activity-EF	All energy related	Ramaswami and Chavez (2013)	

# Urban emission quantification architecture



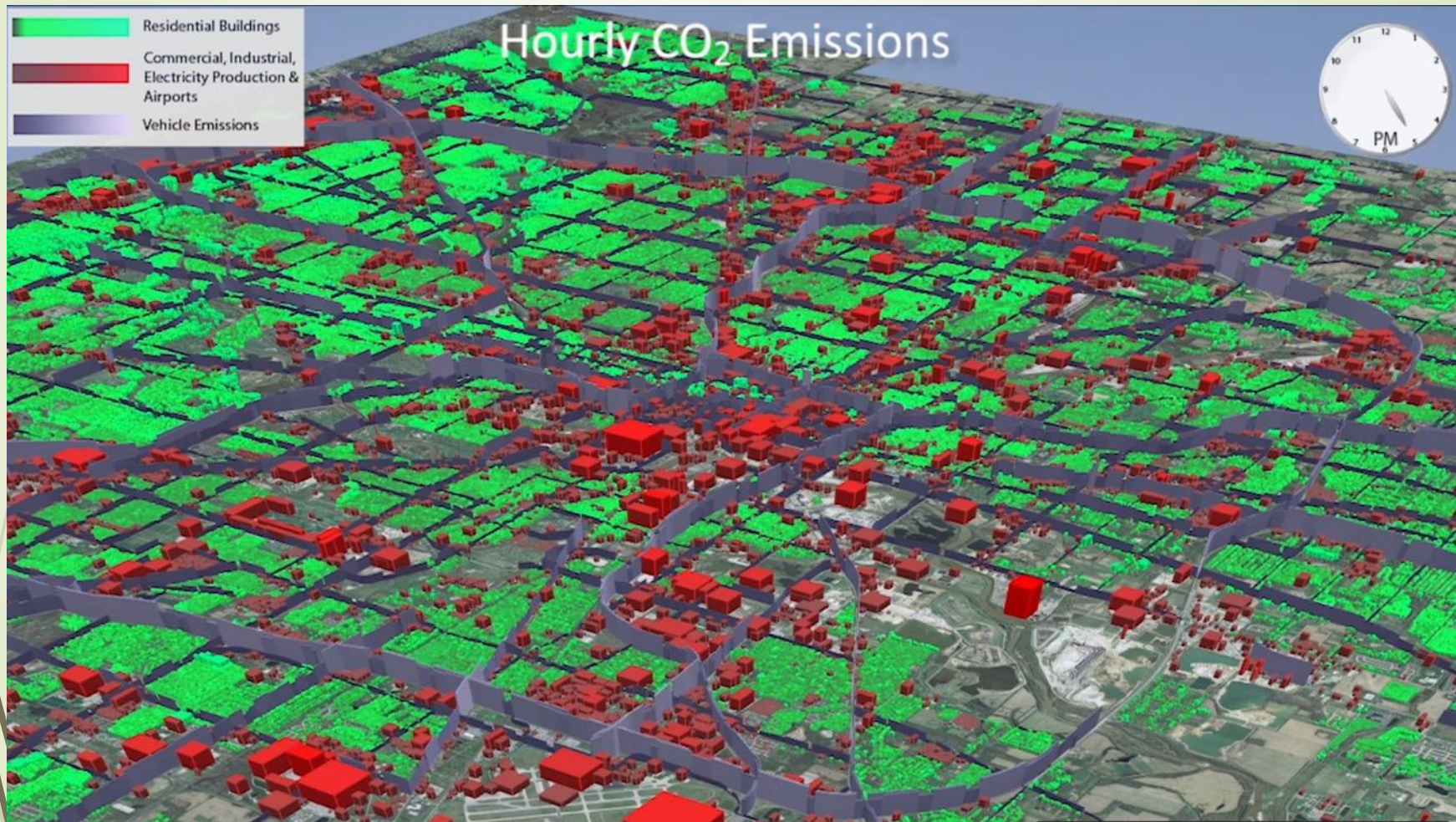
Shepson and Davis



- 1) Verification capability
- 2) Mitigation guidance
- 3) Questions on urban metabolism

Aiming for the knowledge gap  
between whole-city inventories  
and building-scale energy auditing

# Hestia

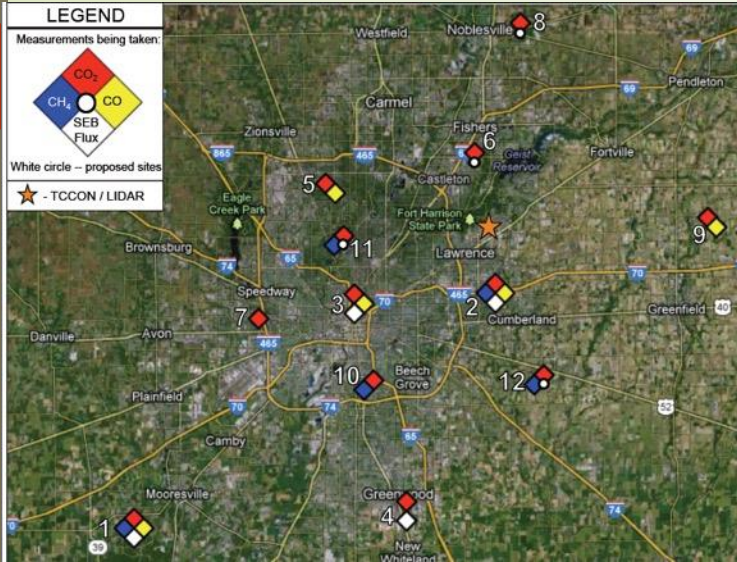


Nested within Vulcan (conserves mass)  
Data mining from city operations (traffic data, tax assessment)

Space, time, process

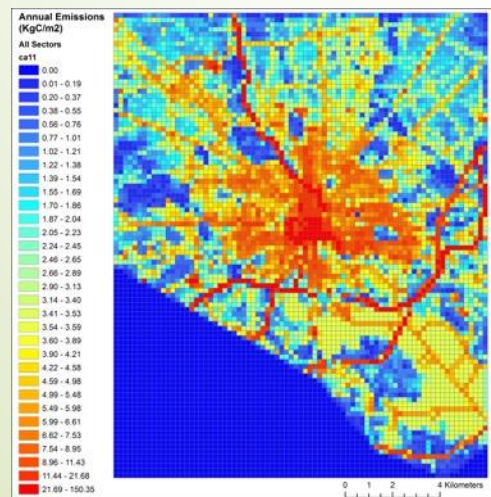


# Multiple cities



Melbourne  
Auckland  
Paris  
Sao Paulo

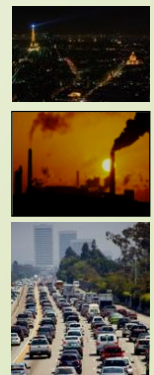
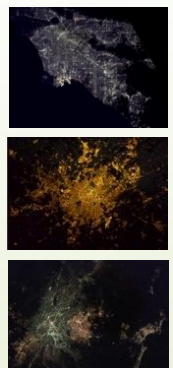
Boston via  
BU/Harvard



NATURE CLIMATE CHANGE | VOL 2 | AUGUST 2012 | www.nature.com/natureclimatechange  
COMMENTARY:  
**Measuring the carbon emissions of megacities**  
Riley M. Duren and Charles E. Miller

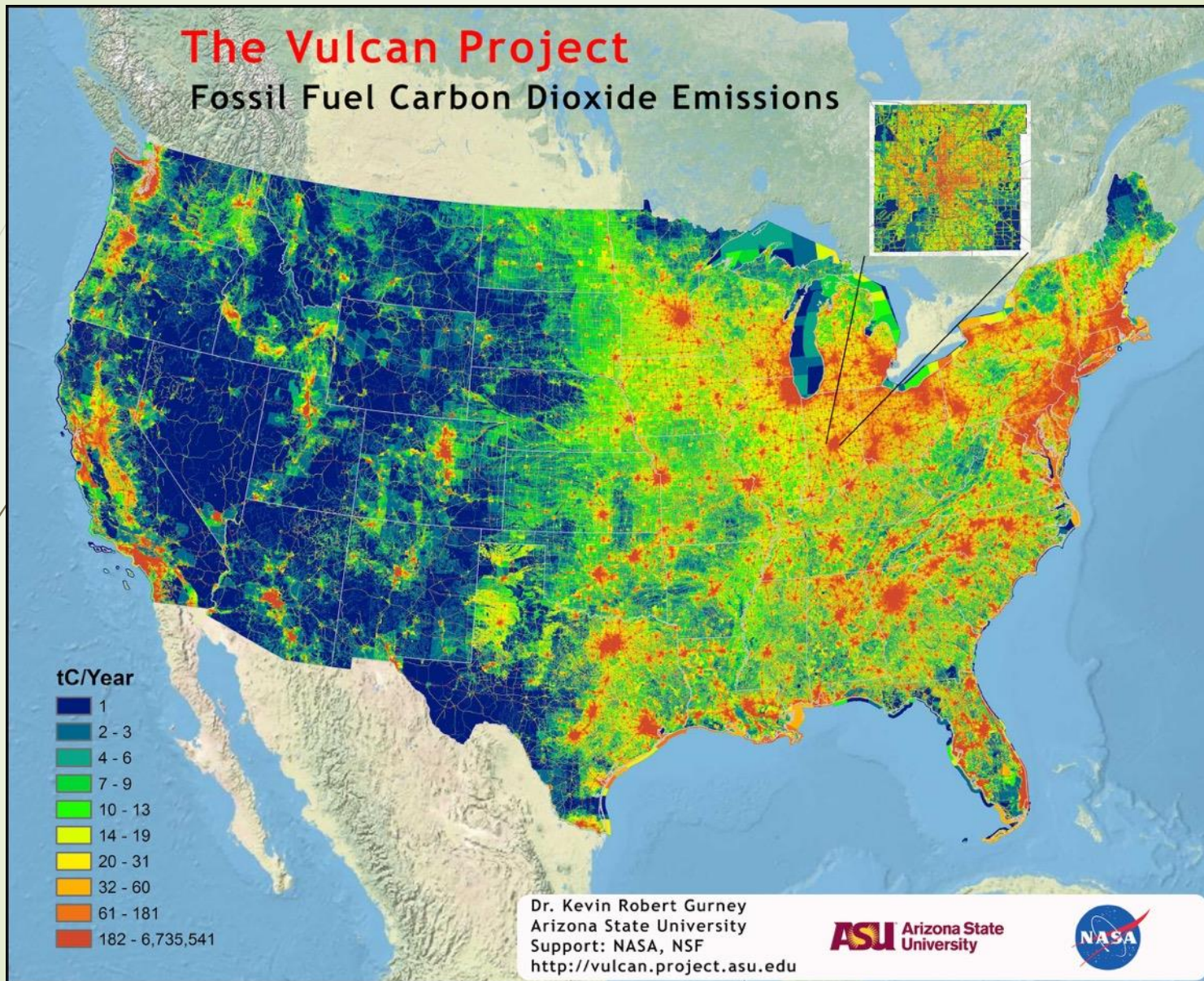


*Megacities Carbon Project*



# Vulcan

0.5 km x 0.5 km, hourly 2010-2015



**Scope 1 AND scope 2 (working on scope**

Gurney et al., *Env. Sci & Tech*, 2009; 2019

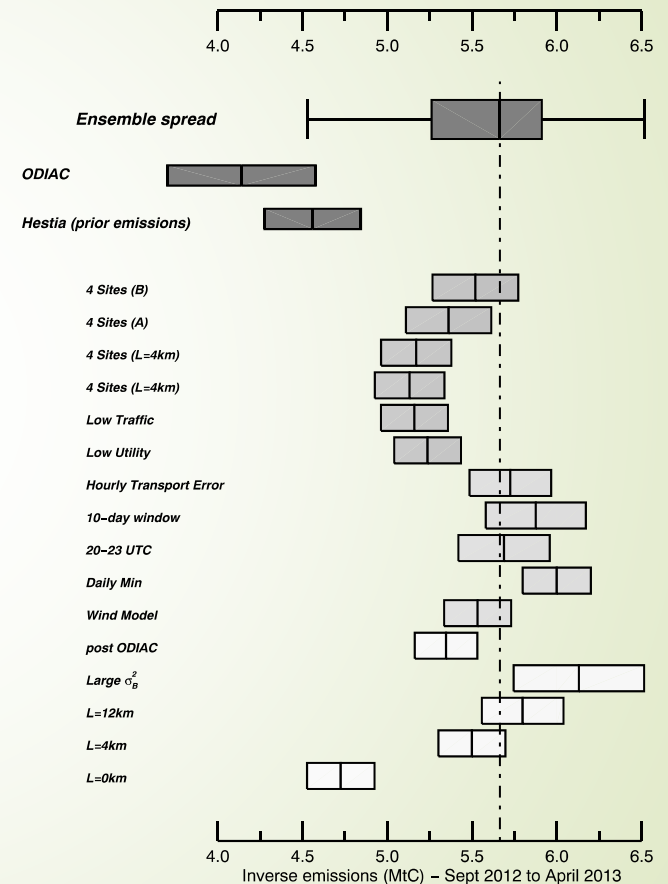


# INFLUX inversion

## Notes:

The inversion is NOT estimating the same thing as contained in the prior.

There is no inversion without a prior.....hence, there is no “independent” inversion.



# Bottom-up/top-down reconciliation

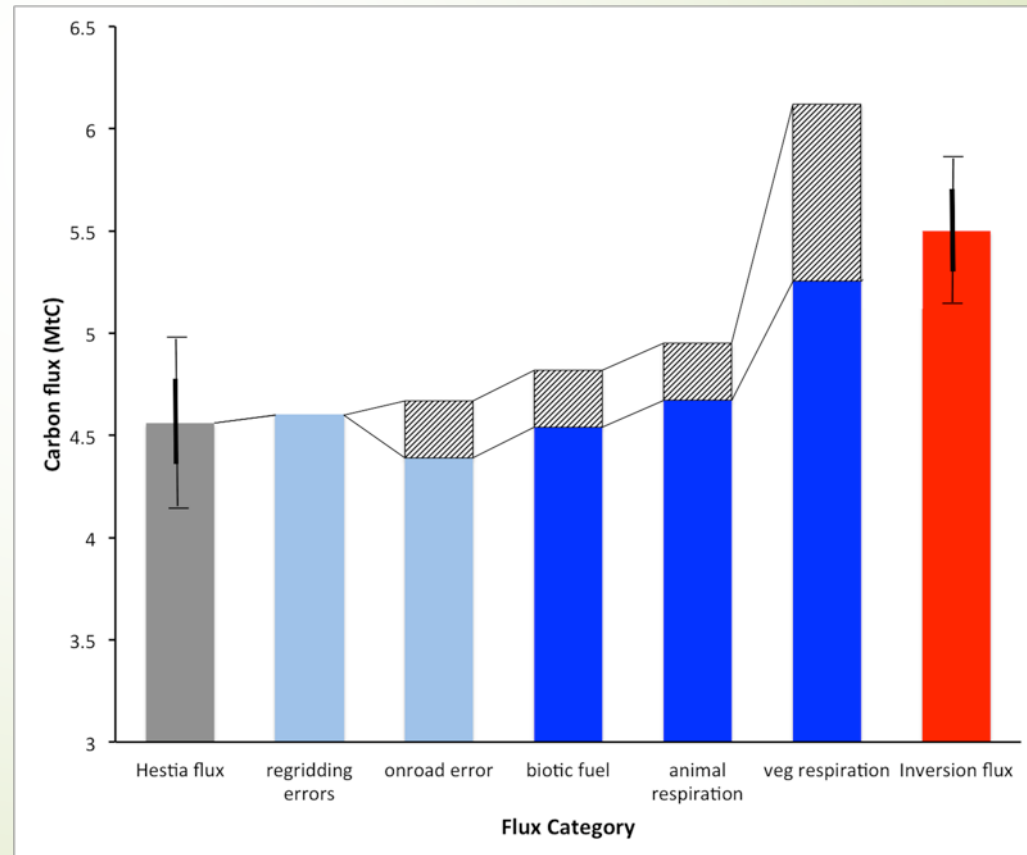
RESEARCH ARTICLE

Reconciling the differences between a bottom-up and inverse-estimated FF<sub>CO<sub>2</sub></sub> emissions estimate in a large US urban area

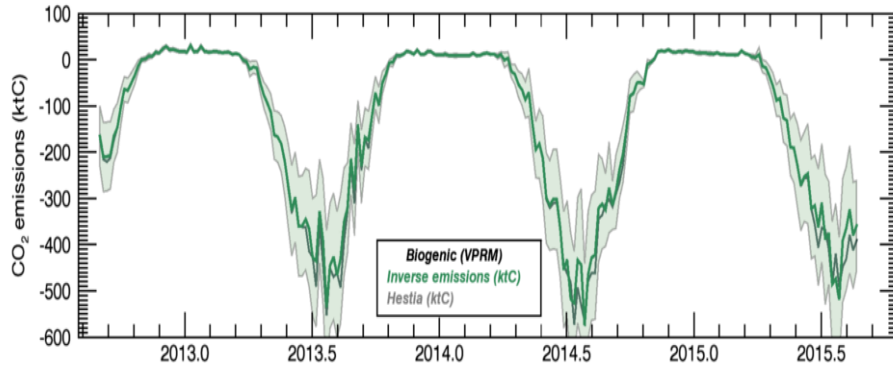
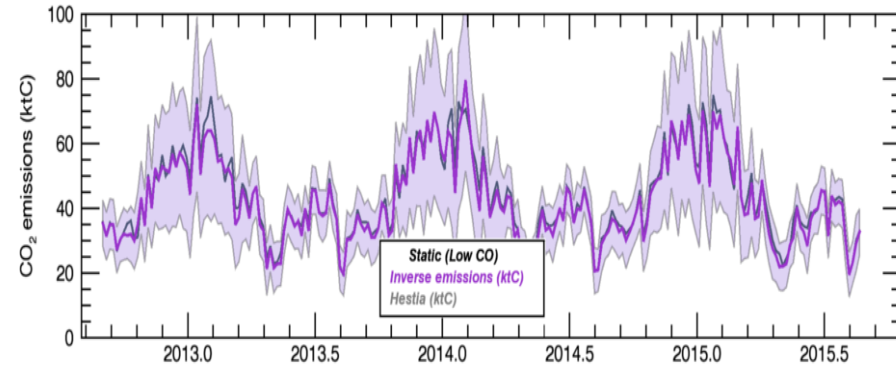
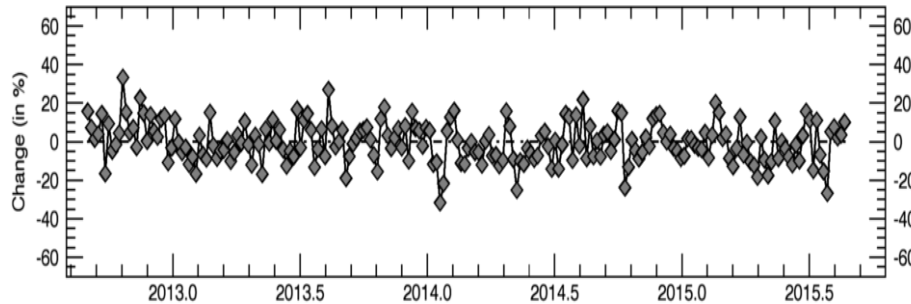
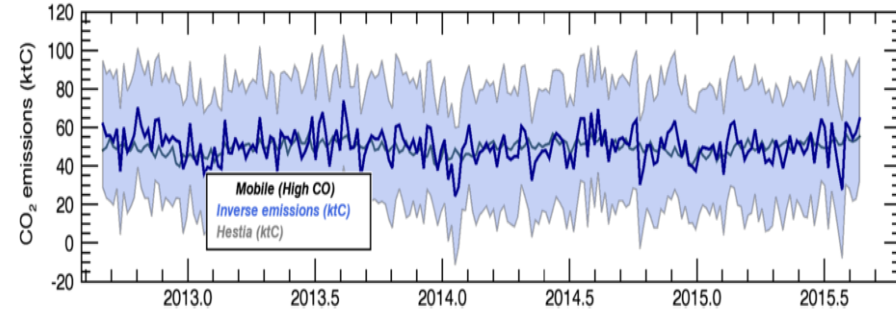
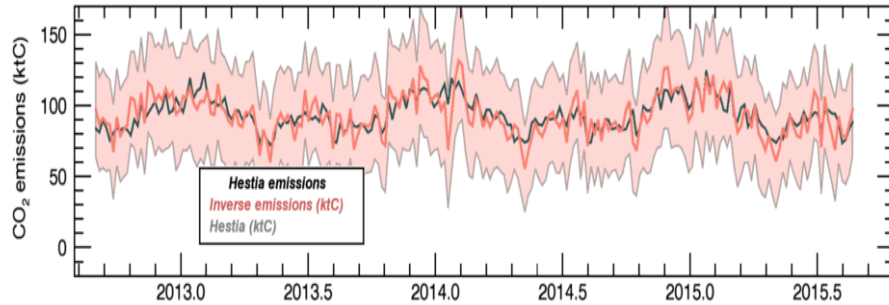
Kevin R. Gurney<sup>\*</sup>, Jianming Liang<sup>\*</sup>, Risa Parasuk<sup>\*</sup>, Darragh O'Keefe<sup>\*</sup>, Jianhua Huang<sup>\*</sup>, Maya Hutchinson<sup>\*</sup>, Thomas Lauvaux<sup>†</sup>, Jocelyn C. Turnbull<sup>‡§</sup> and Paul B. Shepson<sup>||</sup>

Hestia compared to atmospheric CO<sub>2</sub> inversion (Lauvaux et al., 2016)

**Biotic respiration** prior to persistent ground freeze explains majority of difference



# Reconciliation continued



# Comparison to self-reported

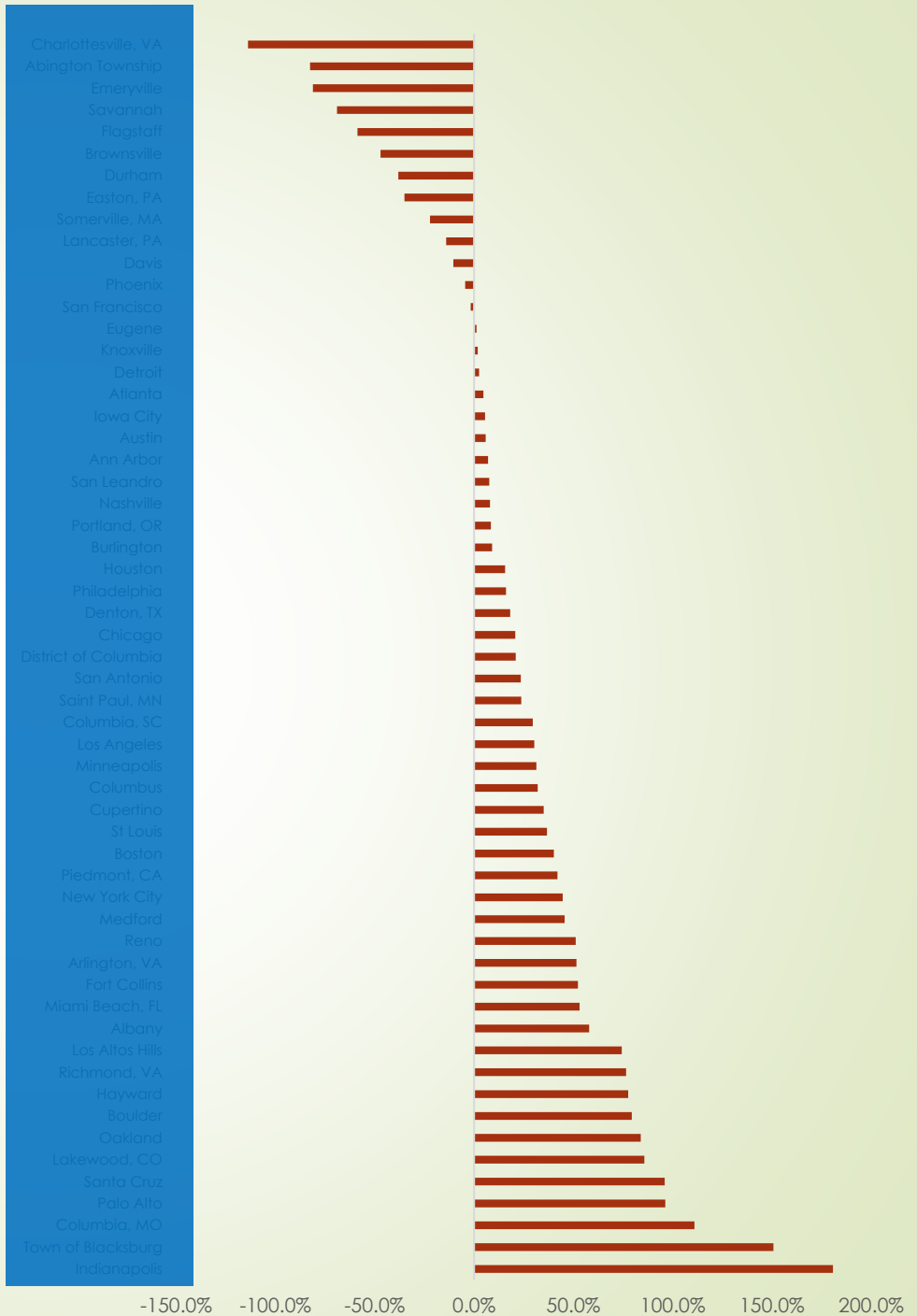
The mean signed % difference:

**+24.0%**

The mean absolute % difference:

**44.3%**

For 44 of the 57 cities,  
Vulcan estimates larger  
scope 1 FFCO<sub>2</sub> emissions



# Thank you



## Acknowledgement of funders:

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- **AND** – SOCCR2 chapter 4 co-authors (co-leads: Paty Romero-Lankao, Stephanie Pincetl)

