

# ***4-D Modeling of the Regional Carbon Cycle in & Around Urban Environments: An Interdisciplinary Study to Advance Observational & Modeling Foundations***

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## ***4-D Modeling of the Regional Carbon Cycle in & Around Urban Environments***

***Developing an end-to-end capability for modeling GHG dynamics in urban areas that links natural and anthropogenic drivers of GHG emissions.***

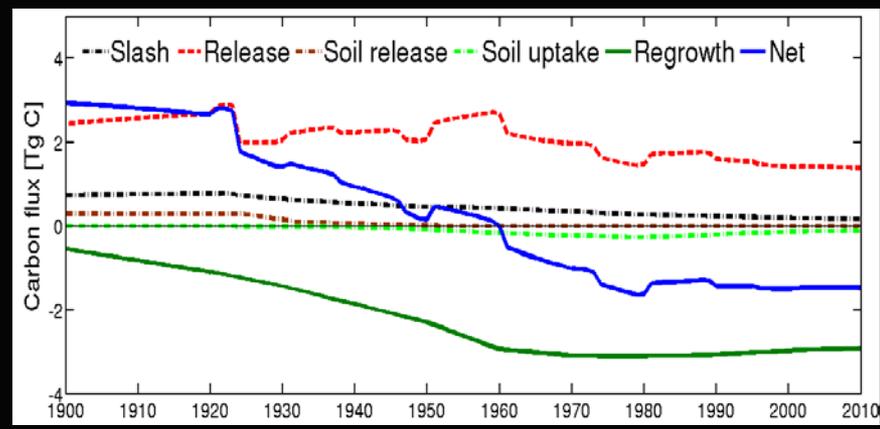
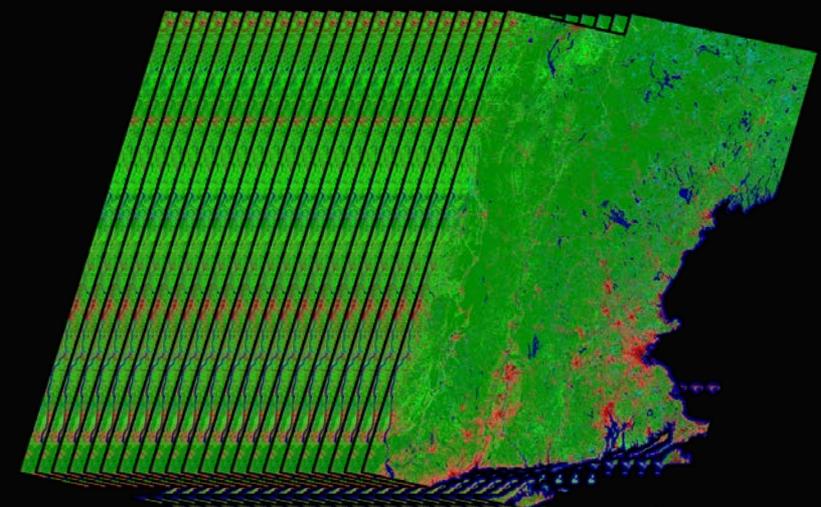
1. How do land use, land cover, and land cover change in and around metropolitan areas affect carbon storage and fluxes at daily, seasonal, interannual, and decadal time scales?
2. How are anthropogenic emissions and biogenic carbon fluxes from urban and suburban ecosystems redistributed by atmospheric transport processes at regional scales where urban emissions influence GHG measurements from surface networks and satellite platforms?
3. How can inverse methods, atmospheric transport models, and remote sensing be used to better represent total atmospheric column dynamics in GHG concentrations, and by extension, determine surface fluxes in urban environments and surrounding landscapes?



# 4-D Modeling of the Regional Carbon Cycle in & Around Urban Environments

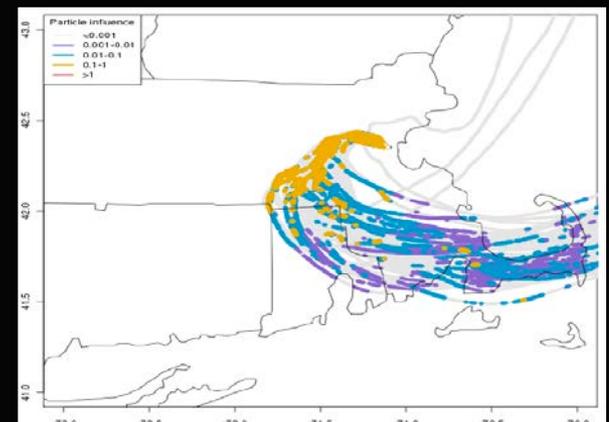
## LCLUC Dynamics from Landsat Time Series

## Modeling Carbon Dynamics of LCLUC

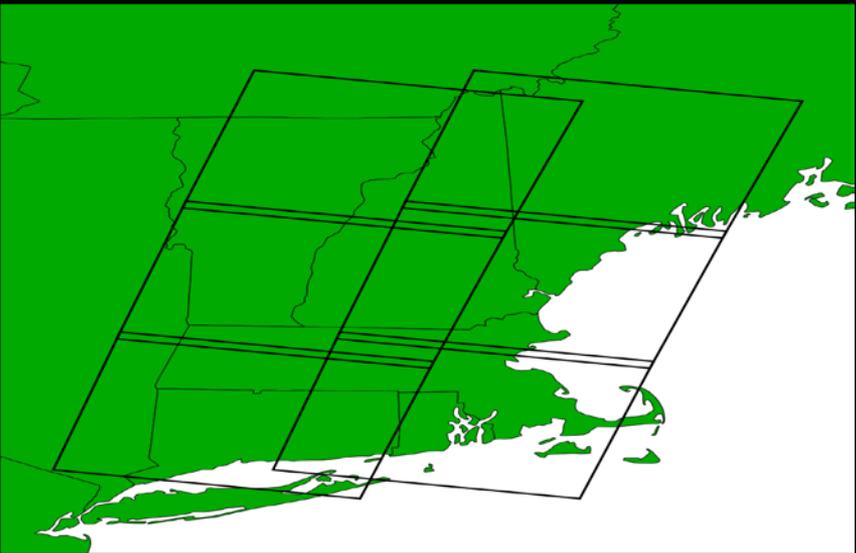


## Atmospheric Measurements

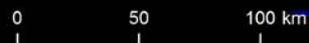
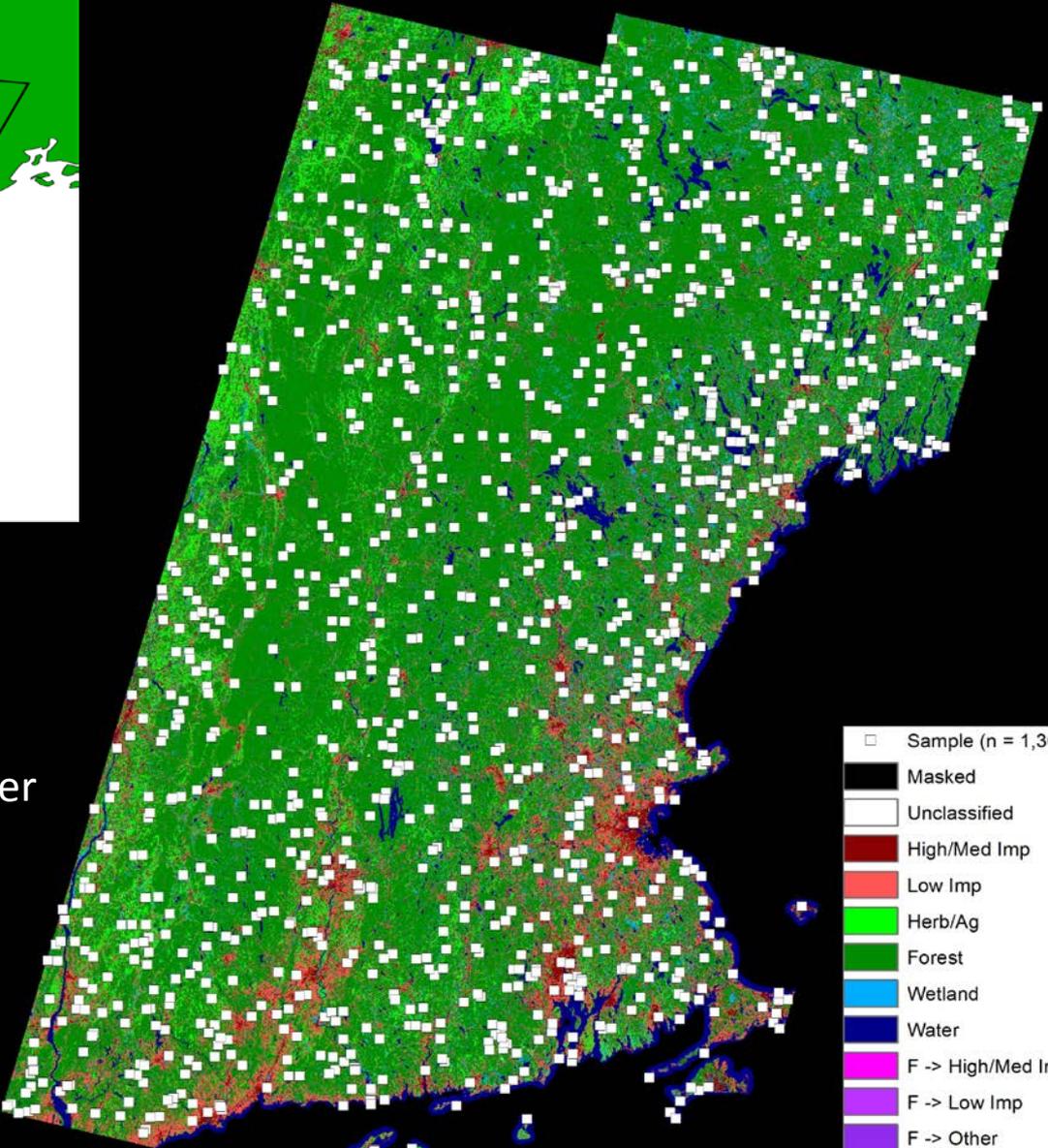
## Atmospheric Modeling



# LCLUC Dynamics

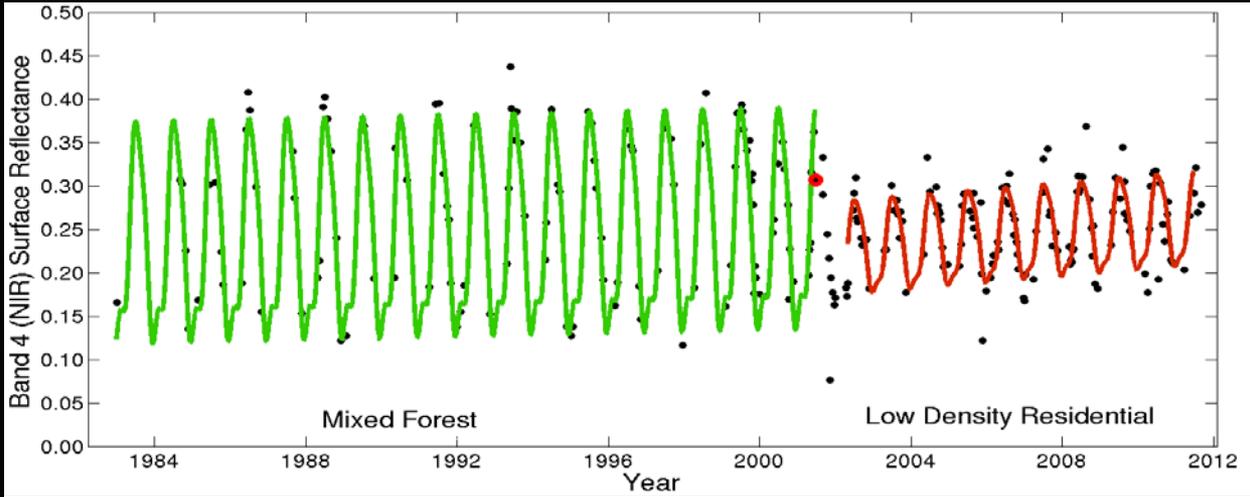


Five Landsat scenes have processed using a Continuous Change Detection and Classification (CCDC) of Land Cover Using All Available Landsat Data



- Sample (n = 1,300)
- Masked
- Unclassified
- High/Med Imp
- Low Imp
- Herb/Ag
- Forest
- Wetland
- Water
- F -> High/Med Imp
- F -> Low Imp
- F -> Other
- Herb/Ag -> F
- Other -> F

# LCLUC Dynamics



where,

$x$  Julian date  
 $I$  the  $i$ th Landsat Band

$T$  number of days per year ( $T = 365$ )

$N$  number of years of Landsat data

$a_{0,i}$  coefficient for overall values for the  $i$ th Landsat Band

$a_{1,i}, b_{1,i}$  coefficients for intra-annual change for the  $i$ th Landsat Band

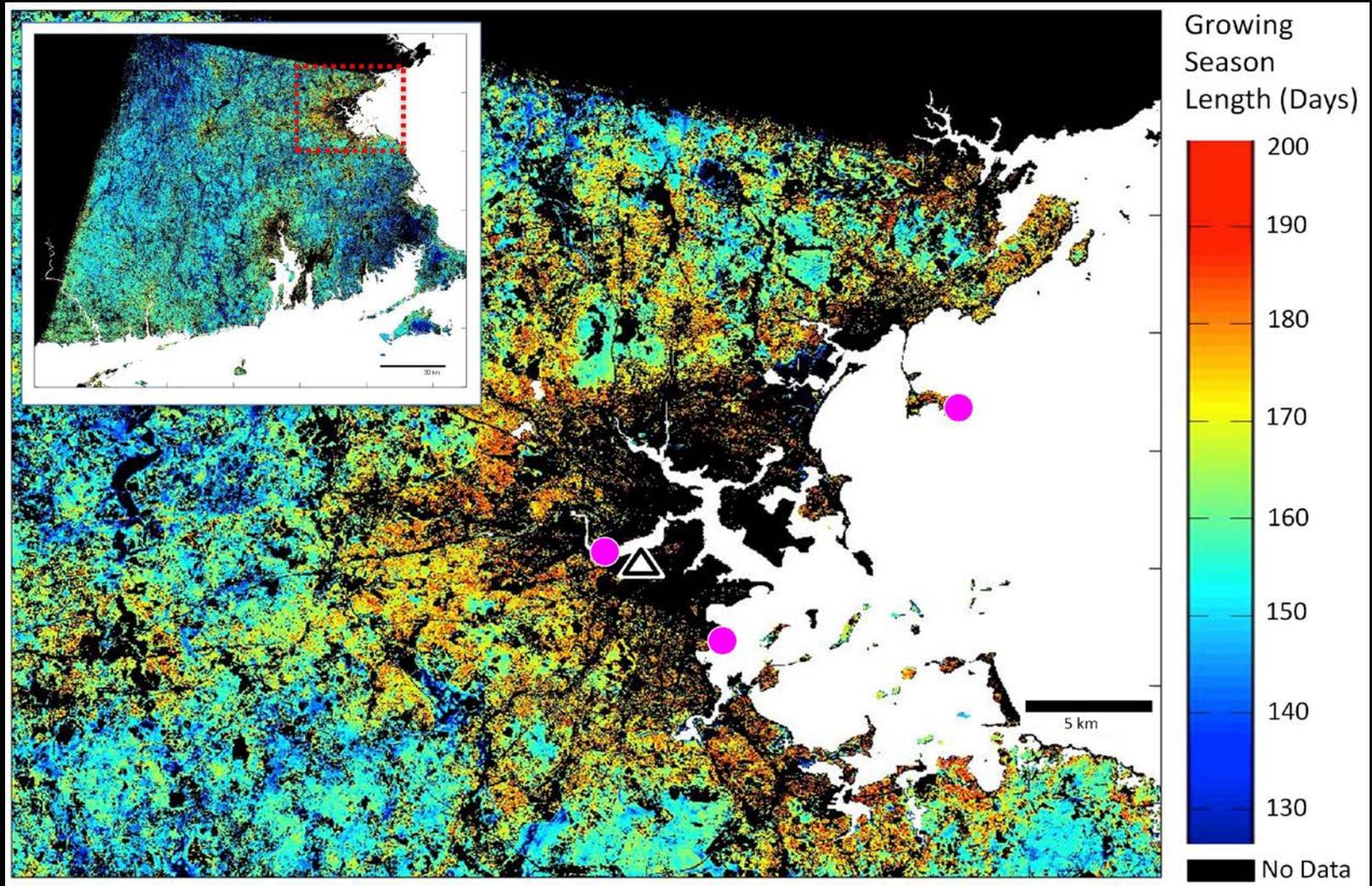
$a_{2,i}, b_{2,i}$  coefficients for inter-annual change for the  $i$ th Landsat Band

$\hat{\rho}(i, x)_{RIRLS}$  predicted value for the  $i$ th Landsat Band at Julian date  $x$  based on RIRLS fitting.

$$\hat{\rho}(i, x)_{RIRLS} = a_{0,i} + a_{1,i} \cos\left(\frac{2\pi}{T} x\right) + b_{1,i} \sin\left(\frac{2\pi}{T} x\right) + a_{2,i} \cos\left(\frac{2\pi}{NT} x\right) + b_{2,i} \sin\left(\frac{2\pi}{NT} x\right)$$

# LCLUC Dynamics

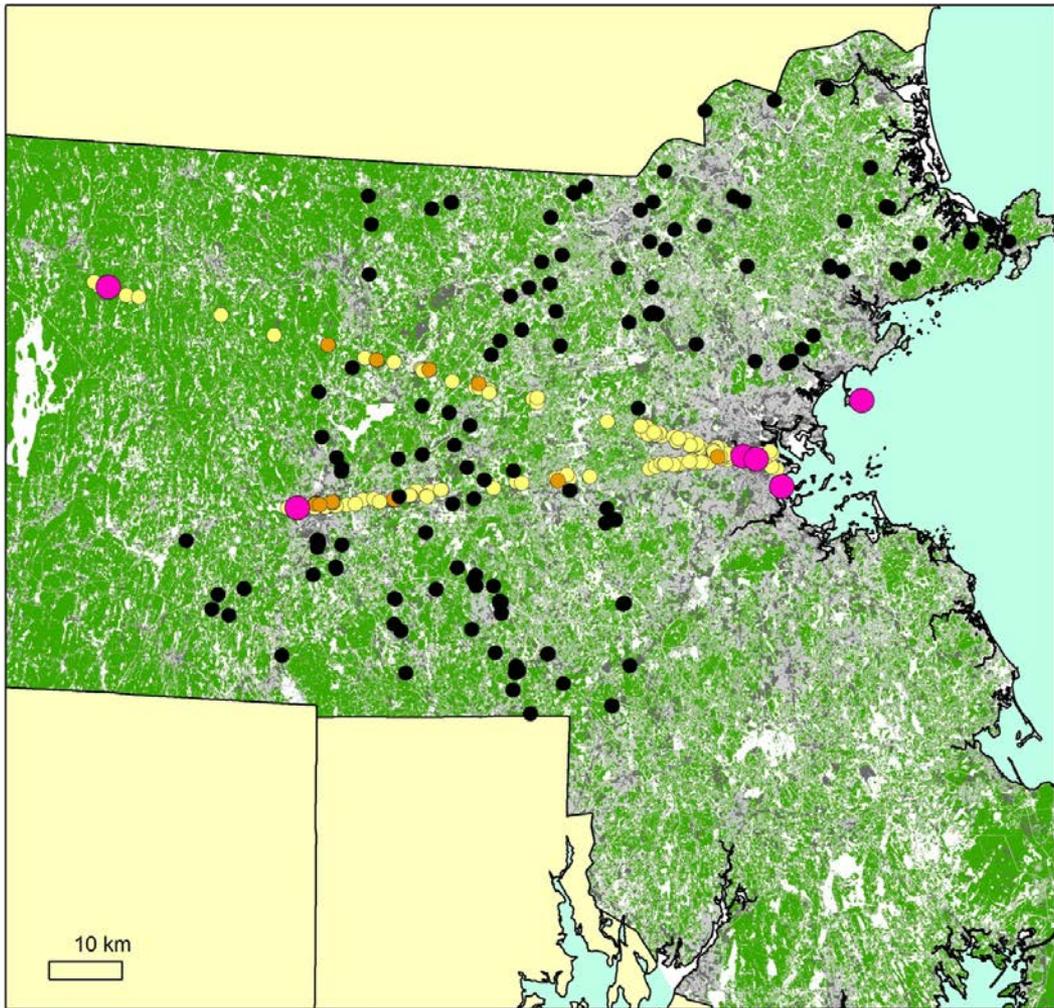
Urban lengthening of plant growing season by ~ 1 month!



# Modeling of Carbon Dynamics of LCLUC

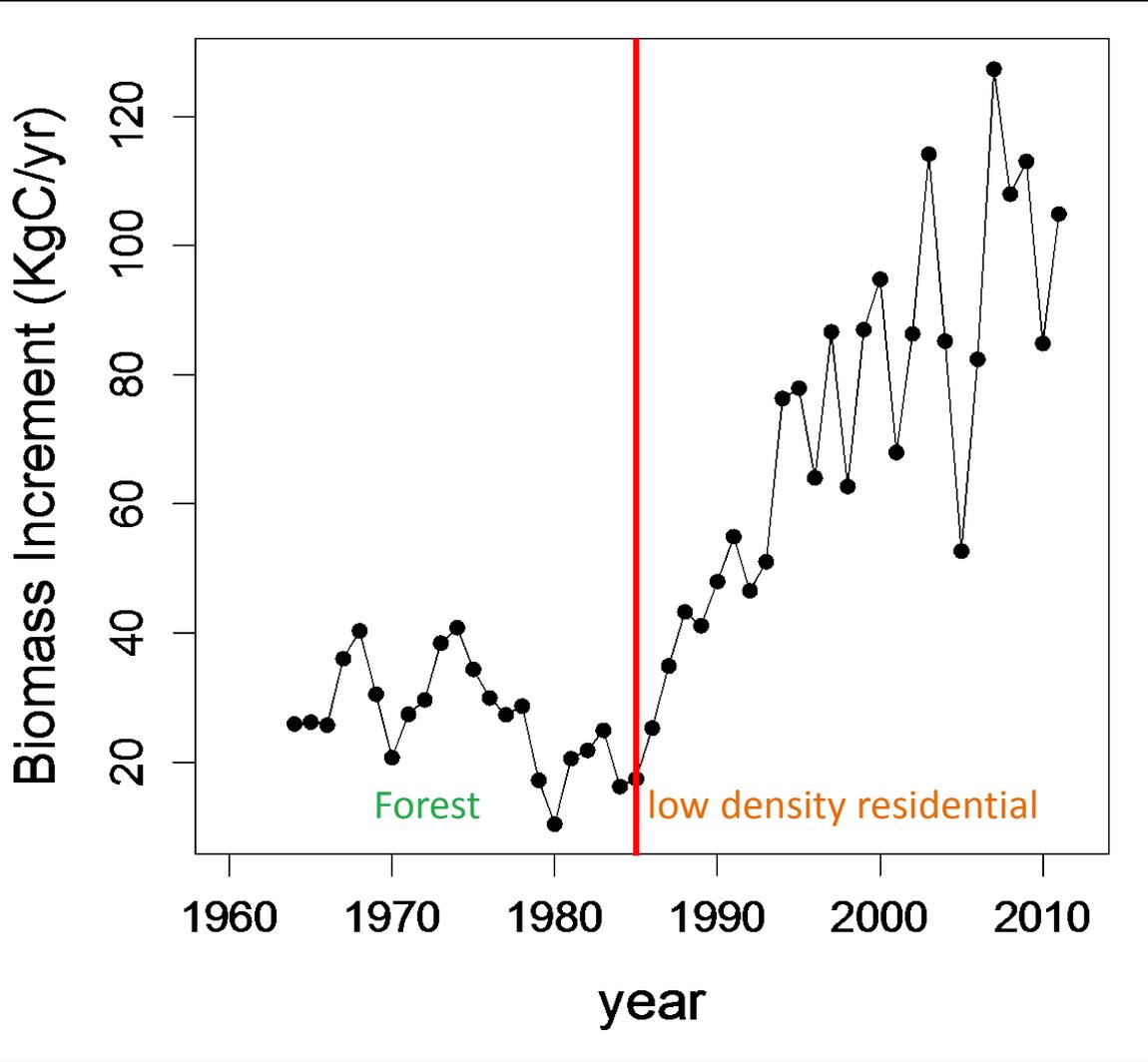
## Legend

- Towers
- 2013 Field Sites
- 2010 Field Sites
- 2010 Revisited
- Unsampld
- Residential
- Comm/Industrial
- Forest

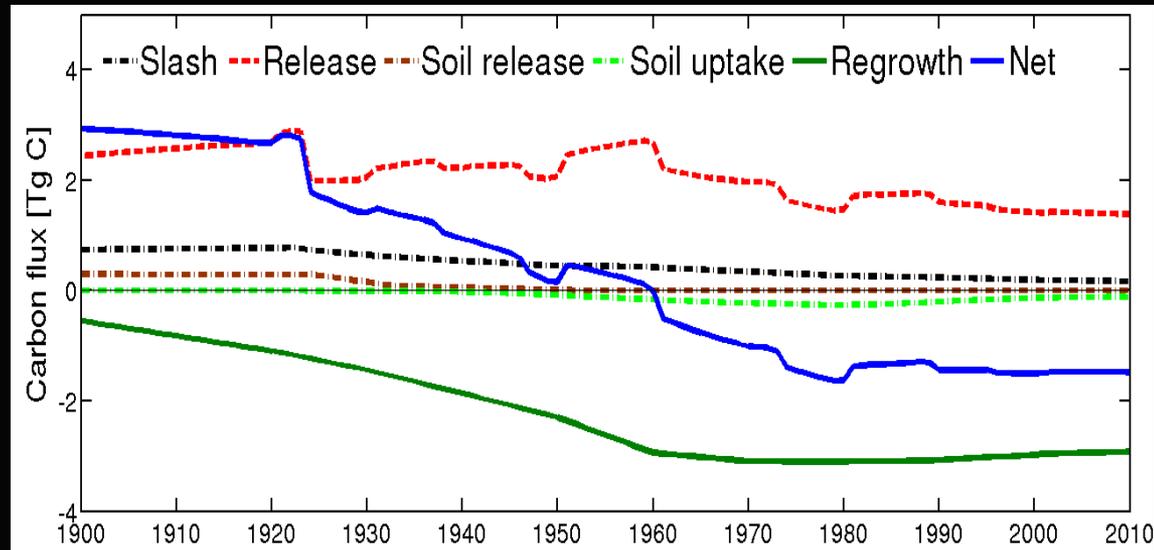


# Modeling of Carbon Dynamics of LCLUC

~50% less biomass in urban areas, but we observe an ~50% increase in per tree productivity

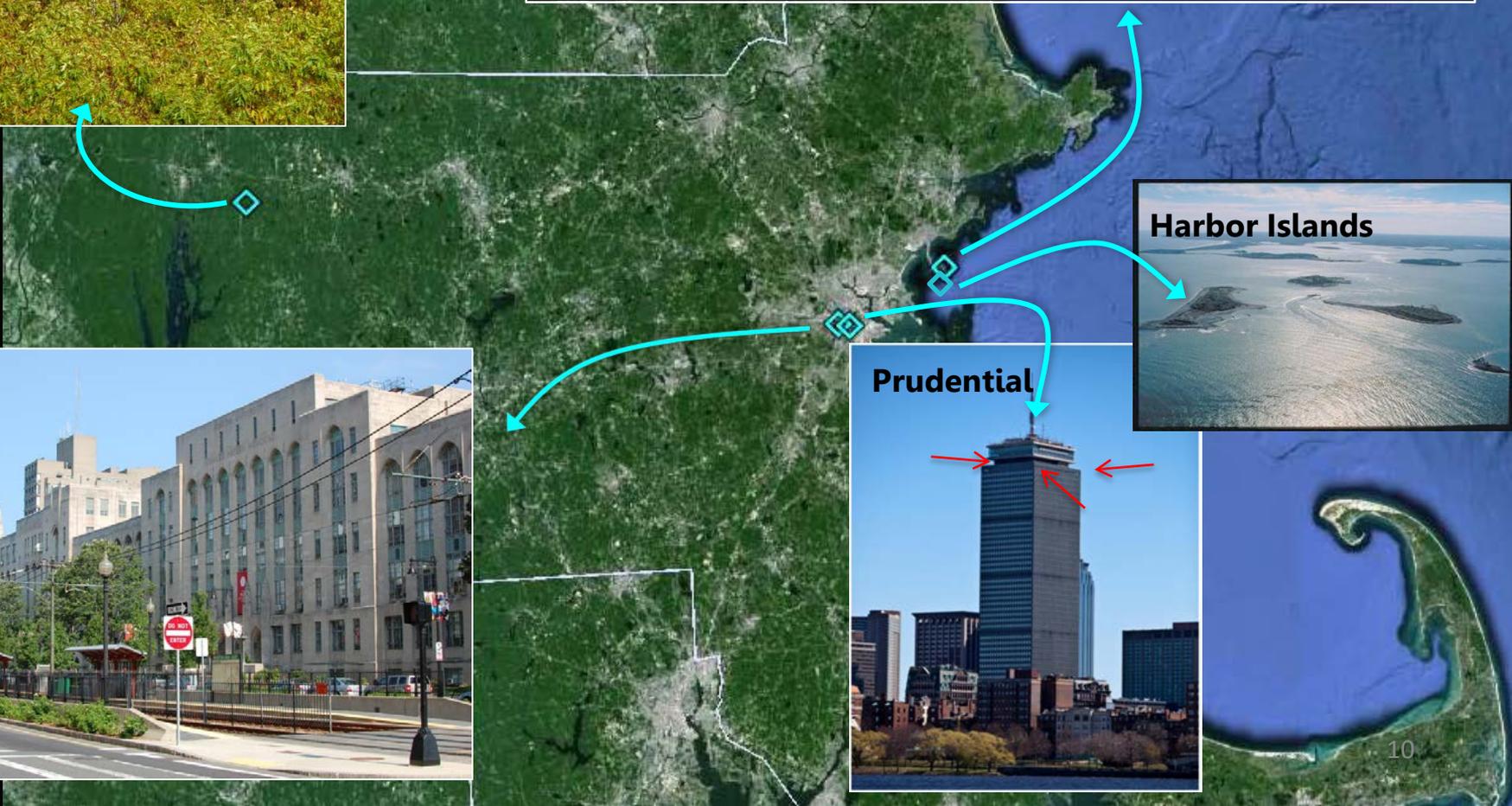
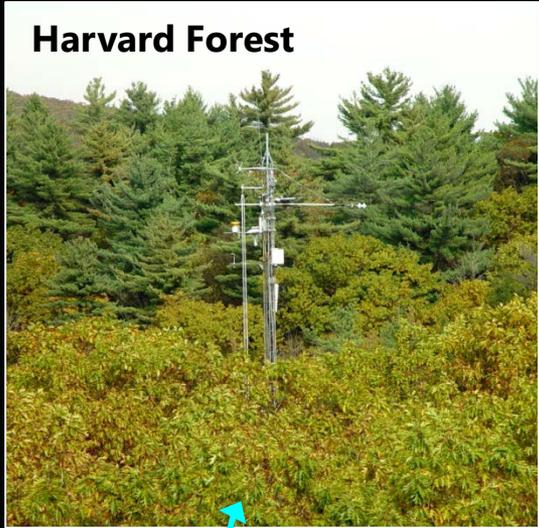


# Modeling of Carbon Dynamics of LCLUC

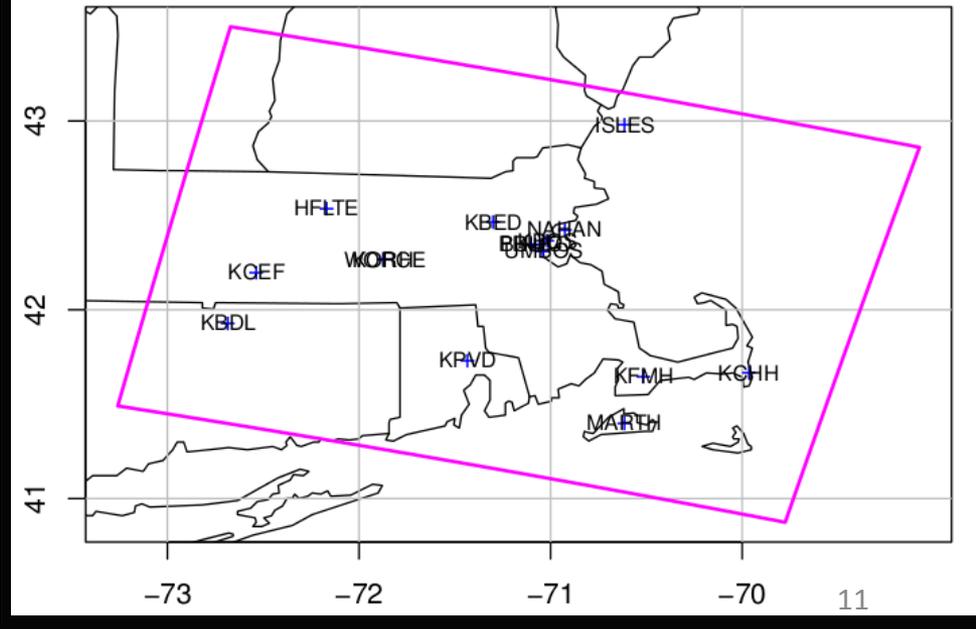
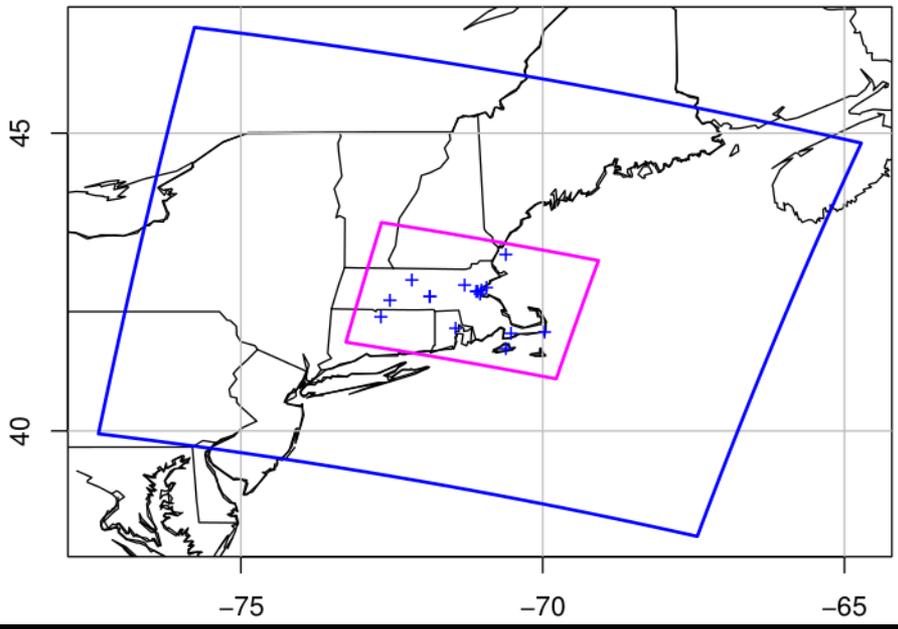
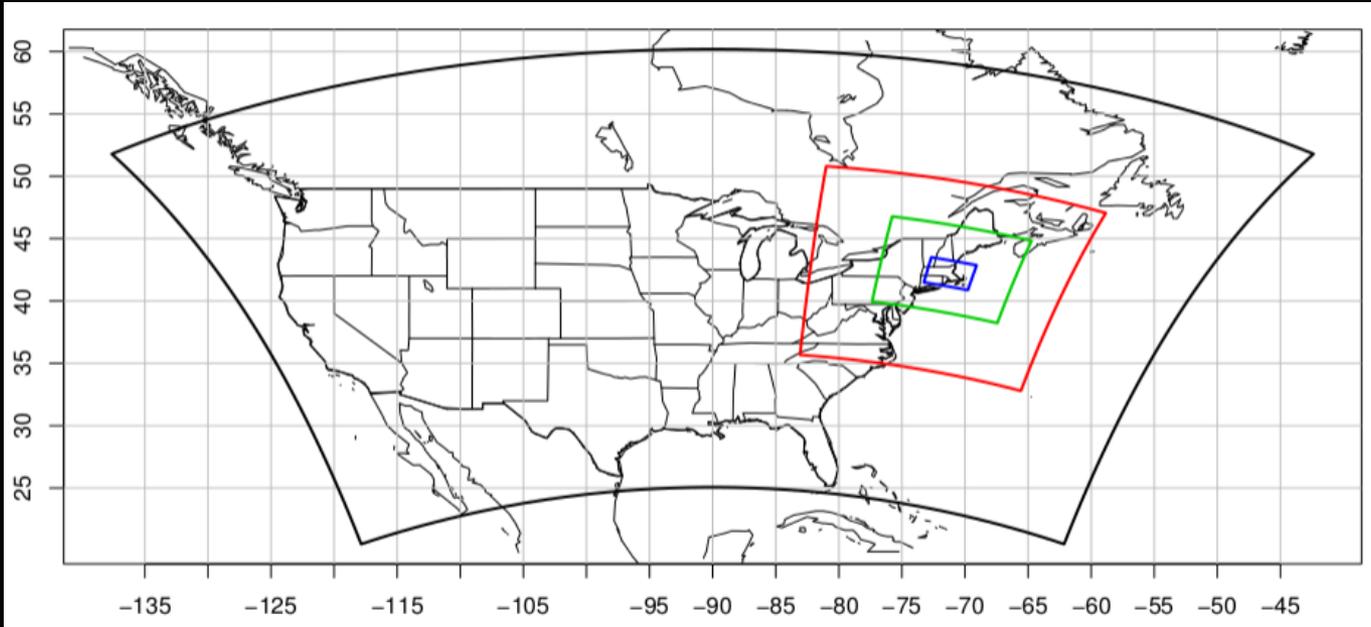


We are parameterizing a model for long-term carbon dynamics following land cover change wherein we track changes in carbon pools follow forest harvests and urban development. Model utilizes the Houghton bookkeeping framework, FIA data, and direct urban field observations.

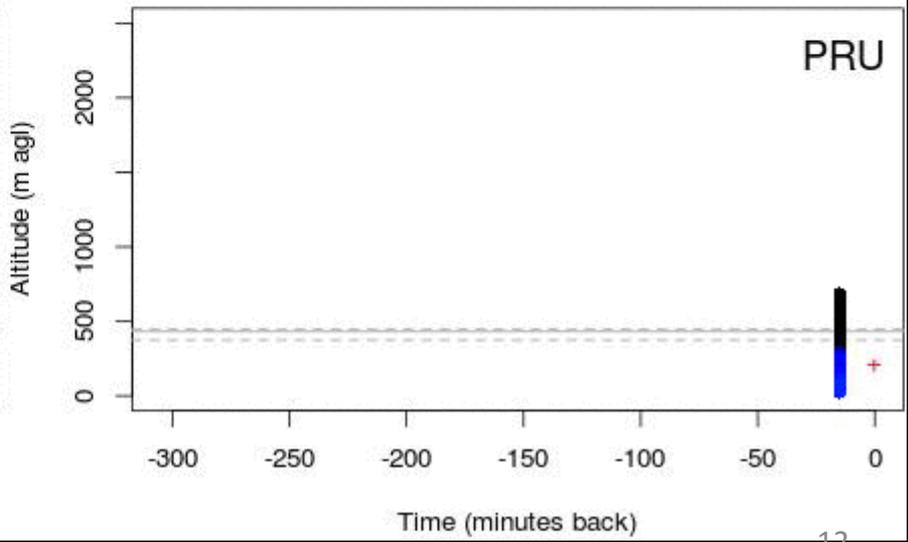
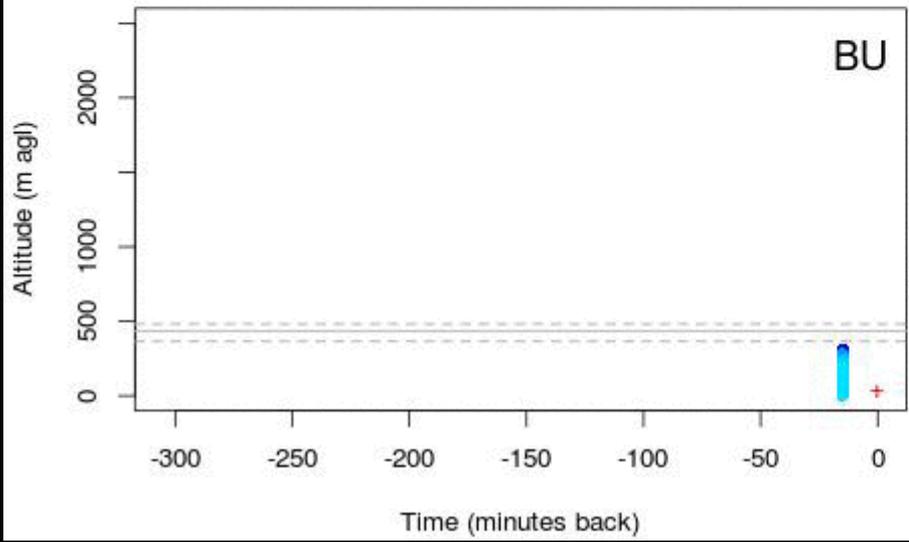
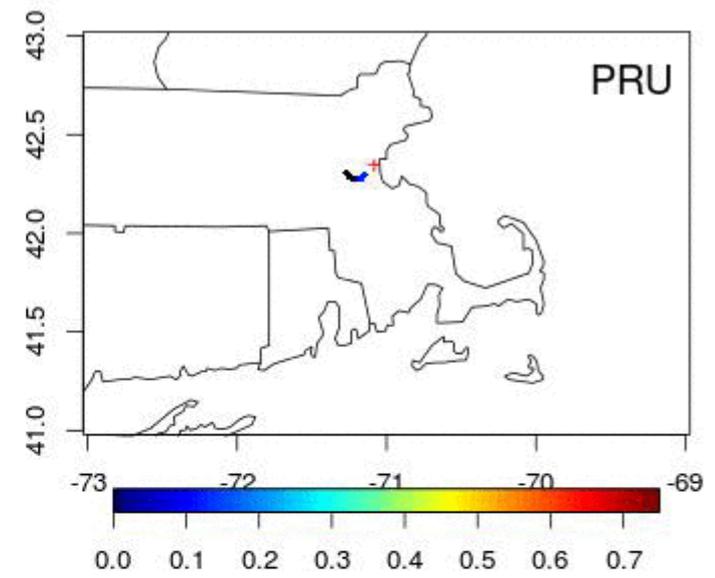
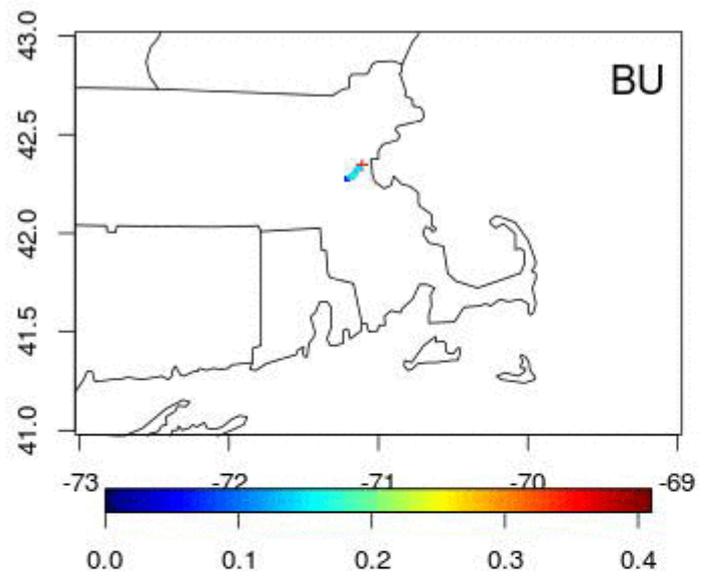
# Atmospheric Measurements



# Atmospheric Modeling



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## Summary

We are implementing an interdisciplinary measurement and modeling framework that combines explicit treatment of urban emission sources, urban ecology, atmospheric transport of GHGs, and land cover change dynamics in a comprehensive treatment of carbon flows in and around densely populated regions.

- Measurement systems in place
- Field measurements complete
- Remote sensing imagery processed
- Model parameterization and simulation in progress.
- Synthesis is in progress.



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