

# HERO: Urban Forestry Summer 2020

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Anna Massinger, Galen Oettel  
& William Sanders



George Perkins Marsh Institute



# Meet the Research Team

## Undergraduate Research Cohort:

Valeria Chavez, Alvaro Esparza, Anna Massinger, Galen Oettel & William Sanders

## Graduate Mentors:

Marc Healy & Nicholas Geron

## Directors:

John Rogan & Deborah Martin



# Human-Environment Regional Observatory (HERO)

## Summer 2020

- Urban Forestry in the Hadwen Arboretum
- HOBO Sensor Analysis in Gateway Cities



Human-Environment  
Regional Observatory



2005



1999



2012

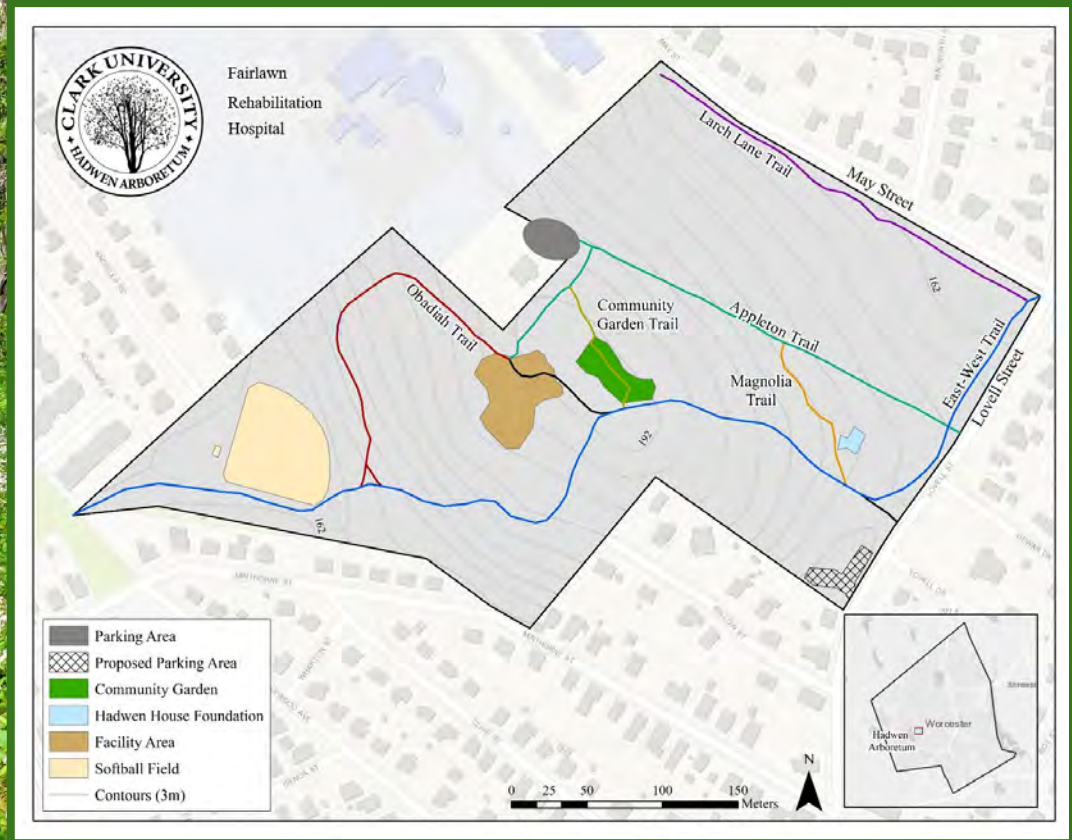


2020





# Urban Forestry in the Hadwen Arboretum





May 28th: removing Japanese knotweed





June 2nd:  
Clearing and mulching  
the Magnolia Trail







June 12th - 16th:  
Preparing for tree planting









June 26th - July 2nd:  
Watering and measuring  
newly planted trees





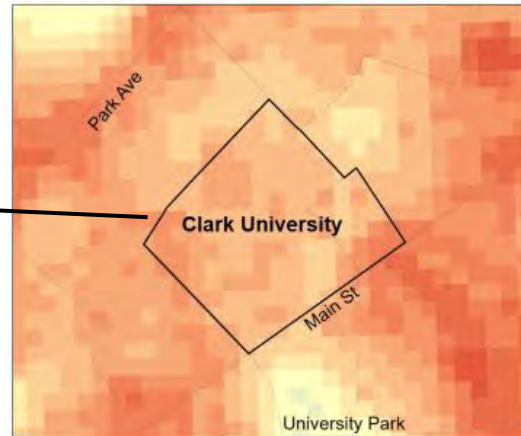
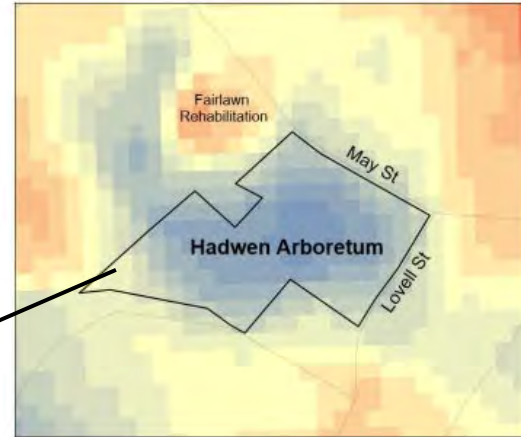
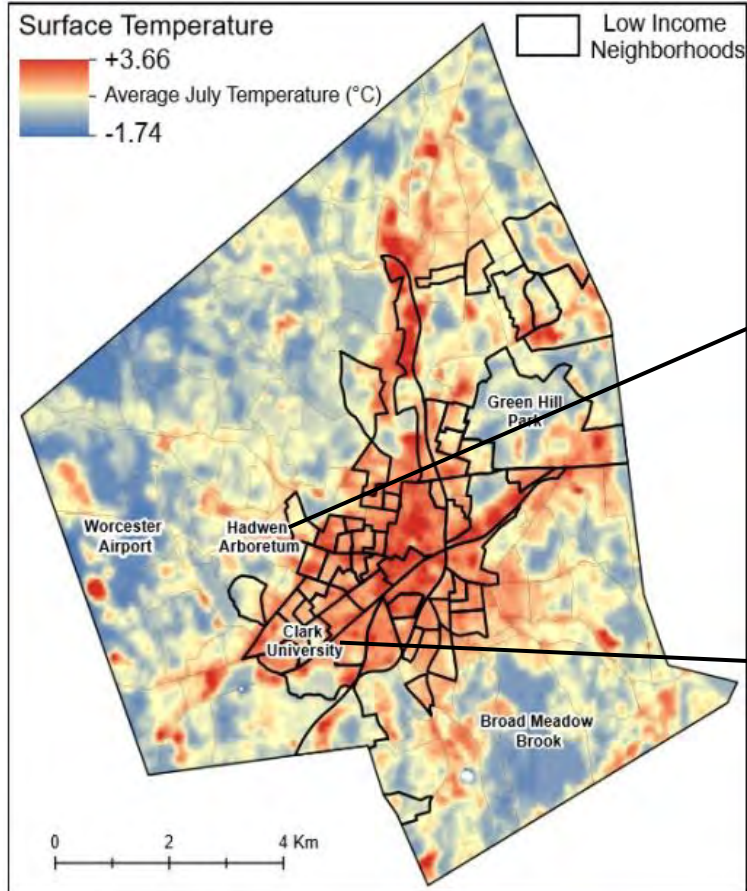
# Life-History Information of Planted Trees

Count	Vigor	Species	Tree ID #
5	1	Serviceberry	1006, 1009, 1010, 1012, 1014
2	1	Dogwood	1002, 1005
2	1	Eastern redbud	1004, 1007
1	2	American beech	1001
1	1	American sweetgum	1008
1	1	Blue spruce	<b>1000</b>
1	2	American Hornbeam	1013
1	1	Honey locust	1003
1	1	Kentucky coffeetree	1011





# Land-Surface Temperature Differences





# Arboretum Takeaways

- Community benefits
  - Accessibility: restoring worn down trails and overgrown vistas
  - Potential cooling of surrounding areas
- Challenges
  - Choosing planting locations (right tree, right place)
  - Tree care during heat waves
  - Persistence of invasive species
- Plan for the future
  - Community tours
  - Interactive events to foster local involvement
  - Continued maintenance





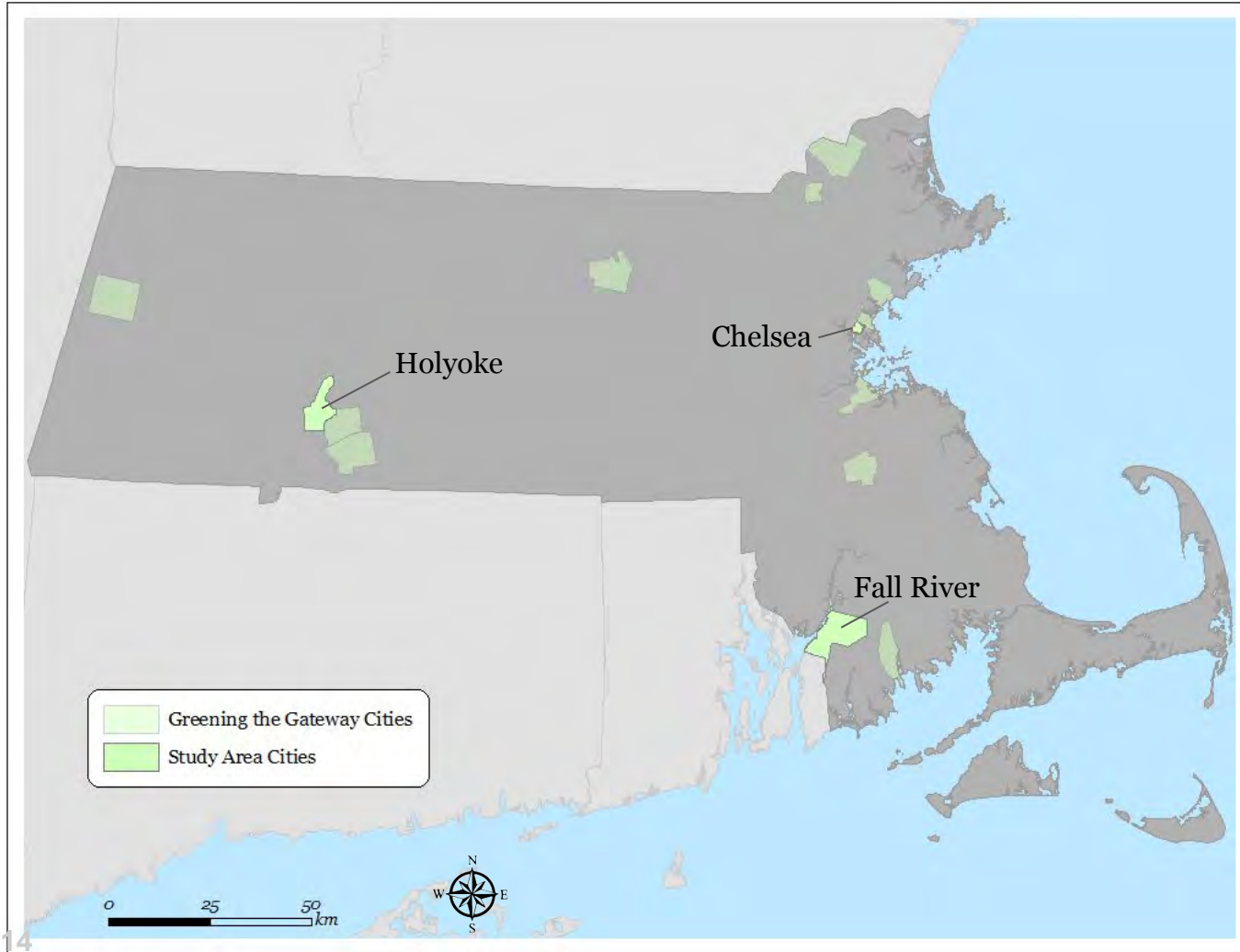
# HOBO Temperature Sensor Analysis

(Honest Observer By Onset)





# Study Area



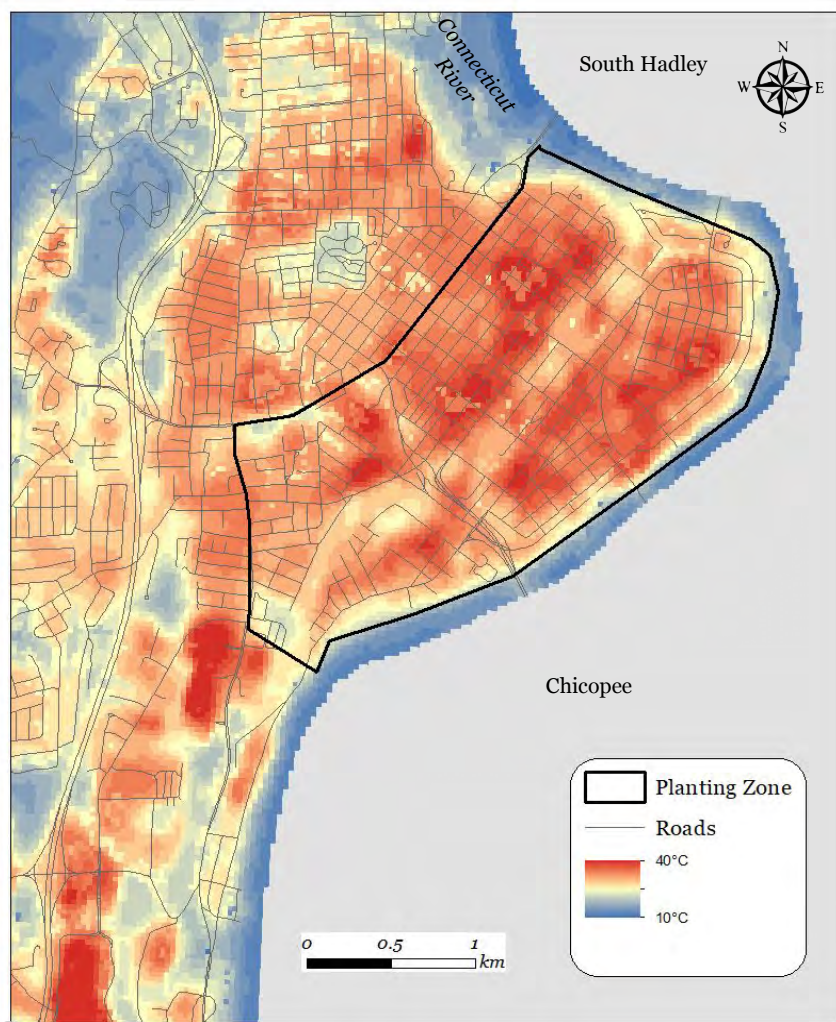


# Demographic Information

	Holyoke	Fall River	Chelsea	Massachusetts
<b>Population</b>	40,117	89,541	39,852	6,892,503
<b>Median Household Income</b>	\$37,372	\$41,585	\$53,280	\$79,054
<b>Families Below Poverty Line (%)</b>	29.7%	19.4%	18.8%	10.4%
<b>Population Demographic Distribution</b>	White - 41.9% Hispanic/Latinx - 52.1% Black/African American - 4.5% Asian - 1.3%	White - 76.9% Hispanic/Latinx - 10.4% Black/African American - 5.7% Asian - 2.3%	White - 21.9% Hispanic/Latinx - 66.9% Black/African American - 6.9% Asian - 3.2%	White - 71.4% Hispanic/Latinx - 12.3% Black/African American - 8.9% Asian - 7.1% Indigenous - 0.5%
<b>Educational Attainment of those age 25 years+ - B.A. or Higher</b>	23.4%	15.1%	17.5%	42.9%
<b>Foreign-Born Persons (%)</b>	5.8%	20.8%	45.5%	16.5%



# Holyoke



**Total Population**

40,117

**Total Area**

55.17  
Sq km

**% of Impervious  
Cover**

62%

**% of Green Cover  
(Tree canopy  
& grass)**

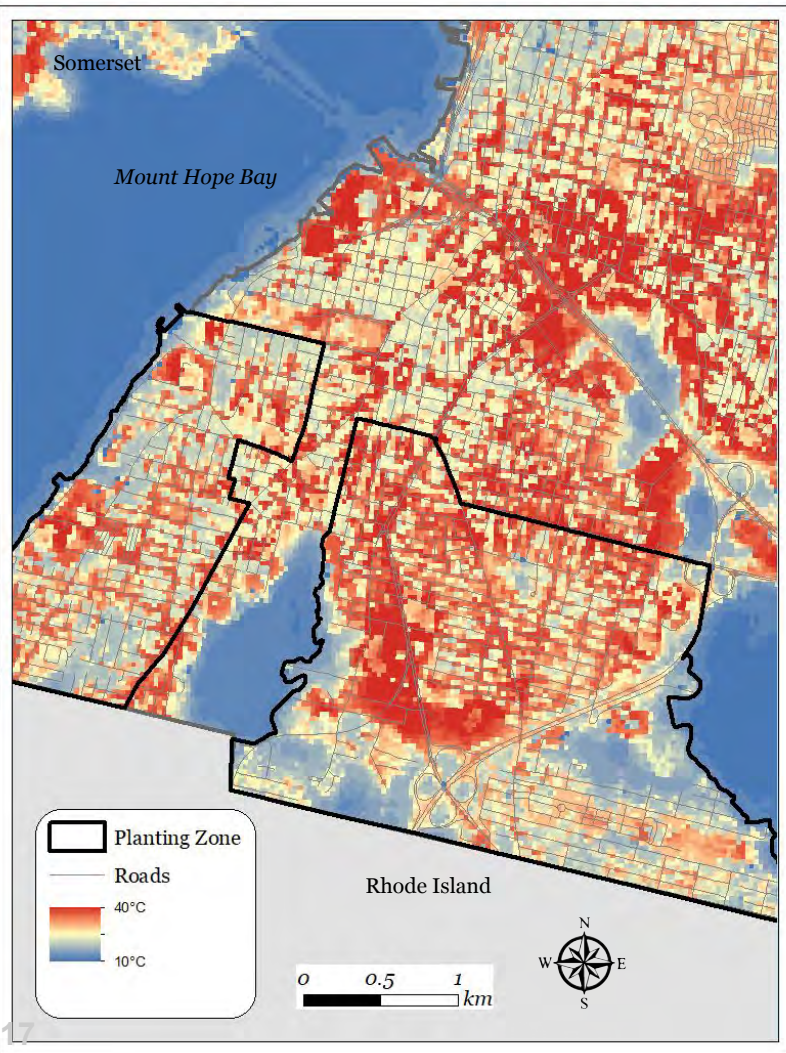
38%

**Number of DCR trees  
planted**

1,819







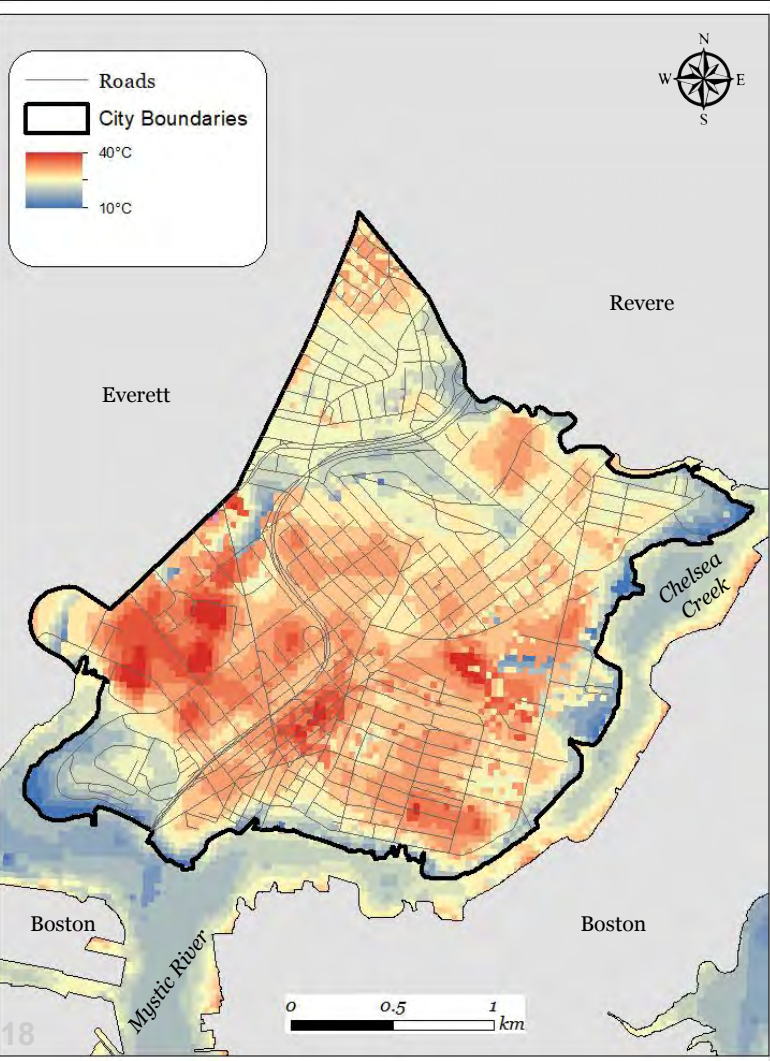
# Fall River

<b>Total Population</b>	89,541
<b>Total Area</b>	104.38 Sq km
<b>% of Impervious Cover</b>	44.7%
<b>% of Green Cover (Tree canopy &amp; grass)</b>	55.3%
<b>Number of DCR trees planted</b>	2706



# Chelsea

Total Population	39,852
Total Area	6.47 Sq km
% of Impervious Cover	75%
% Green Cover (Tree canopy & grass)	25%
Number of DCR trees planted	2159





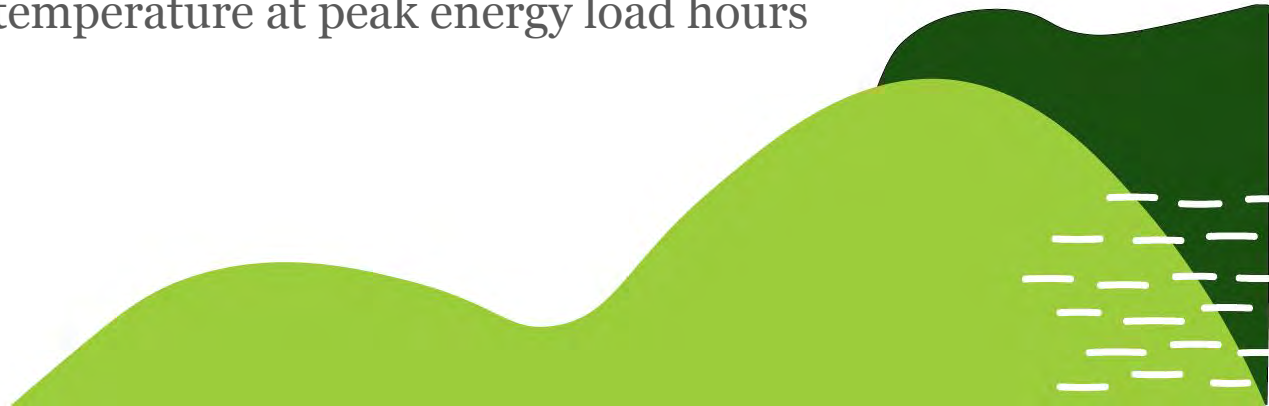
# Research Questions for HOB0 Sensor Analysis

1. What are the daily maximum temperatures and temperatures during peak energy load hours (4pm - 7pm) in Gateway Cities?
2. How do the trees planted by the Greening the Gateway Cities Program impact temperatures during peak energy load hours?



# Objectives for HOB0 Sensor Analysis

1. **Evaluate daily maximum temperatures and temperature during peak energy load hours (4pm - 7pm)**
  - Determine percent canopy cover (PCC) and percent impervious cover (PIC) for land use
  - Find which land-use and land cover types have the highest vs. lowest daily max temperature
  - Analyze land use temperature at peak energy load hours





# Objectives for HOB0 Sensor Analysis

## 2. Determine the effect of trees planted by DCR on residential temperature

- Model effects of PCC, PIC, number of trees planted on temperature, and distance to water
- Compare temperatures at peak energy load hours
- Compare residential temperatures at peak energy load hours between 2016 and 2019



# Hypotheses

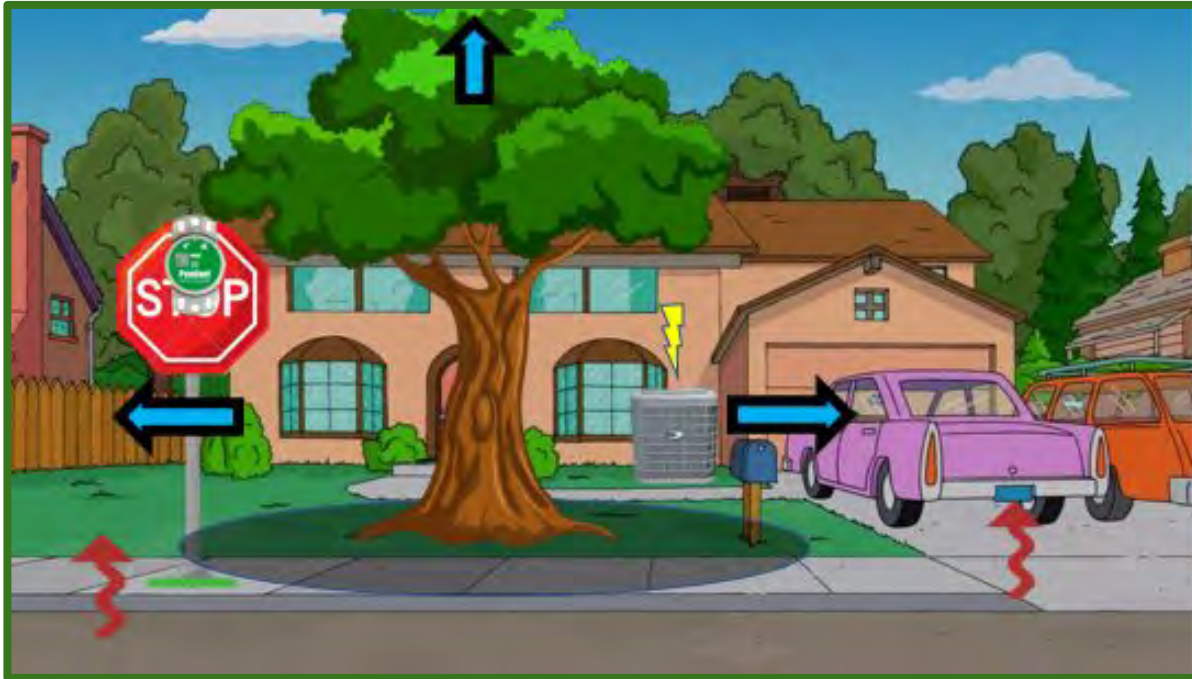
HOBO sensors in areas with more trees planted will record lower max temperatures and more rapid cooling during peak energy hours than sensors in areas with lower canopy cover.





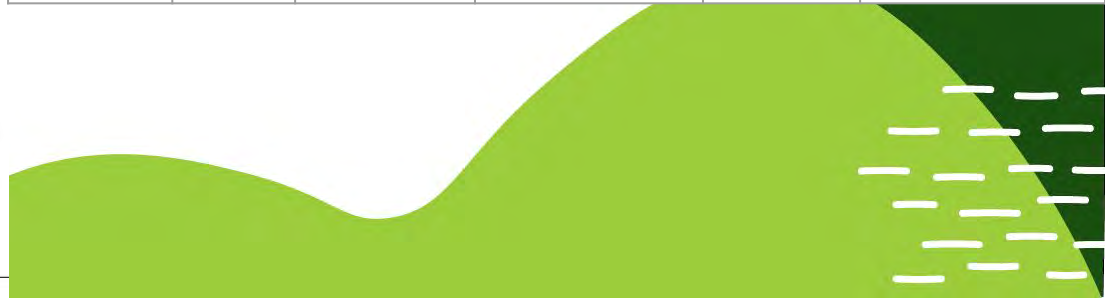
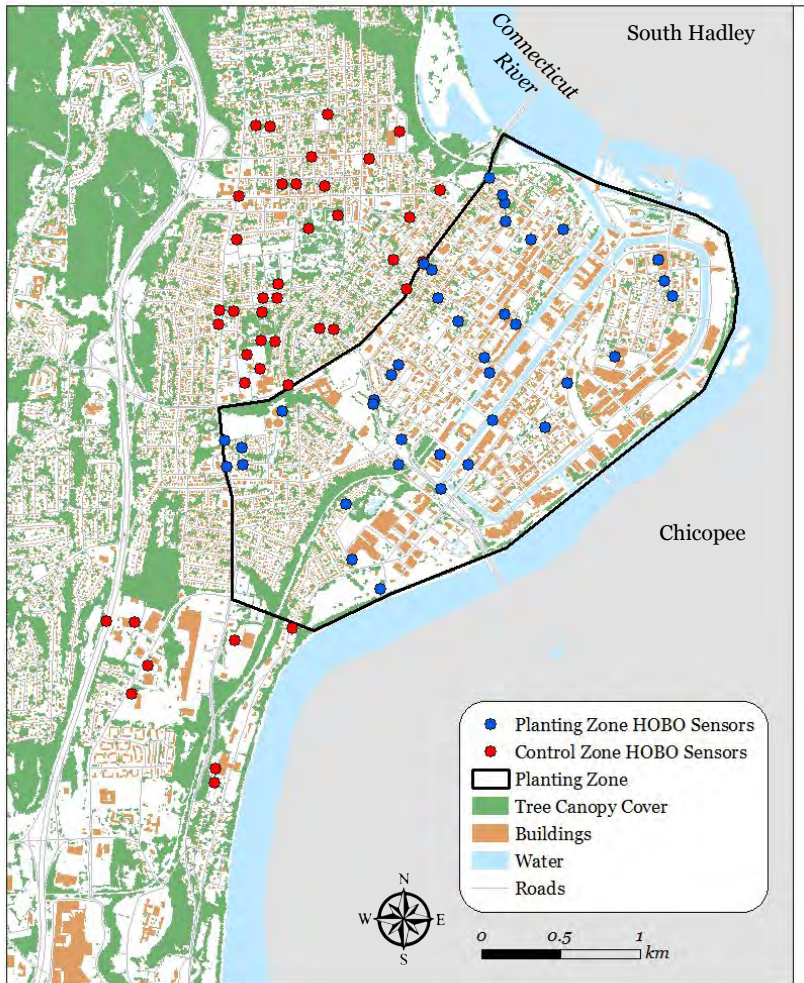
# Hypotheses

HOBO sensors in areas with more trees planted will record lower max temperatures and more rapid cooling during peak energy hours than sensors in areas with lower canopy cover.



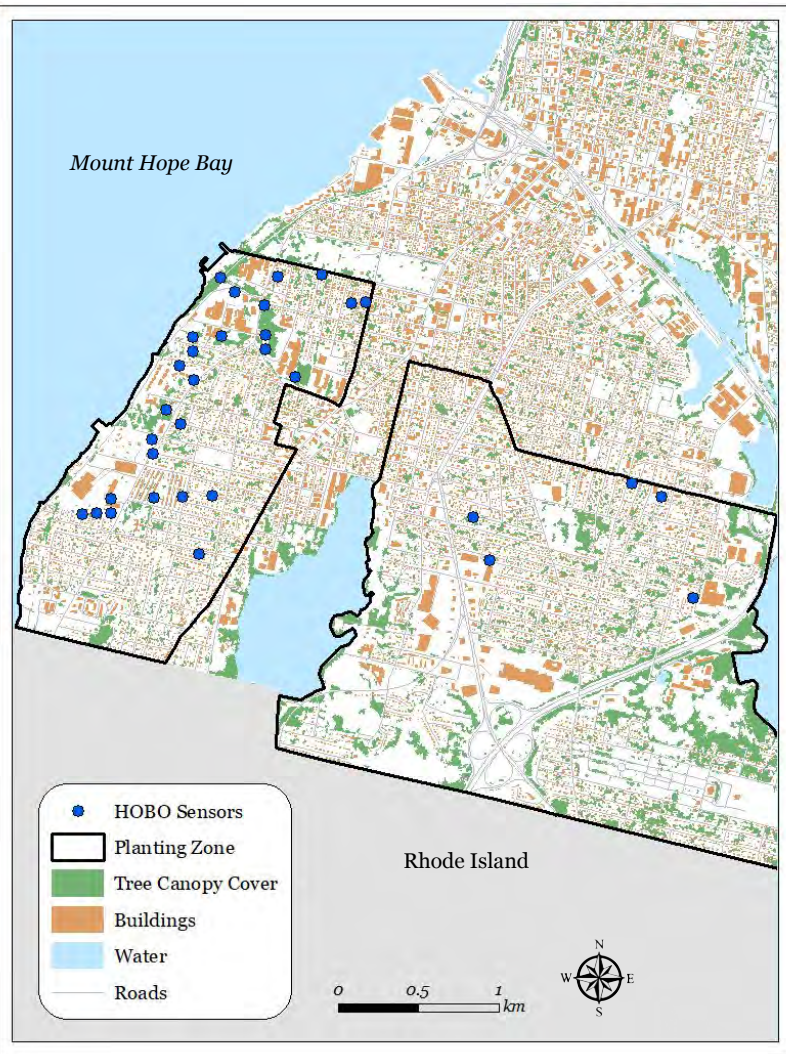
# Holyoke HOB0 Sensor Data

Sensor Type	Total	Used in Analysis	Active Through 2016 - 2019	Active in 2017	Active Only First & Last Year (2016 & 2019)
Planting Zone	45	38	27	37	26
Control Zone	82	37	0	33	5
Total	127	75	27	70	29



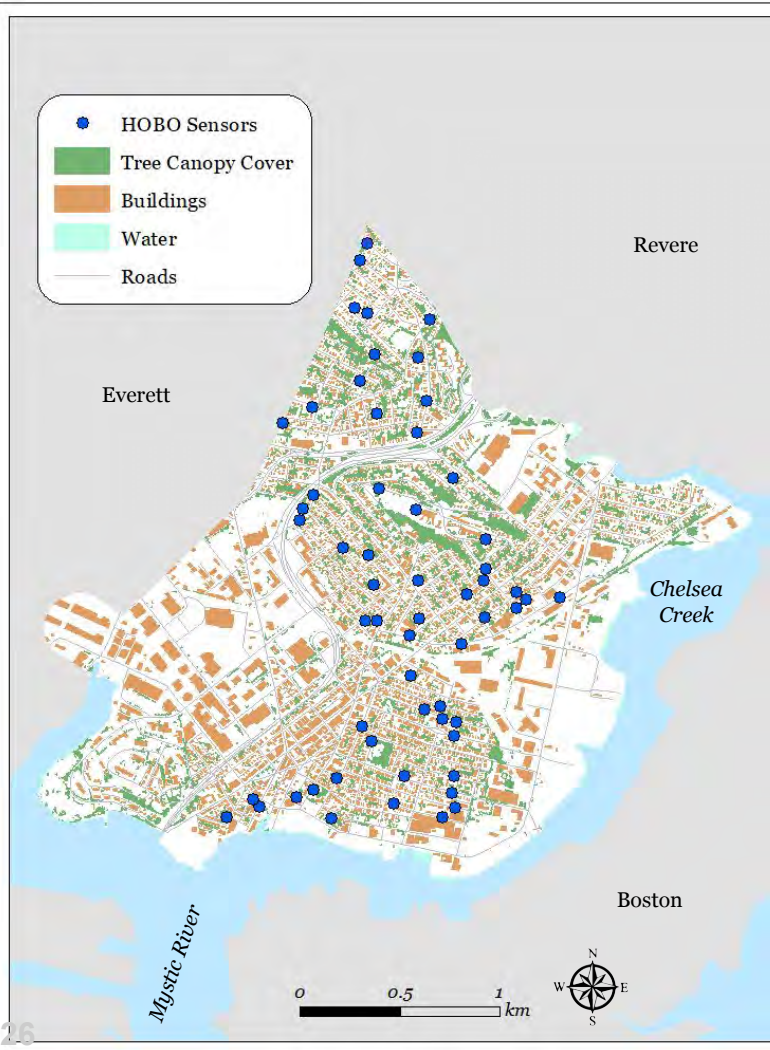


# Fall River HOBO Sensor Data



Sensor Type	Total	Used in Analysis	Active Through 2016 - 2019	Active in 2017	Active Through 2016 - 2018
Planting Zone	72	32	1	31	11

# Chelsea HOBOSensor Data

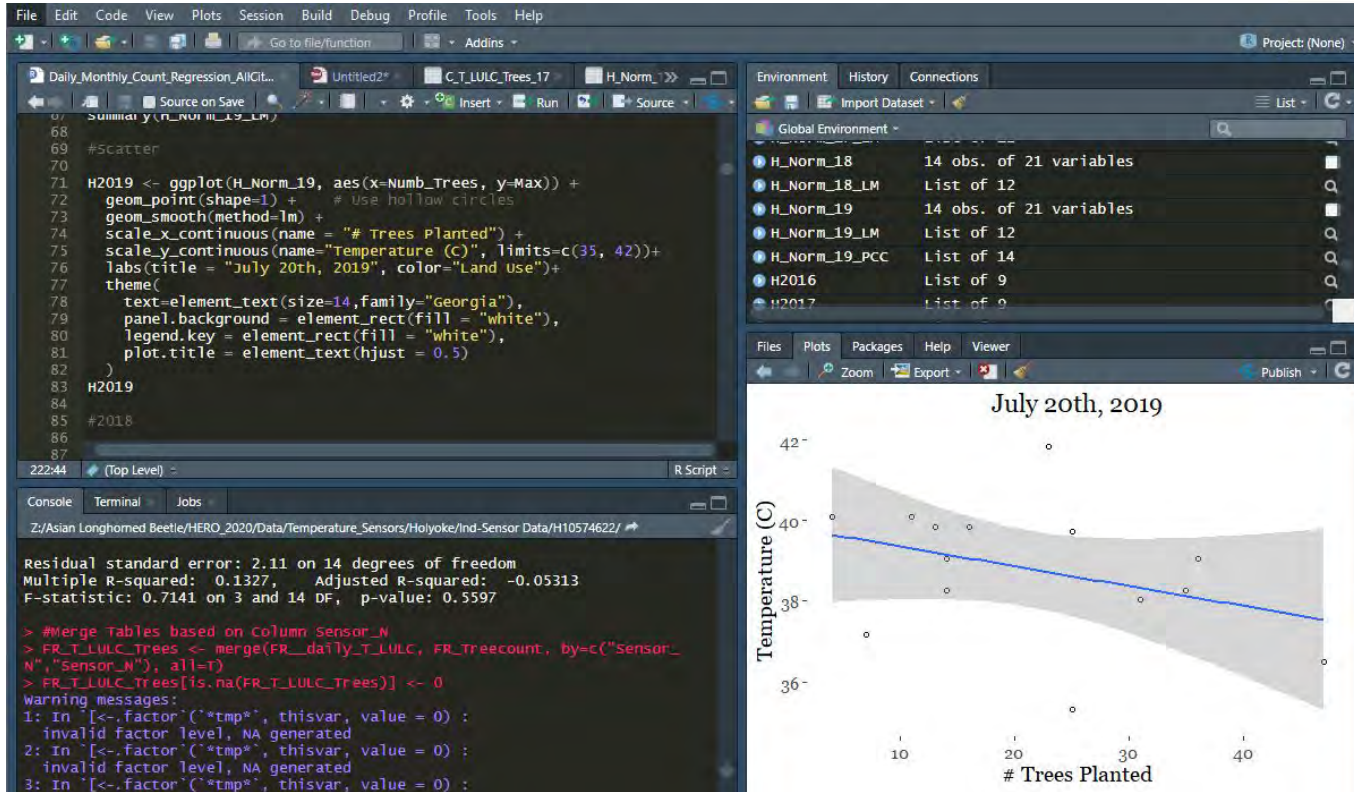


Sensor Type	Total	Used in Analysis	Active Through 2016 - 2019	Active in 2017	Active Only First & Last Year (2015 & 2019)
Planting Zone	63	54	22	42	33



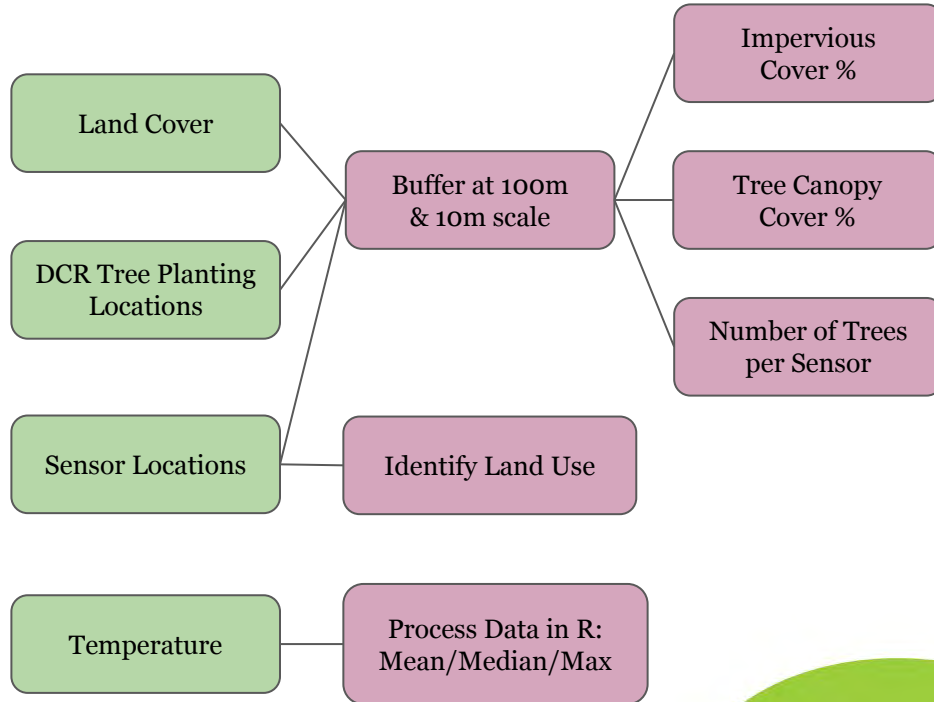


# Approach: Methods of Analysis

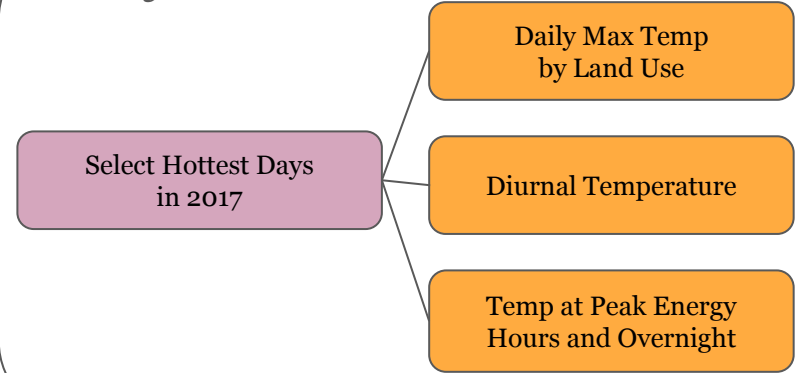


# Approach

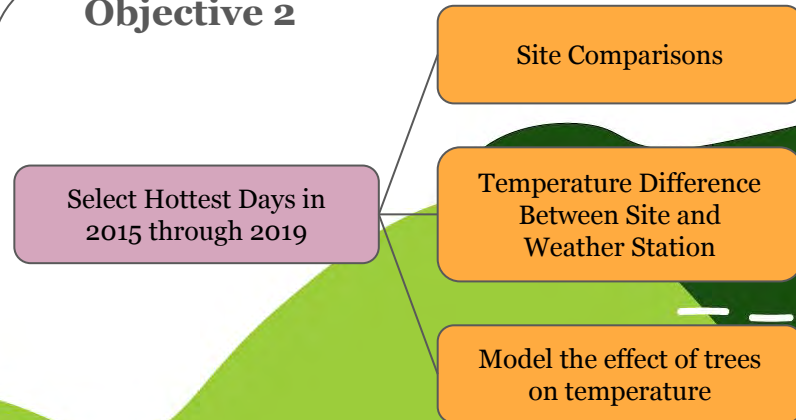
## Data Processing



## Objective 1



## Objective 2





# Land Use Classification



**Commercial  
(COMM)**



**Institutional  
(INST)**



**Maintained  
Park (MP)**



**Multi-Family  
Residential  
(MFR)**



**Single Family  
Residential  
(SFR)**



**Vacant (V)**

We define land use as the characterization of the land based on what is built on it and what can be used there.

# Land Cover Classification



**Impervious**



**Urban Forest**

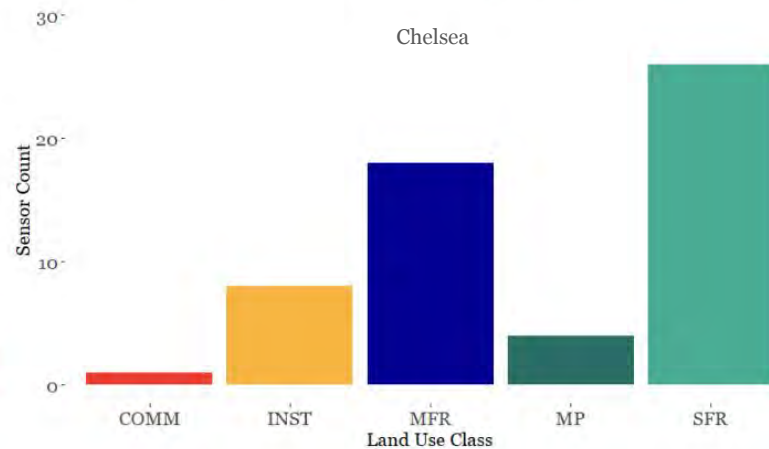
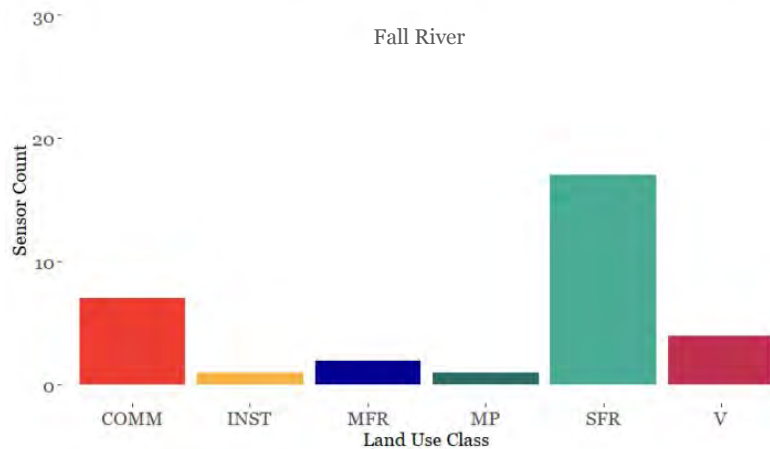
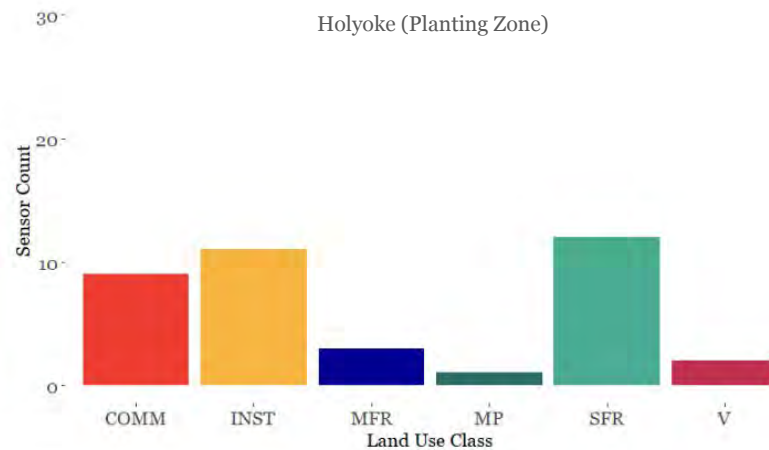
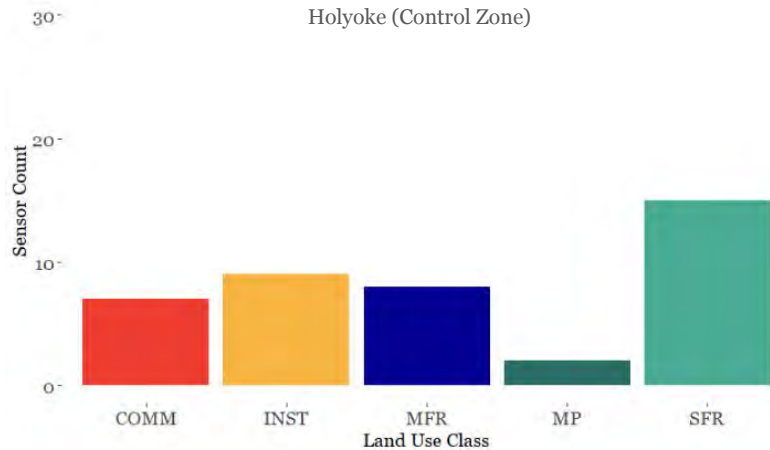


**Developed Open Space**

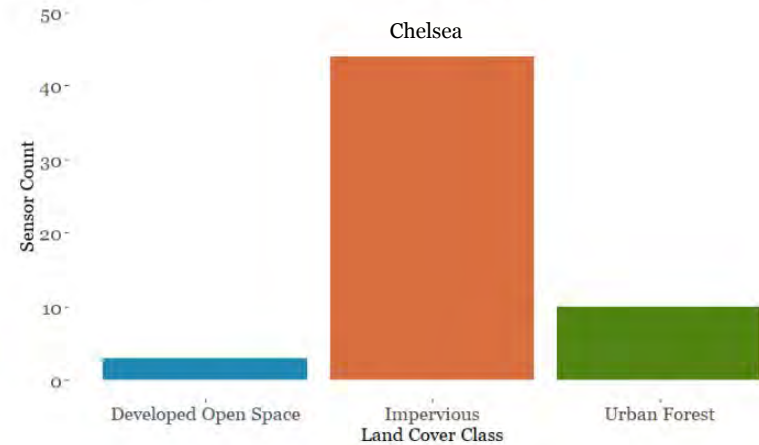
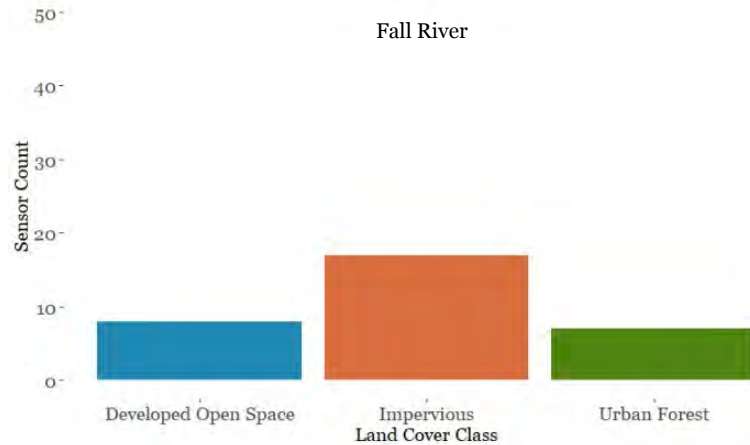
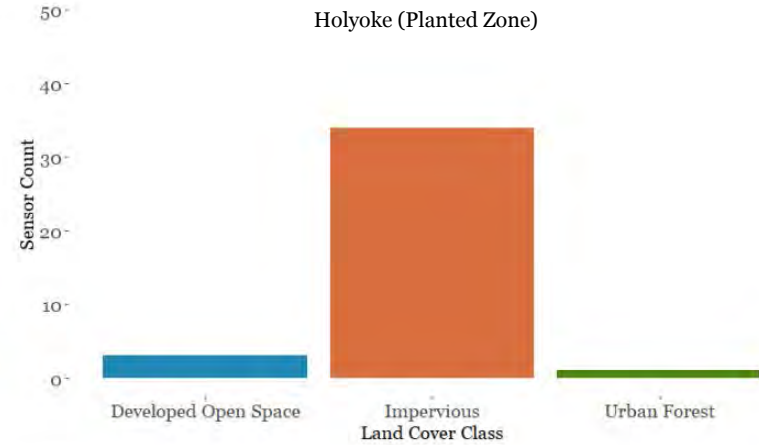
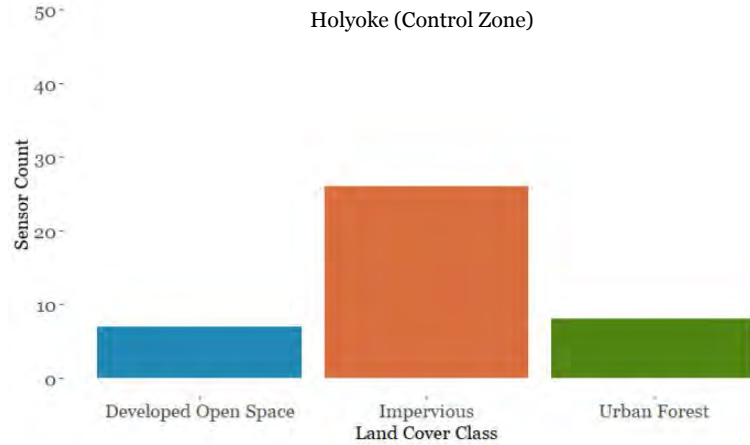
The characterization of the land based on the physical land type.



# Sensor Distribution by Land Use



# Sensor Distribution by Land Cover



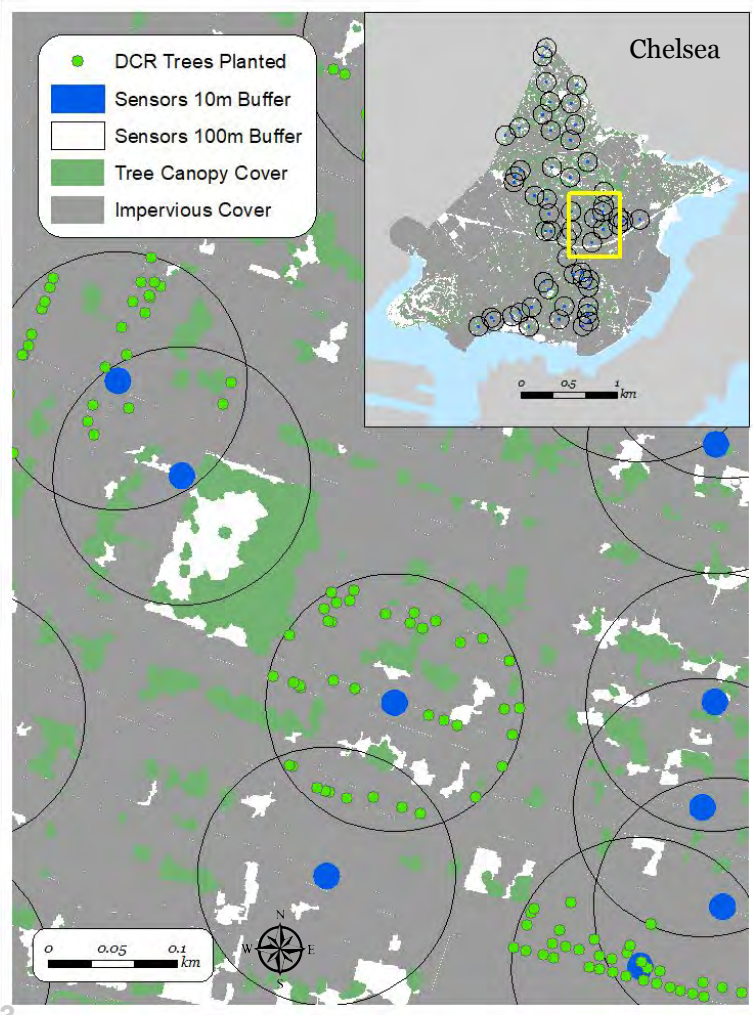


# HOBO Sensor Buffers at 10m & 100m

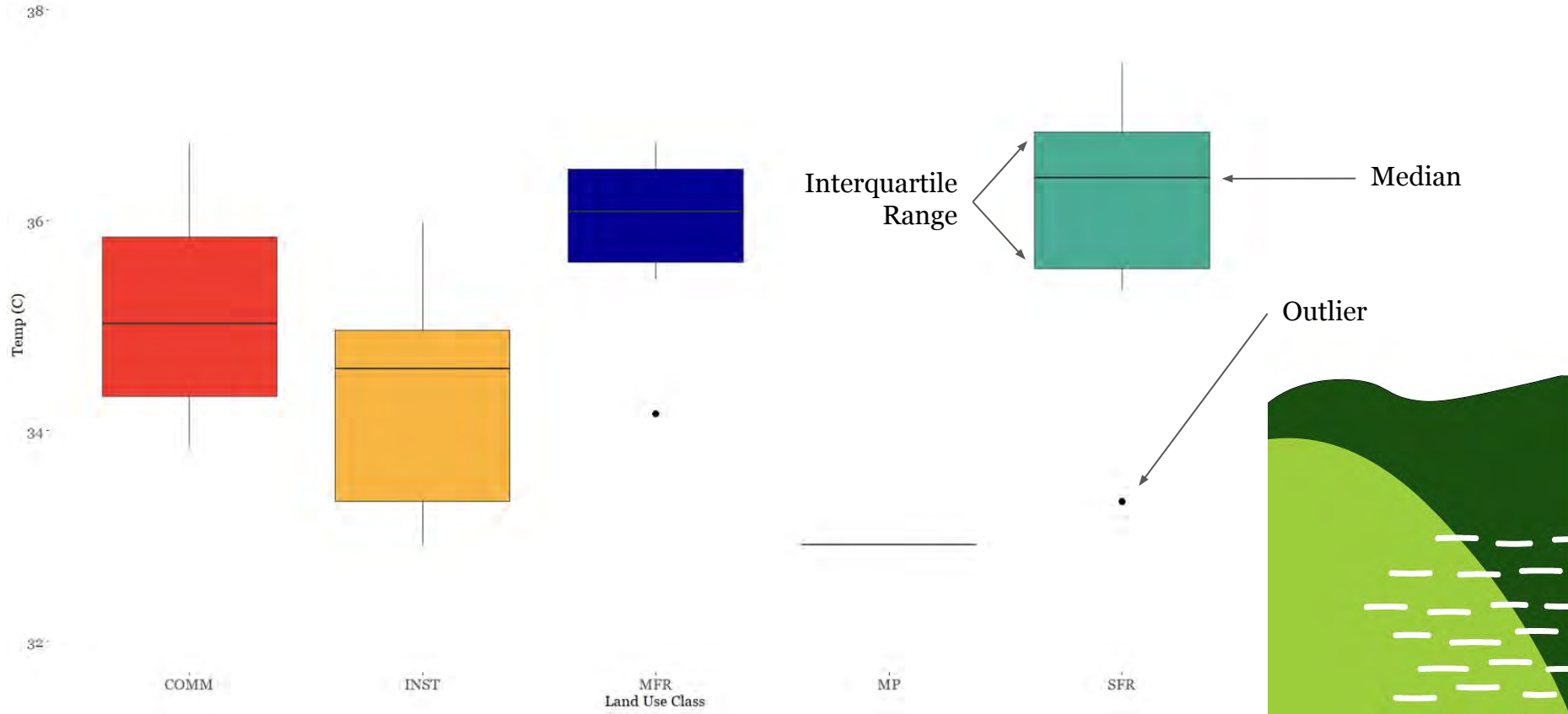
**10m radius** shows land cover composition at the local scale.

**100m radius** shows land cover composition and number of DCR trees planted at the neighborhood scale

(Ziter et al., 2019)



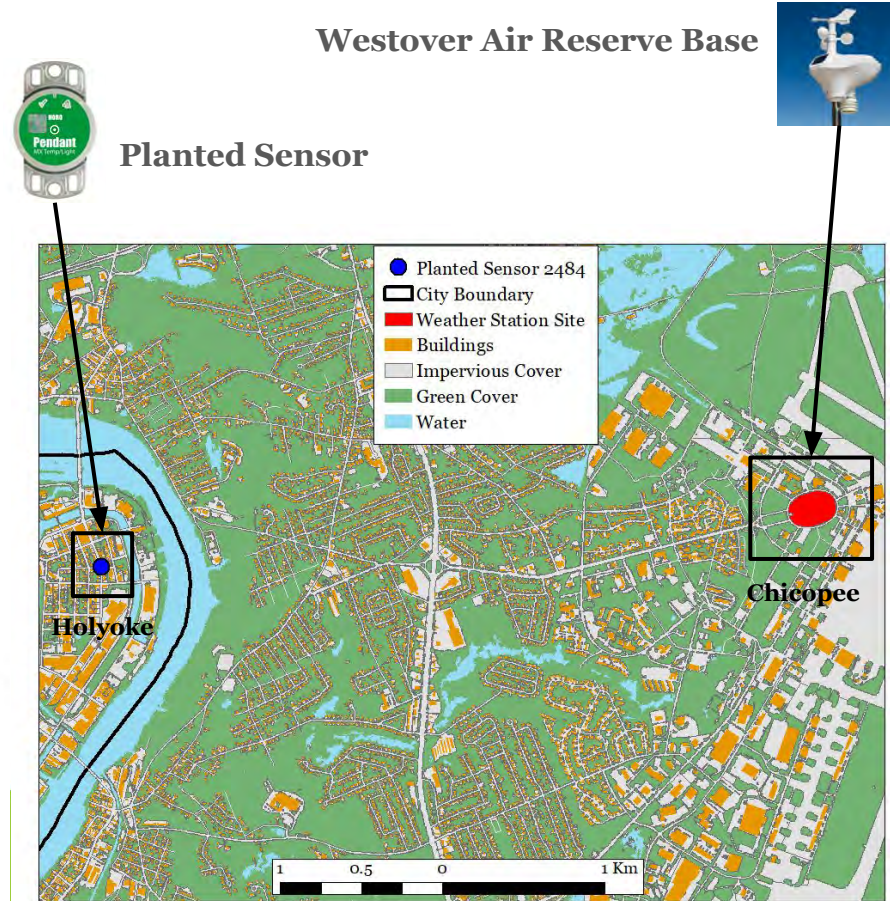
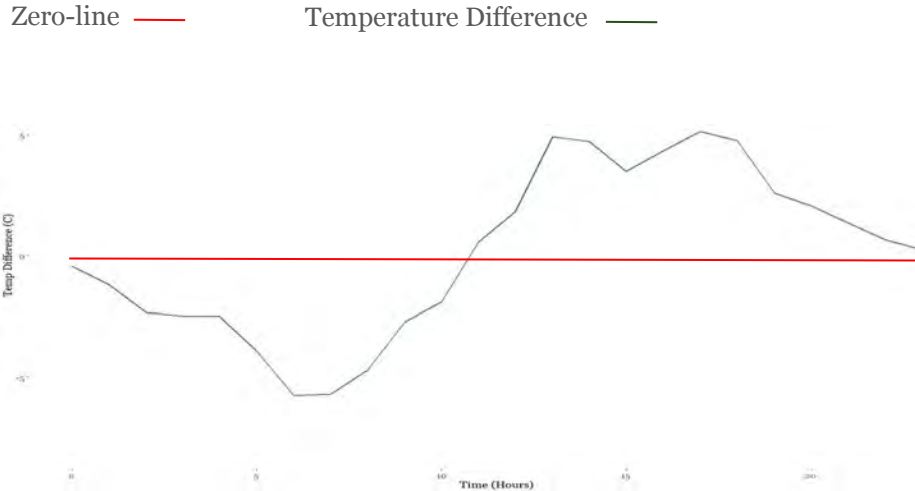
# Creating Boxplots





# HOBO Sensors and Local Weather Stations

	Average Difference (2016)
Holyoke	0.20 °C
Fall River	-0.10 °C
Chelsea	1.95 °C



# Model Building

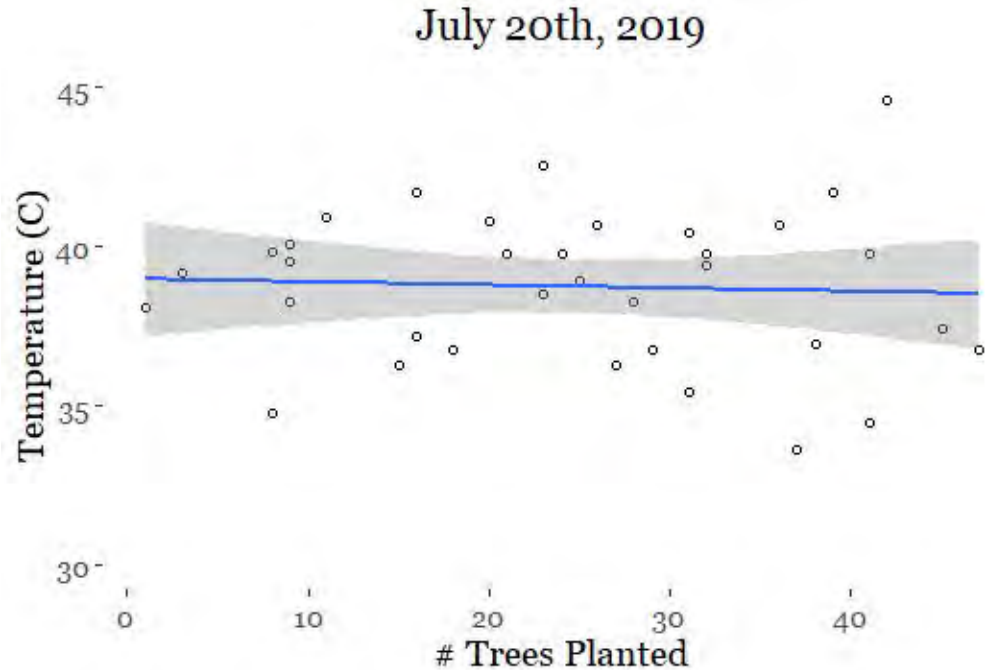
## Statistical Analysis

- What is significance?
- What is an  $R^2$  value?

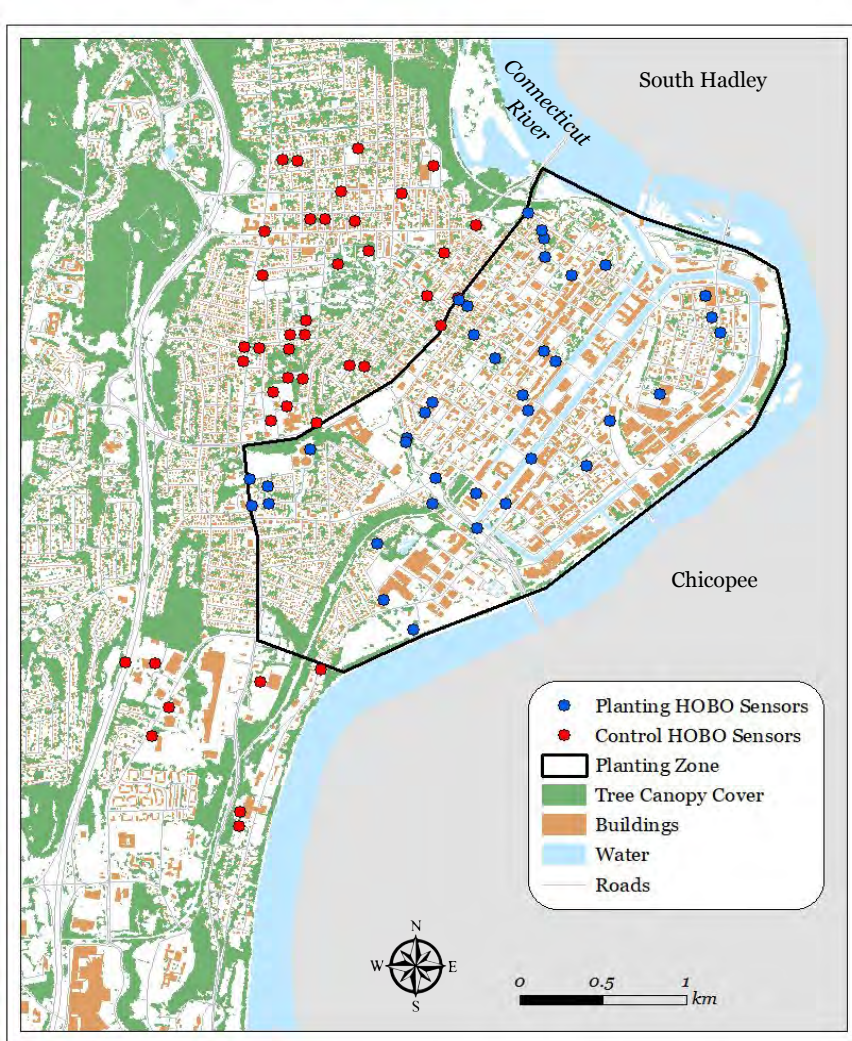
## Regressions

- Select for Residential (MFR & SFR)

Independent Variable	Dependent Variable
<ul style="list-style-type: none"><li>• Canopy Cover %</li><li>• Impervious Cover %</li><li>• # of Trees Planted</li></ul>	<ul style="list-style-type: none"><li>• Maximum Temperature</li></ul>







# Holyoke

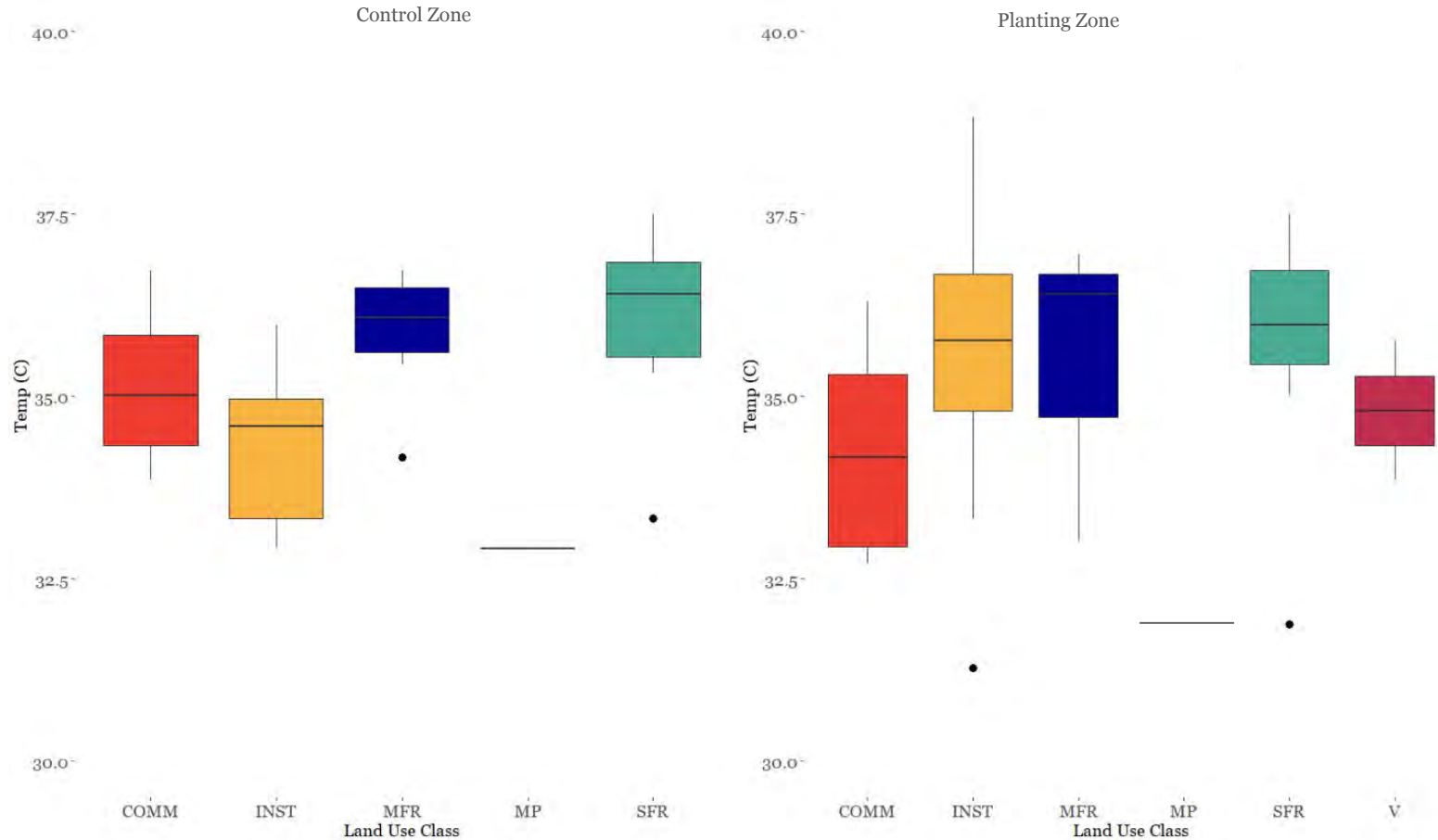
## Control & Planting Zones

# Objective 1:

Evaluate daily maximum temperatures and  
temperature during peak energy load  
hours (4pm - 7pm)

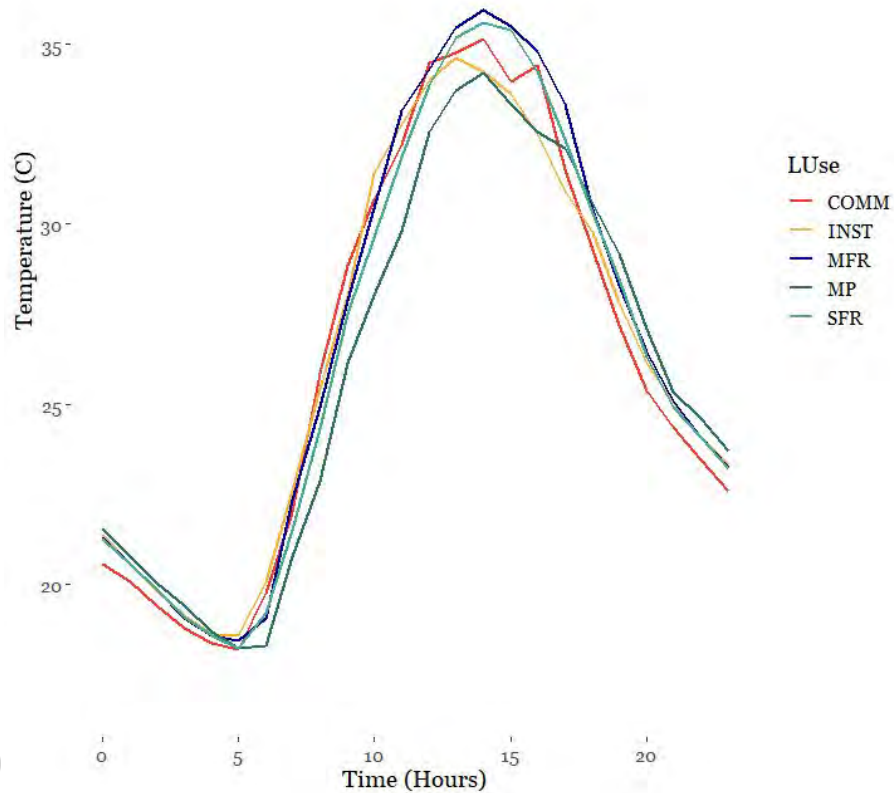


# Maximum Temperature on August 22nd, 2017

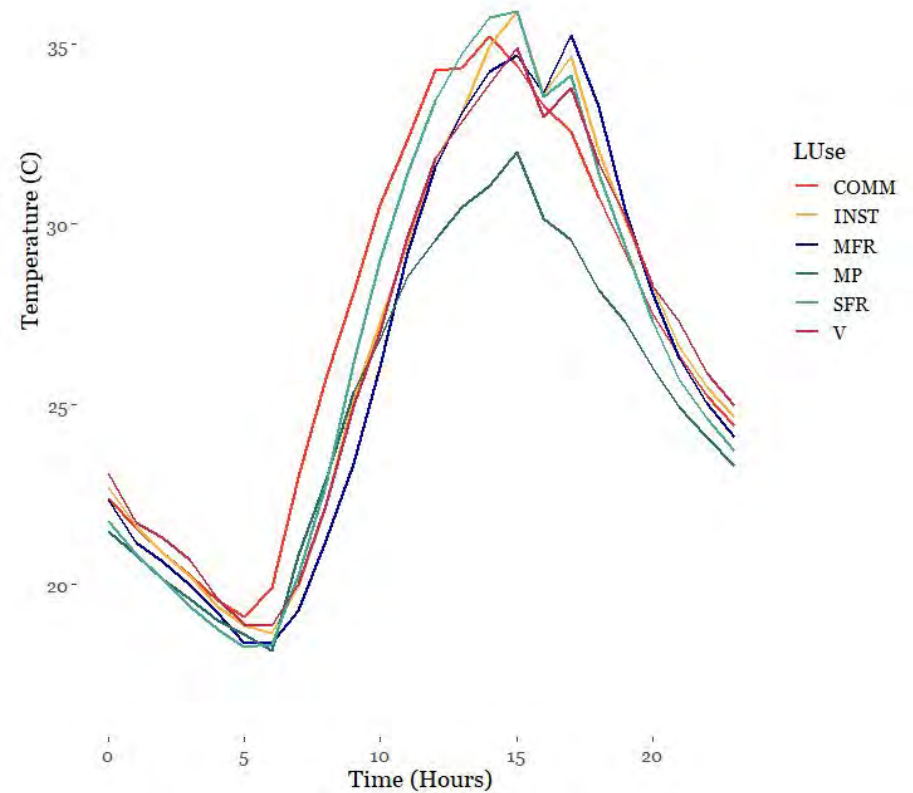


# Diurnal Temperature on August 22nd, 2017

Control Zone



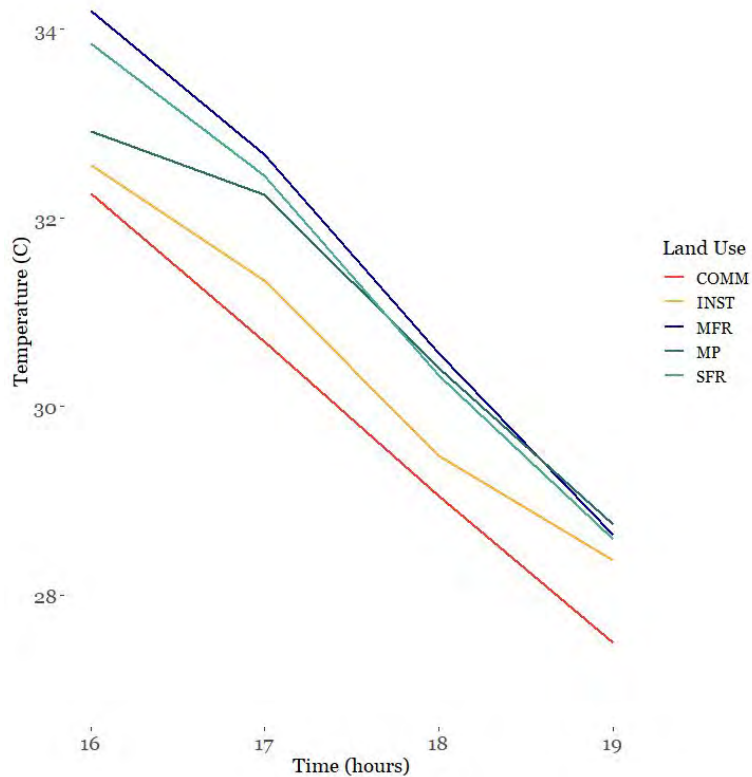
Planting Zone



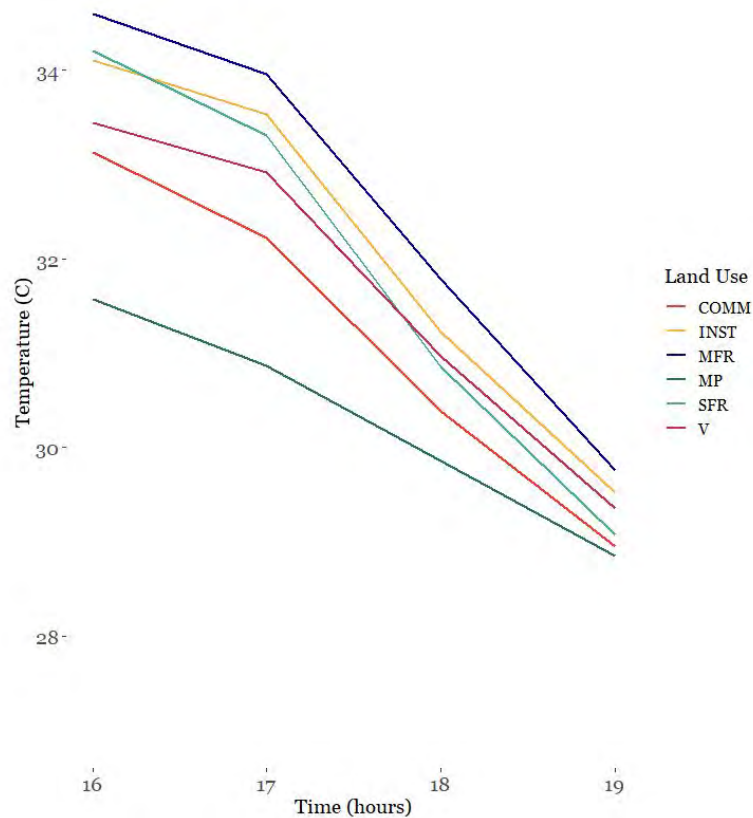


# Temperature During Peak Load Hours on August 22nd, 2017

Peak Load Hours (Control Zone)

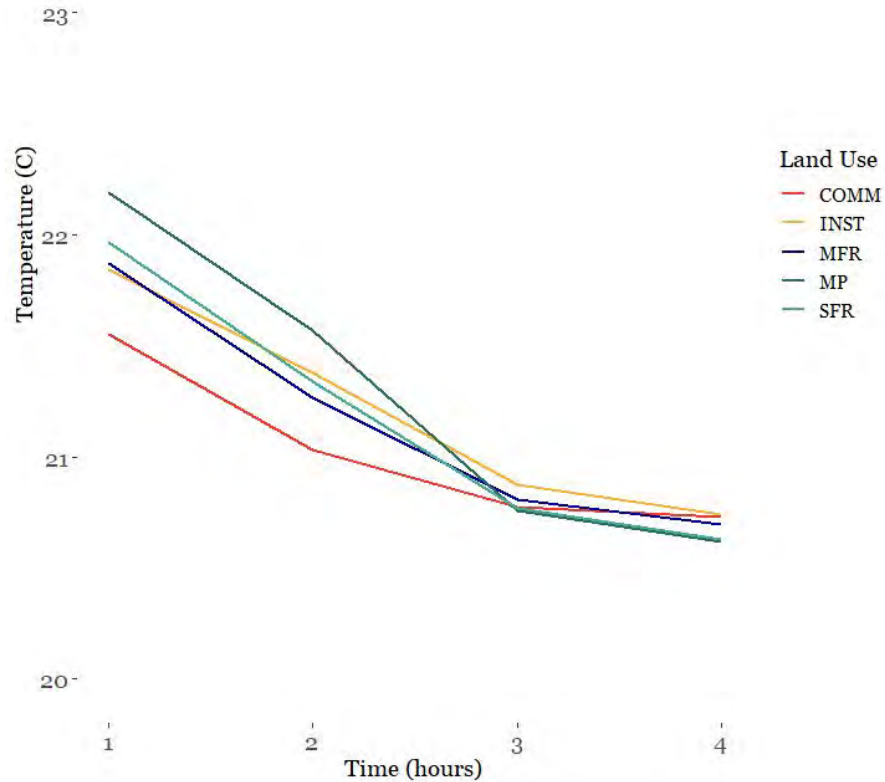


Peak Load Hours (Planting Zone)

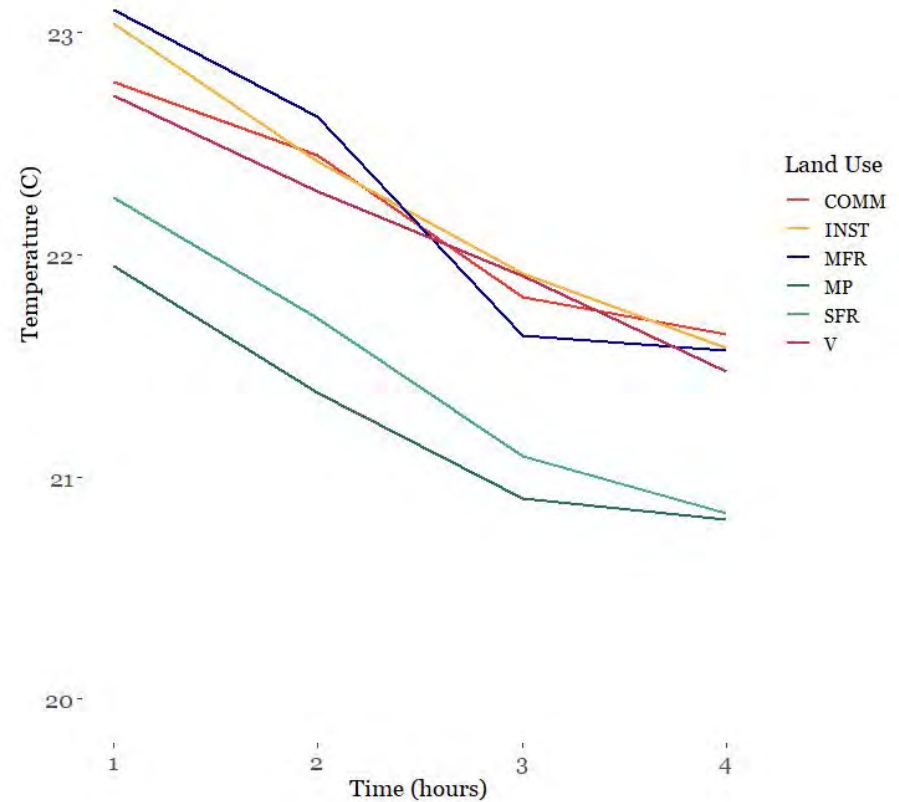


# Temperature During Overnight Hours on August 22nd, 2017

Overnight Hours (Control Zone)



Overnight Hours (Planting Zone)



## Objective 2:

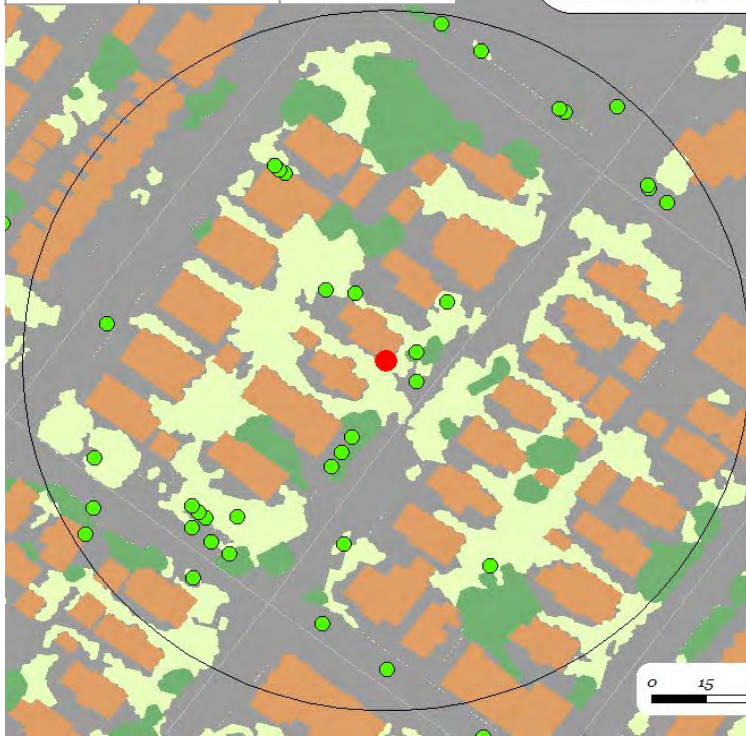
Determine the effect of trees planted by  
DCR on temperature in residential areas



# Single Family Residential Sensors

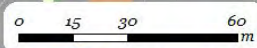
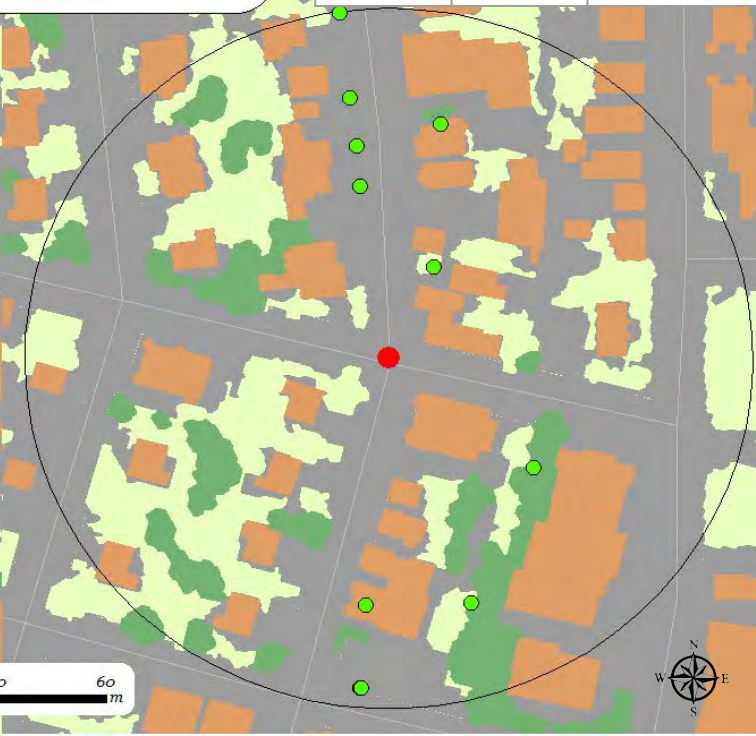
Site with More Planting

Trees Planted	Canopy Cover	Impervious Cover
35	8.8%	70.1%

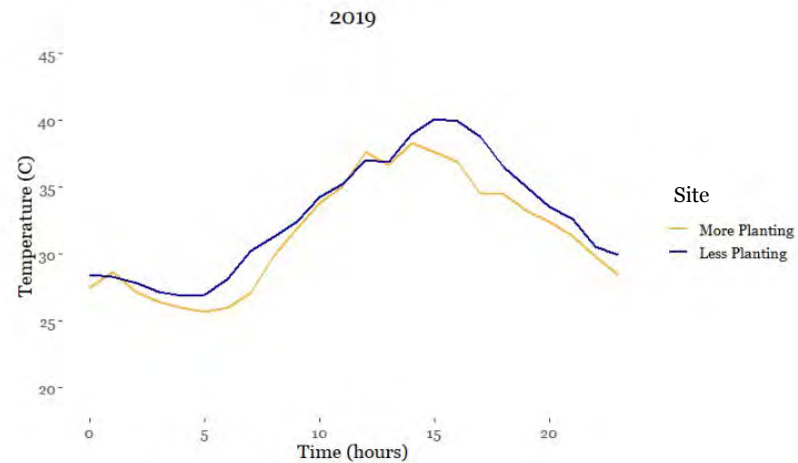
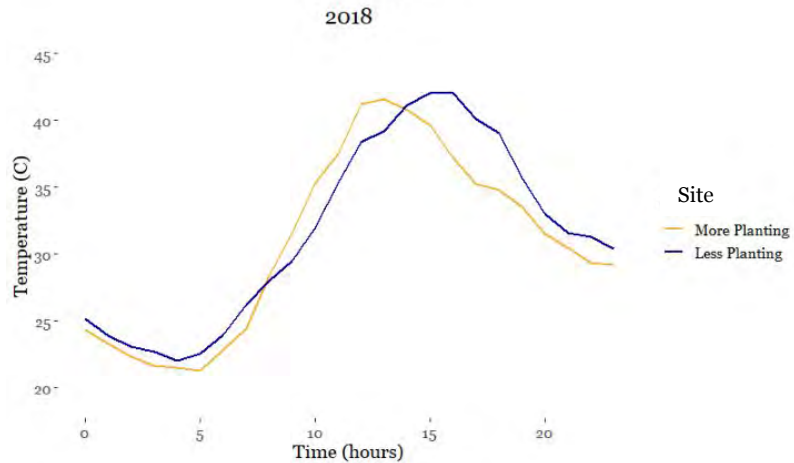
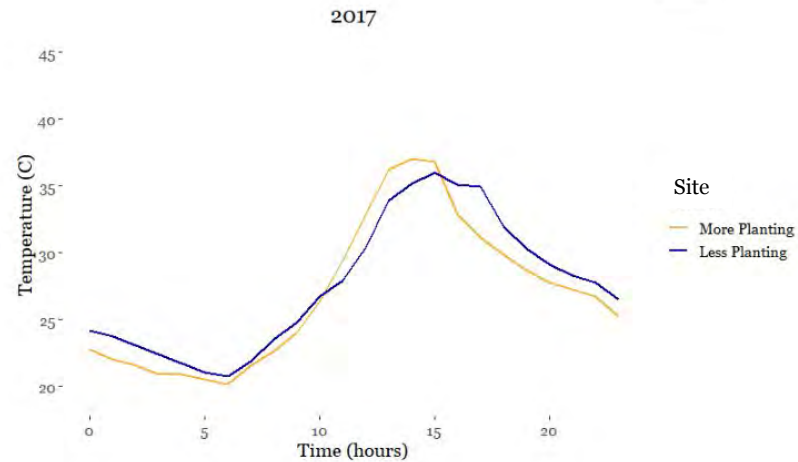
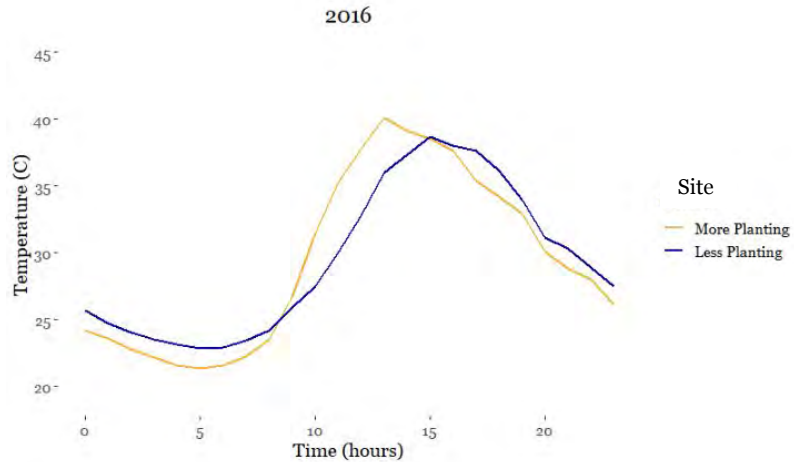


Site with Less Planting

Trees Planted	Canopy Cover	Impervious Cover
11	9.4%	70.0%

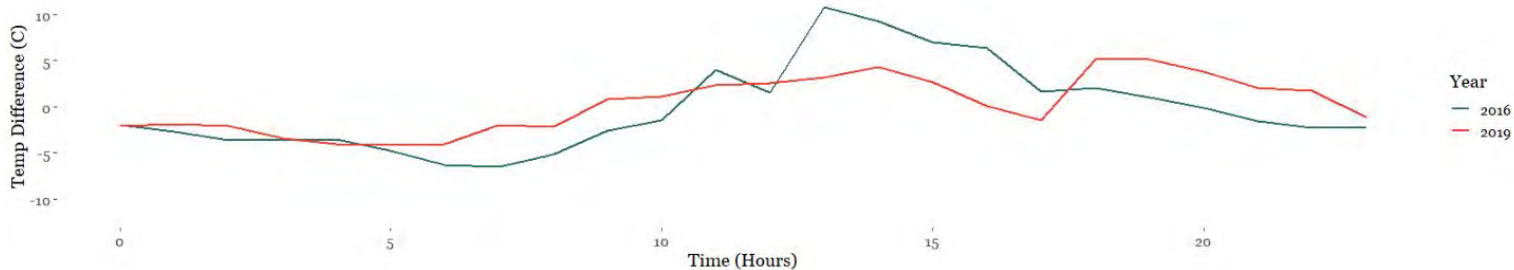


# Comparison by Diurnal Temperature

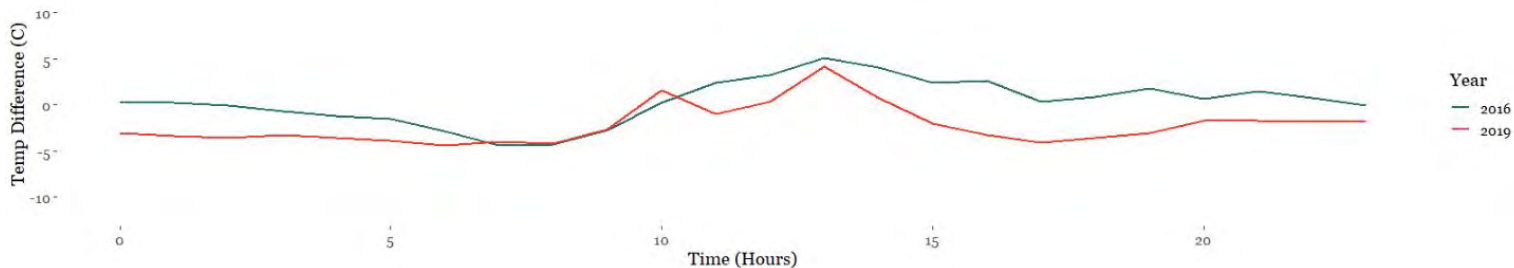


# Comparison to Local Weather Station Site with More Planting

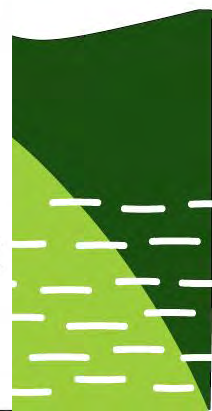
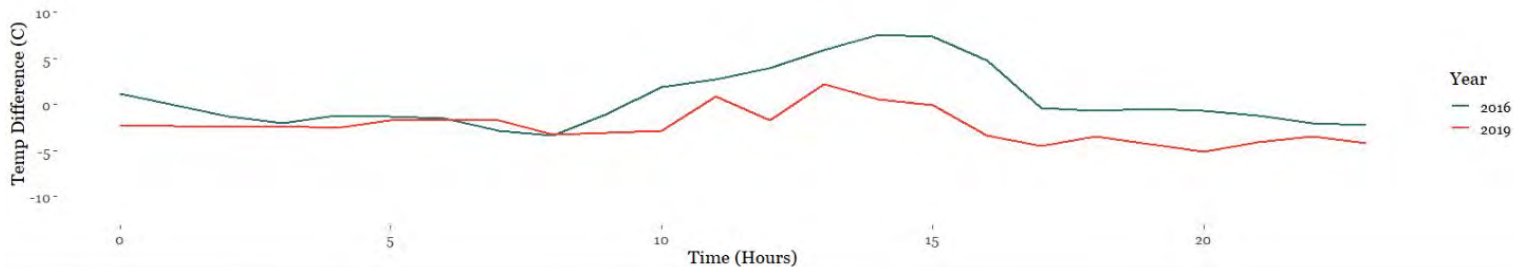
June  
22nd



July  
22nd



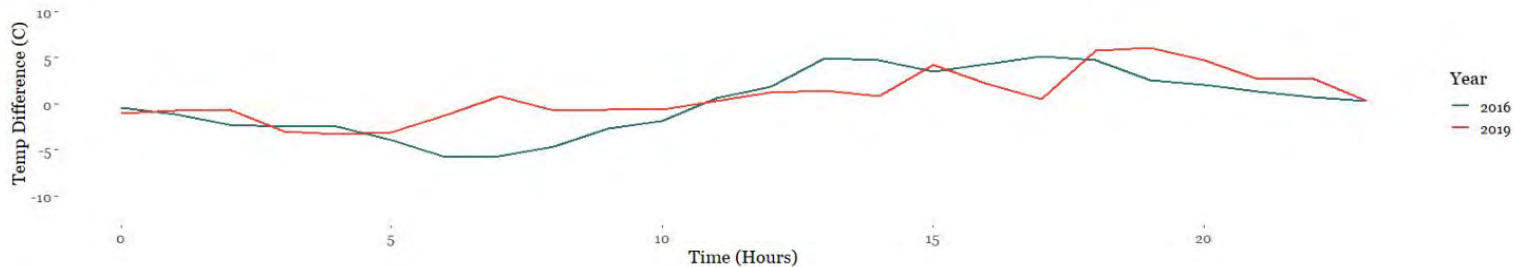
August  
22nd



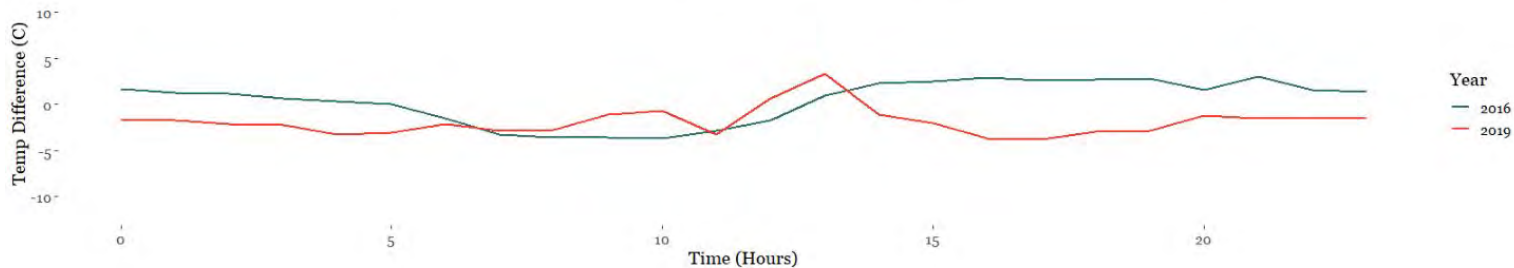


# Comparison to Local Weather Station Site with Less Planting

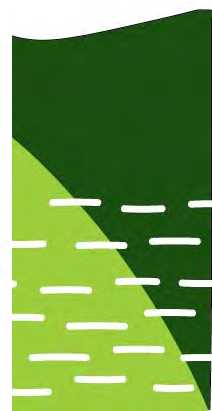
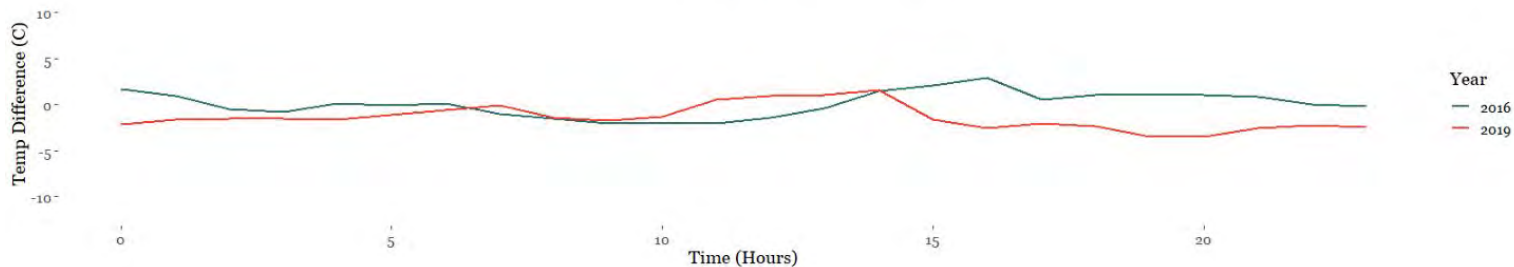
June  
22nd



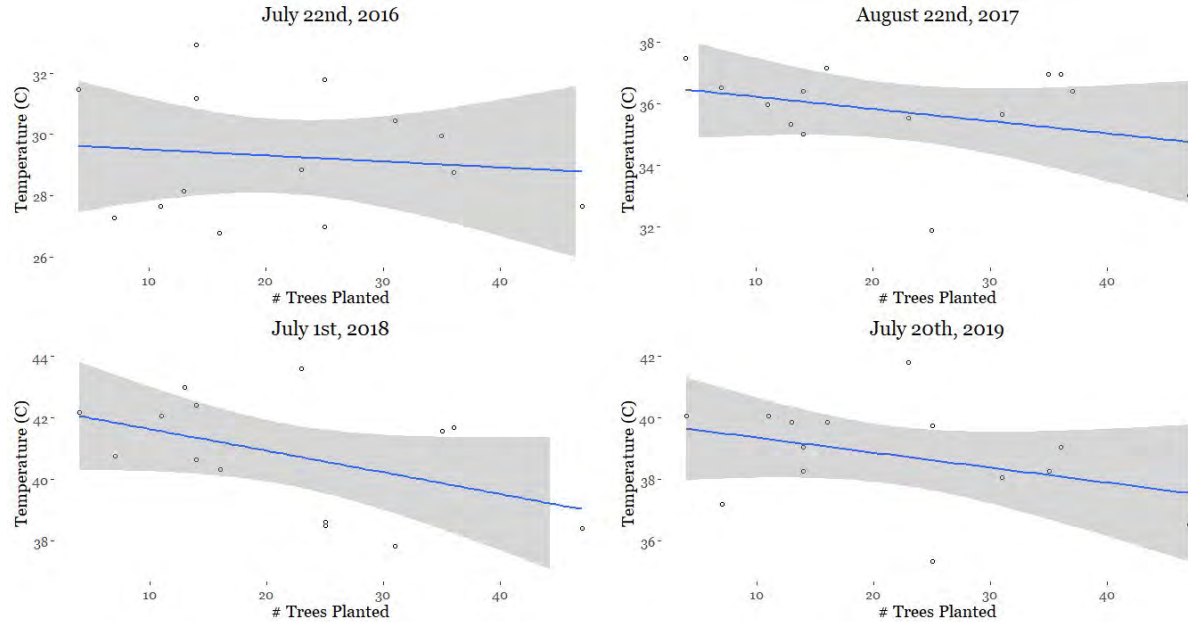
July  
22nd



August  
22nd

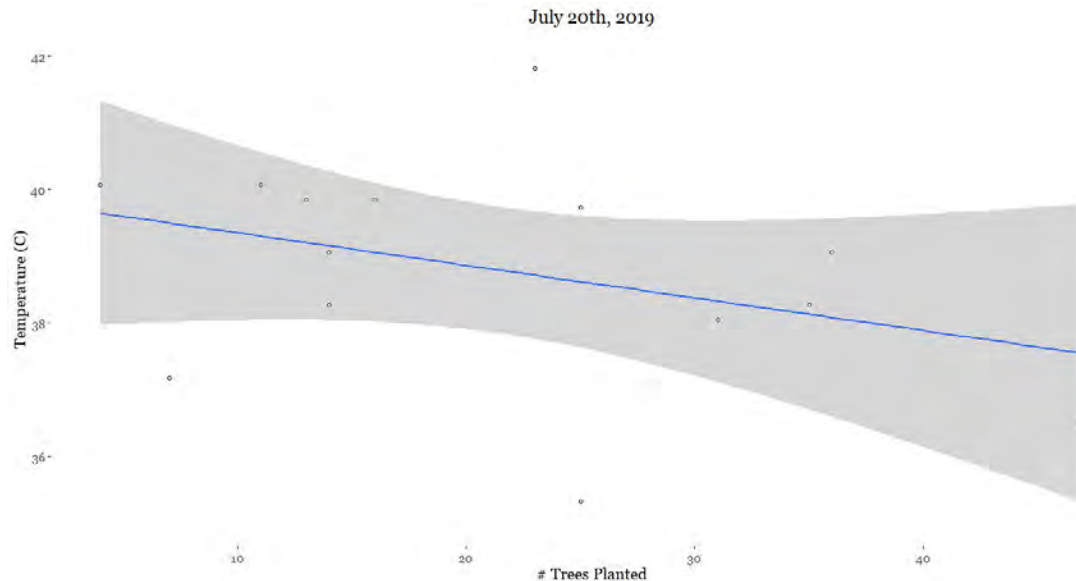


# Modeling Shift in Temperature for SFR and MFR Locations



	2016	2017	2018	2019
Adjusted R <sup>2</sup>	-0.3306	0.095	0.095	0.497
Model p-value	0.9641	0.2851	0.2853	0.01925

# Modeling Effect of Tree Planting on Temperature



July 20th, 2019: $R^2 = 0.497$ , P-Value = 0.019	Coefficients	P-value
# of Trees Planted	-0.06733	0.06403
Canopy Cover %	0.29757	0.01681
Impervious Surface %	0.21896	0.00653



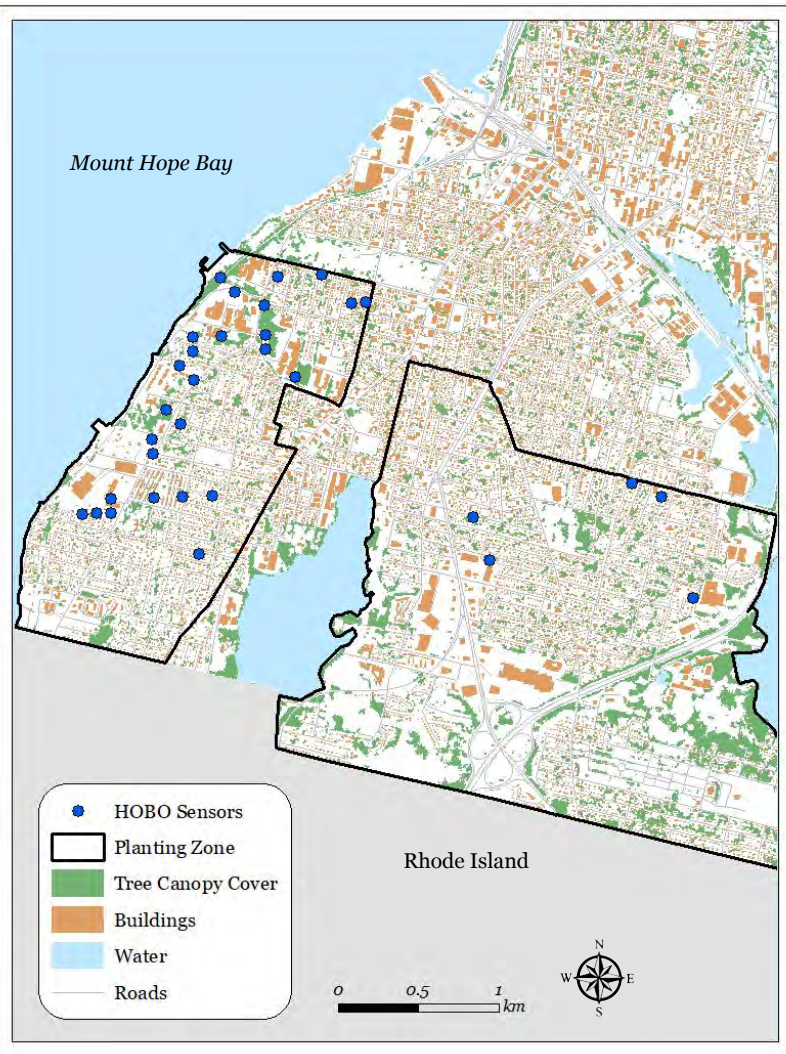
# Holyoke Summary

## Objective 1

- MFR was the warmest land use during peak load hours on the hottest day of 2017
- The planting zone experienced a lower degree of cooling during peak load hours and was warmer overnight in 2017

## Objective 2

- The difference between the more planting site and a nearby weather station was 3°C lower in 2019 than it was on the same day 2016
- For every tree planted in residential land uses, there is a statistically significant decrease in temperature of 0.07°C



# Fall River

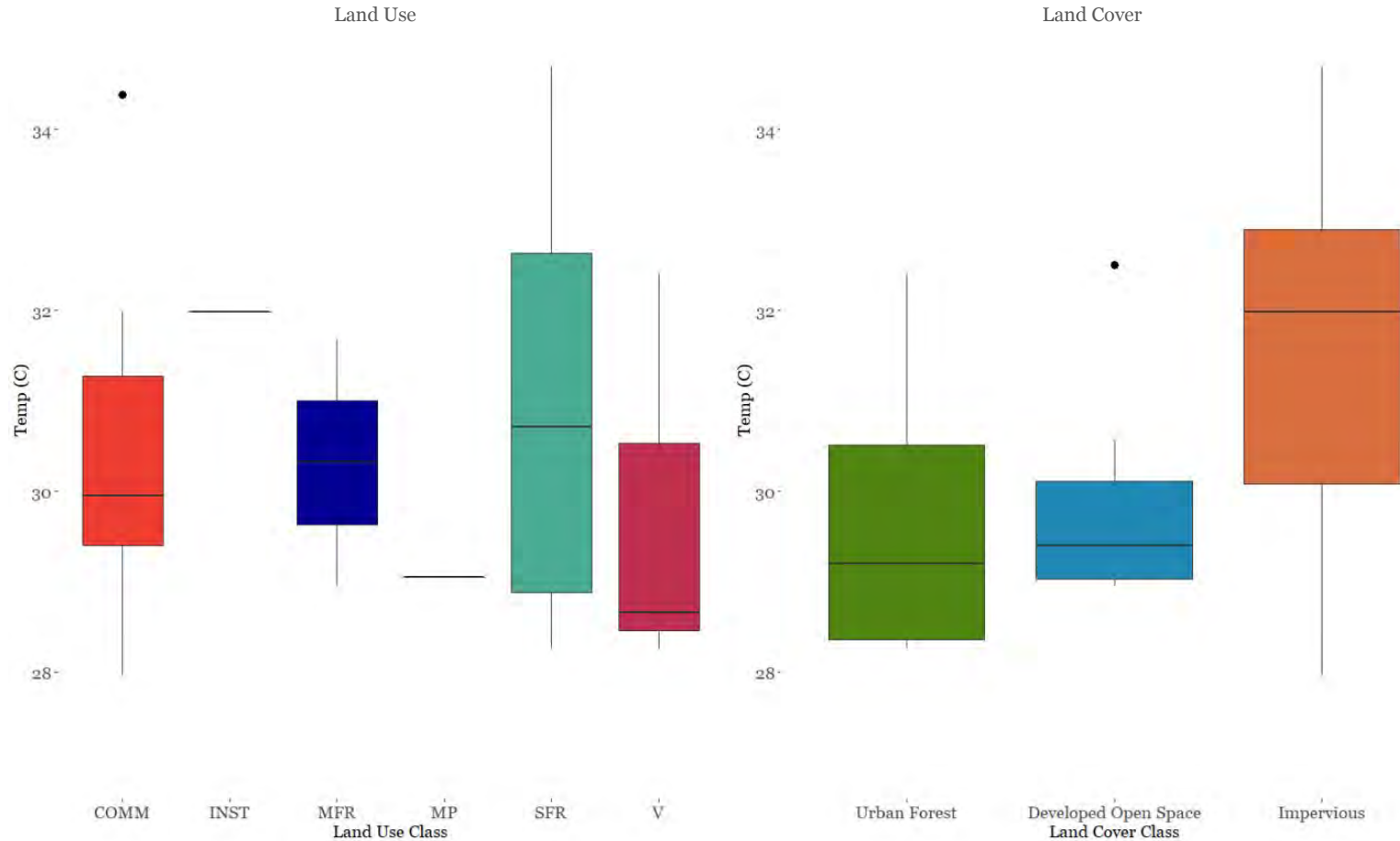
## Planting Zone

# Objective 1:

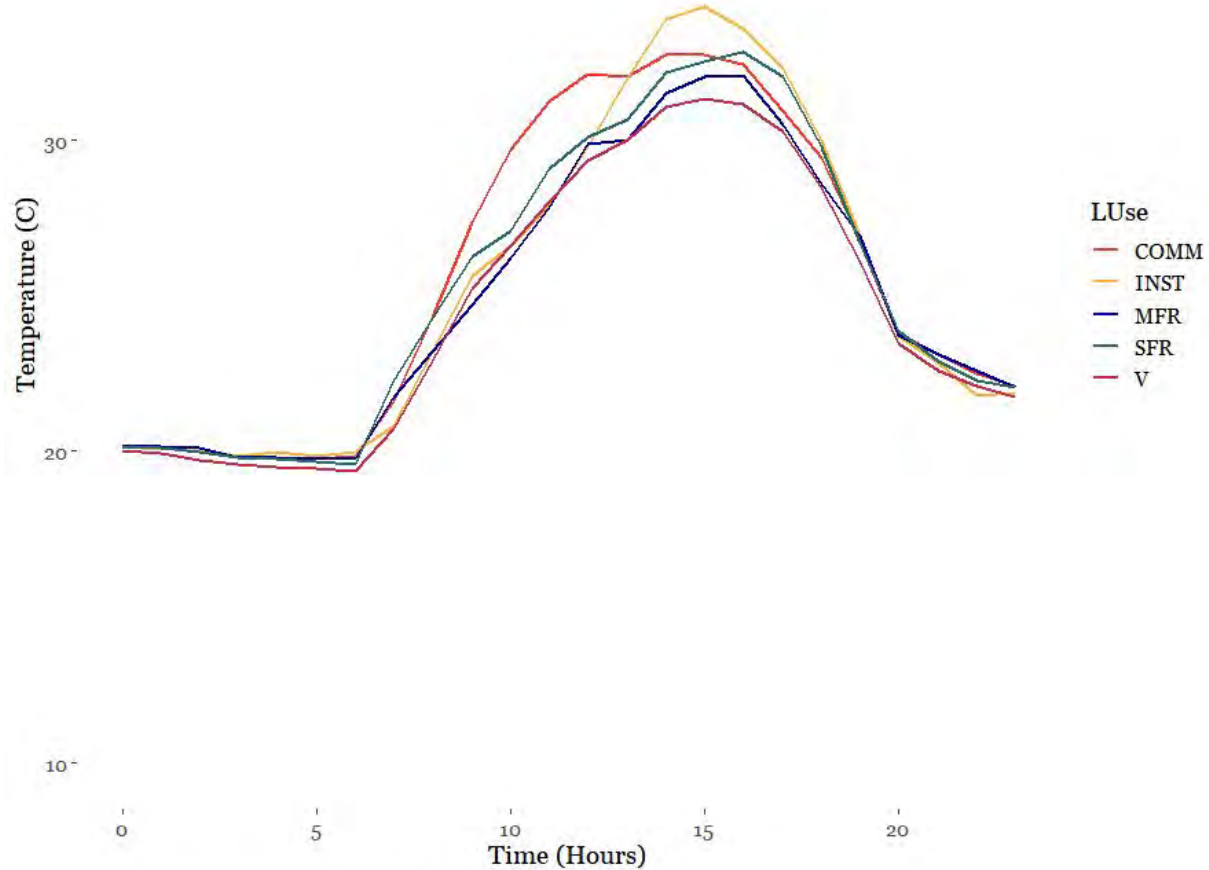
Evaluate daily maximum temperatures and  
temperature during peak energy load  
hours (4pm - 7pm)



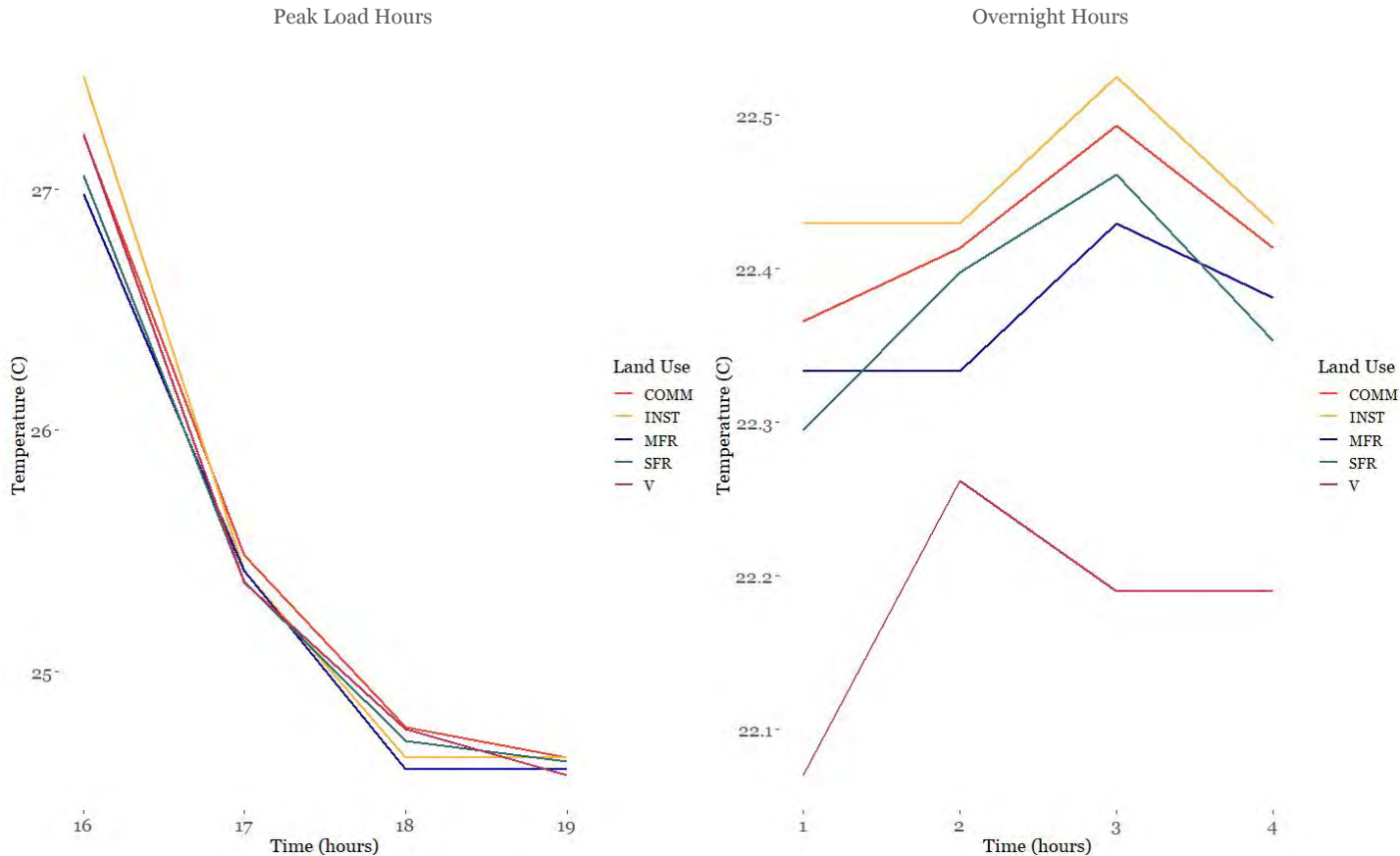
# Maximum Temperature on August 22nd, 2017



## Diurnal Temperature on August 22nd, 2017



# Temperature During Peak Load & Overnight Hours on August 22nd, 2017





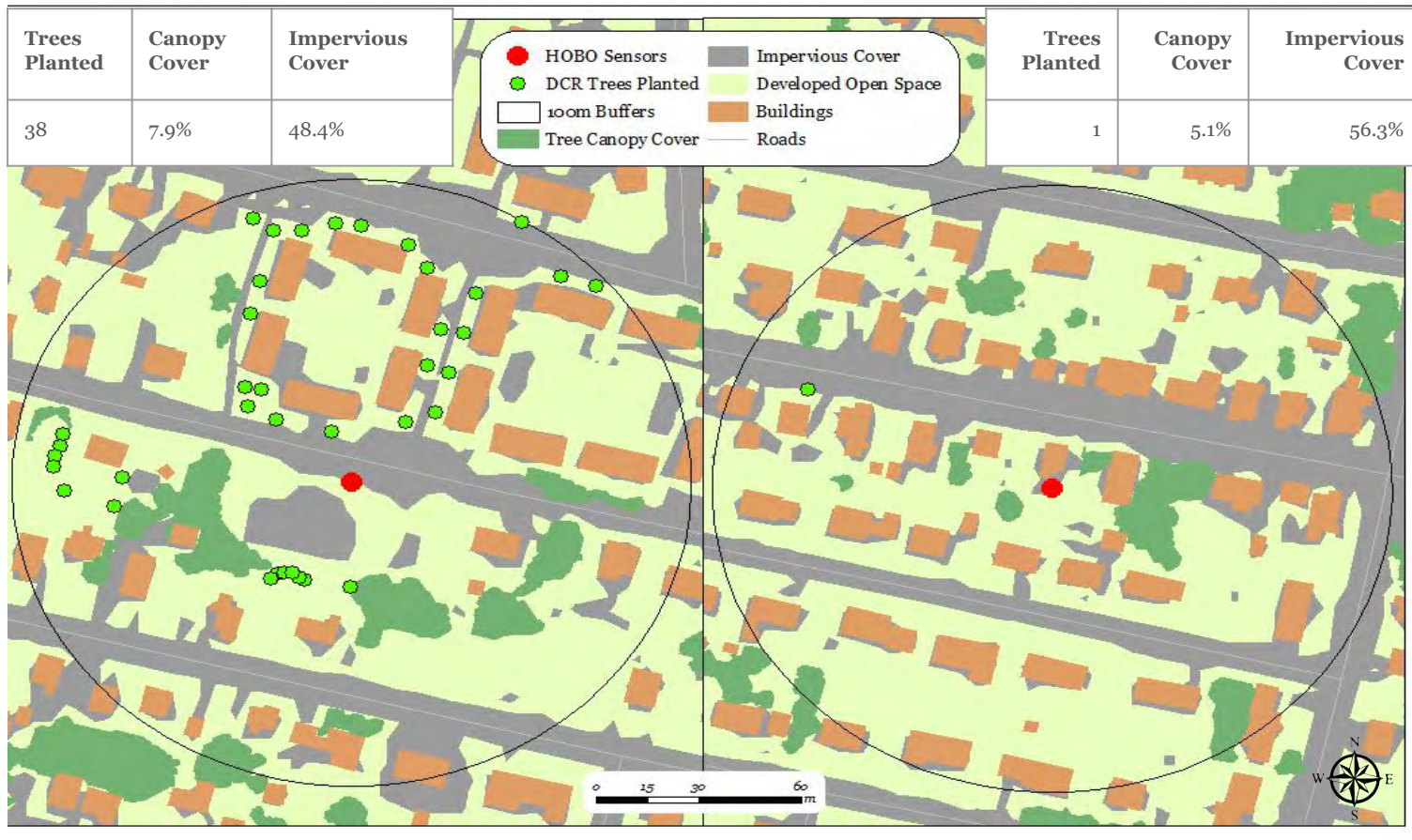
## Objective 2:

Determine the effect of trees planted by  
DCR on temperature in residential areas

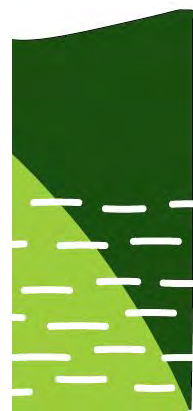
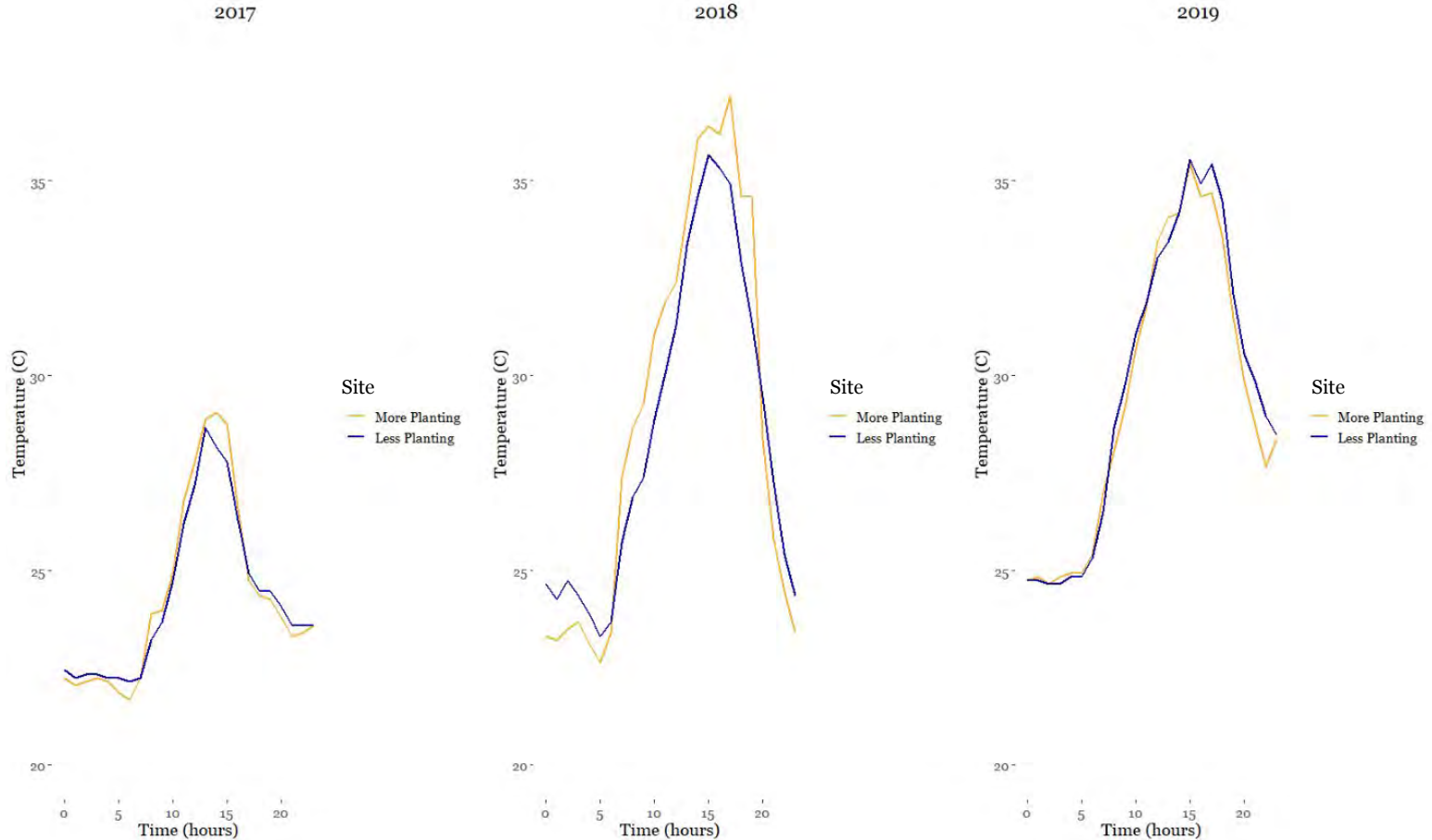
# Single Family Residential Sensors

Site with More Planting

Site with Less Planting



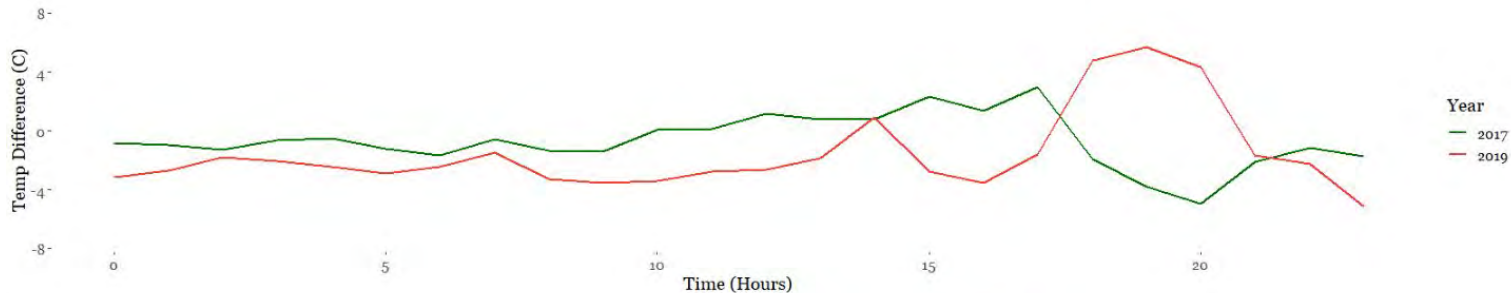
## Comparison by Diurnal Temperature



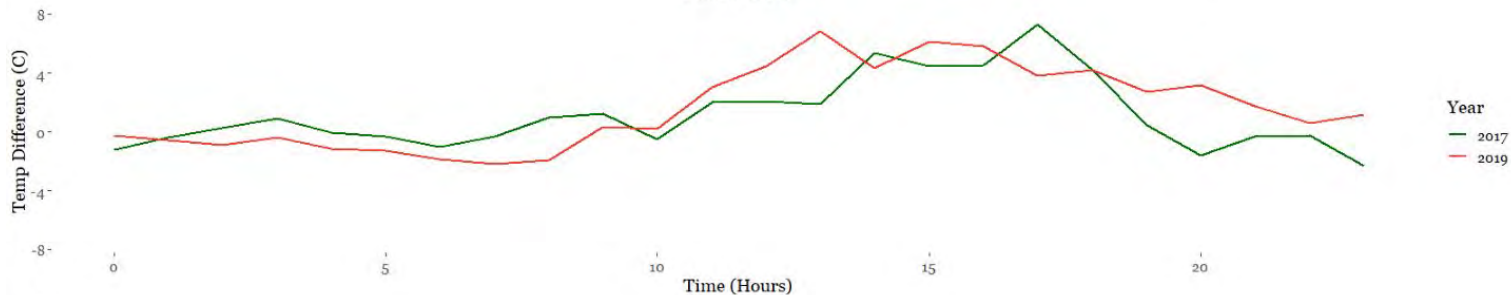


## Comparison to Local Weather Station Site with More Planting

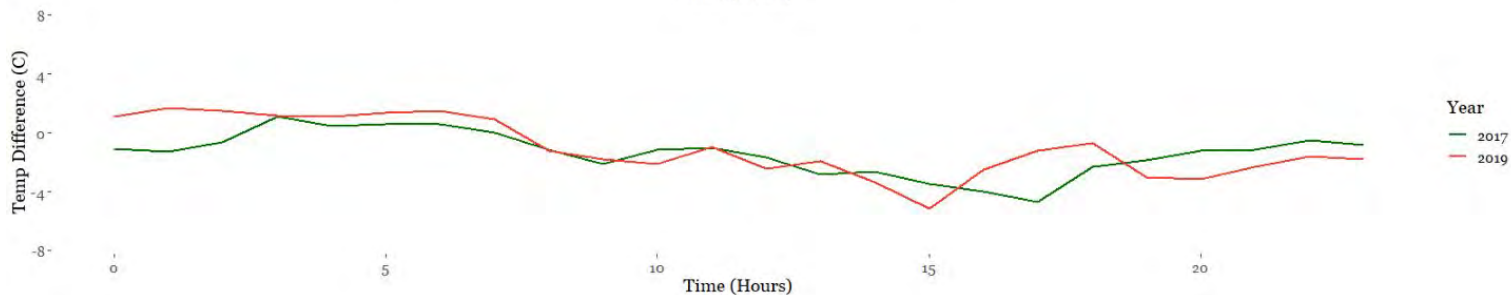
June  
22nd



July  
22nd

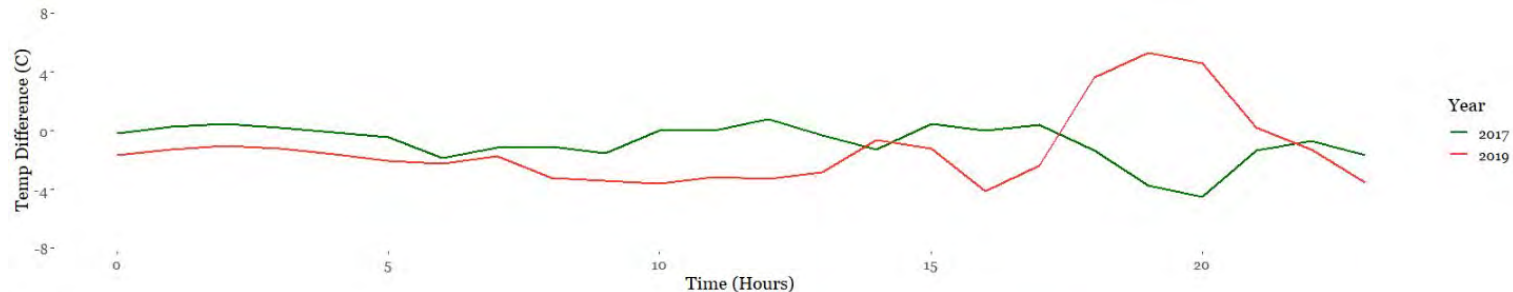


August  
22nd

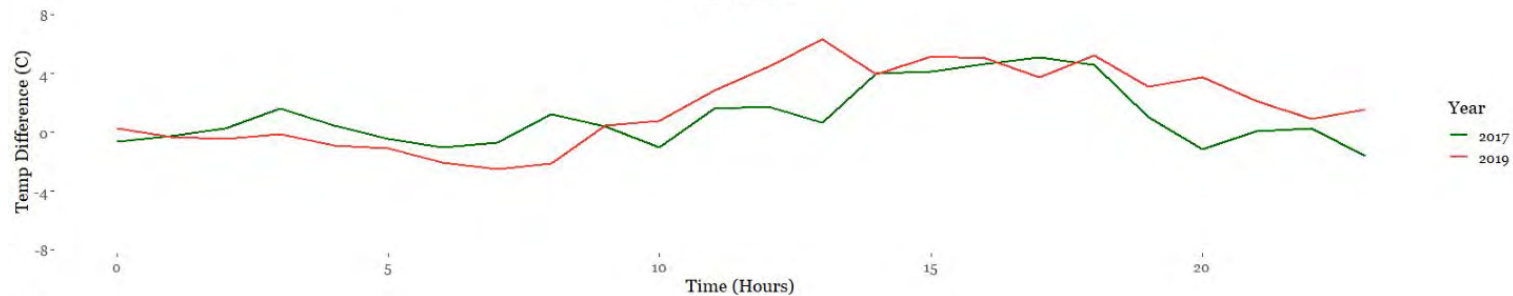


# Comparison to Local Weather Station Site with Less Planting

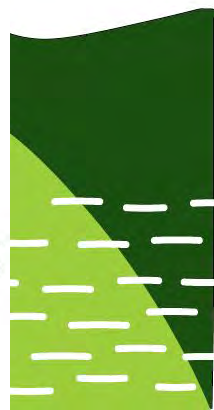
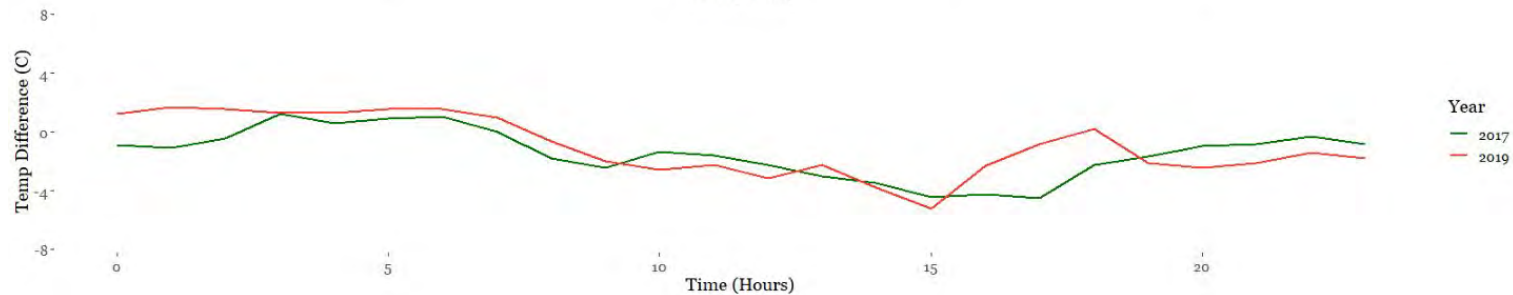
June  
22nd



July  
22nd

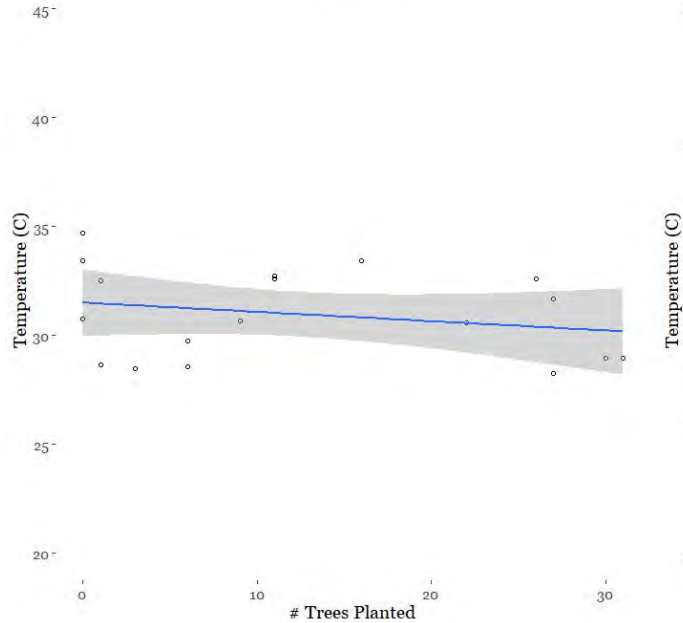


August  
22nd

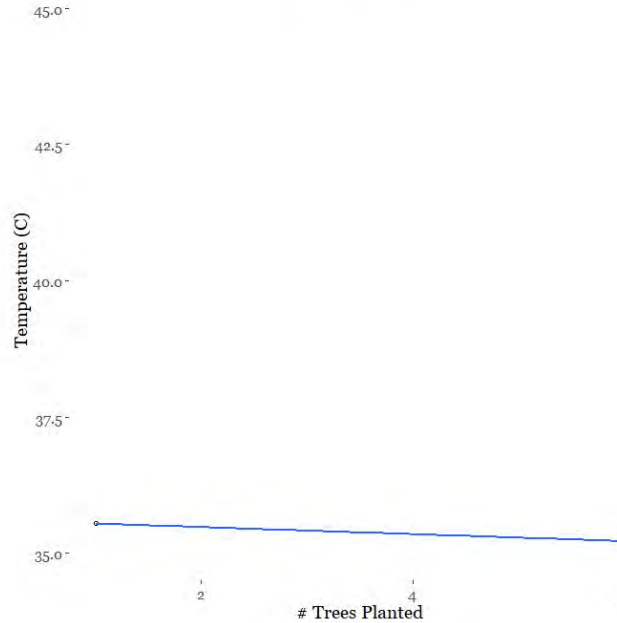


# Modeling Effect of Tree Planting on Temperature

August 22nd, 2017



July 20, 2019



	2017	2019
Adjusted R <sup>2</sup>	-0.053	N/A
Model p-value	0.5597	N/A



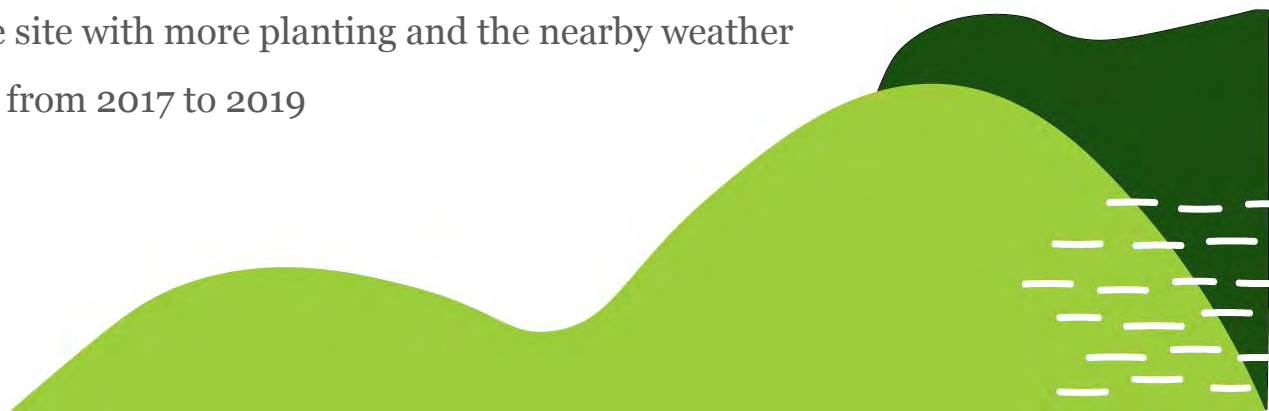
# Fall River Summary

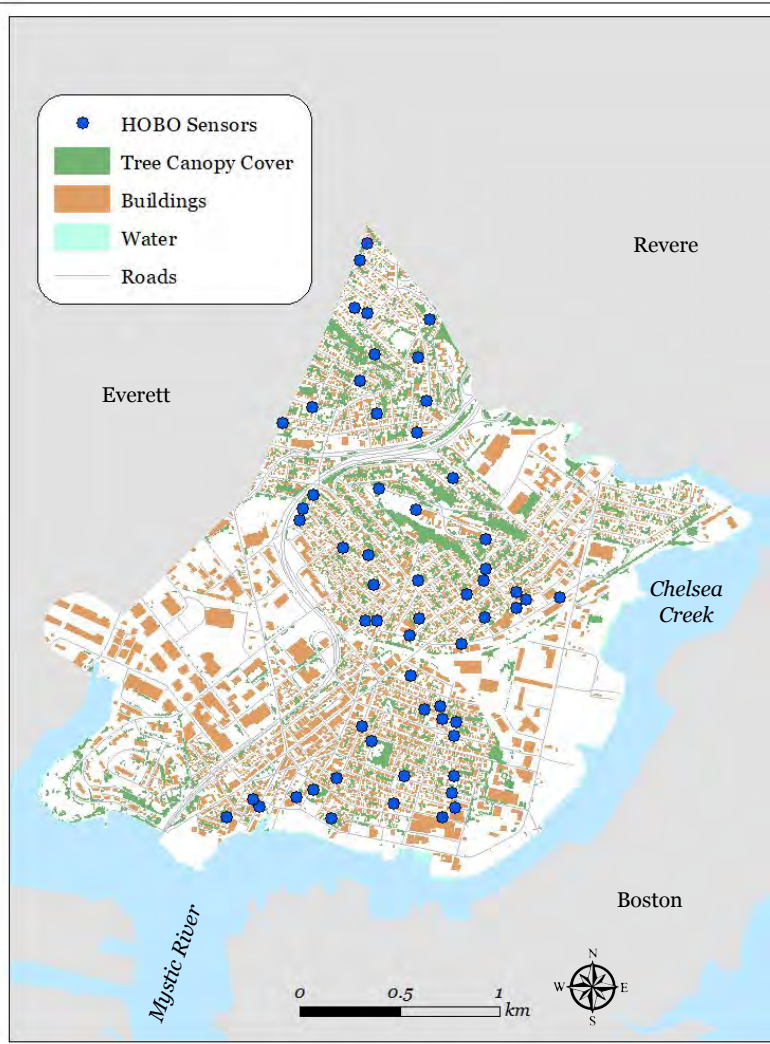
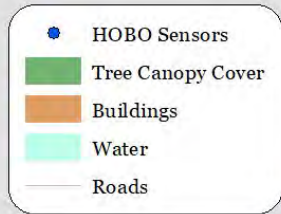
## Objective 1

- Residential areas have a similar temperature profile to Commercial and Institutional areas with high percentage of impervious cover

## Objective 2

- The site with more trees planted was warmer than the site with less trees planted on the hottest day of 2017, but became slightly cooler by the same day of 2019
- The difference between the site with more planting and the nearby weather station remained the same from 2017 to 2019





# Chelsea

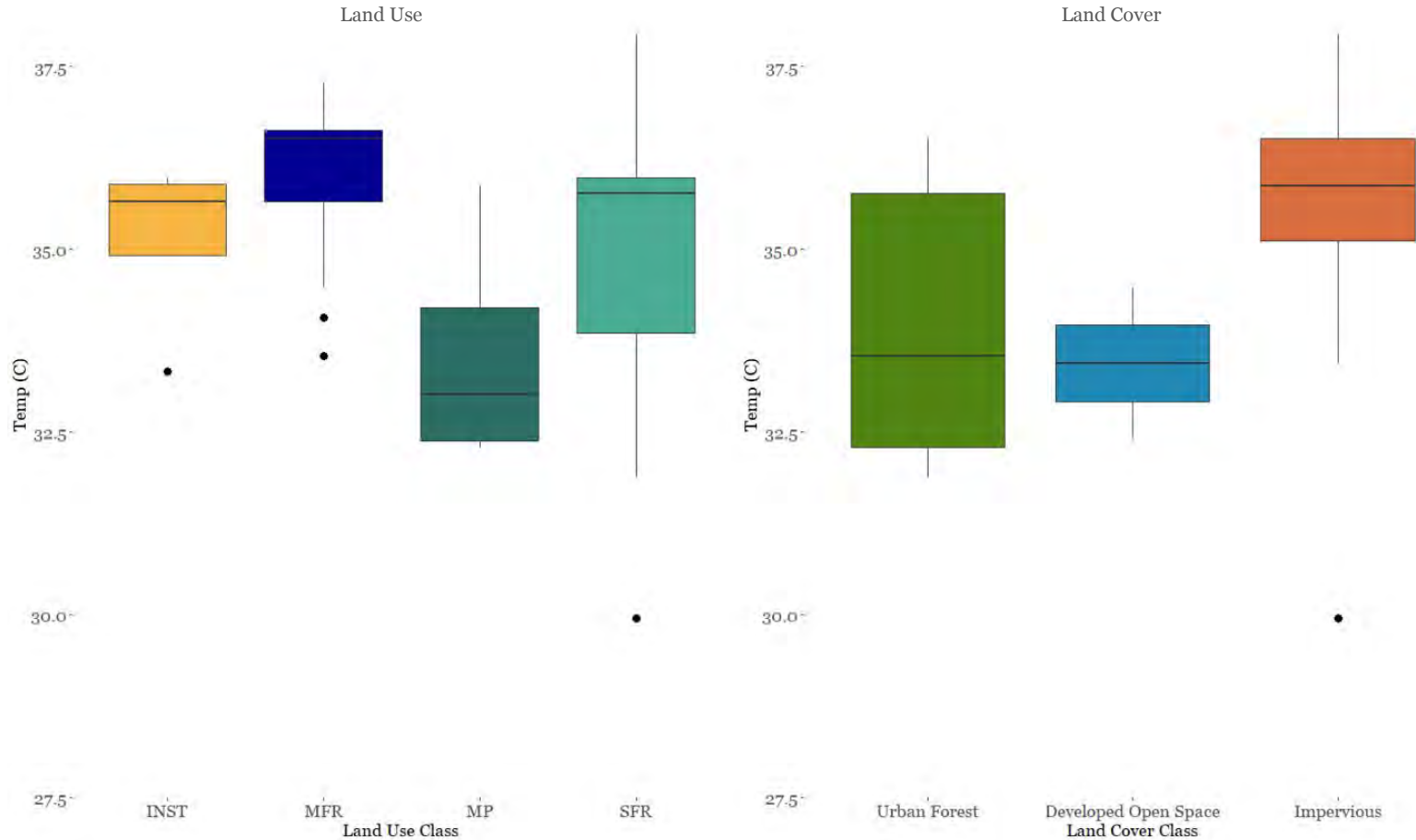
## Planting Zone

# Objective 1:

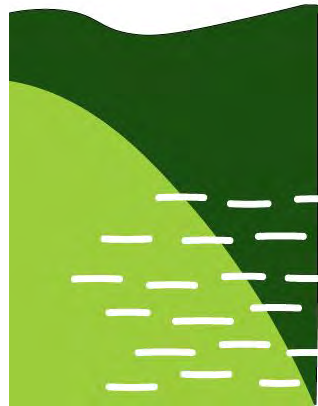
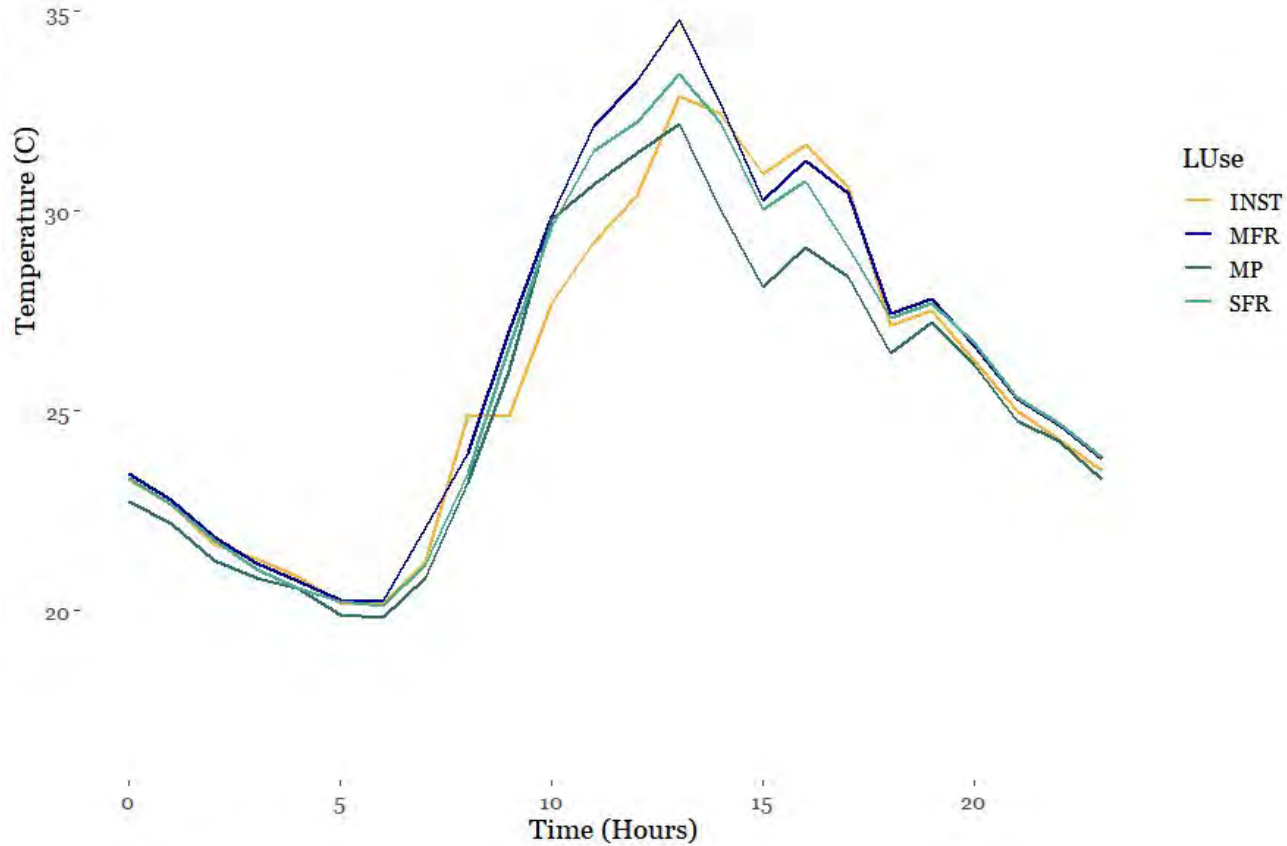
Evaluate daily maximum temperatures and  
temperature during peak energy load  
hours (4pm - 7pm)



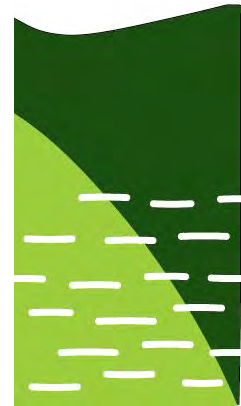
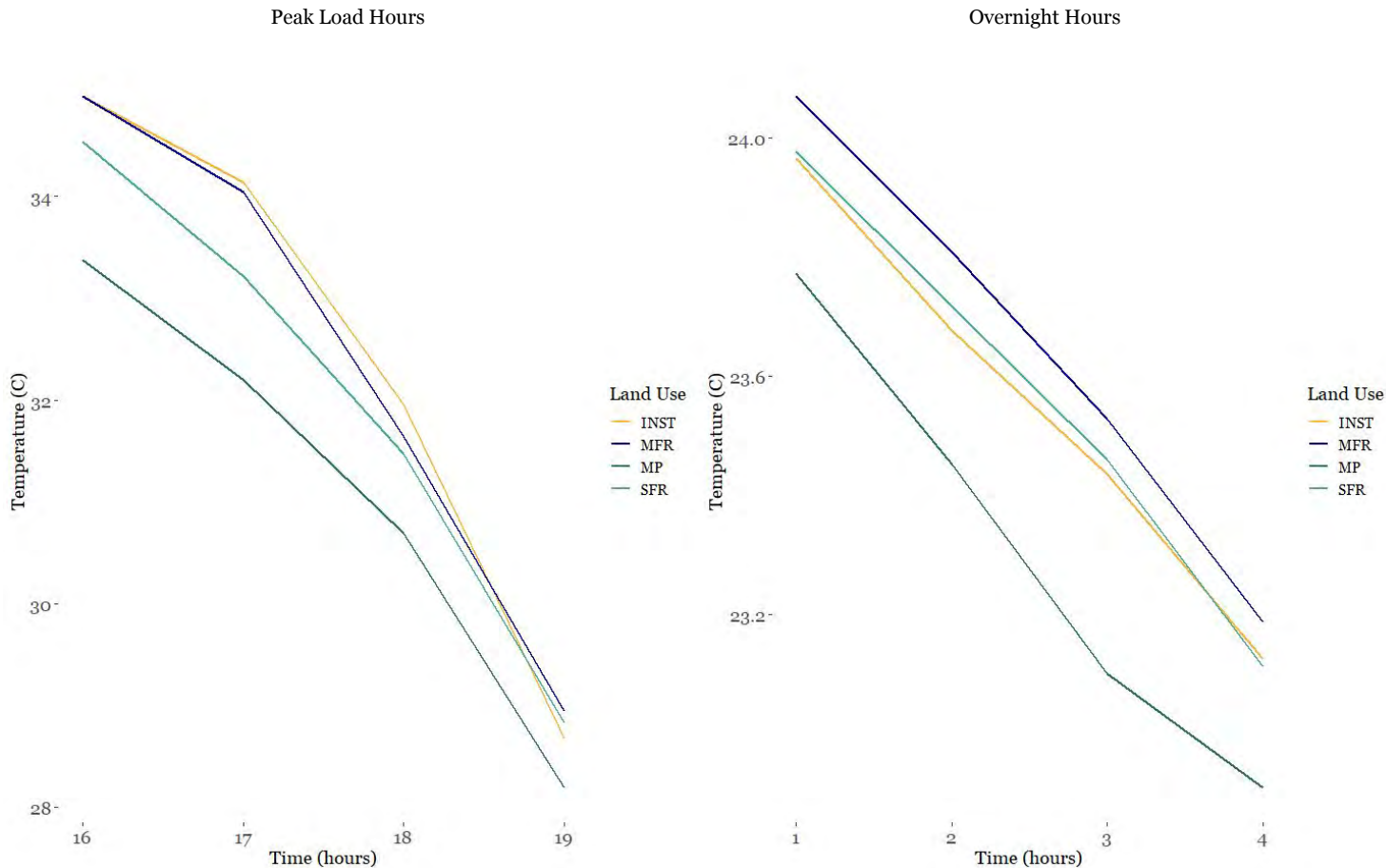
# Maximum Temperature on August 22nd, 2017



# Diurnal Temperature on August 22nd, 2017



# Temperature During Peak Load & Overnight Hours on August 22nd, 2017





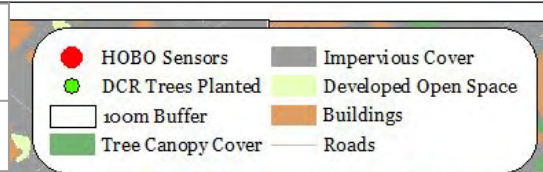
## Objective 2:

Determine the effect of trees planted by  
DCR on temperature in residential areas

# Multi-Family Residential Sensor Comparison

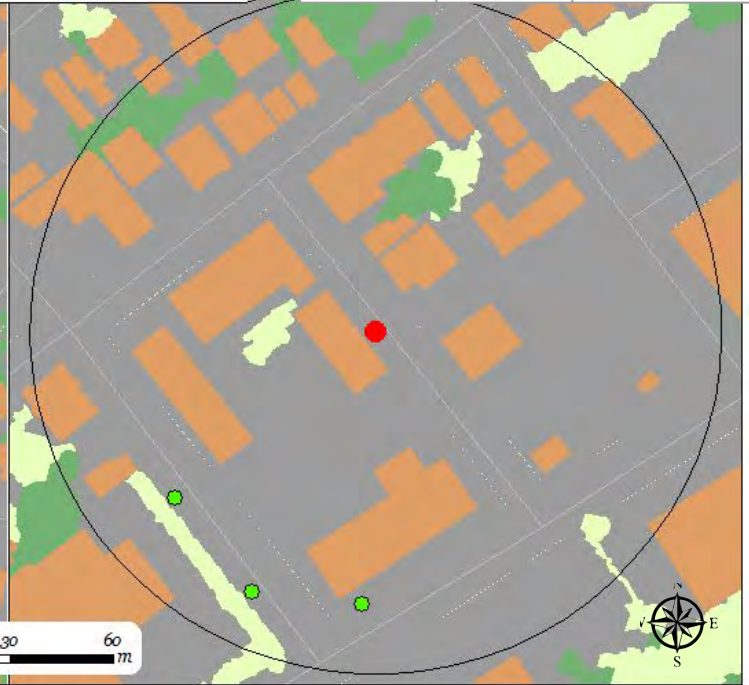
Site with More Planting

Trees Planted	Canopy Cover	Impervious Cover
28	11.2%	78.8%

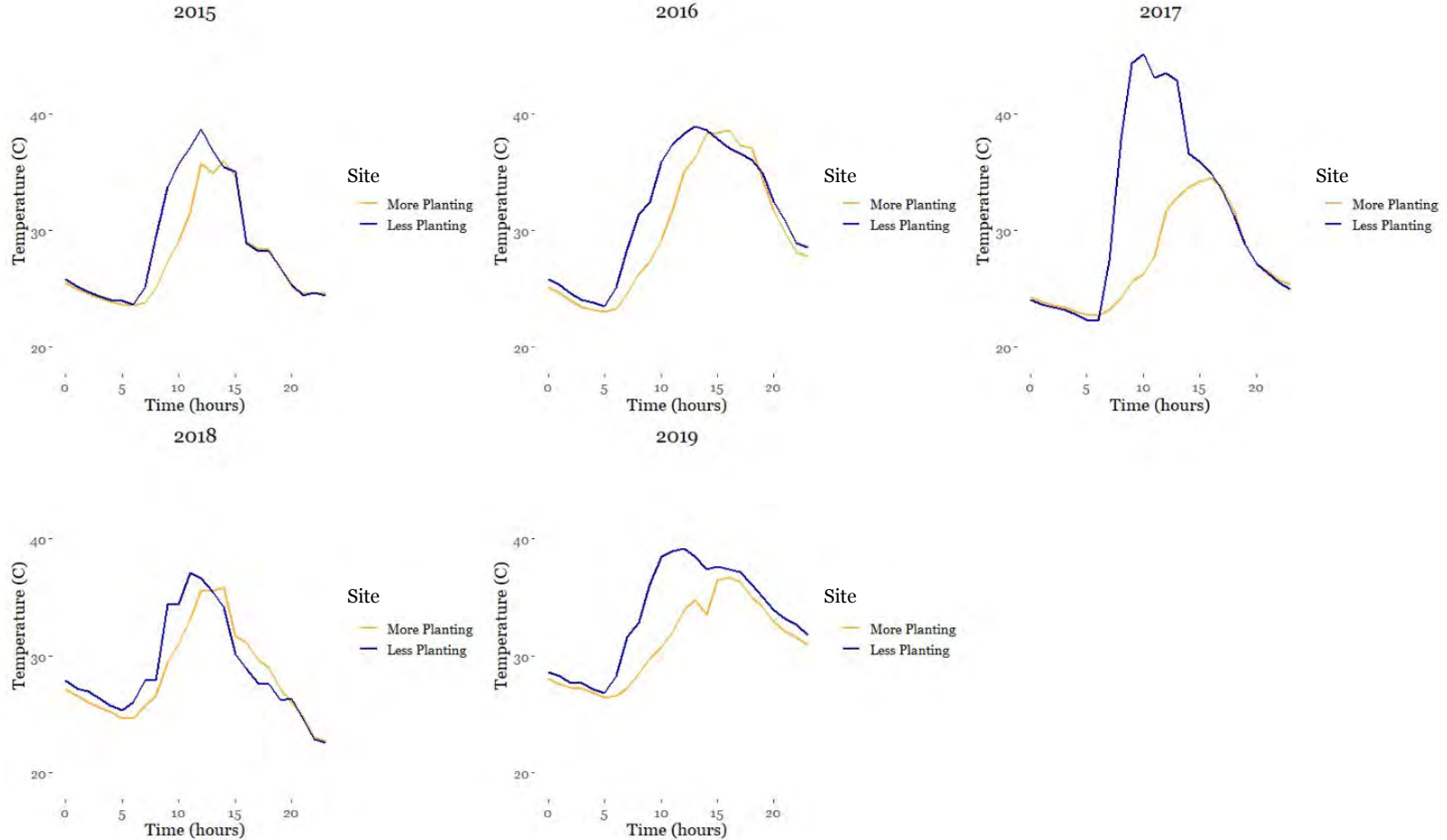


Site with Less Planting

Trees Planted	Canopy Cover	Impervious Cover
3	4.3%	92.7%



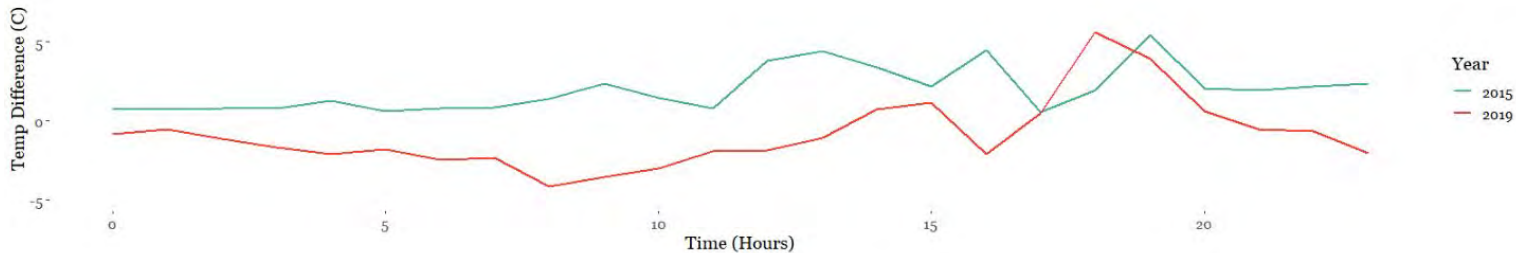
# Comparison by Diurnal Temperature



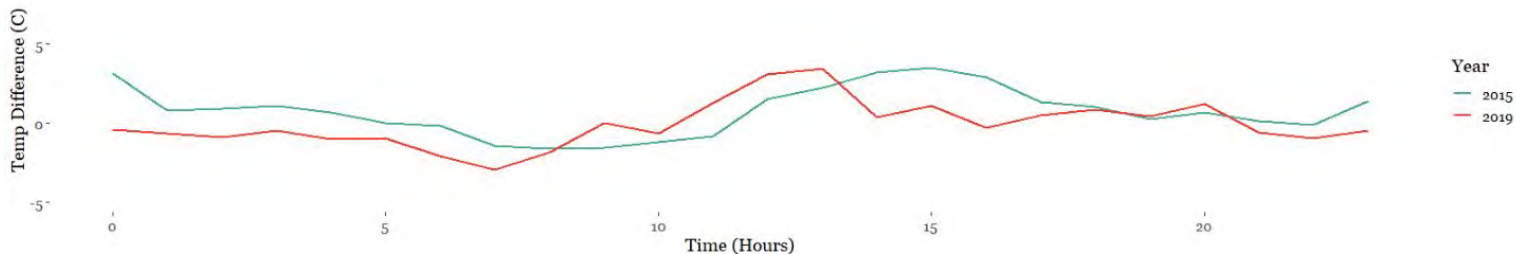


## Comparison to Local Weather Station Site with More Planting

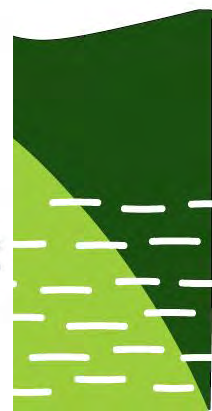
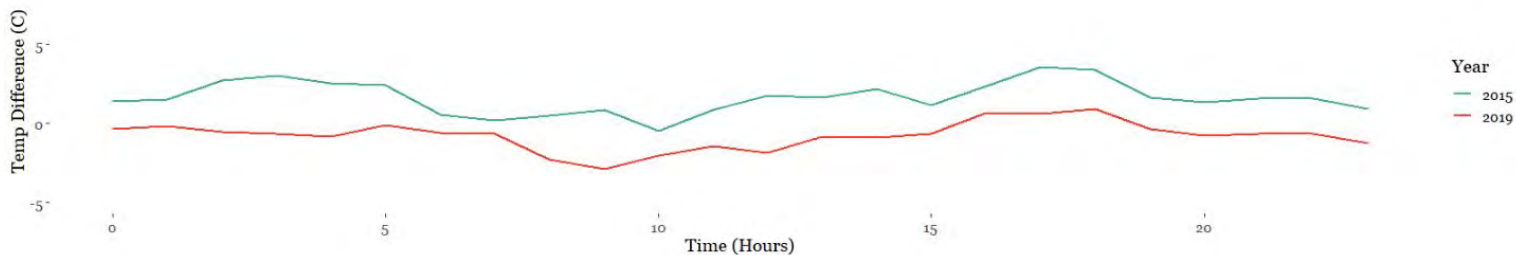
June  
22nd



July  
22nd

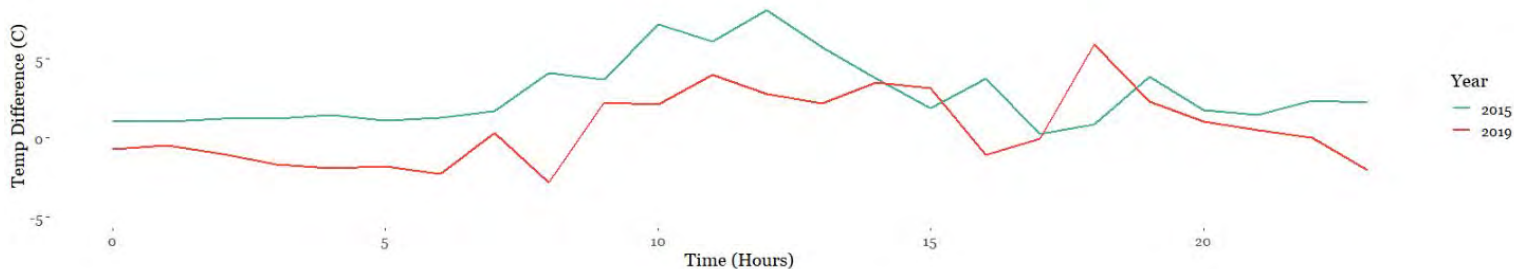


August  
22nd

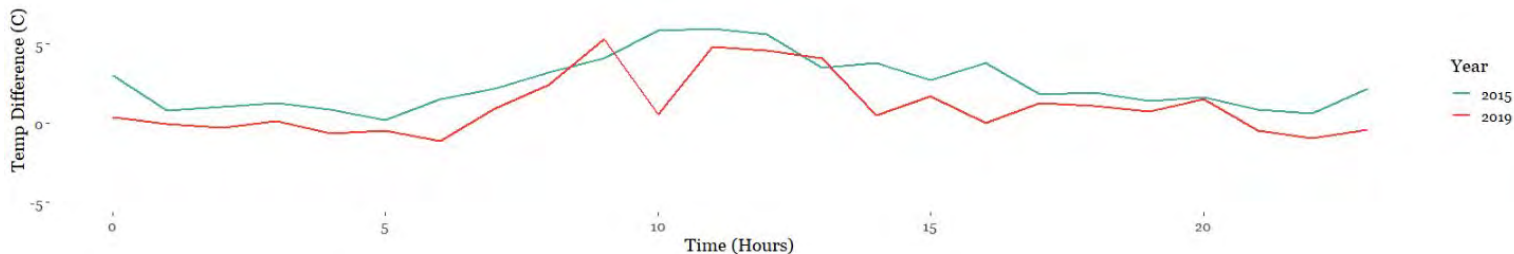


## Comparison to Local Weather Station Site with Less Planting

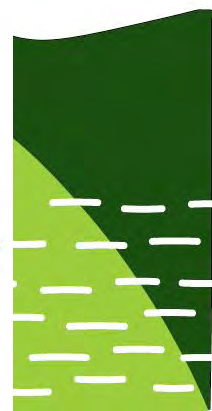
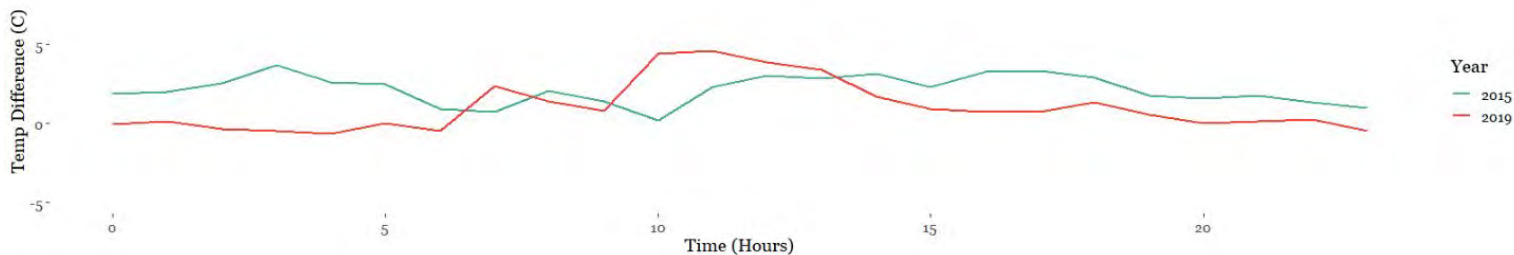
June  
22nd



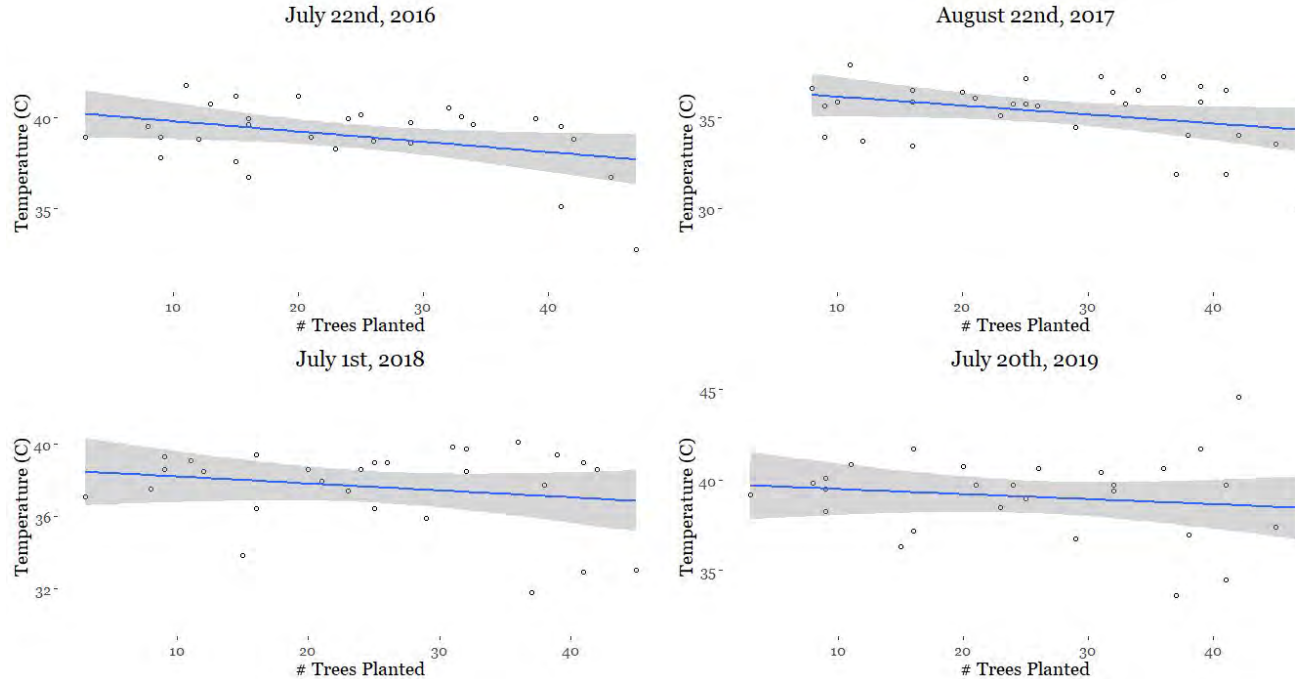
July  
22nd



August  
22nd



# Modeling Effect of Tree Planting on Temperature



	2016	2017	2018	2019
<b>Adjusted R<sup>2</sup></b>	0.127	0.173	-0.019	-0.059
<b>Model p-value</b>	0.08377	0.03665	0.4901	0.6908



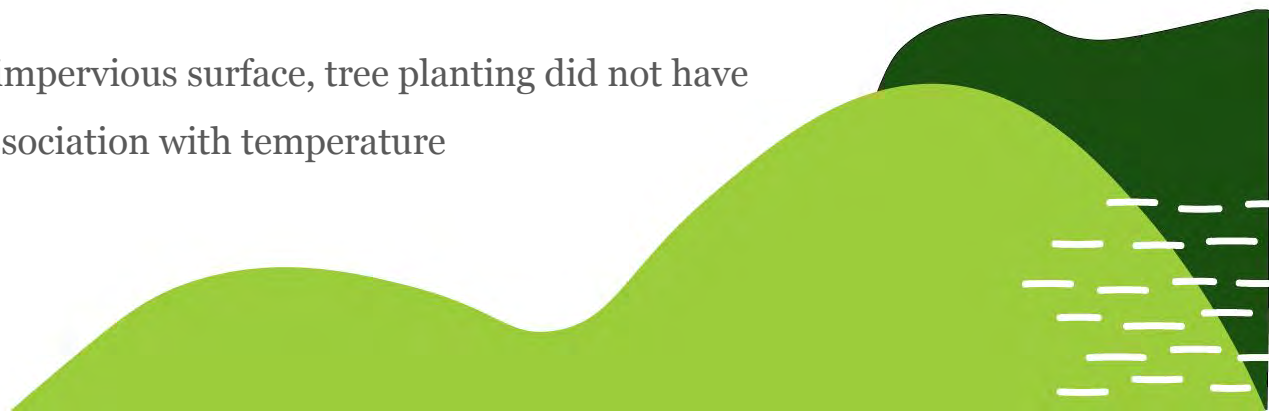
# Chelsea Summary

## Objective 1

- MFR was the warmest land use on the hottest day of the year, reaching 1°C warmer than other land uses in the afternoon

## Objective 2

- The site with more trees was -0.75°C cooler in 2019 than it was in 2016 throughout the same day
- Due to high percentage of impervious surface, tree planting did not have a statistically significant association with temperature



The background features several decorative elements: a large, irregular green shape in the top left; a series of parallel green lines in the top right; and a large green shape in the bottom right with white horizontal dashed lines. The text is centered in the middle of the slide.

# **Final Takeaways & Recommendations**

# Conclusions

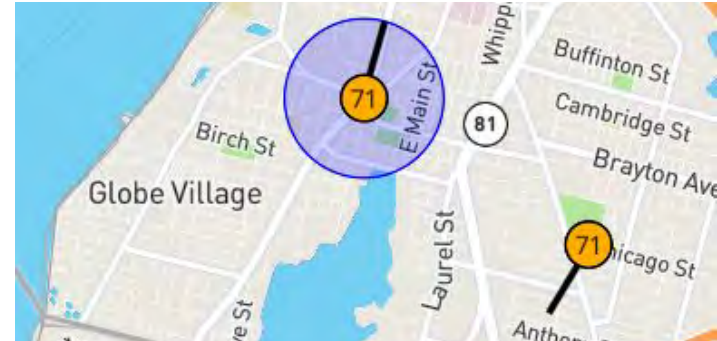
- The Hadwen Arboretum is a valuable green space to the Worcester community
  - Cooling effects from large patches of urban forest
  - Maintenance efforts have increased accessibility for locals
- Residential land use with 20 or more DCR trees planted shows evidence of cooling at peak energy hours
  - Statistically significant cooling found in Holyoke (0.07°C per tree)
- Geography matters
  - Moderate levels of canopy cover and developed open space in Holyoke
  - Ocean proximity and heterogeneous landscape adds complexity to Fall River
  - High levels of impervious surface in Chelsea





# Future Research

- Fall River
  - Analyze 2018 and 2019 HOBO sensor data
  - Include weather station further from coast
- Holyoke
  - Track temperature variation in control and planting zone over time
- Chelsea
  - Continue a long-term collection of data
- Replicate approach for other GGCP cities



Weather Underground Weather Stations in Fall River

# Acknowledgements

Mat Cahill, Department of Conservation & Recreation

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Dr. Ben Weil, UMass Amherst

John T. O'Connor '78 Fund



# Average Offset

	6/2016	6/2019	7/2016	7/2019	8/2016	8/2019
<b>Holyoke 19226</b>	-0.23	0.27	0.36	-2.22	0.51	-2.40
<b>Holyoke 2484</b>	0.13	0.75	0.40	-1.87	0.05	-1.41

	6/2017	6/2019	7/2017	7/2019	8/2017	8/2019
<b>Fall River 1267</b>	0.13	0.75	0.40	-1.87	0.05	-1.41
<b>Fall River 26954</b>	-0.80	-1.35	1.06	1.69	-1.45	-0.99

	6/2015	6/2019	7/2015	7/2019	8/2015	8/2019
<b>Chelsea 899</b>	1.96	-0.89	0.71	-0.11	1.64	-0.75
<b>Chelsea 947</b>	2.78	0.58	2.46	1.03	2.13	1.04