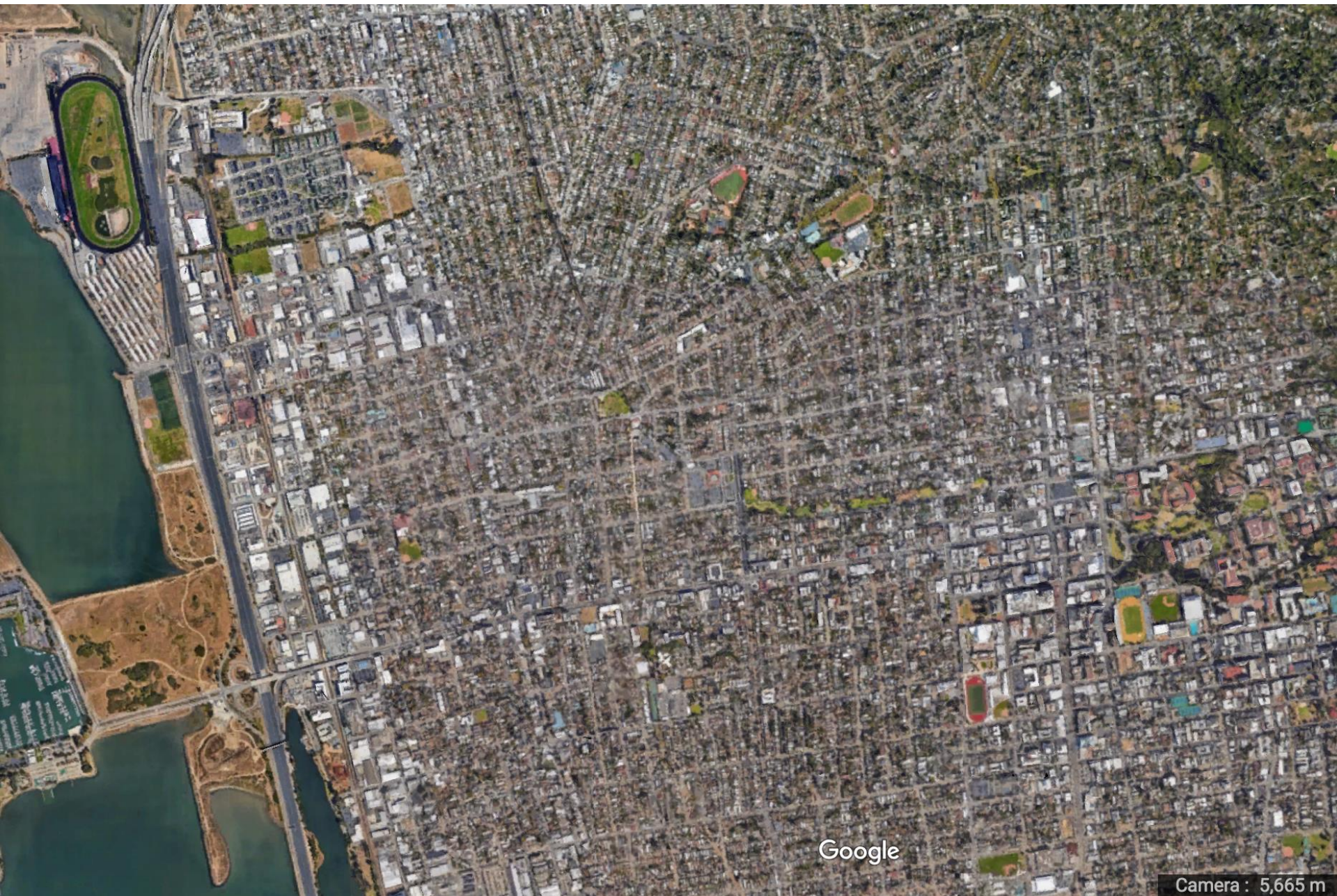


# Exploring urban biodiversity patterns with iNat data

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Google

Camera : 5,665 m



Courtesy of NASA/DSMP

# City Nature Challenge



CITY NATURE CHALLENGE IS ORGANIZED BY



CALIFORNIA  
ACADEMY OF  
SCIENCES





**9,389**  
observations



**1,551**  
species



**444**  
people

# 2016



**10,353**  
observations



**1,601**  
species



**574**  
people



**2**  
**cities**

**1K**  
**people**

**20K**  
**obs**

**2.5K**  
**species**

# 2017



16 cities took part

---

- > Austin
- > Boston
- > Chicago
- > Dallas/Fort Worth
- > D.C.
- > Duluth
- > Houston
- > Los Angeles
- > Miami
- > Minneapolis/St. Paul
- > Nashville
- > New York
- > Raleigh
- > Salt Lake City
- > San Francisco
- > Seattle

**16**  
**cities**

**4K**  
**people**

**125K**  
**obs**

**8.6K**  
**species**

# 2018



**City  
Nature  
Challenge  
2018**

**63+  
cities**

**17K  
people**

**430K  
obs**

**19K  
species**



# Urban Homogenization Hypothesis

As urbanization intensifies, does biodiversity become more similar?

Are certain taxa more susceptible?

Which species are “winners” vs “losers” with urbanization?

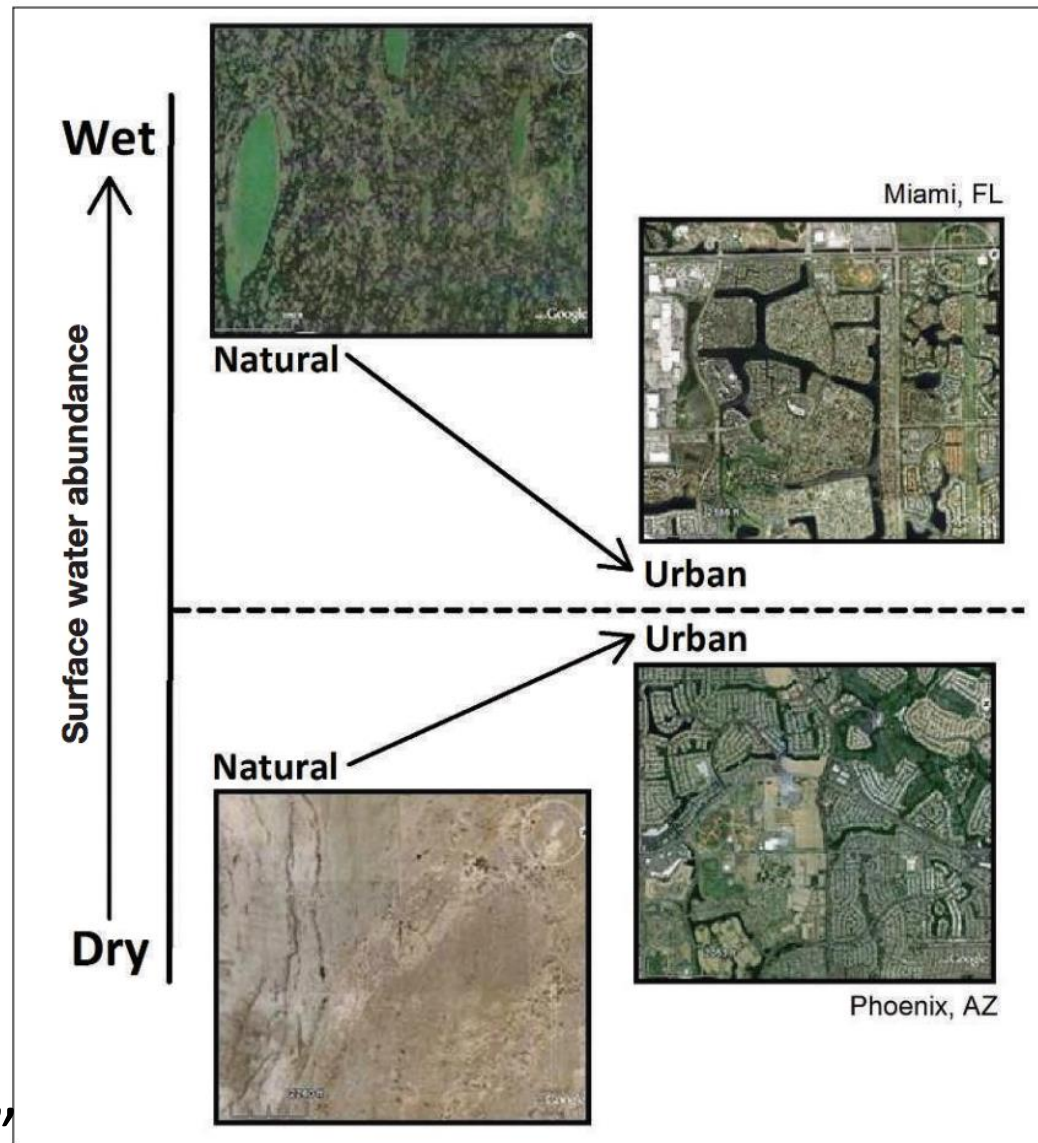
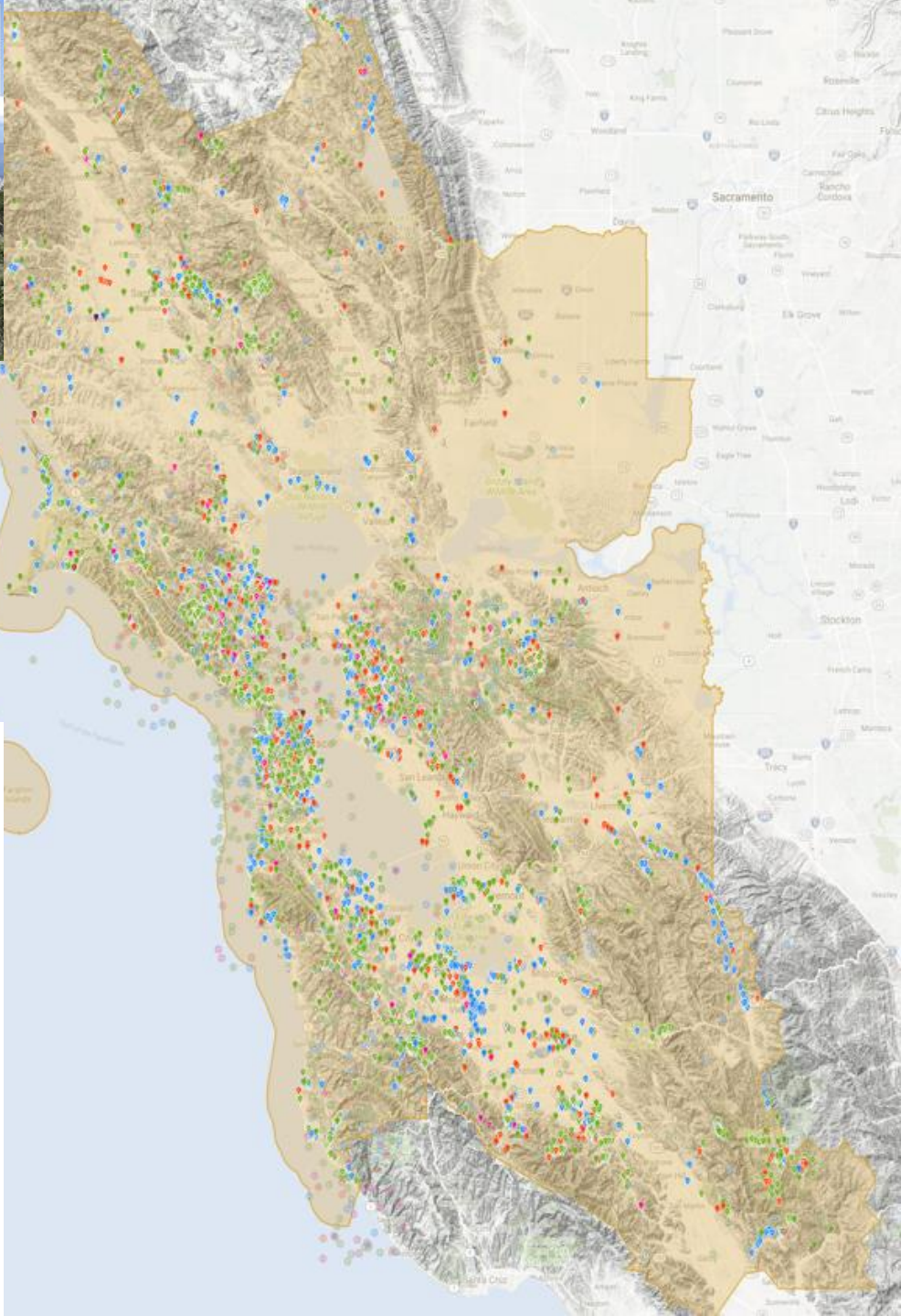


Figure 5. Urban homogenization should lead to a decrease or alteration in surface waterbodies in humid regions (eg Miami) and an increase in arid regions (eg Phoenix), such that the hydrography of urban ecosystems in these diverse regions are more similar than the hydrography of the native ecosystems that they replaced.

City  
Nature  
Challenge  
2018

*San Francisco Bay Area*



Observations



**41737**

San Francisco Bay Area

**34218**

Dallas/Fort Worth

**33448**

San Diego County

Species



**3211**

San Francisco Bay Area

**3088**

Houston

**2946**

San Diego County

People



**1532**

San Francisco Bay Area

**1211**

San Diego County

**992**

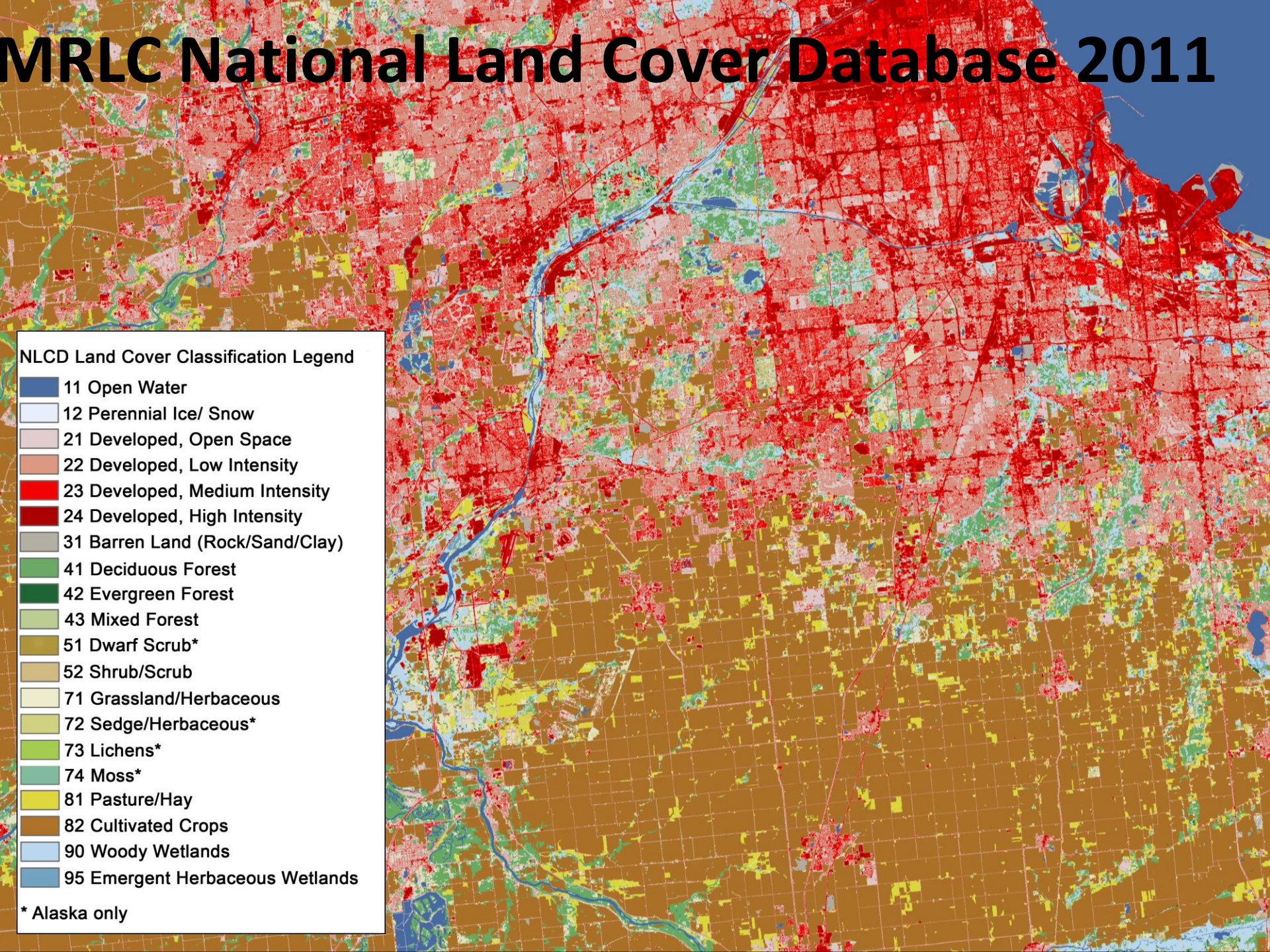
Boston Area

# NLRC National Land Cover Database 2011

## NLCD Land Cover Classification Legend

-  11 Open Water
-  12 Perennial Ice/ Snow
-  21 Developed, Open Space
-  22 Developed, Low Intensity
-  23 Developed, Medium Intensity
-  24 Developed, High Intensity
-  31 Barren Land (Rock/Sand/Clay)
-  41 Deciduous Forest
-  42 Evergreen Forest
-  43 Mixed Forest
-  51 Dwarf Scrub\*
-  52 Shrub/Scrub
-  71 Grassland/Herbaceous
-  72 Sedge/Herbaceous\*
-  73 Lichens\*
-  74 Moss\*
-  81 Pasture/Hay
-  82 Cultivated Crops
-  90 Woody Wetlands
-  95 Emergent Herbaceous Wetlands

\* Alaska only



# As urbanization intensifies, does biodiversity become more similar?

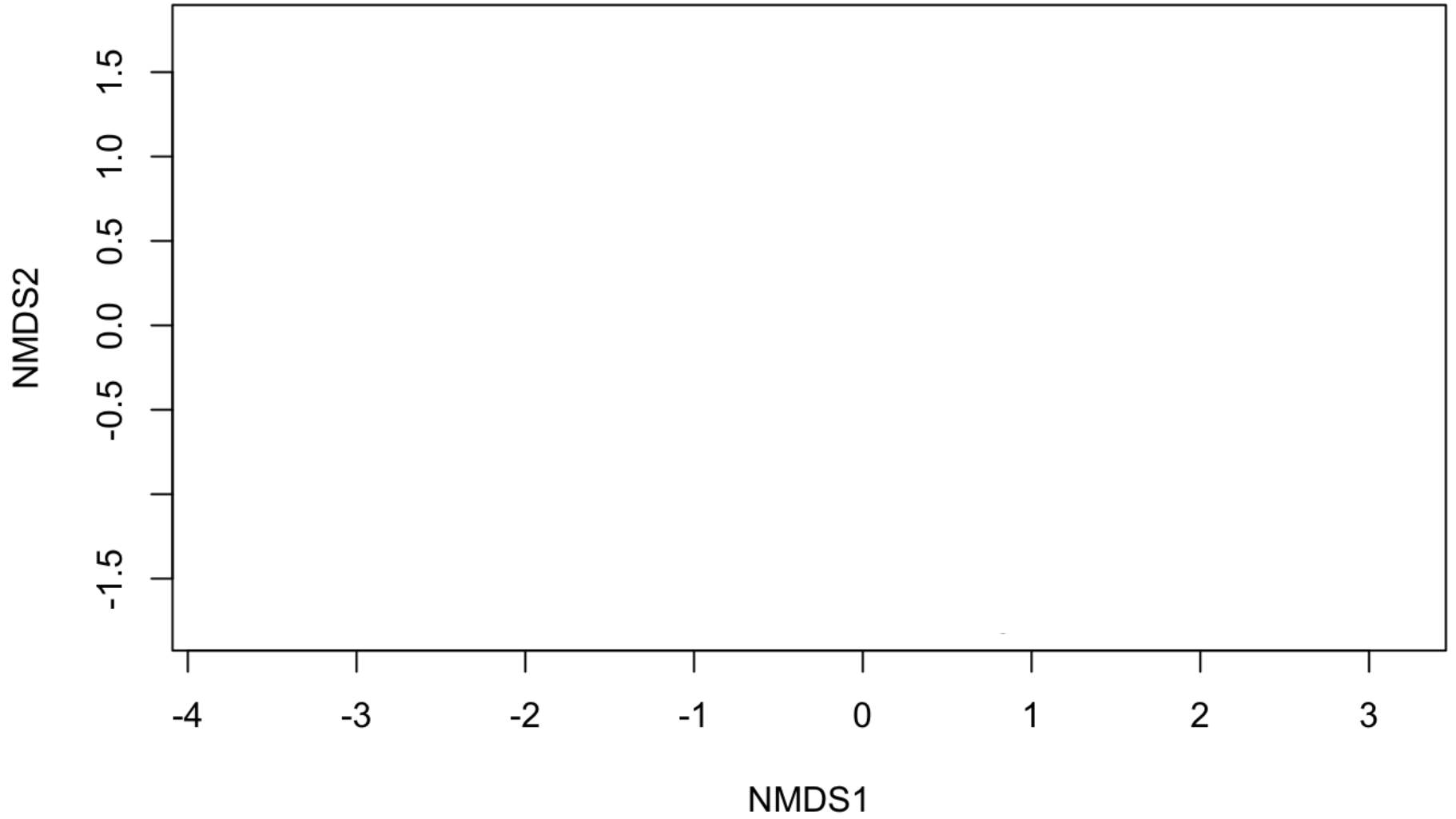
- NMDS

- ex. Is the community composition of highly urbanized Chicago more similar to natural Chicago or highly urbanized Houston?)

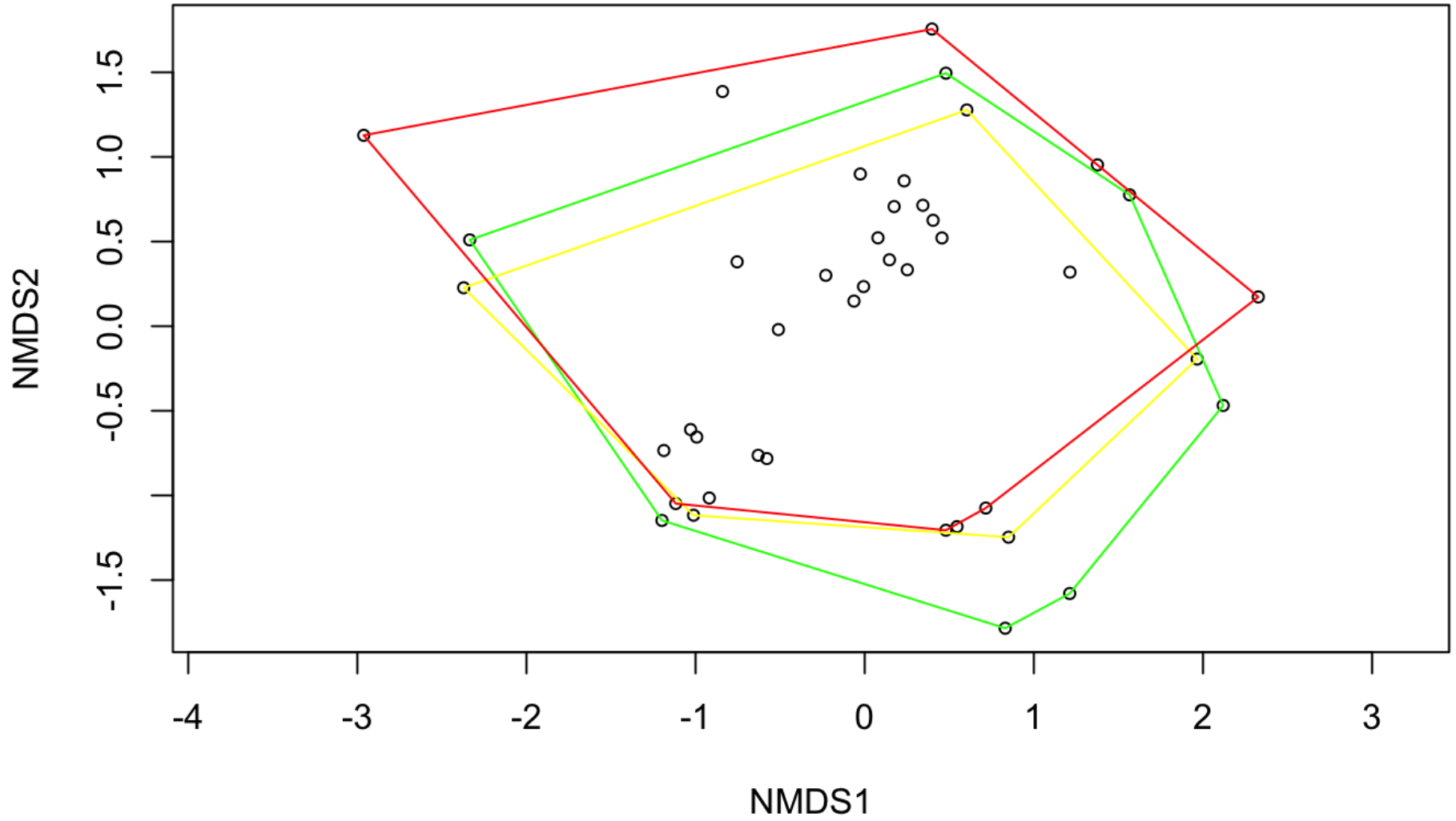
- PERMANOVA

- `adonis(formula = all_matrix ~ all_env$landcover_group, data = all_env, permutations = 999, strata = all_env$hometown)`

# All taxa

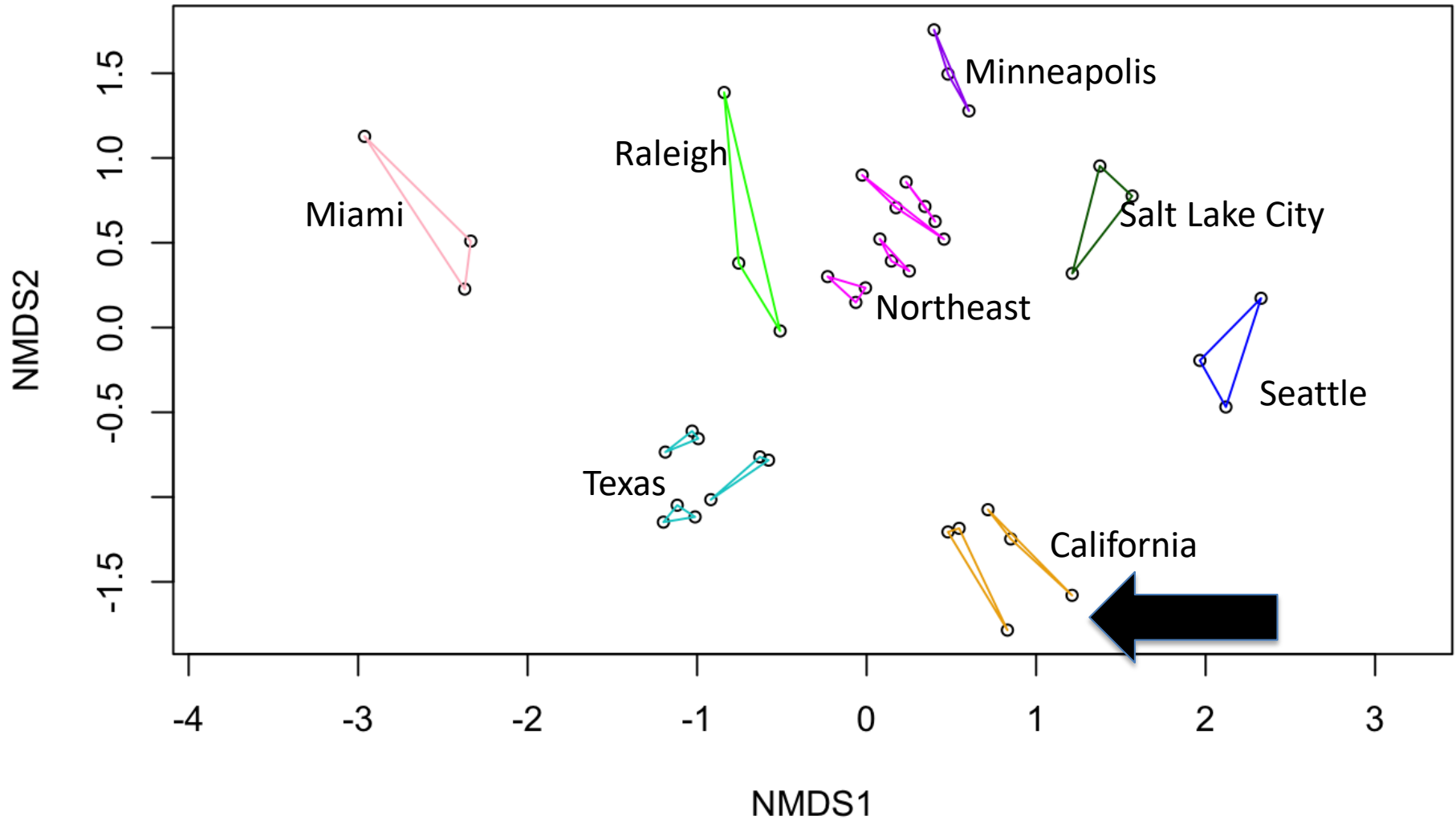


# All taxa



Stress = 0.156; Procrustes: rmse 5.03e-05; max residual 0.0002

### All taxa

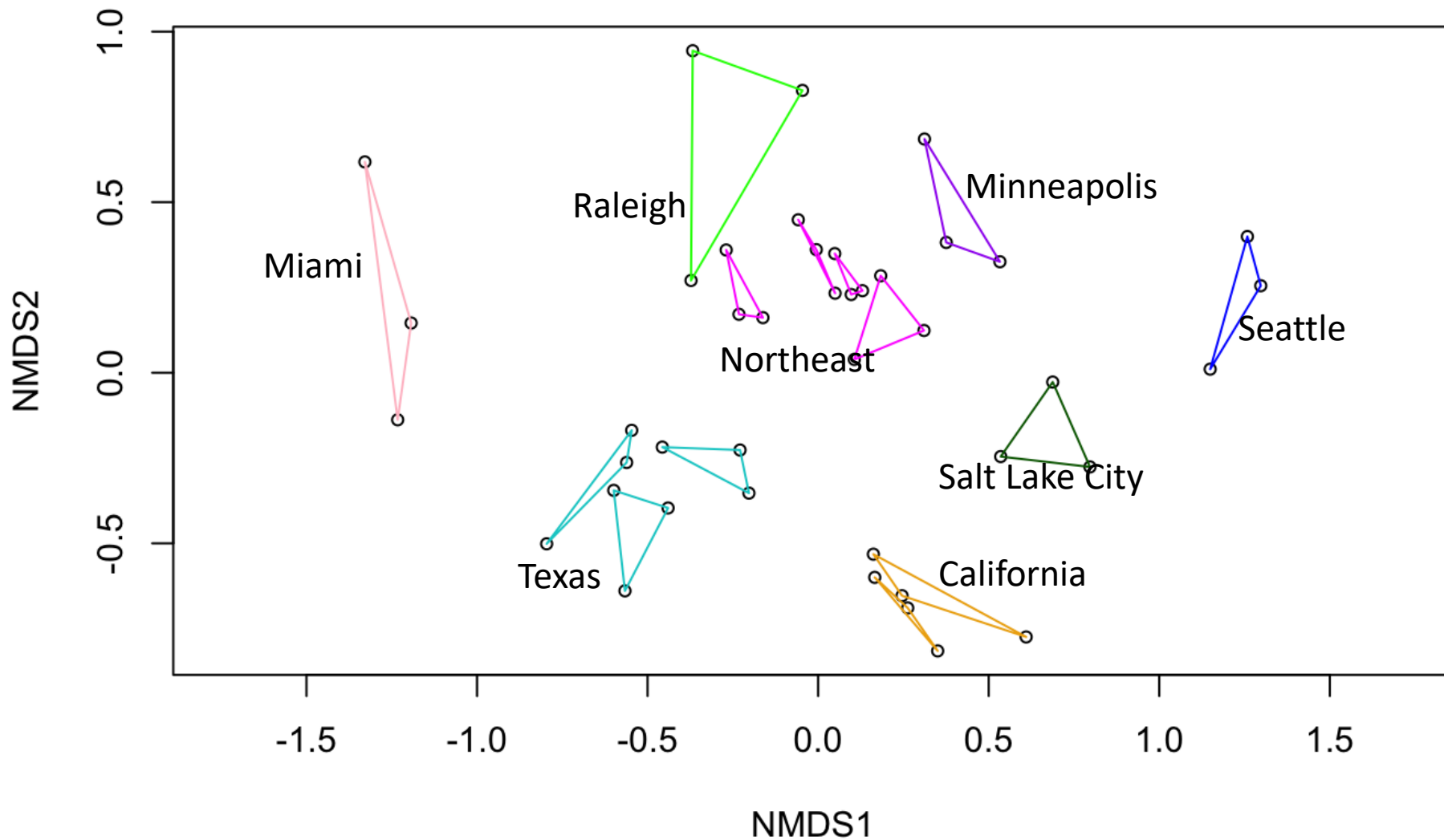


PERMANOVA<sub>NLCD(city)</sub>  
 $p < 0.001$ ;  $R^2 = 0.05$

PERMANOVA<sub>city(NLCD)</sub>  
 $p < 0.001$ ;  $R^2 = 0.70$

Stress = 0.20; Procrustes: rmse 0.01566; max residual 0.0703

### Birds



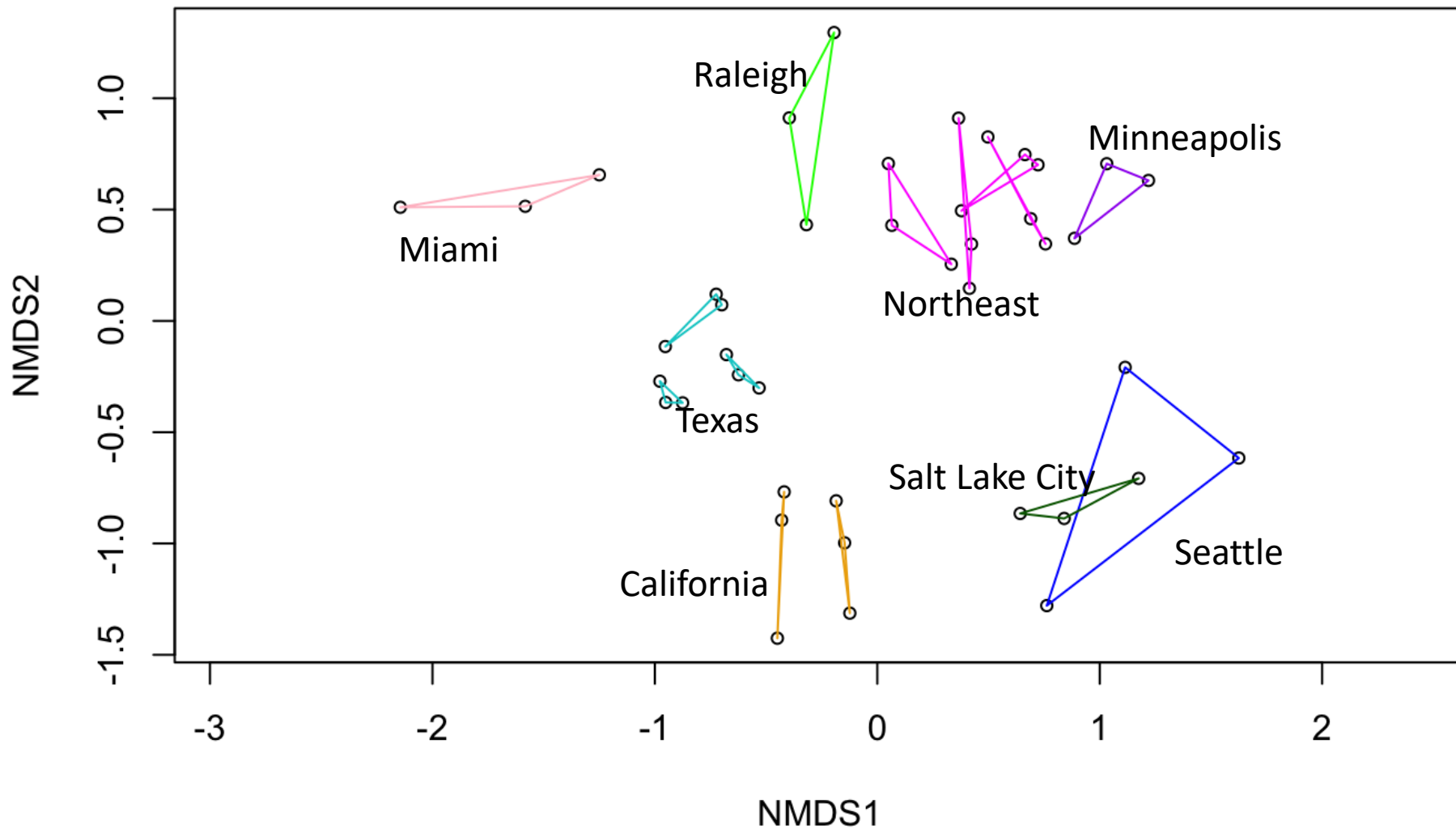
PERMANOVA<sub>NLCD(city)</sub>  
 $p < 0.001$ ;  $R^2 = 0.08$

PERMANOVA<sub>city(NLCD)</sub>  
 $p < 0.001$ ;  $R^2 = 0.64$



Stress = 0.1977; Procrustes: rmse 0.00836; max residual 0.0378

## Non-bird animals

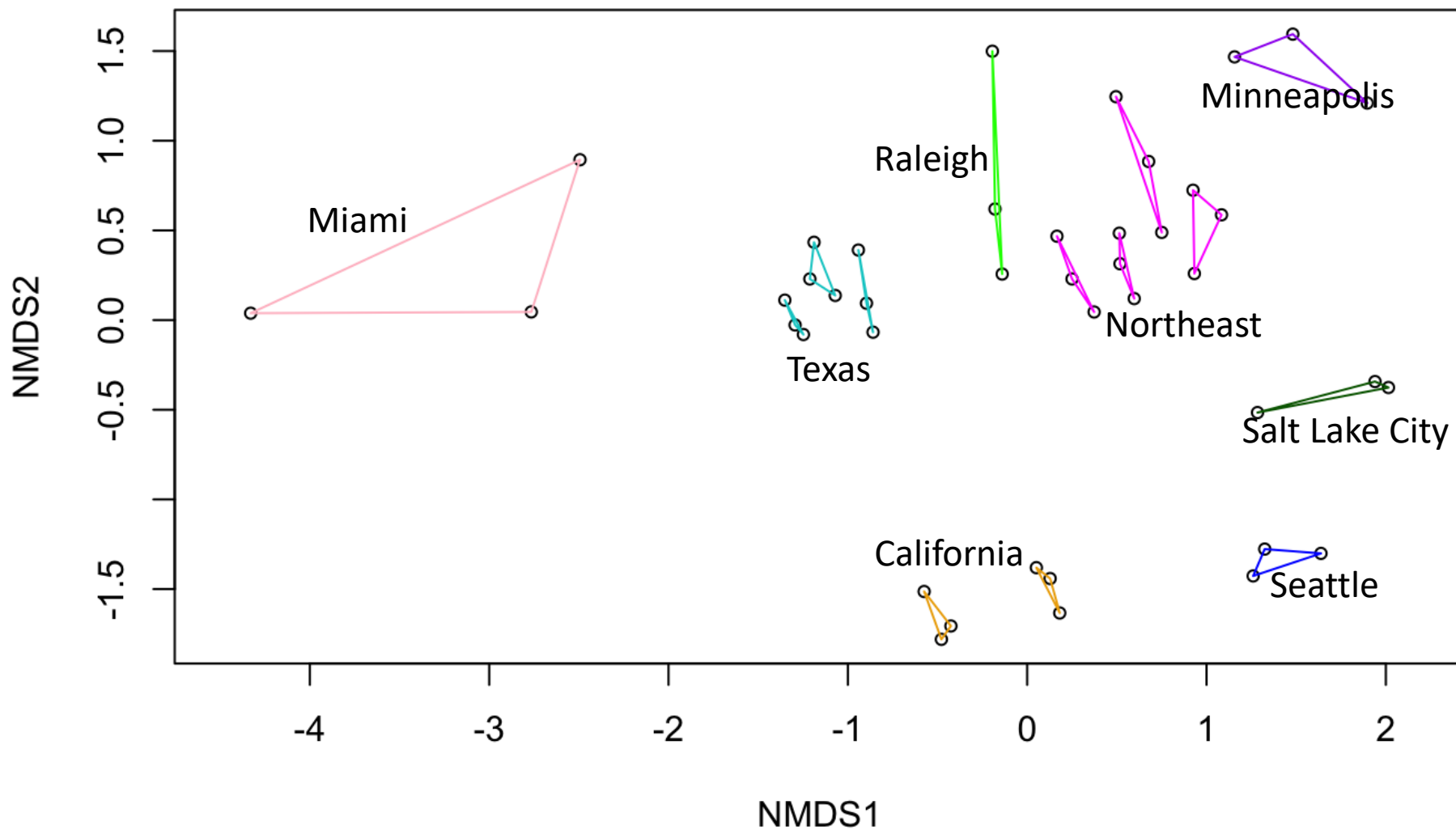


PERMANOVA<sub>NLCD(city)</sub>  
 $p < 0.001$ ;  $R^2 = 0.05$

PERMANOVA<sub>city(NLCD)</sub>  
 $p < 0.001$ ;  $R^2 = 0.66$

Stress = 0.133; Procrustes: rmse 0.0031; max residual 0.0135

## Plants



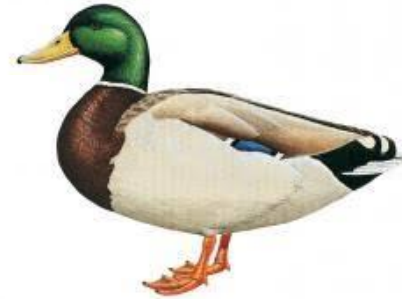
PERMANOVA<sub>NLCD(city)</sub>  
 $p < 0.001$ ;  $R^2 = 0.04$

PERMANOVA<sub>city(NLCD)</sub>  
 $p < 0.001$ ;  $R^2 = 0.71$

# Most common species

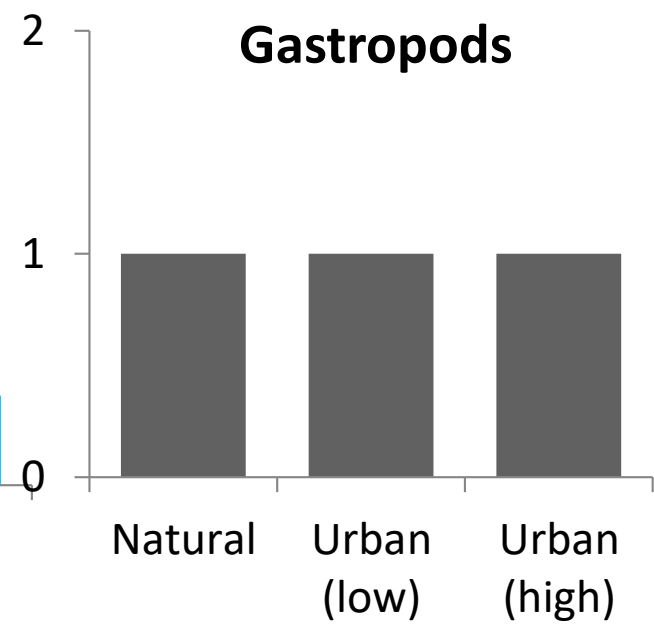
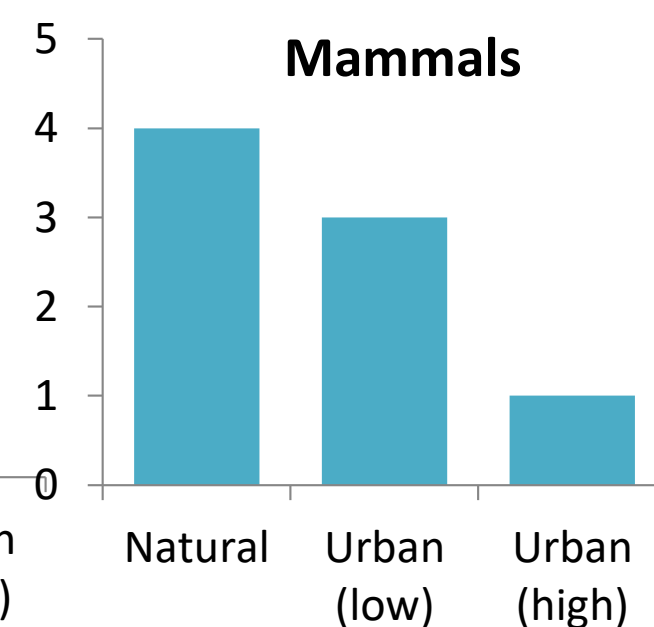
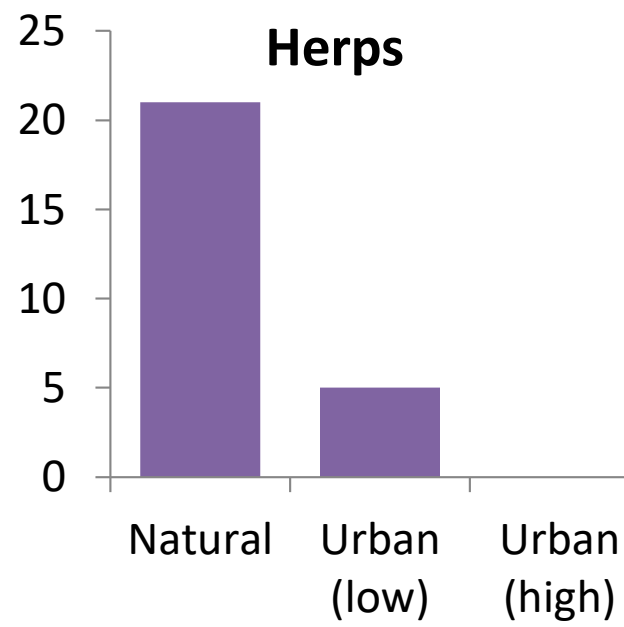
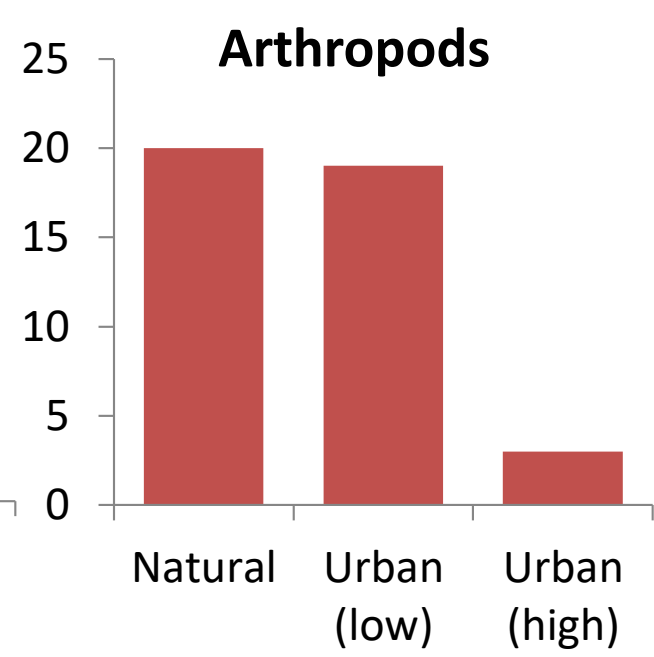
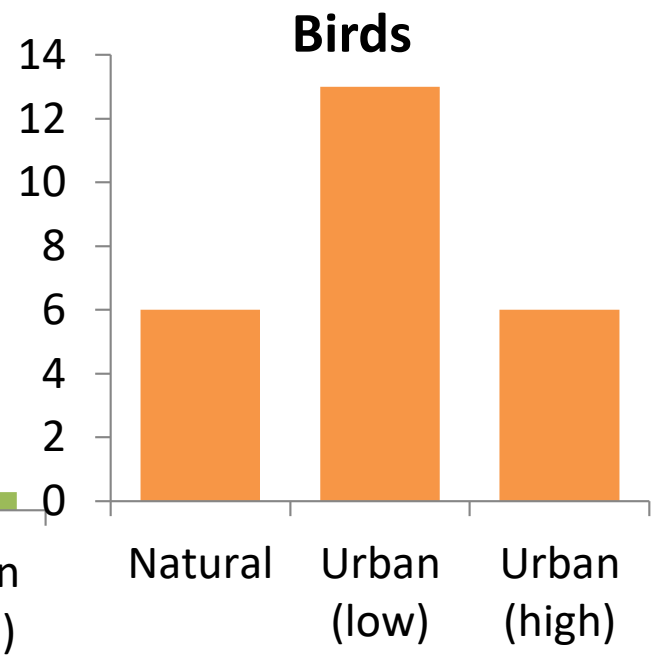
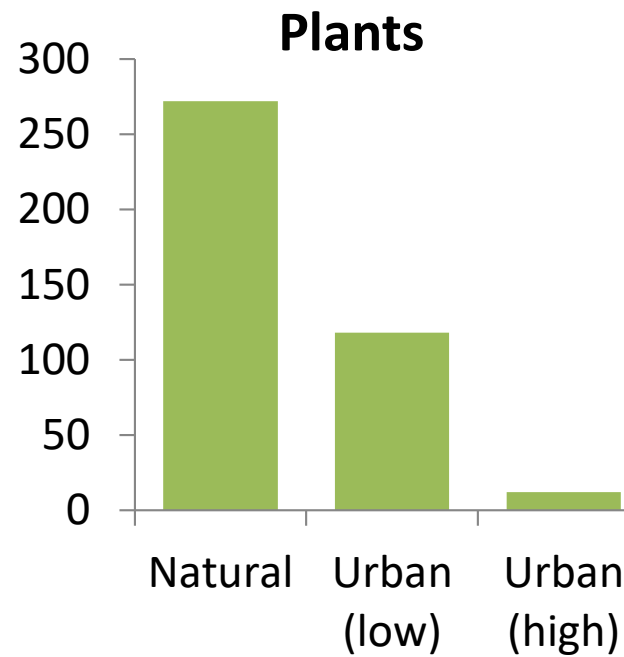
- Divided species by taxa
- Ranked them in order of most to least frequently observed by land use type, nested by city

Natural ← Everywhere → Urban



# Over-representation

1. Filtered out species found at least 10 times.
2. Divided # of times found in each land use type by total # of times found.
3. If this proportion was greater than  $0.33 + 1$  sd, considered it “over-represented)”



# Over-representation in high urban

- Birds
  - *Columba livia* (pigeon)
  - *Zenaida asiatica* (mourning dove)
  - *Passer domesticus* (house sparrow)
  - *Spinus psaltria* (goldfinch)
  - *Pica hudsonia* (magpie)
- Arthropods
  - *Schistocerca nitens* (grasshopper)
  - *Polistes dominula* (European paper wasp)
  - *Aphis nerii* (oleander aphid)
- Mammals
  - *Otospermophilus beecheyi* (California ground squirrel)
- Gastropods
  - *Cepaea nemoralis* (grove snail)



# Future work

- Expansion
  - Specialization indices and trait data
  - International comparisons
- Methodology
  - 2016 vs 2017 vs 2018
  - Research grade versus verifiable observations
  - CNC vs general iNat vs GBIF



# THANKS!

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