

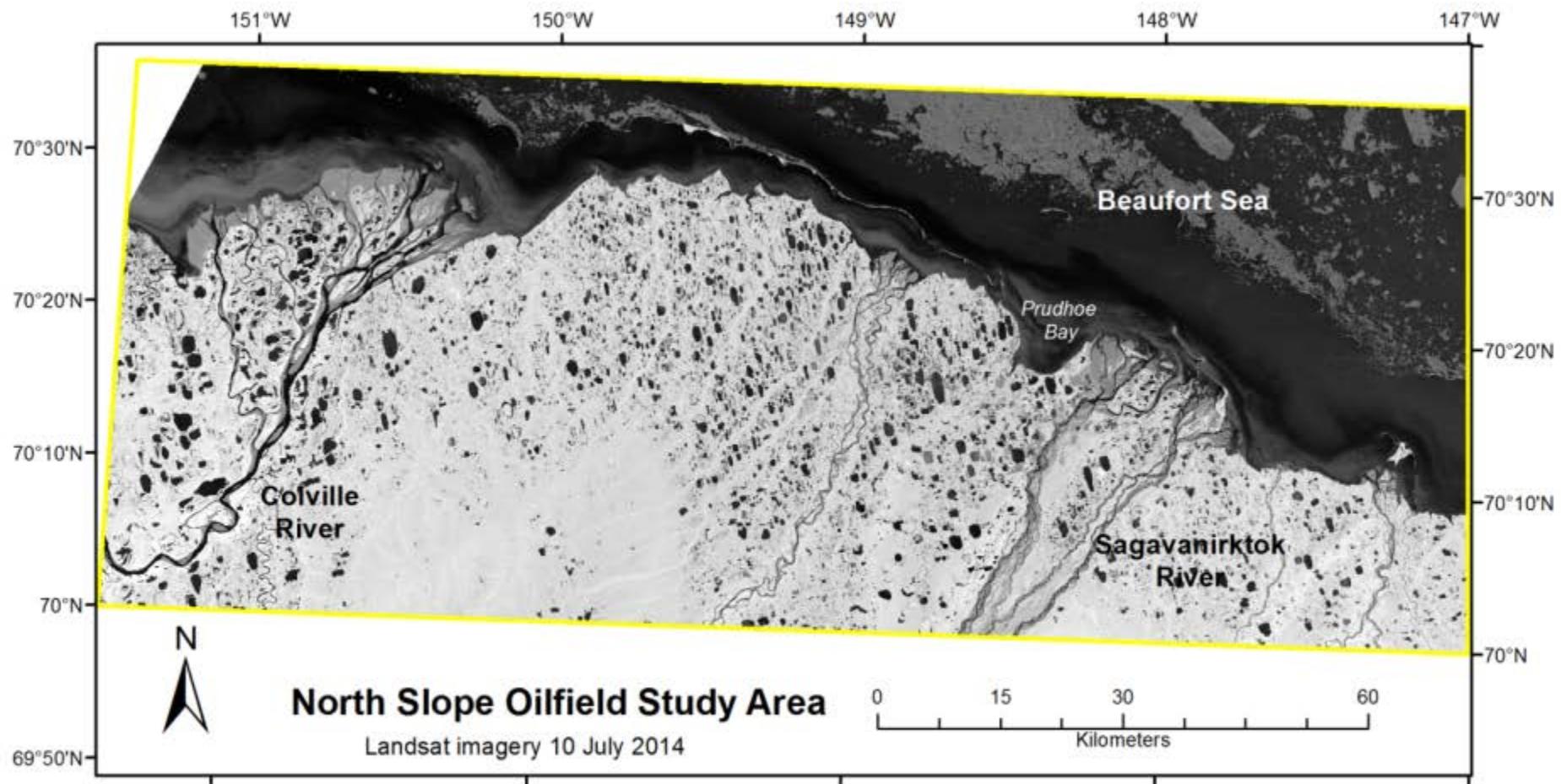
# Landsat analysis of vegetation change in the Alaska North Slope Oilfields region using NDVI and tasseled-cap indices

**Martha Raynolds**  
*University of Alaska Fairbanks*

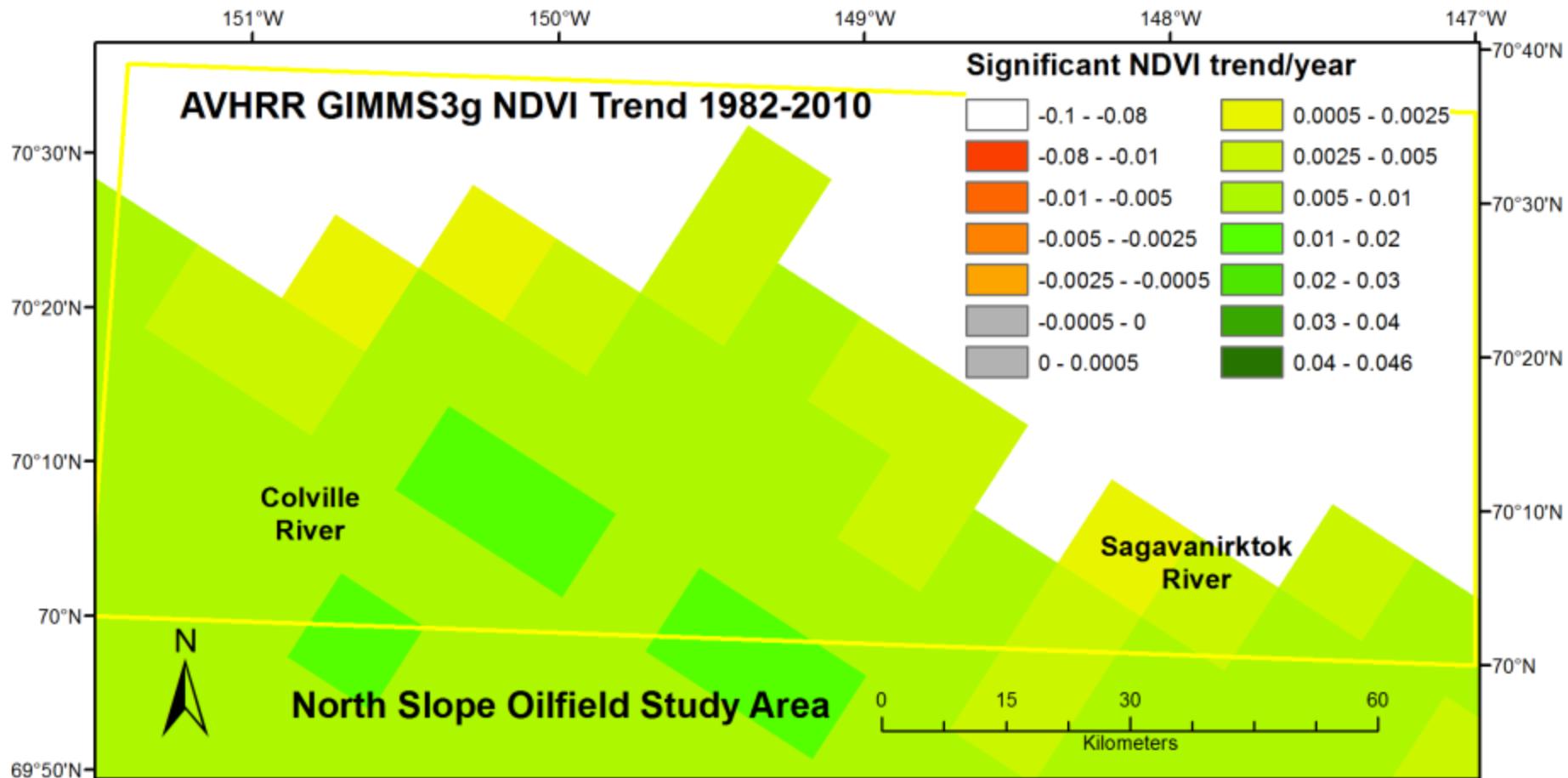
Arctic Biomass Final Workshop  
20-23 October 2015  
Longyearbyen, Svalbard



# Study Area



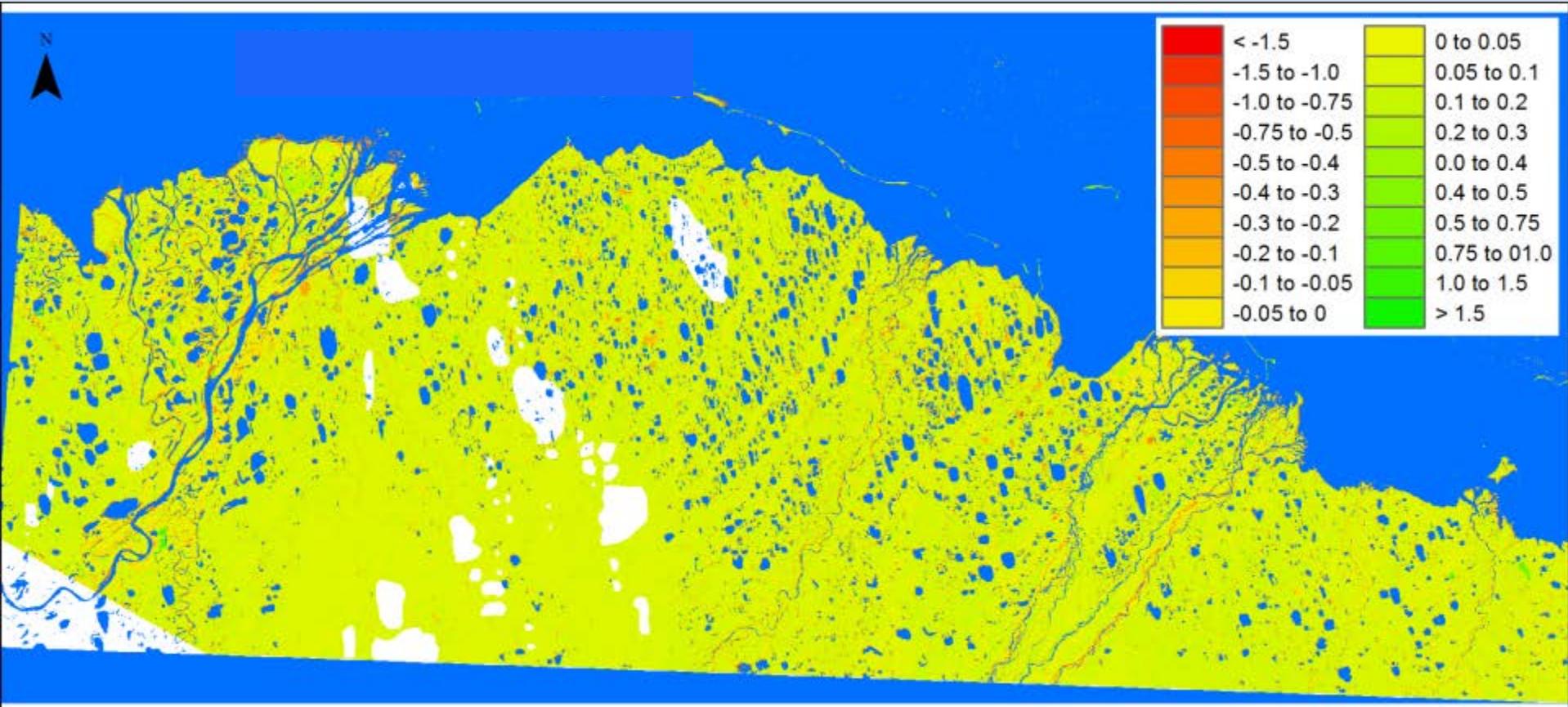
# AVHRR GIMMS3g NDVI trend



- All trends are positive, though most are small

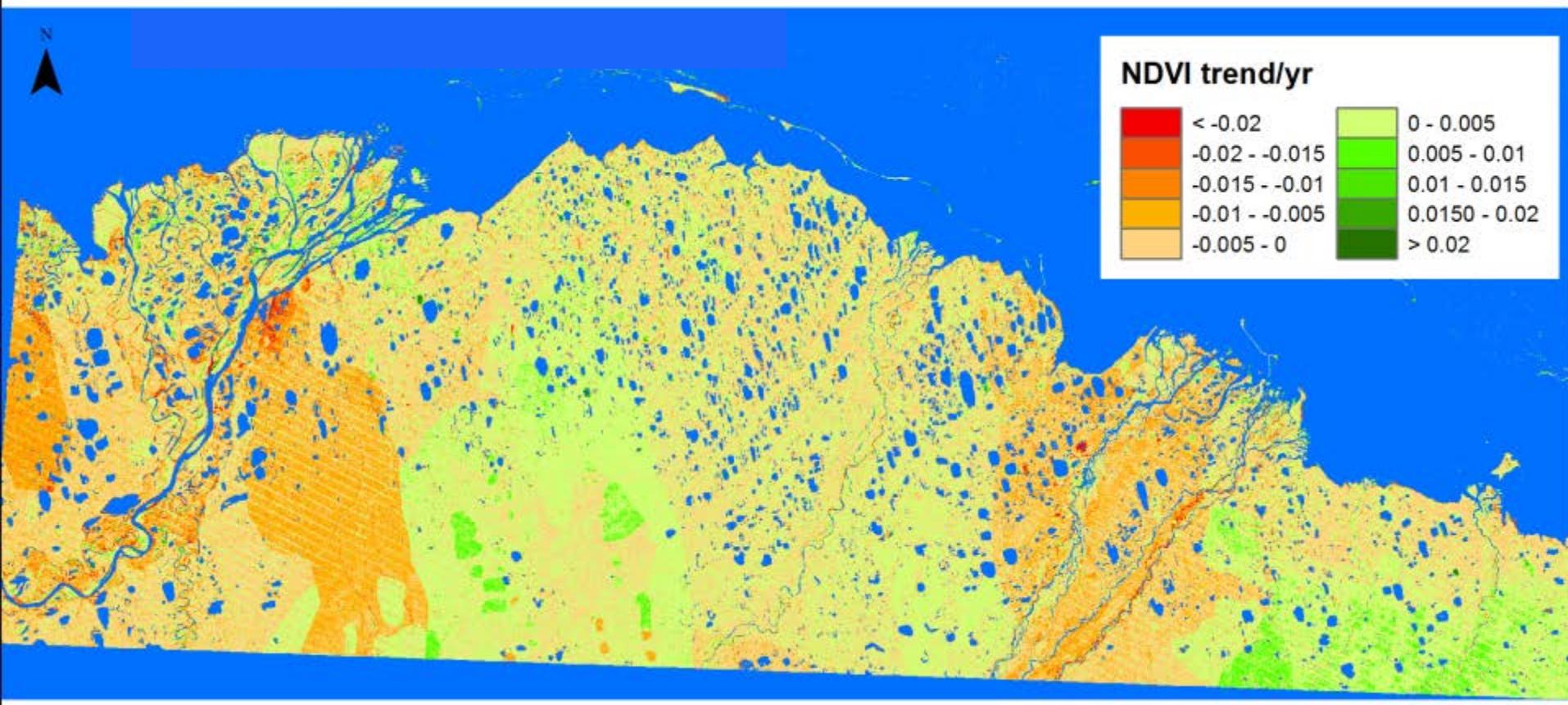
# Landsat difference map

## Subtracting 1977 from 2011

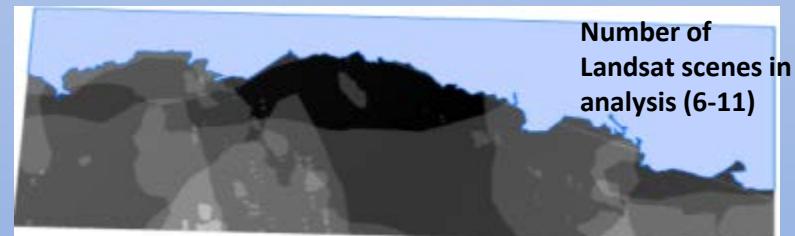


- The difference is positive overall (mean = 0.06 NDVI units = 0.002 NDVI units/year)
- Similar scale of NDVI change as seen with GIMMS data

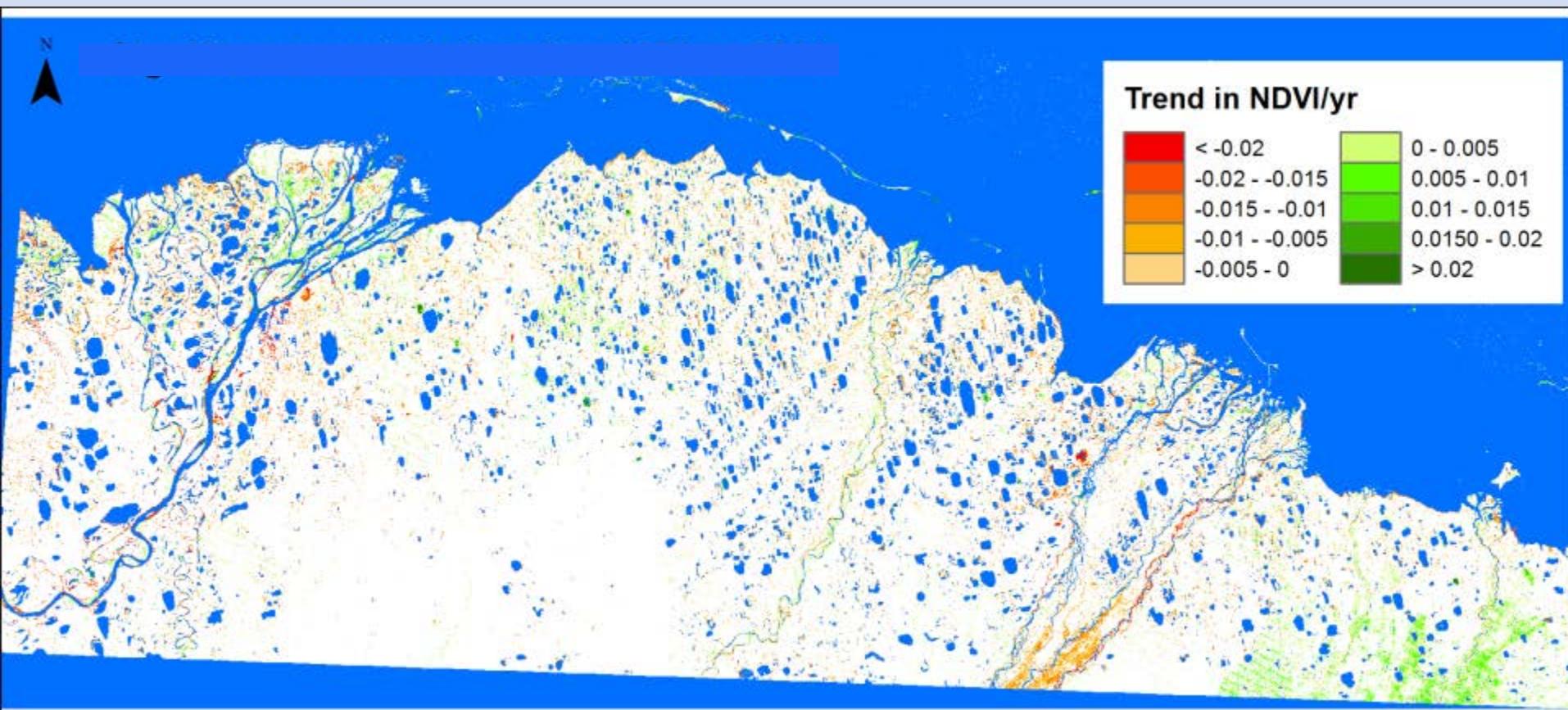
# Landsat NDVI trend 1977 to 2011



- Average is negative: - 0.0024 NDVI units/yr
- Patchiness due to variable cloud cover in different years: 1977, 1979, 1985, 1986, 1989, 2001, 2002, 2005, 2007, 2008, 2009, 2011

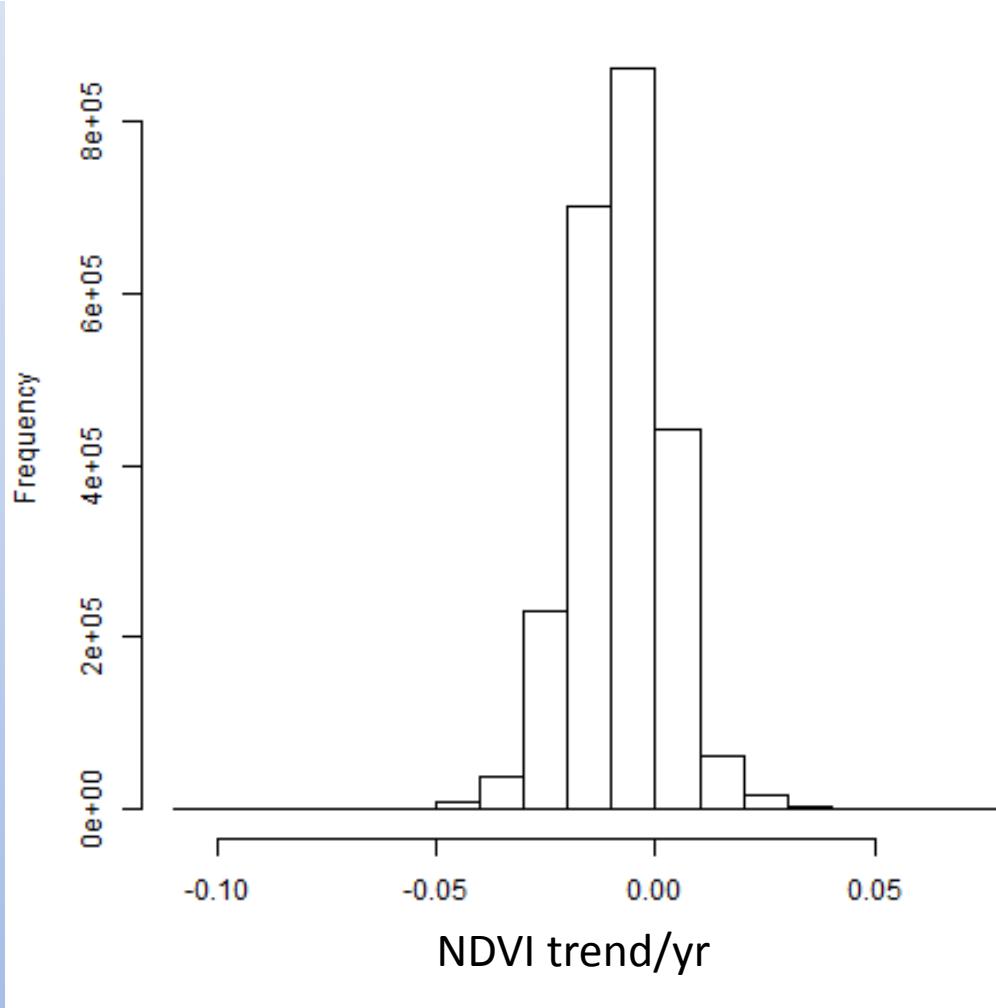


# Significant trends in Landsat NDVI 1977 to 2011



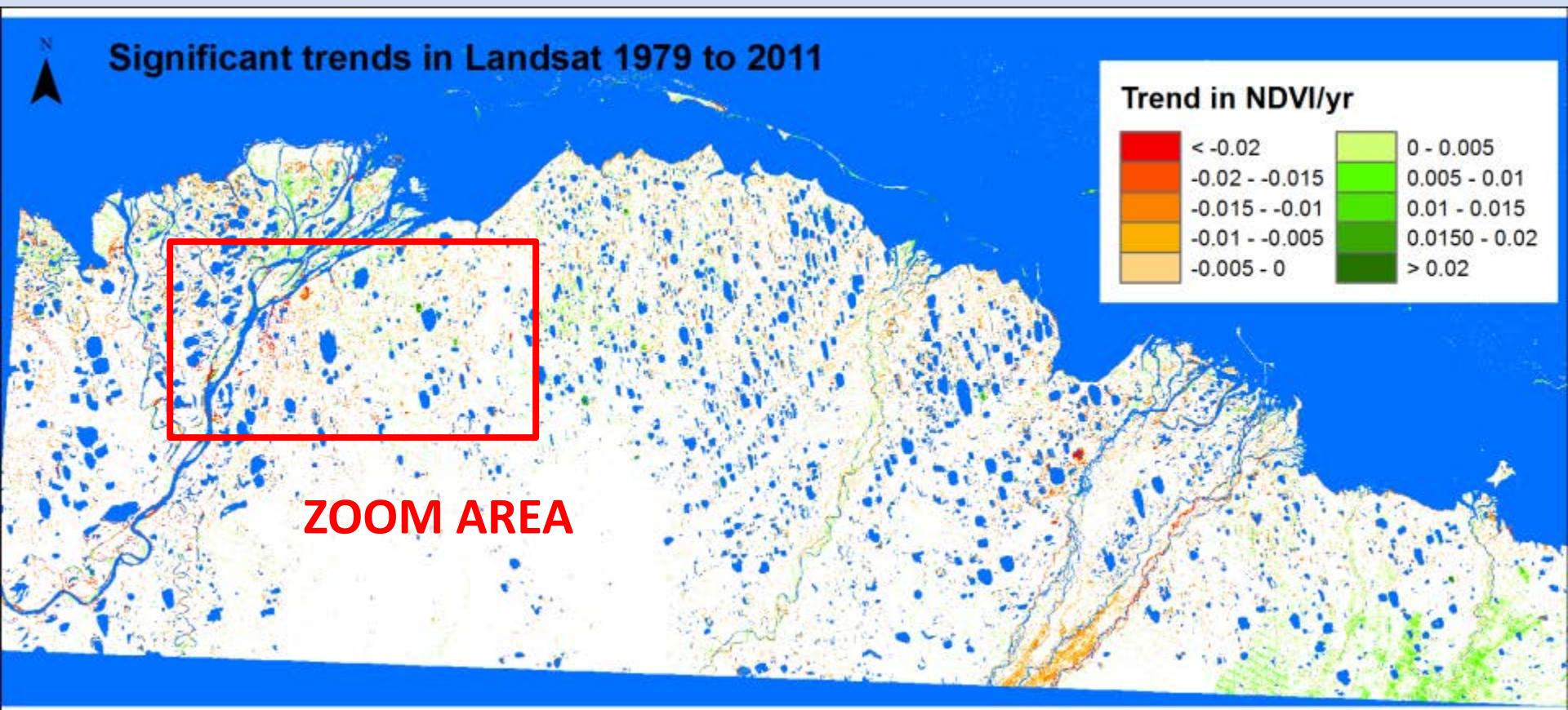
- Significant trends are negative overall (mean = - 0.0037 NDVI units/year)
- Small amount of area has significant trends (< 10 %)

# Histogram of Significant Trends in Landsat NDVI 1977-2011

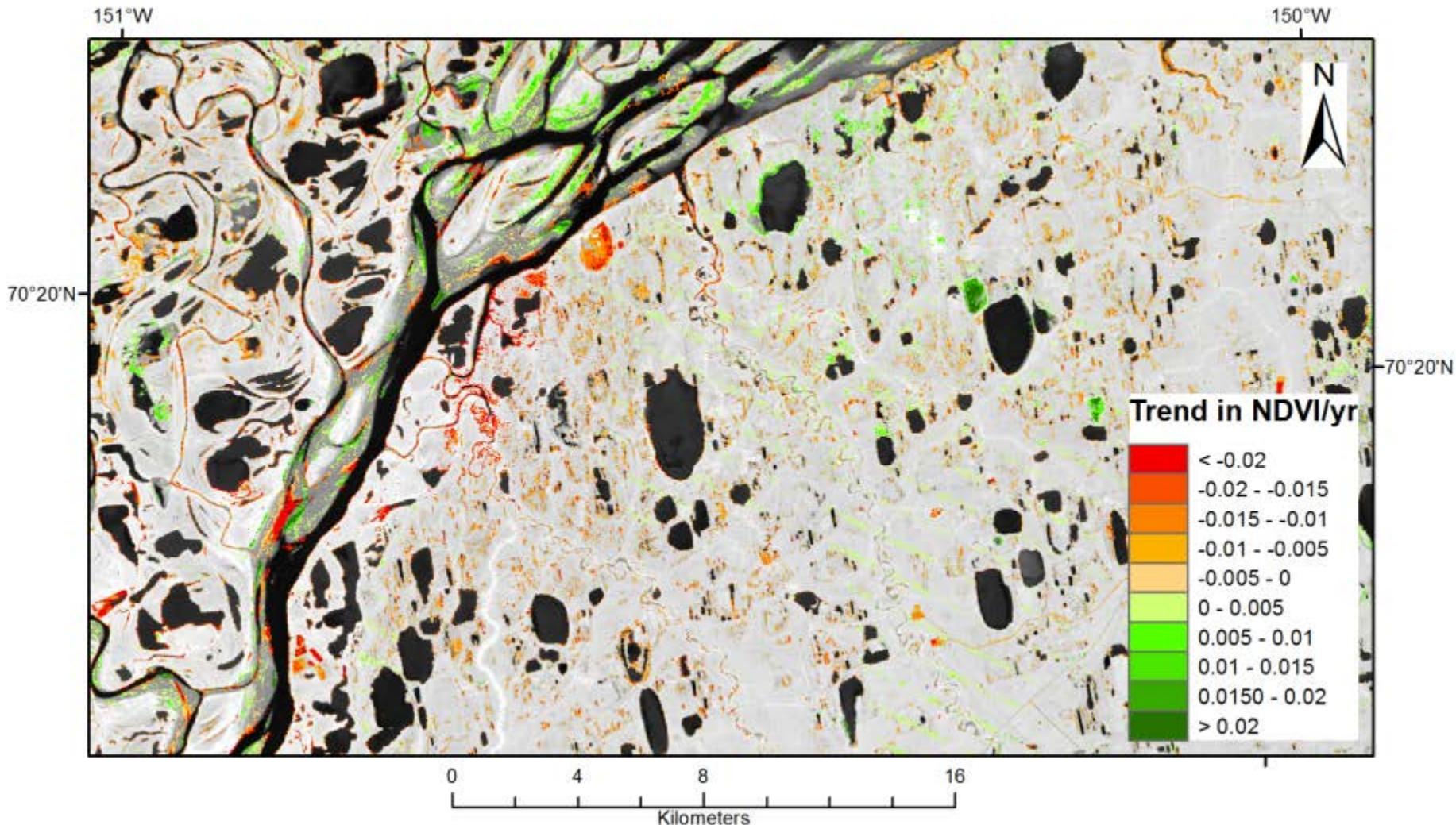


mean = - 0.0037 NDVI units/year

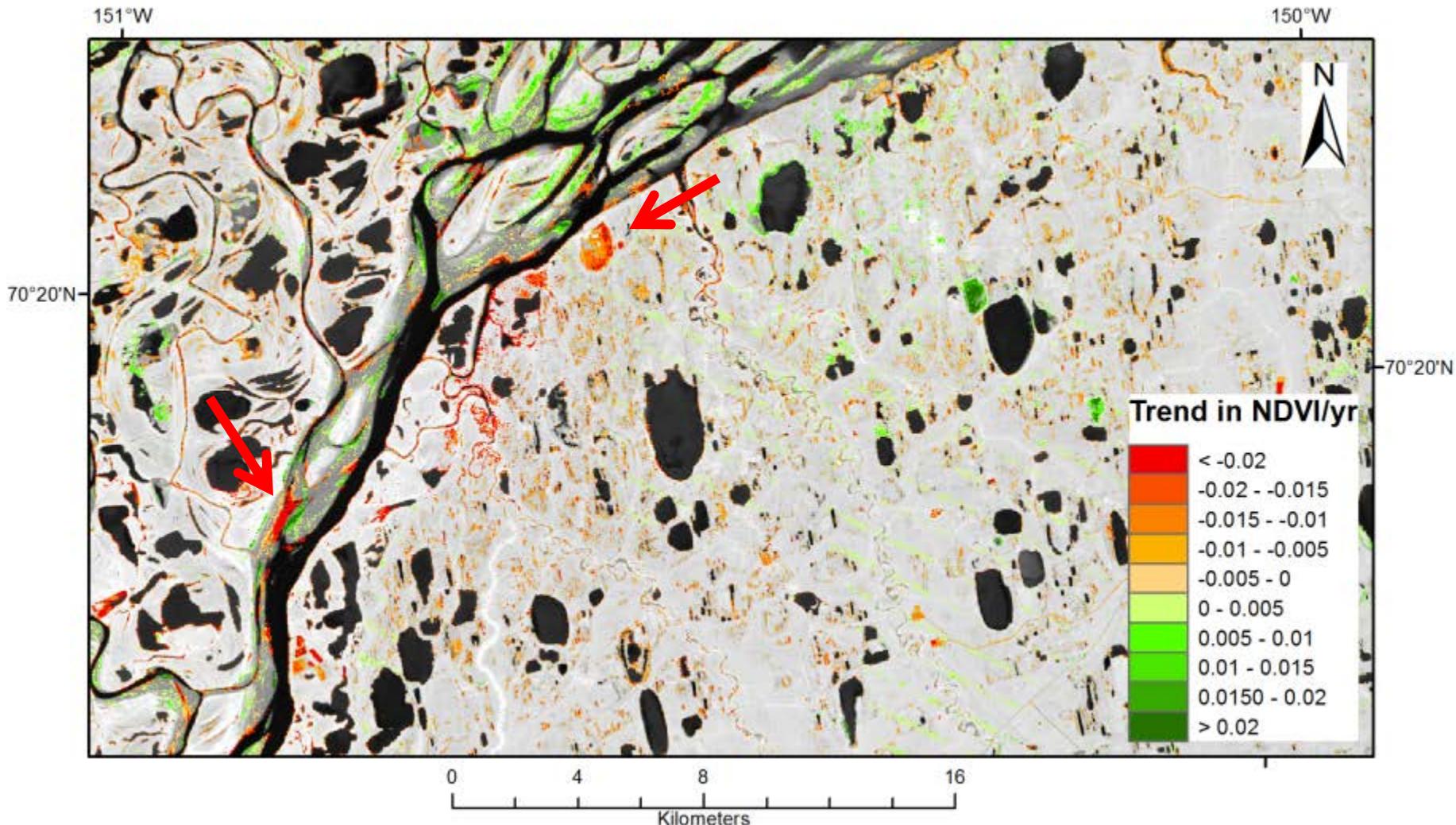
# Significant trends in Landsat NDVI 1977 to 2011



# Significant trends in Landsat NDVI 1977 to 2011

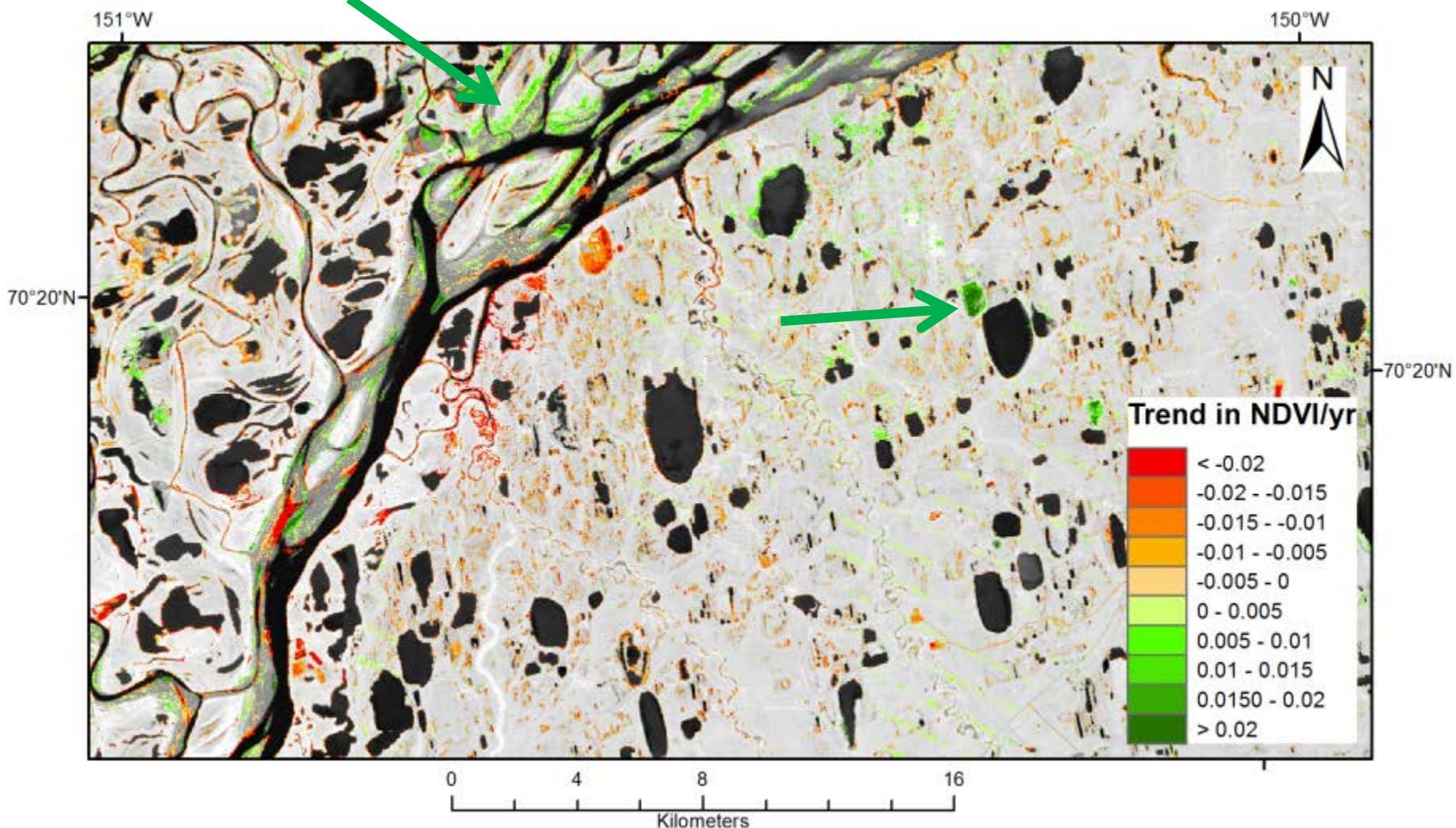


# Significant trends in Landsat NDVI 1977 to 2011



Decreases in NDVI (orange) – changes in river channel, newly drained lake

# Significant trends in Landsat NDVI 1977 to 2011



Decreases in NDVI (orange) – changes in river channel, newly drained lake

Increases in NDVI (green) – succession on river bars and previously drained lakes

# Tasseled-Cap Index Transformation

- Orthogonal statistical analysis (like Principal Components Analysis (PCA))
  - Designed for Landsat data
  - Separate transformations developed for TM and ETM data, none available for Landsat 8 data yet
- Uses 6 Landsat bands (1, 2, 3, 4, 5 and 7)
- Returns 3 indices
  - Tasseled-Cap Index 1 – Brightness
  - Tasseled-Cap Index 2 - Greenness
  - Tasseled-Cap Index 3 – Wetness
- Processed in ENVI using the MSS and TM Tasseled-Cap Transformations
  - Used 1985, 1986, 1989, 2001, 2002, 2007, 2008, 2009, 2011
  - Could not use 1977, 1979 (MSS), or 2005 (SLC gaps)

(Crist and Cicone 1984)

# Circumpolar Vegetation Physiognomy Categories from the Circumpolar Arctic Vegetation Map(CAVM)



**Significant trend in NDVI**

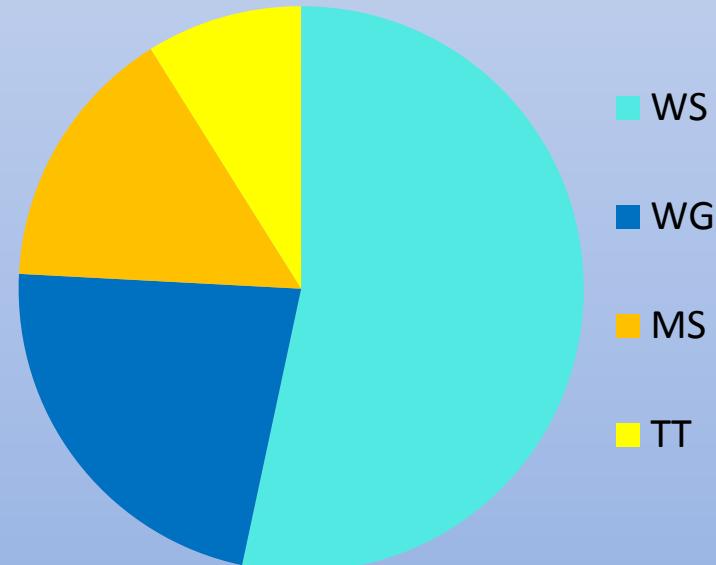
**MS** – Moist non-tussock sedge, dwarf shrub, moss tundra

**TT** – Moist tussock sedge, dwarf shrub, moss tundra

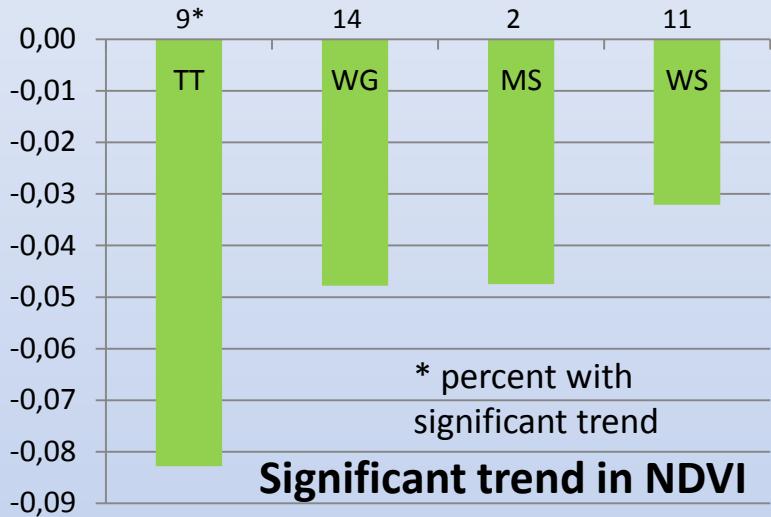
**WG** – Wet graminoid, moss tundra

**WS** – Wet sedge, moss tundra

**CAVM cover types (% land area)**



## Circumpolar Vegetation categories (CAVM)



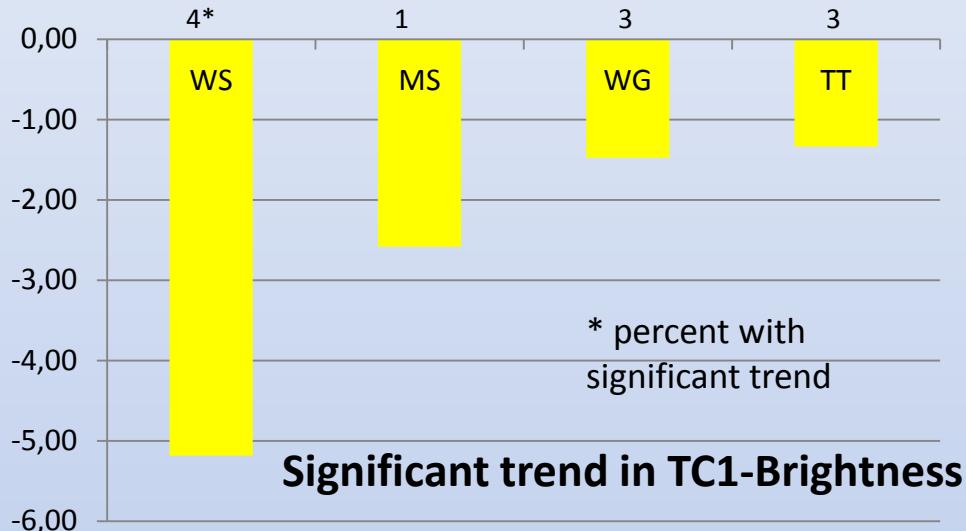
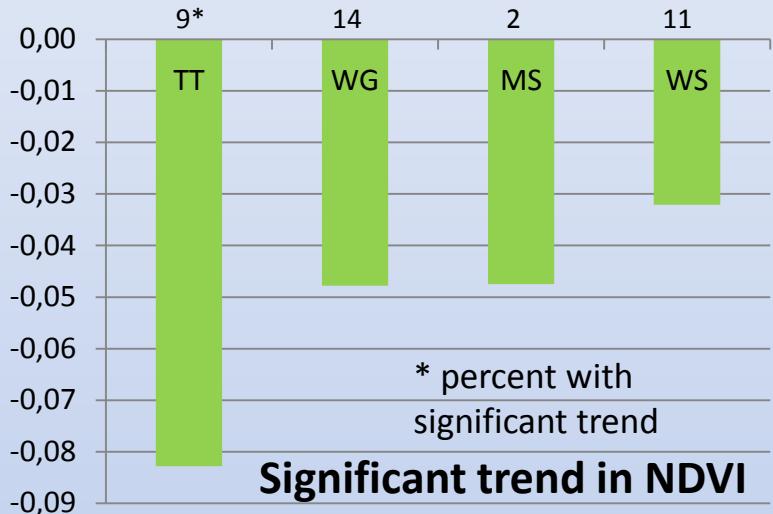
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## Circumpolar Vegetation categories (CAVM)



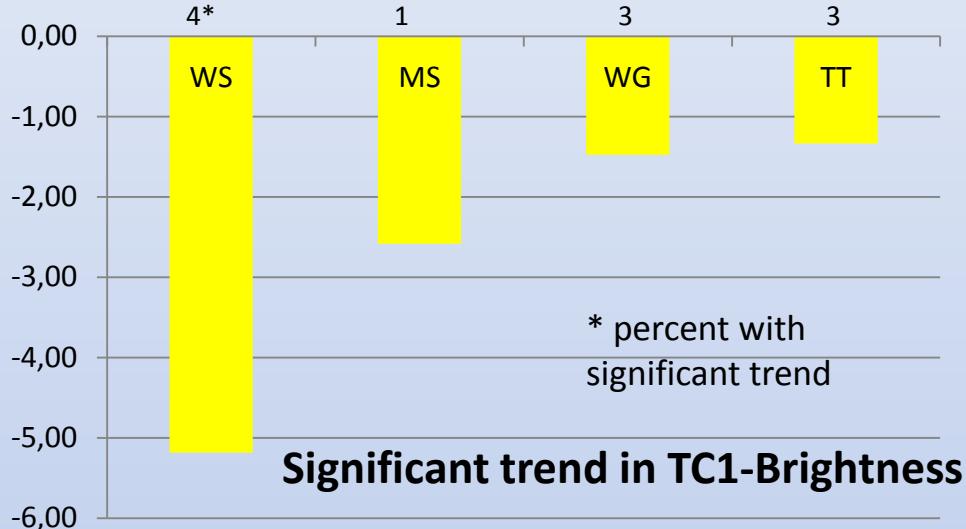
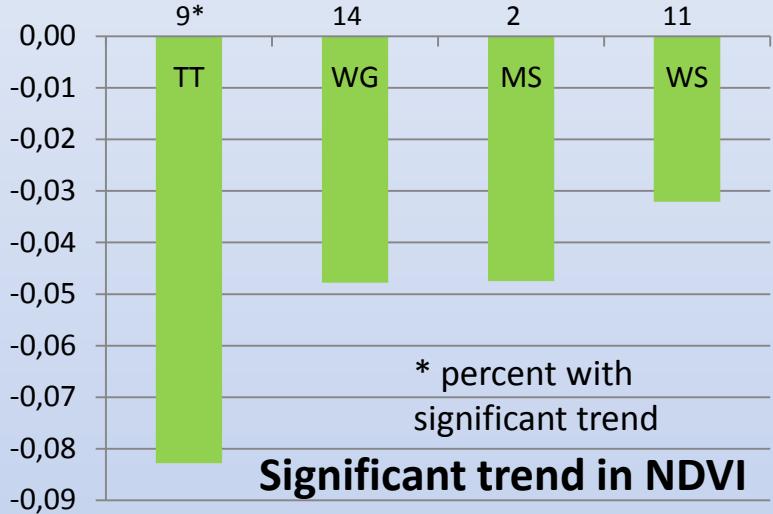
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## Circumpolar Vegetation categories (CAVM)

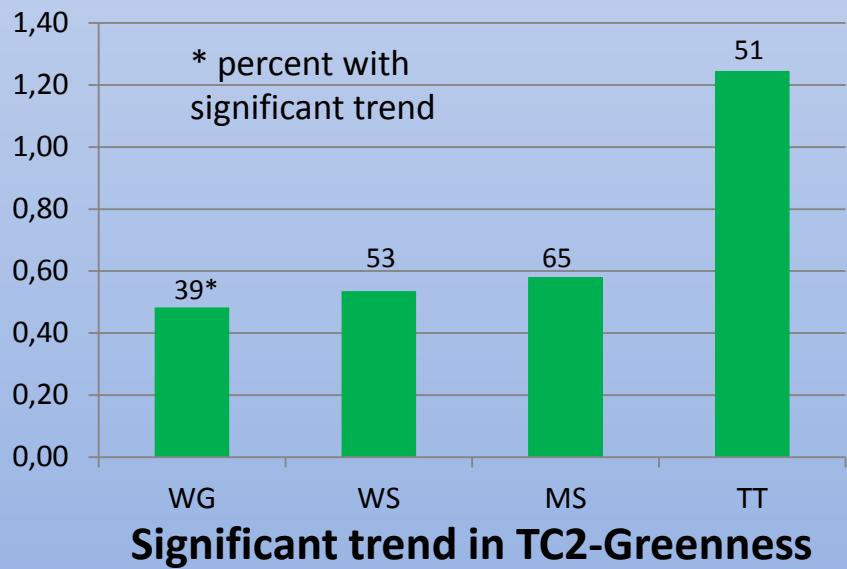


**MS** – Moist non-tussock sedge, dwarf shrub, moss tundra

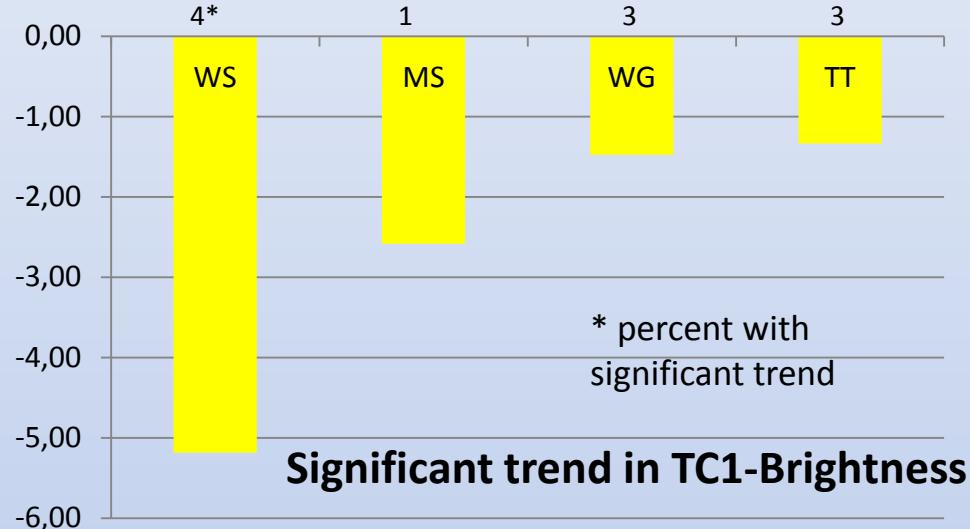
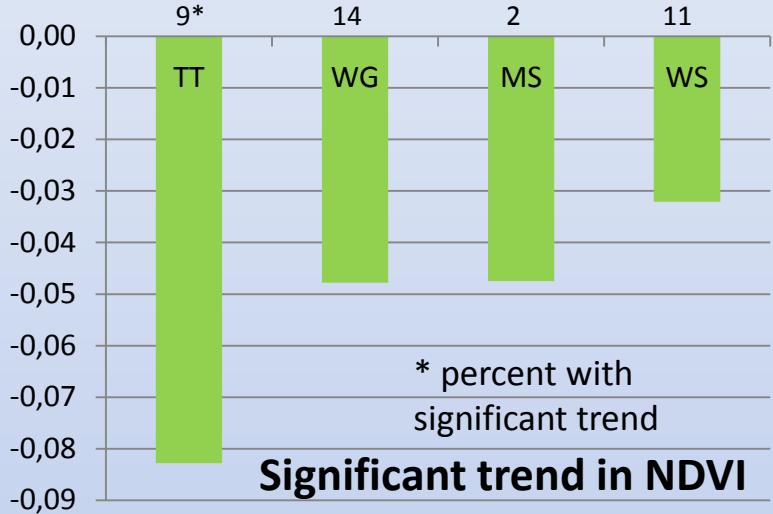
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## Circumpolar Vegetation categories (CAVM)

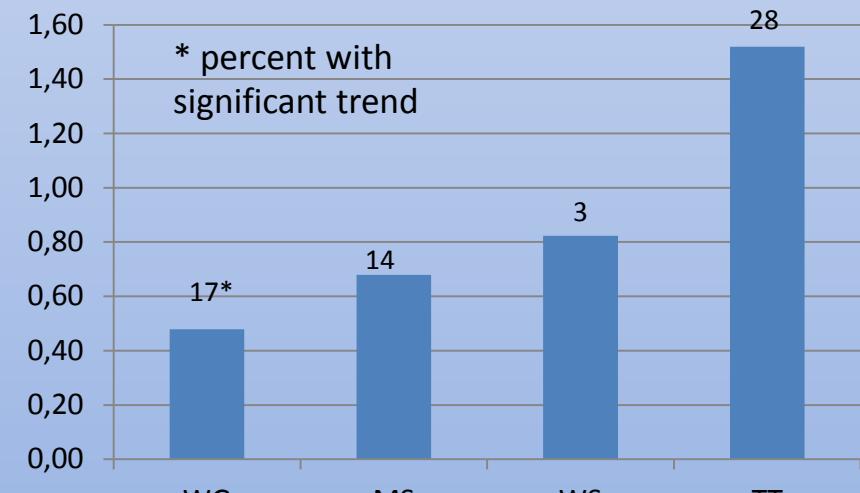
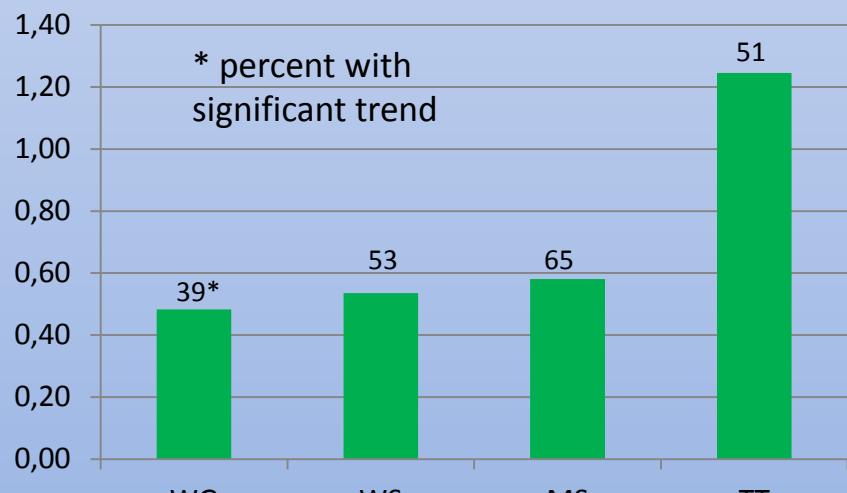


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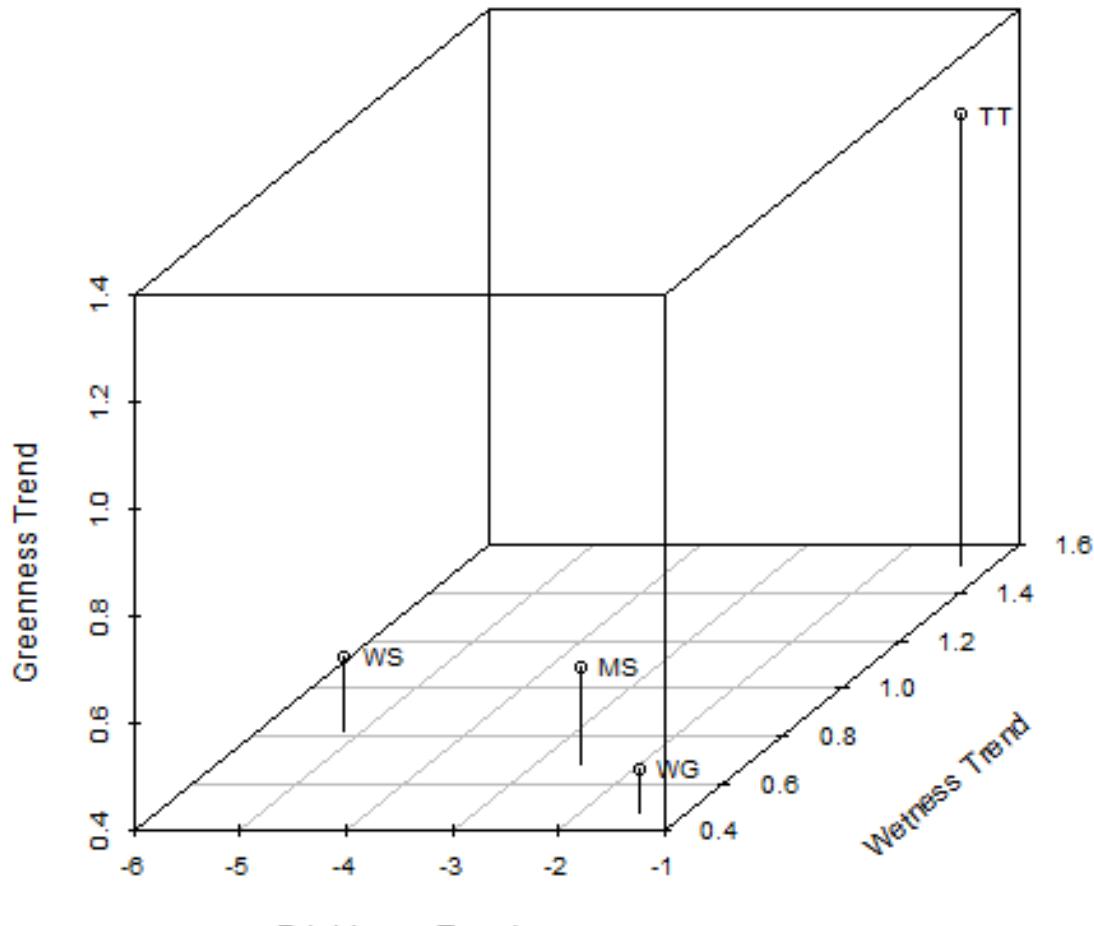
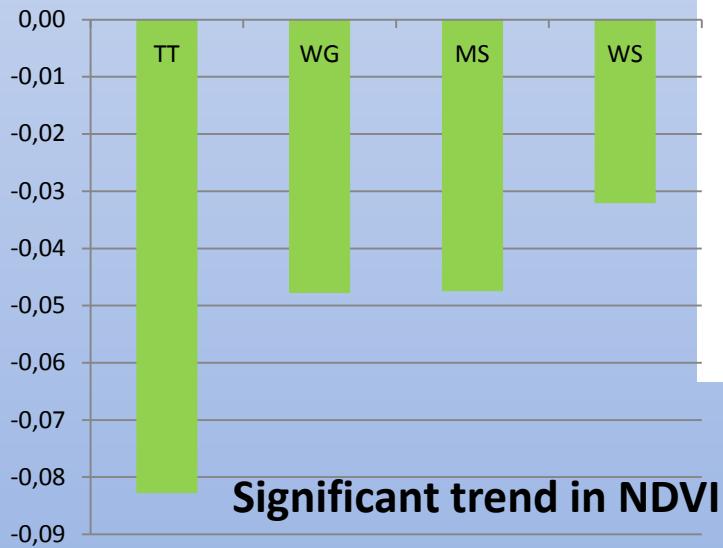
**WS** – Wet sedge, moss tundra



**Significant trend in TC2-Greenness**

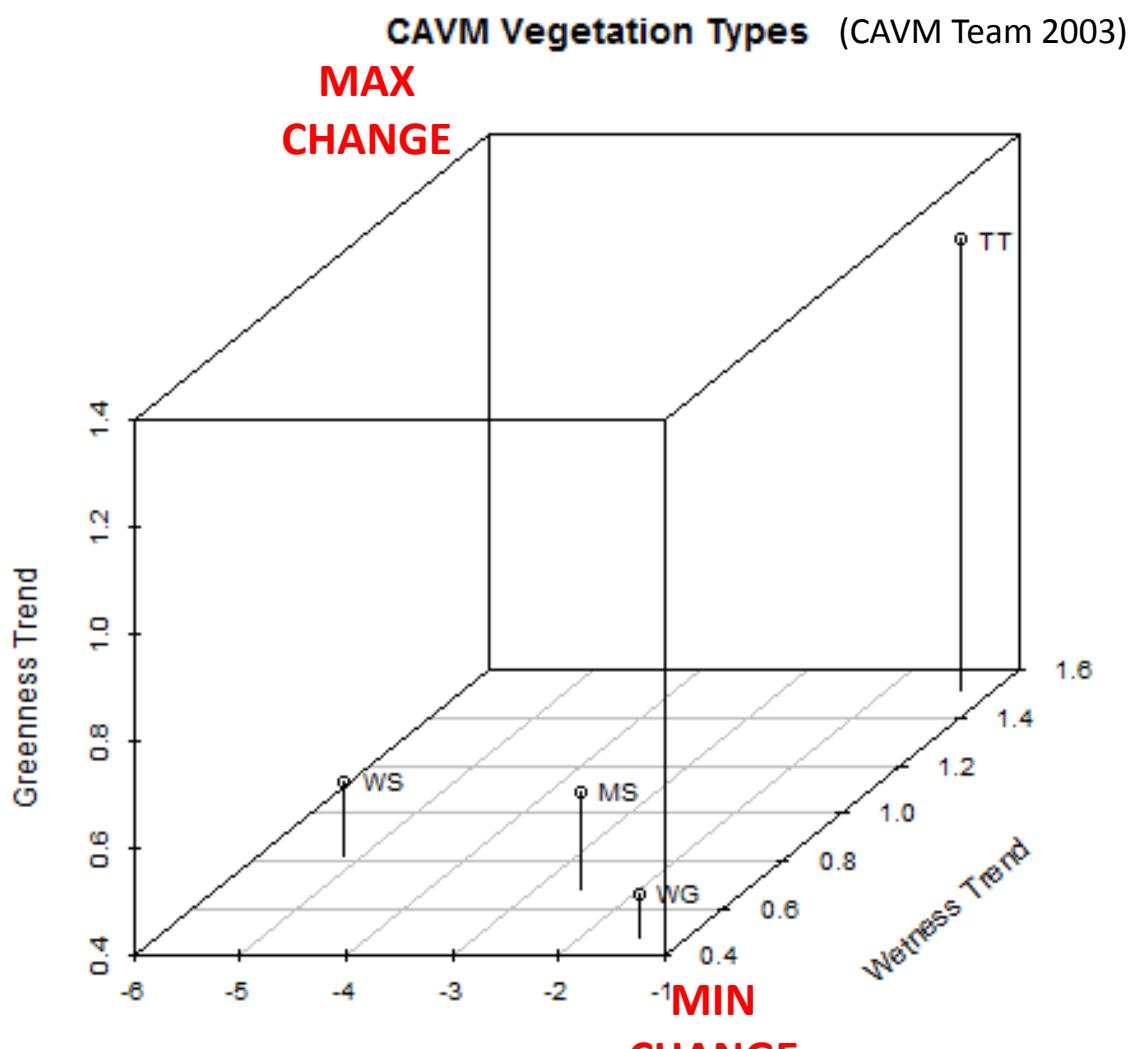
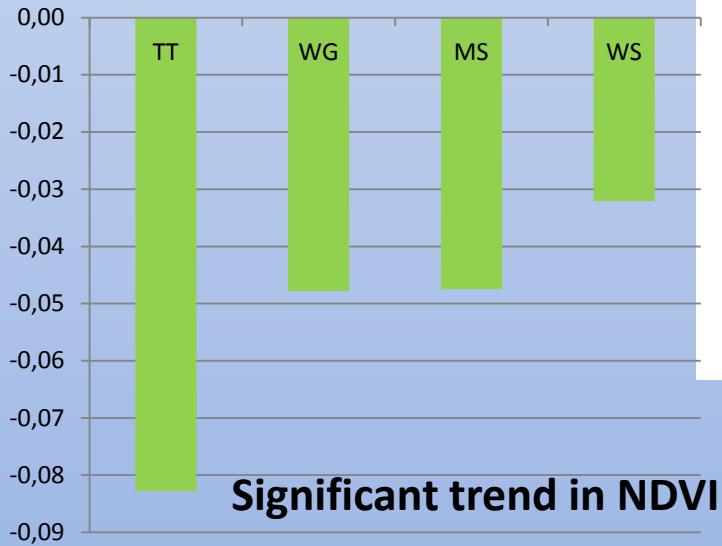
**Significant trend in TC3-Brightness**

# 3-Dimensional view of significant trends in tasseled-cap indices, 1985 to 2011



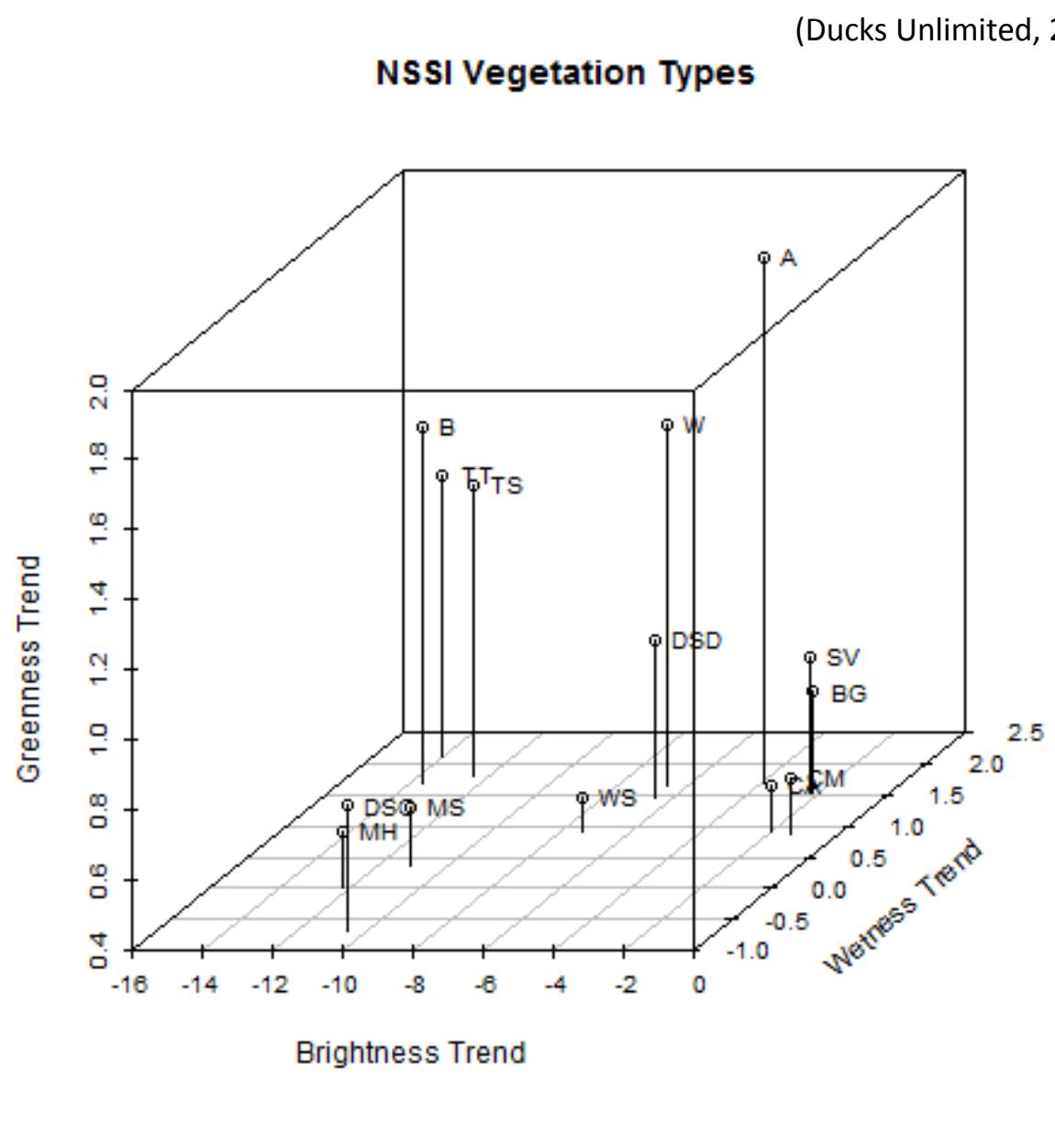
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# 3-Dimensional view of significant trends in tasseled-cap indices, 1985 to 2011



MS – Moist non-tussock sedge, dwarf shrub, moss tundra  
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WG – Wet graminoid, moss tundra  
WS – Wet sedge, moss tundra

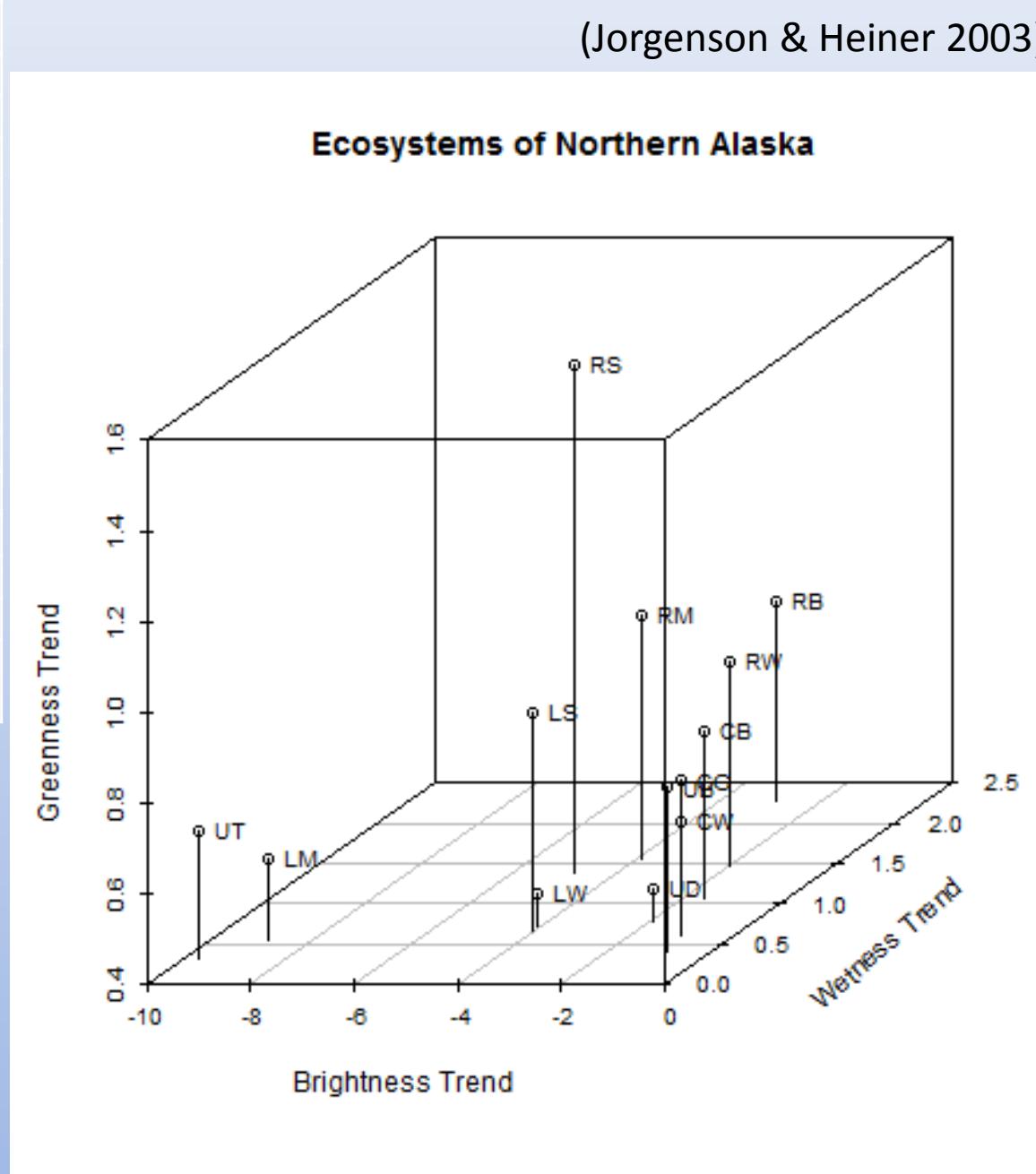
| Code | Cover Type                 | Km <sup>2</sup> |
|------|----------------------------|-----------------|
|      | Mesic Sedge-Dwarf Shrub    |                 |
| MS   | Tundra                     | 2229            |
| WS   | Wet Sedge                  | 1848            |
| CA   | FWM:Carex aquatilis        | 759             |
| MH   | Mesic Herbaceous           | 293             |
| BG   | Bare Ground                | 274             |
| SV   | Sparsely Vegetated         | 186             |
| DSD  | Dwarf Shrub - Dryas        | 175             |
| TS   | Tussock Shrub Tundra       | 128             |
| W    | Low-Tall Willow            | 88              |
| CM   | Coastal Marsh              | 72              |
| TT   | Tussock Tundra             | 19              |
| A    | Alder                      | 3               |
| DSO  | Dwarf Shrub - other        | 2               |
| B    | Birch Ericaceous Low Shrub | 1               |



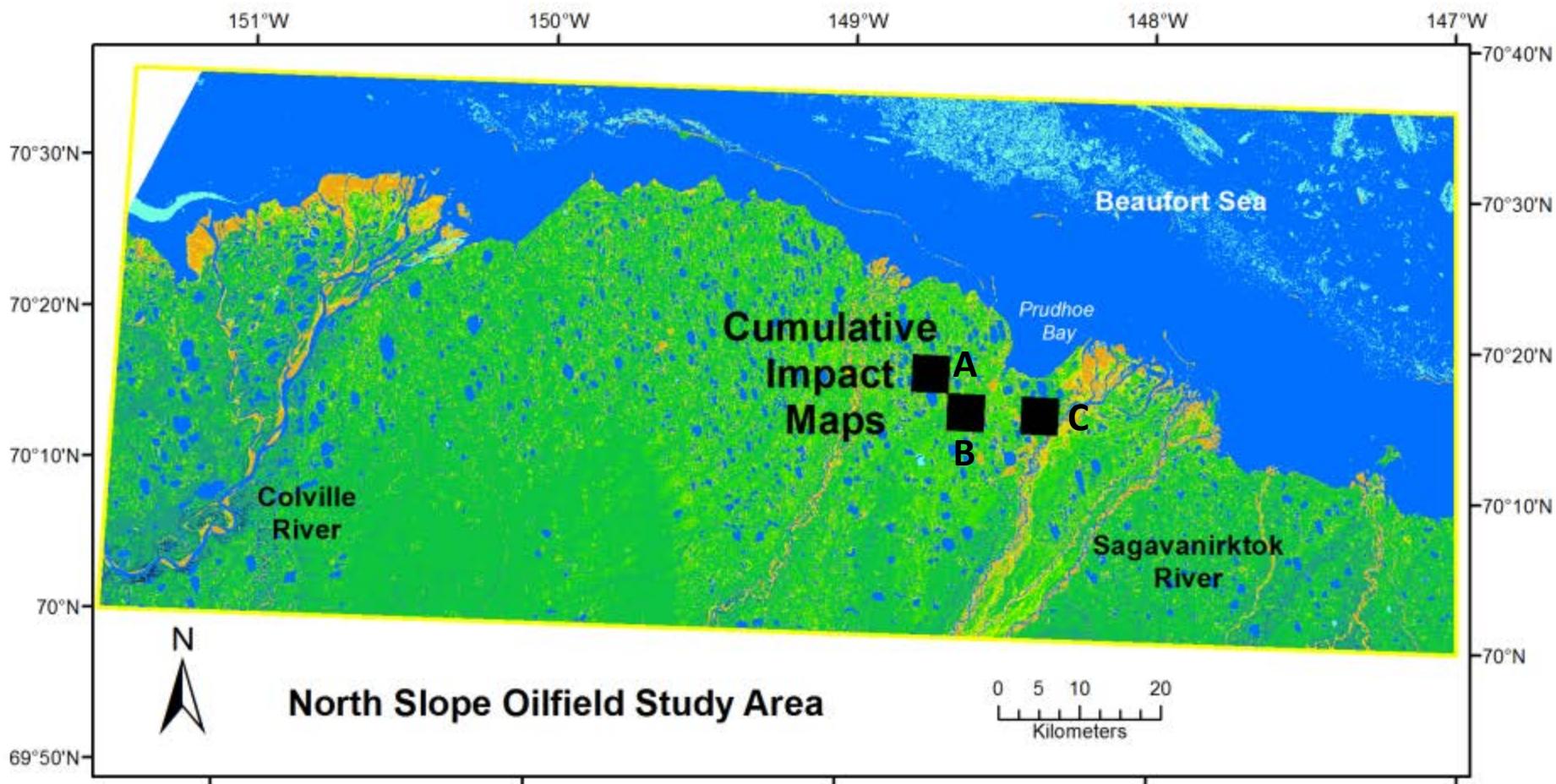
3-Dimensional graph of tasseled-cap index trends 1985-2011

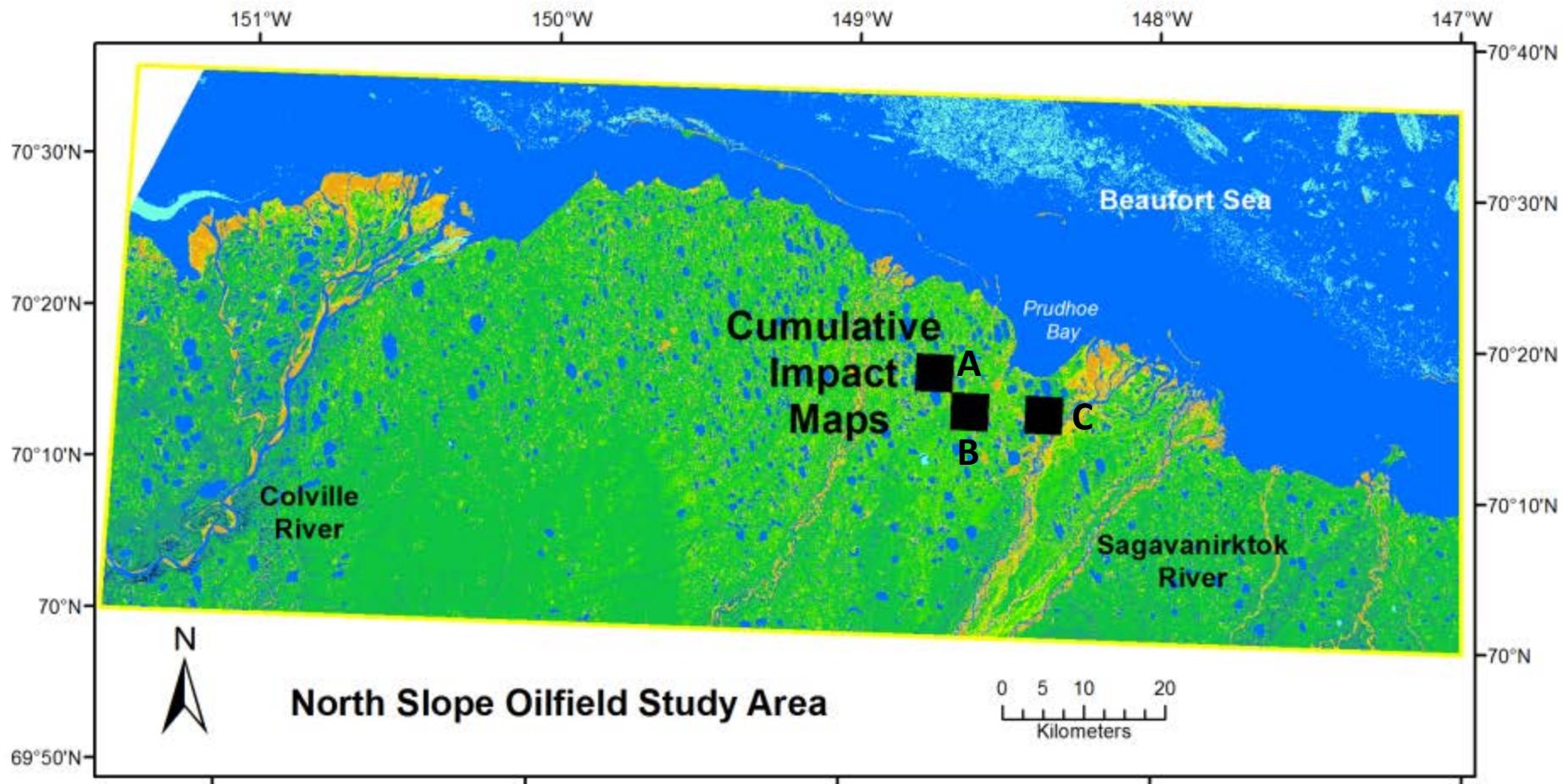
| Code | Cover type                    | Km <sup>2</sup> |
|------|-------------------------------|-----------------|
| LM   | Lowland moist sedge-shrub     | 2139            |
| LW   | Lowland wet sedge             | 1736            |
| UT   | Upland tussock                | 488             |
| RM   | Riverine moist sedge-shrub    | 431             |
| RW   | Riverine wet sedge            | 229             |
| UD   | Upland Dryas                  | 196             |
| RB   | Riverine barren               | 189             |
| CB   | Coastal barren                | 181             |
| CW   | Coastal wet sedge             | 116             |
| CG   | Coastal grass                 | 98              |
| RS   | Riverine shrub                | 31              |
| LS   | Lowland shrub                 | 14              |
| US   | Upland shrubby tussock        | 5               |
| UM   | Upland moist sedge-shrub      | 2               |
| UB   | Upland low birch-willow shrub | 1               |

(Jorgenson & Heiner 2003)



3-Dimensional graph of tasseled-cap index trends 1985-2011

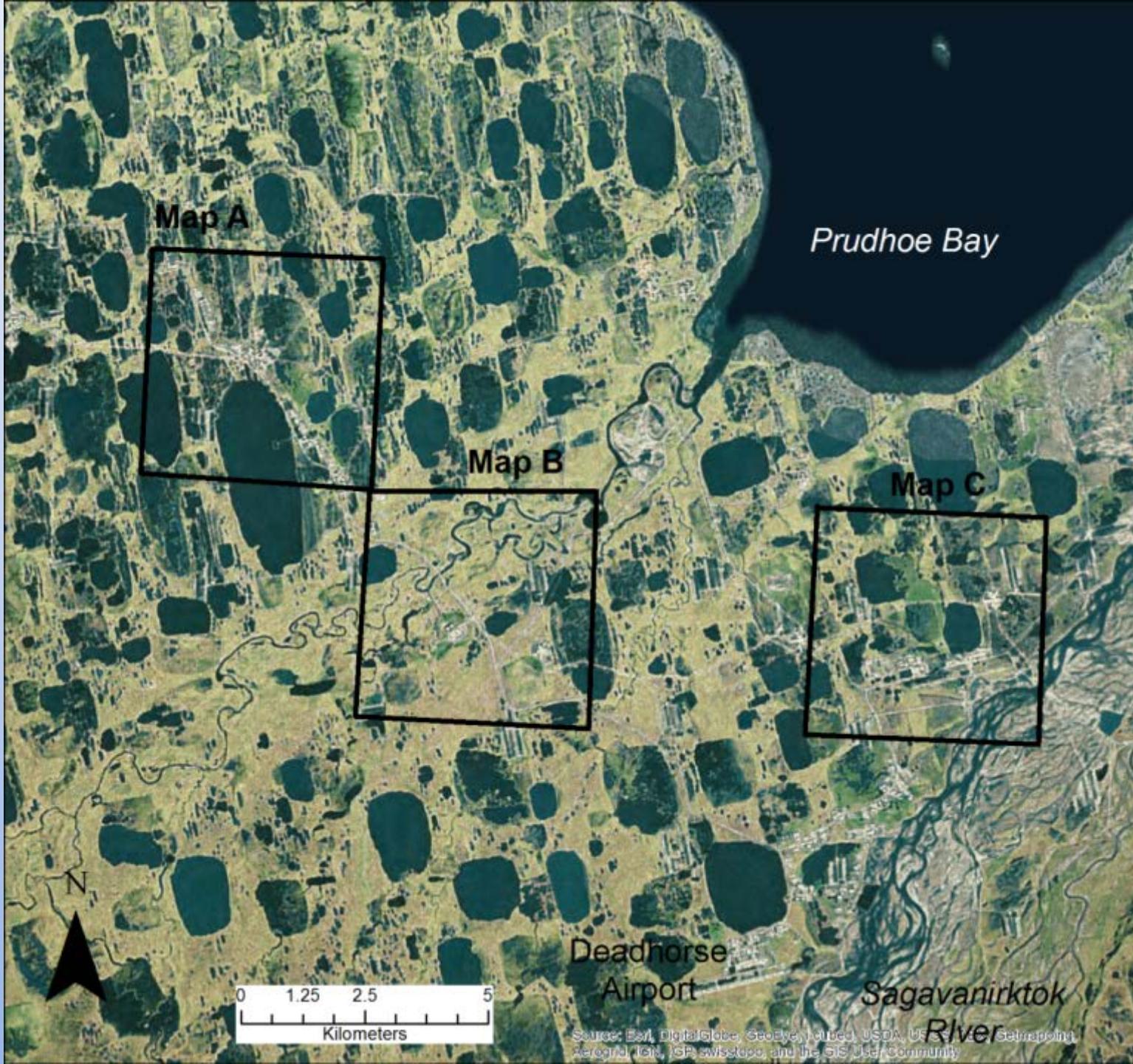




Advantages to smaller area

- more consistent Landsat coverage
- ground knowledge of vegetation and changes

Raynolds *et al.* 2014



Map A

Prudhoe Bay

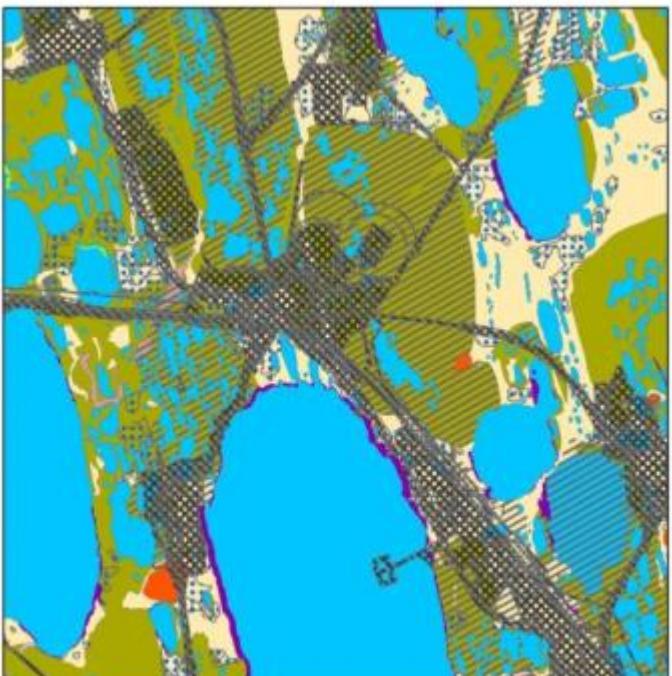
Map B

Map C

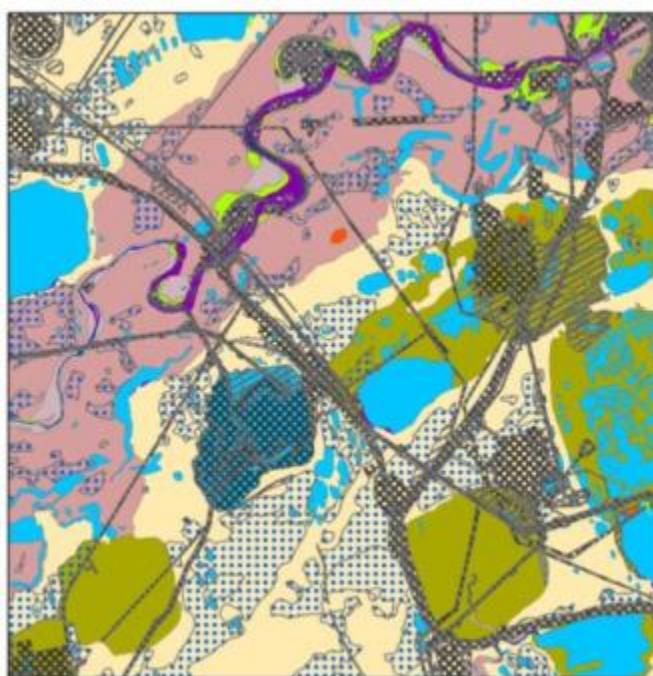
N

0 1.25 2.5 5  
Kilometers

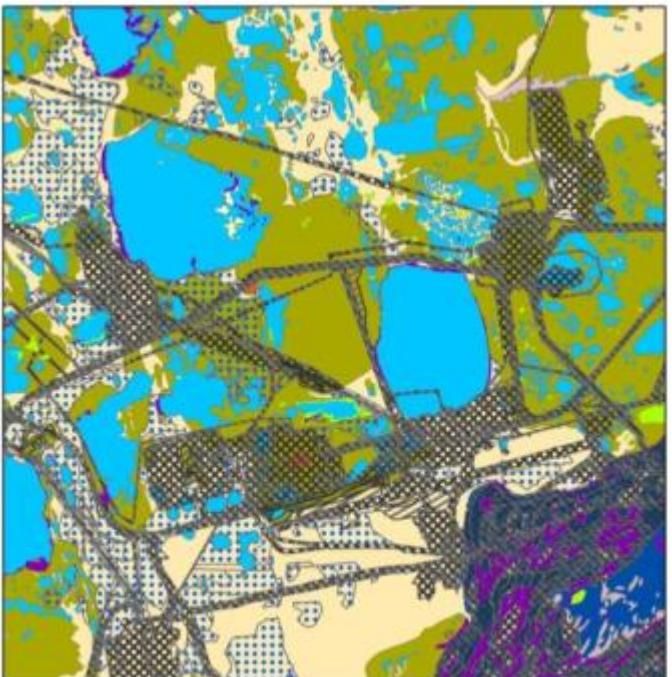
Source: Esri, DigitalGlobe, GeoEye, i-cubed, USDA, USGS, AeroGRID, Getmapping, Aerogrid, IGN, IGP, swisstopo, and the GIS User Community



Map A



Map B



Map C

### Landform

- [Green square] Drained thaw-lake basin
- [Yellow square] Inter-thaw-lake area
- [Orange square] Pingo
- [Purple square] Active floodplain
- [Red square] Stabilized floodpl
- [Blue square] Lake
- [Dark Blue square] River

Raynolds *et al.* 2014

### Change 1968-2010

- [Diamond hatching] Direct industrial impacts
- [Cross-hatching] Flooding due to industrial infrastructure
- [Blue dots] Permafrost degradation
- [Purple line] Changes in river channels and lakeside erosion
- [Yellow-green square] Revegetation

# Tasseled-Cap Index Trends

$p < 0.05$   
1985 to 2011

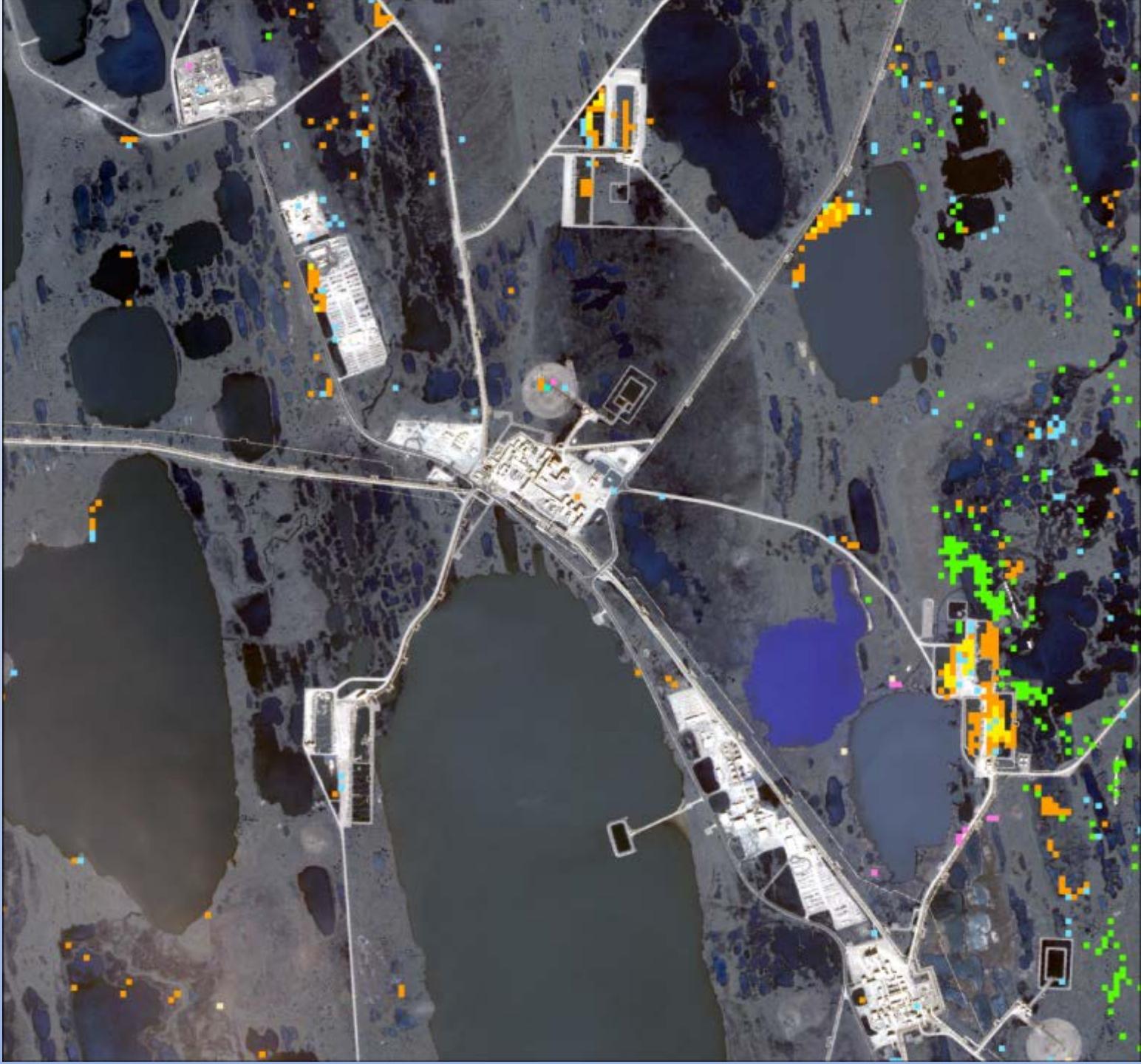
 Increase  
brightness

 Decrease  
brightness

 Increase  
greenness

 Increase  
wetness

Map A



# Tasseled-Cap Index Trends

$p < 0.05$   
1985 to 2011

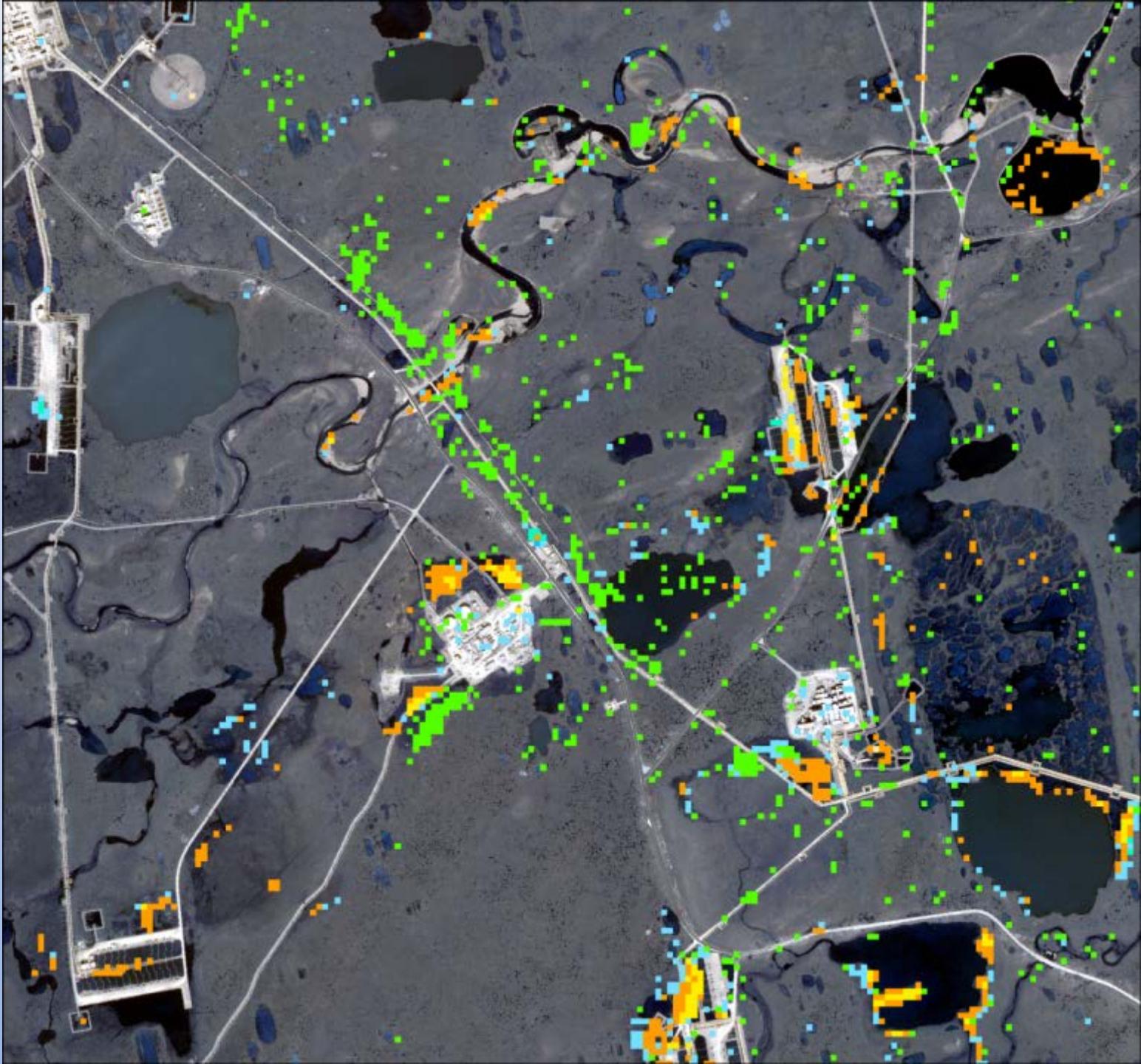
 Increase  
brightness

 Decrease  
brightness

 Increase  
greenness

 Increase  
wetness

Map B



# Tasseled-Cap Index Trends

$p < 0.05$   
1985 to 2011

 Increase  
brightness

 Decrease  
brightness

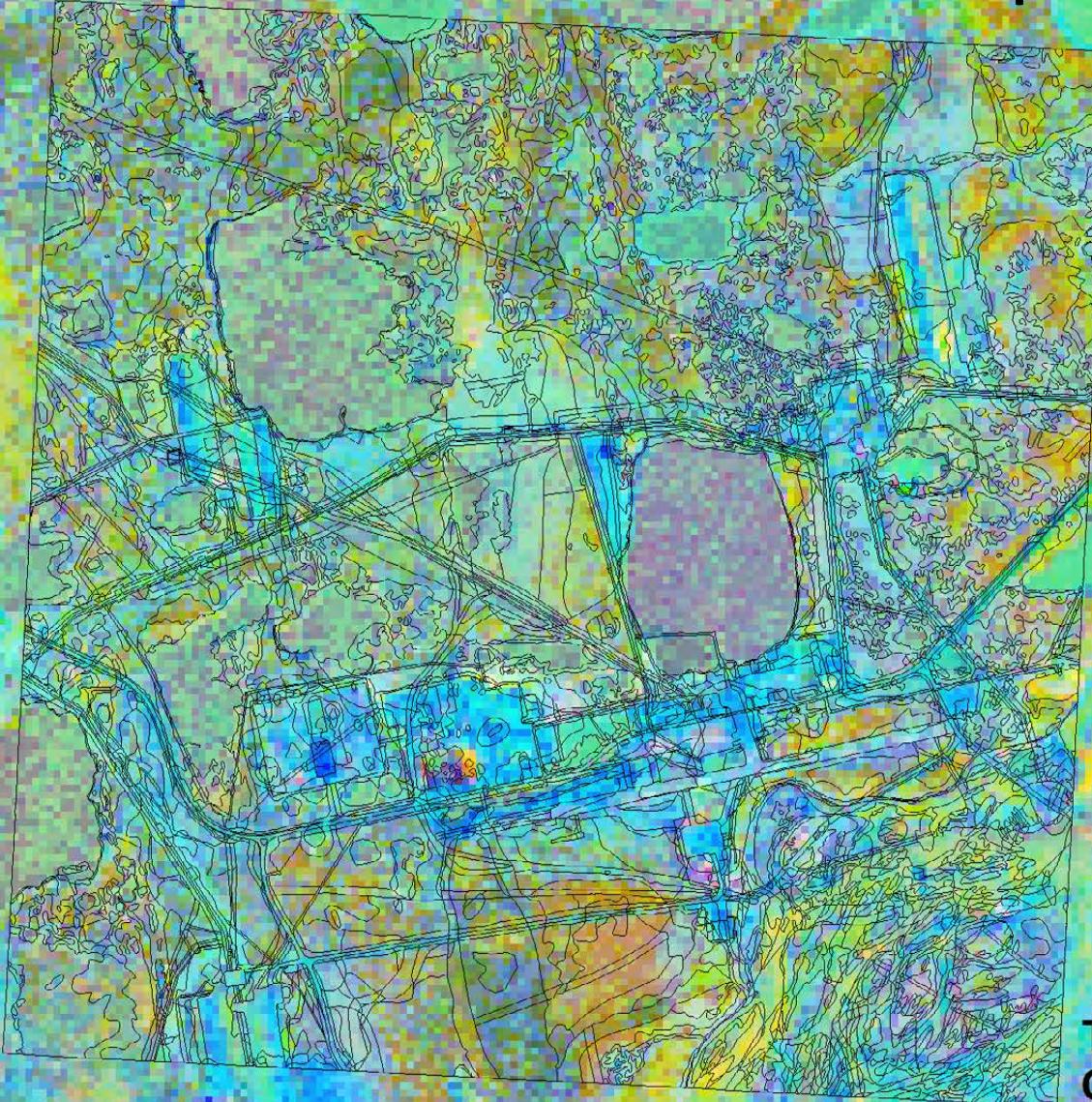
 Increase  
greenness

 Increase  
wetness

Map C



# Cumulative Impacts Map C

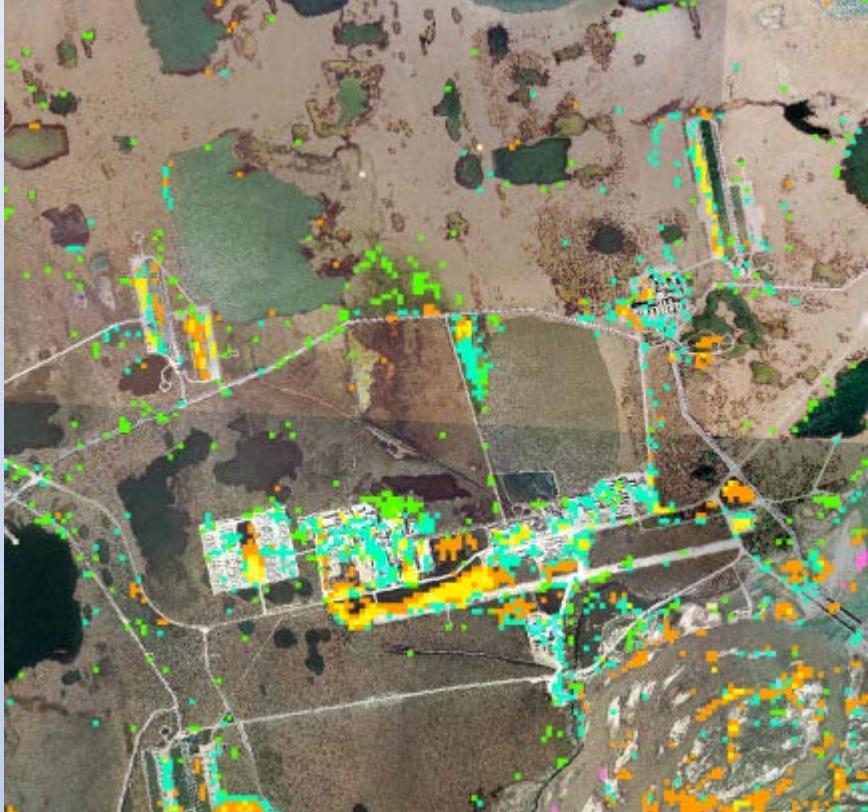
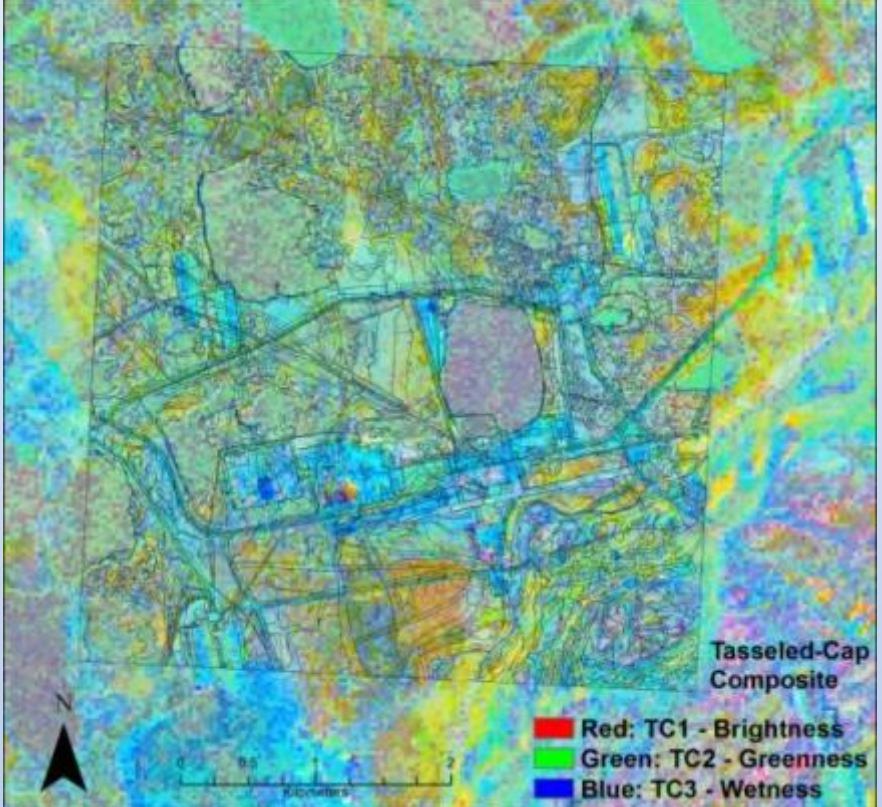


N

0 0.5 1 2  
Kilometers

Tasseled-Cap  
Composite

- Red: TC1 - Brightness
- Green: TC2 - Greenness
- Blue: TC3 - Wetness



**cyan blue** areas are dominated by increased wetness

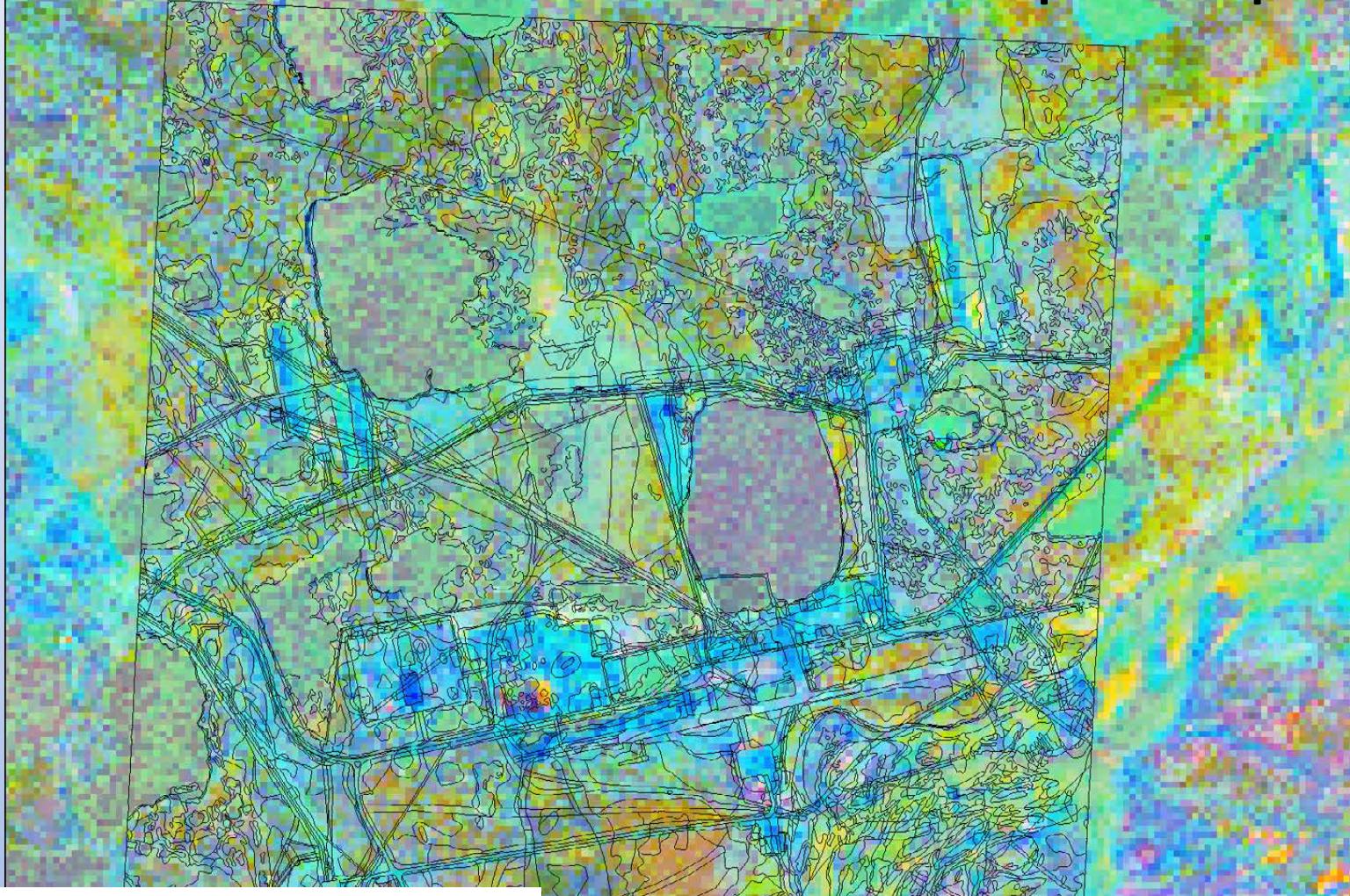
**darker blue** areas have increased wetness and decreased brightness

**pale blue to white** areas have increased greenness

**yellow** areas have decreased wetness and increased brightness

**purple** areas have no change

# Cumulative Impacts Map C



**cyan blue + wetness**

**darker blue + wetness - brightness**

**pale blue to white + greenness**

**yellow - wetness + brightness**

**purple no change**

**Tasseled-Cap  
Composite**

- Red: TC1 - Brightness**
- Green: TC2 - Greenness**
- Blue: TC3 - Wetness**

# Summary

- AVHRR shows positive NDVI trends
- Simple difference with Landsat also shows positive NDVI trends
- Statistical trend analysis shows decreased NDVI trends
  - < 10% of area has significant NDVI trends ( $p < 0.05$ )
- Tasseled-Cap Indices provide additional information
  - Significant increased greenness on over 1/3 area
  - Increased wetness counters this, leading to negative NDVI
- In developed areas, changes on and adjacent to infrastructure are evident

## References

- CAVM Team. 2003. Circumpolar Arctic Vegetation Map, scale 1:7 500 000. *in Conservation of Arctic Flora and Fauna (CAFF) Map No. 1. U.S. Fish and Wildlife Service, Anchorage, Alaska.*
- Crist, E. P., and R. C. Cicone. 1984. A Physically-Based Transformation of Thematic Mapper Data--The TM Tasseled Cap. *IEEE Transactions on Geoscience and Remote Sensing* 22:256-263.
- Ducks Unlimited, Inc. 2013. North Slope Science Initiative Landcover Mapping Summary Report. Rancho Cordova, CA.
- Jorgenson, M. T., and M. Heiner. 2003. Ecosystems of Northern Alaska, 1:2.5 million-scale map. *in. ABR, Inc and The Nature Conservancy, Anchorage, AK.*
- Raynolds, M. K., D. A. Walker, K. J. Ambrosius, J. Brown, K. R. Everett, M. Kanevskiy, G. P. Kofinas, V. E. Romanovsky, Y. Shur, and P. J. Webber. 2014. Cumulative geoecological effects of 62 years of infrastructure and climate change in ice-rich permafrost landscapes, Prudhoe Bay Oilfield, Alaska. *Global Change Biology* 20:1211-1224.

An aerial photograph of a coastal area. In the center, there is a cluster of industrial buildings and structures, possibly a refinery or chemical plant, situated near a body of water. A network of roads and canals connects the facility to the surrounding wetlands. The landscape is dominated by green marshy areas and patches of blue water. The horizon shows a flat coastline under a clear sky.

**Questions & Comments Please!**