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# **JPSS STAR Science Team Annual Meeting**

## **Surface Type**

NOAA Task Lead: Xiwu Zhan

UMD Team: Chengquan Huang, Rui Zhang

BU Team: Mark Friedl, Damien Sulla-Menashe

May 14, 2014



# Outline



- Overview
  - Products, Requirements, Team Members, Users, Accomplishments
- Surface Type Algorithm Evaluation:
  - Algorithm Description
  - Validation Approach and Results
  - Challenges, New Progress, Next Steps
- Plans JPSS-1 and Future Missions
- Summary



# Overview



- VIIRS Surface Type
  - Describe surface condition using 17 IGBP classes
  - Two groups of products
    - QST IP:
      - Generated quarterly using 12 months VIIRS data
      - Continuity with NASA EOS MODIS and NOAA POES AVHRR land cover products
    - EDR:
      - Provides type info for each VIIRS overpass
      - QST IP updated for fire and snow
  - Required accuracy is 70%



# Overview-continue



- Product users:
  - Essential Climate Variable
    - Modeling studies
      - Land surface parameterization for GCM
      - Biogeochemical cycles
      - Hydrological processes
    - Carbon and ecosystem studies
    - Biodiversity
  - Feed to other VIIRS products
    - BRDF/Albedo
    - Land surface temperature (LST)



# Overview-continue



- Team member:
  - STAR: Xiwu Zhan, Task Lead
  - UMD: Chengquan Huang, Rui Zhang
  - BU: Mark Friedl, Damien Sulla-Menashe
- Accomplishment:
  - ST EDR beta maturity passed
  - QST IP provisional maturity delivery (in progress),
  - Preliminary validation,
  - Recent improvements: product derived using a new alternative algorithm Support Vector Machines (SVM).



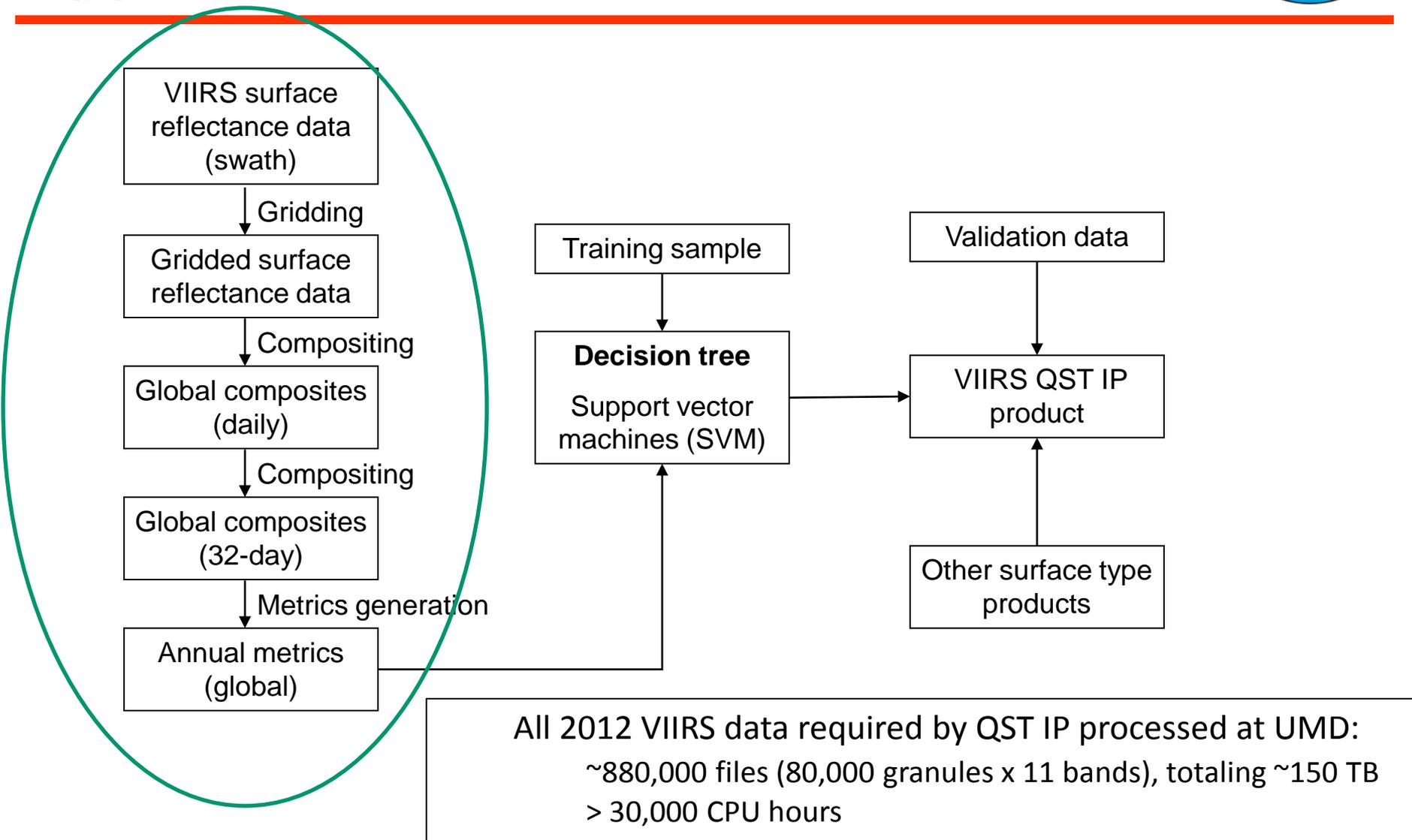
# Algorithm Evaluation



- Algorithm Description:
  - ST-EDR is primarily based on QST-IP updated with snow/ice and fire flags.
    - Passed beta maturity review
  - The QST-IP is generated using C5.0 decision tree algorithm from one full year's (2012) surface reflectance data.
    - Provisional delivery in progress
- Validation approach and dataset:
  - Use an independent global validation dataset
    - stratified random sample of 500 blocks, 10-35 VIIRS 1km pixels per block
    - 17 IGBP classes
    - “Truth” determined by human interpretation of available high resolution images.



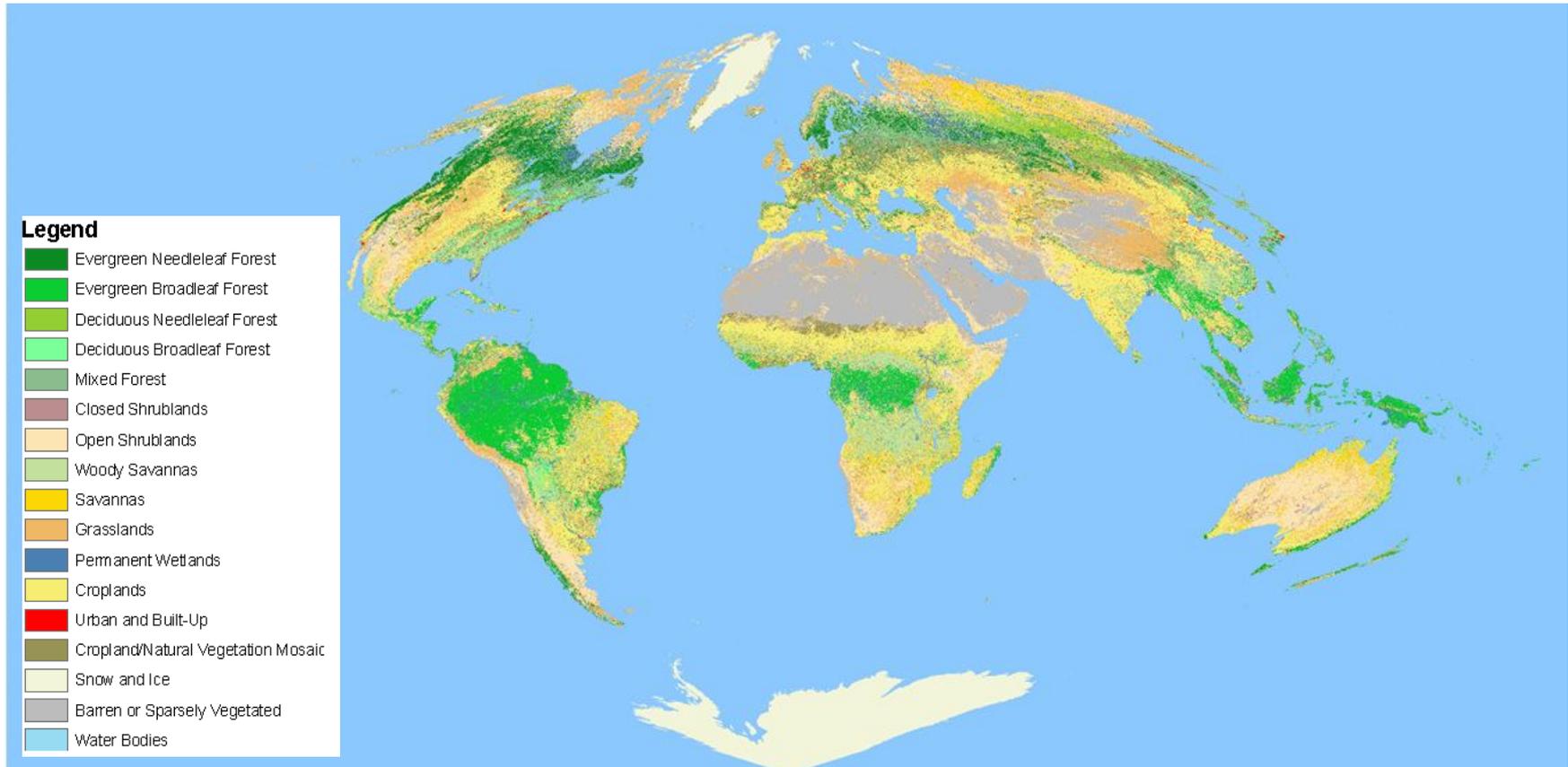
# VIIRS QST IP Generation



All 2012 VIIRS data required by QST IP processed at UMD:  
~880,000 files (80,000 granules x 11 bands), totaling ~150 TB  
> 30,000 CPU hours



# First VIIRS QST IP from 2012 VIIRS Data

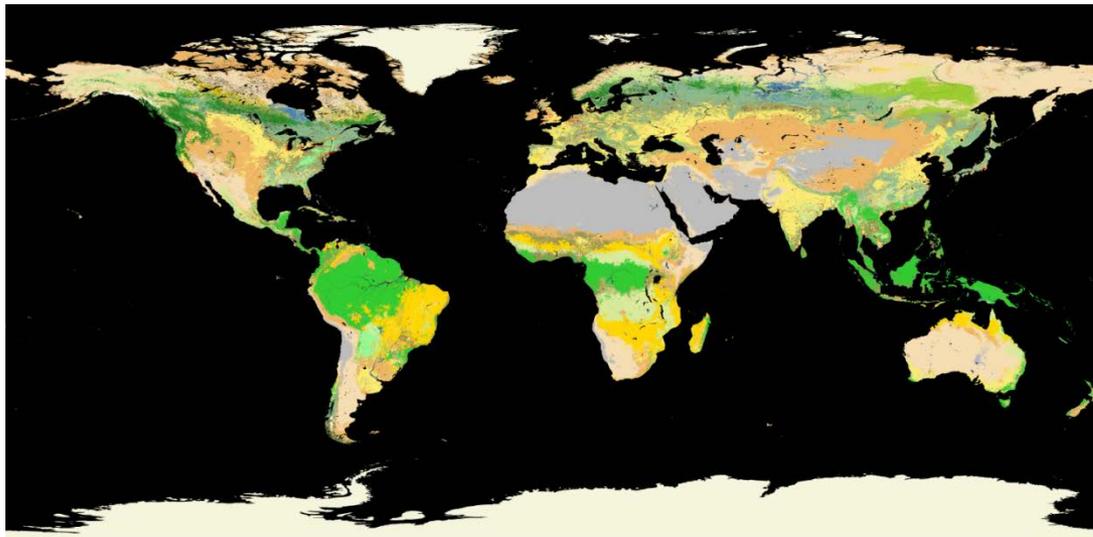




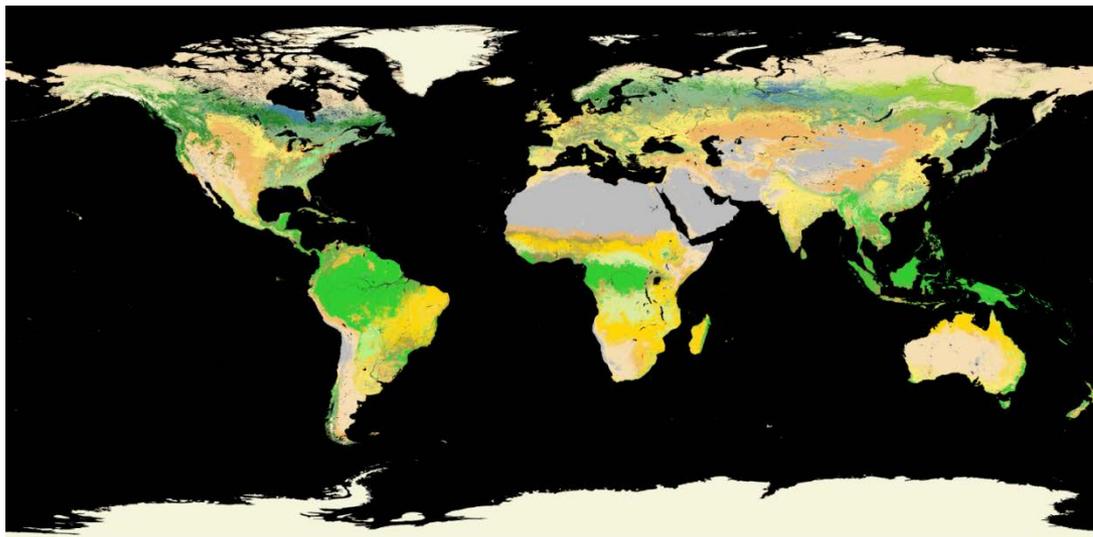
# Similar Patterns between VIIRS QST IP and MODIS Seed



MODIS  
Seed



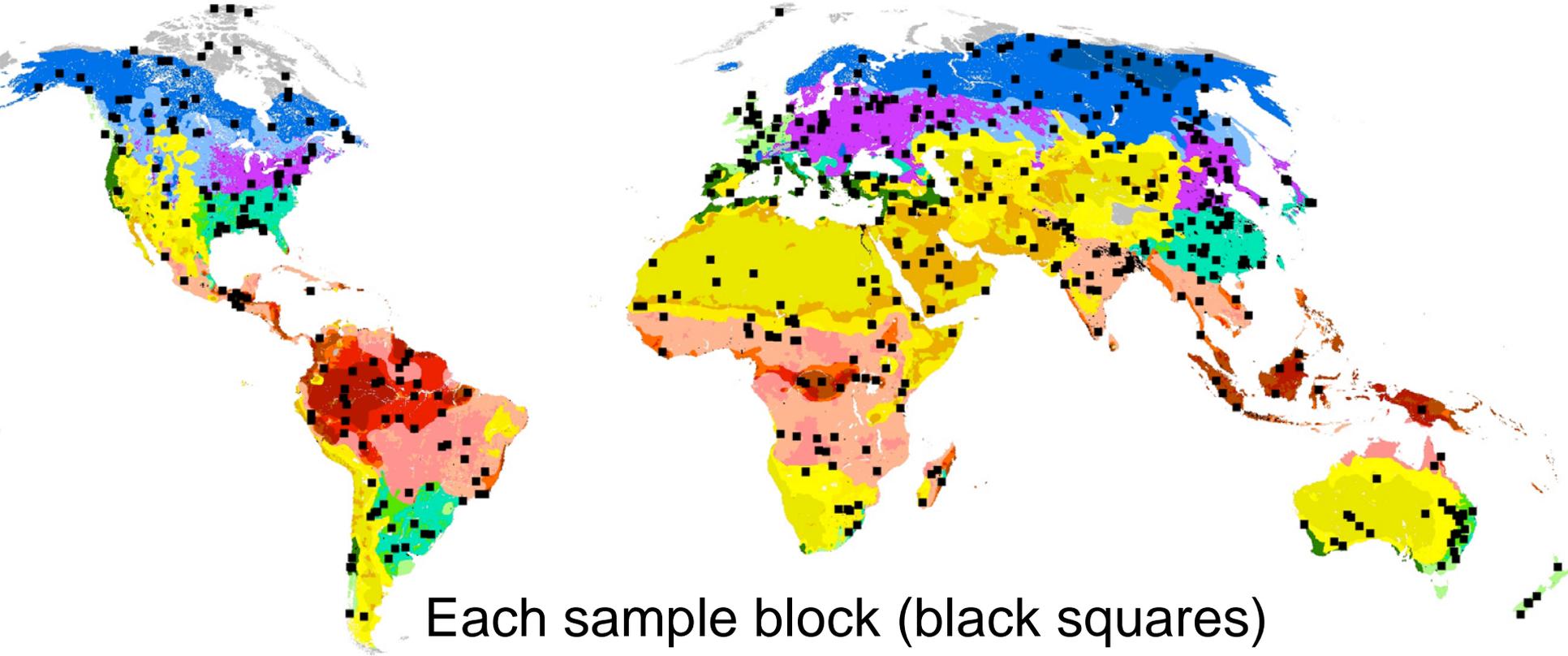
VIIRS  
QST IP



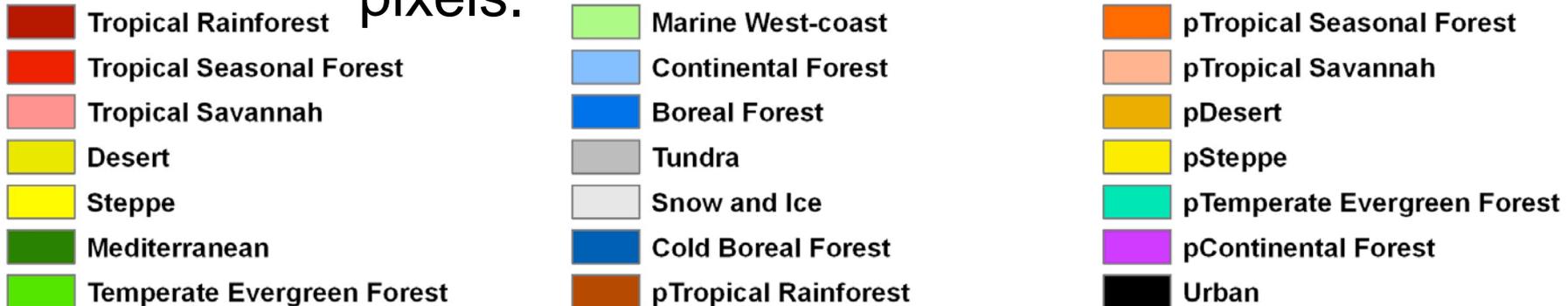
## IGBP Legend

- Water Bodies
- Evergreen Needleleaf Forests
- Evergreen Broadleaf Forests
- Deciduous Needleleaf Forests
- Deciduous Broadleaf Forests
- Mixed Forests
- Closed Shrublands
- Open Shrublands
- Woody Savannas
- Savannas
- Grasslands
- Permanent Wetlands
- Croplands
- Urban and Built-up Lands
- Cropland/Natural Vegetation Mosaics
- Snow and Ice
- Barren

# Validation Sample Design



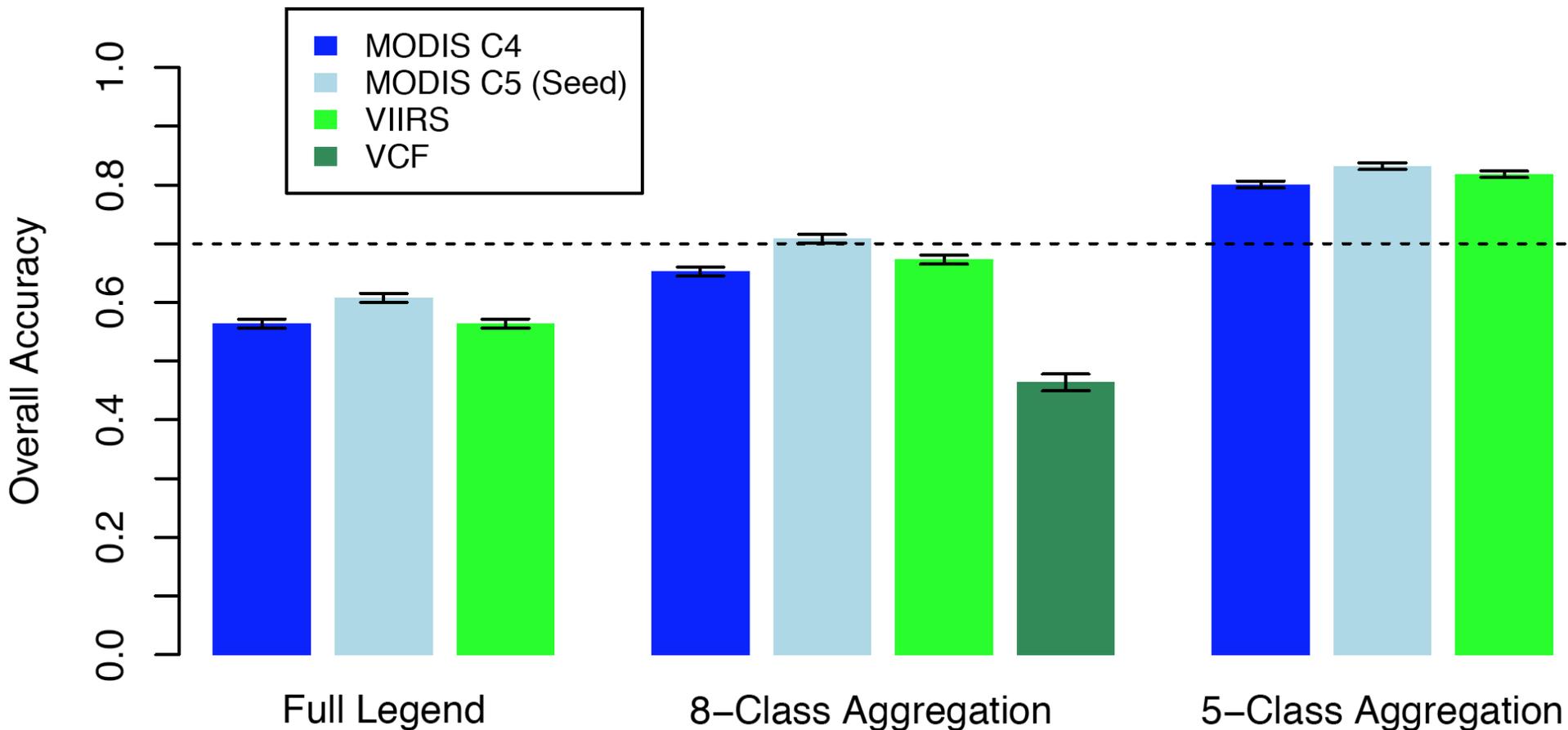
Each sample block (black squares) contains between 10 and 35 1-km VIIRS pixels.





# Algorithm Evaluation

## Overall Accuracies for Different Products



VIIRS QST overall accuracies are similar to MODIS C4 and C5 (Seed)



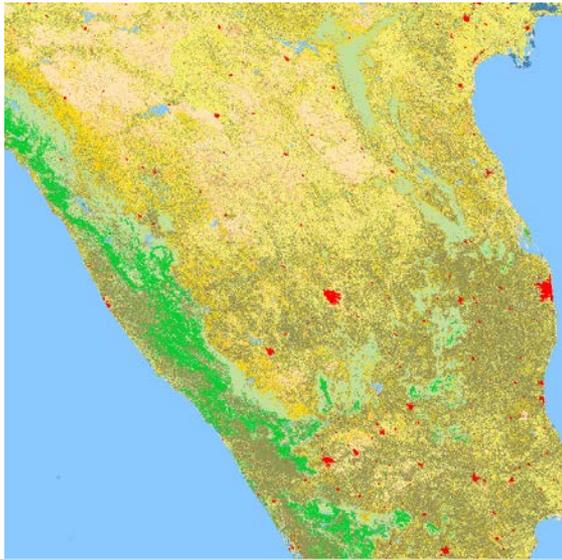
# Issues from Preliminary Assessment



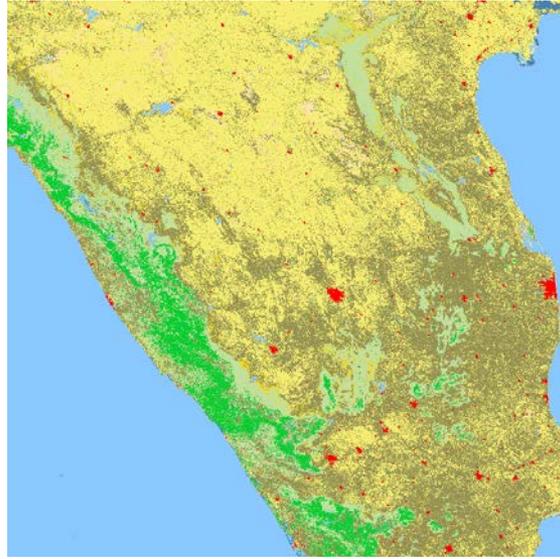
- Most confusions are between:
  - Cropland and grassland
  - Cropland and agriculture-nature vegetation mosaic
    - Post classification modeling
  - Grassland and open shrubland
  - Shrubland and grassland
  - Woody savanna and deciduous forest
  - Woody savanna and savanna



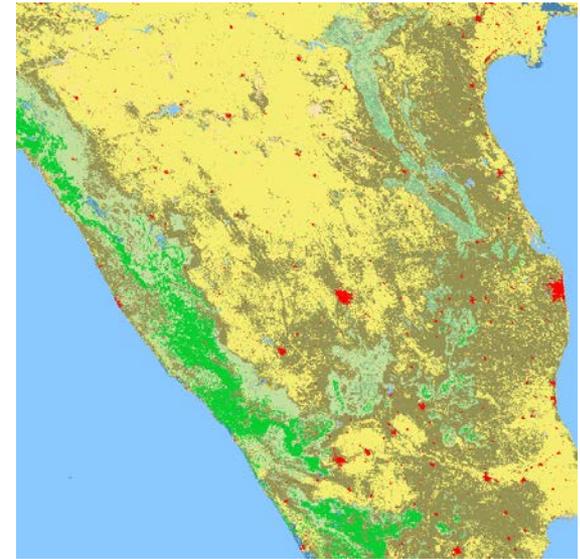
# Post-Classification Modeling of Cropland



Initial QSTIP



QSTIP R2 (post-classification modeling)



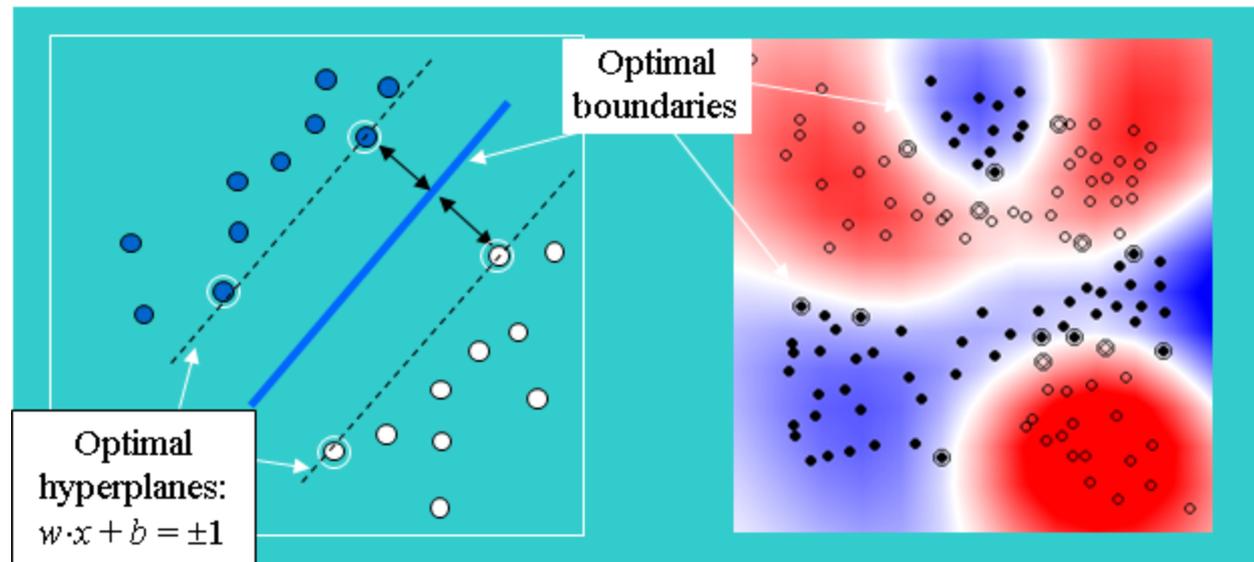
MODIS-based Seed



# Exploring Better Classifiers

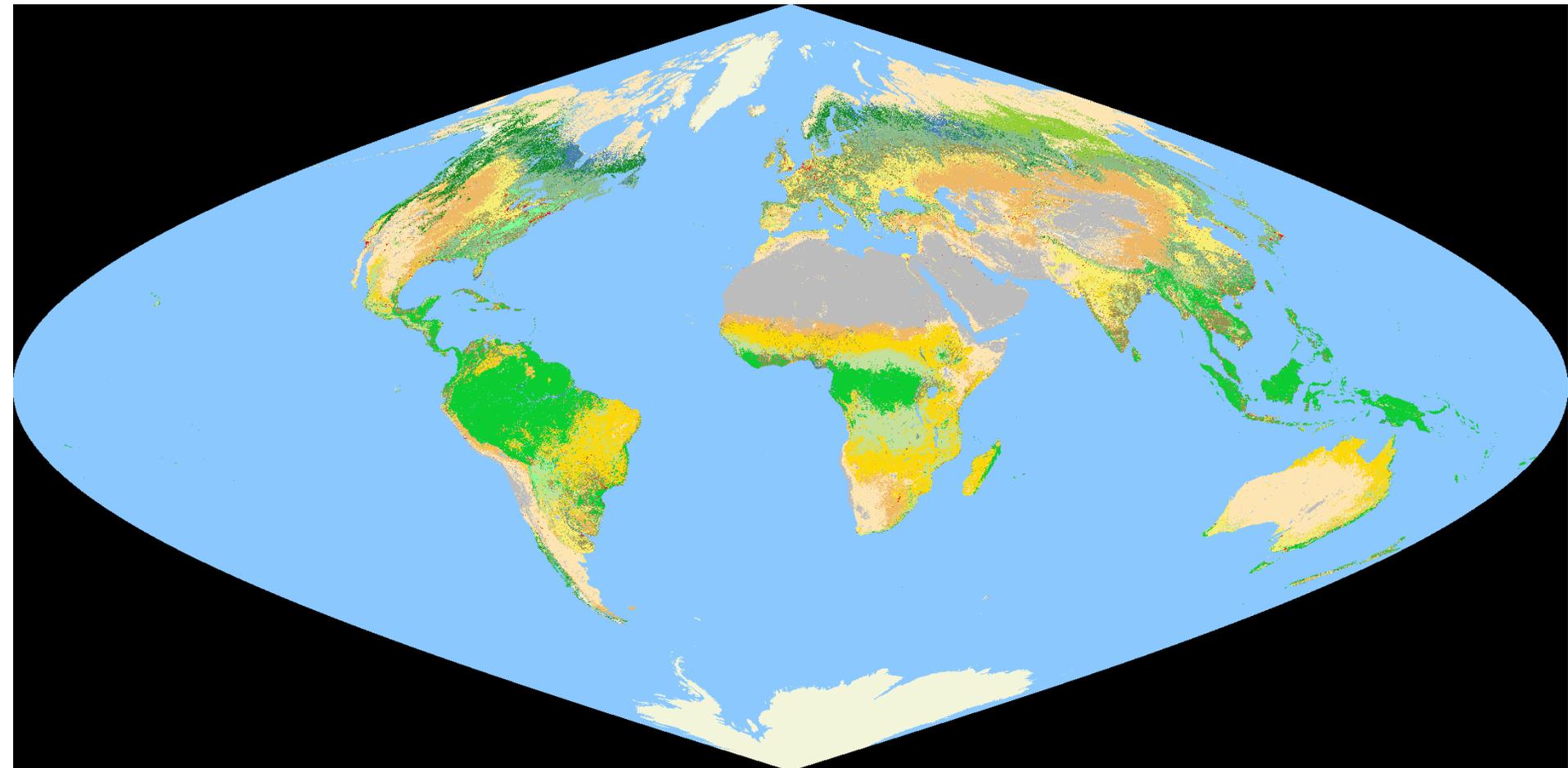


- DT is a MODIS/AVHRR heritage algorithm
- Support Vector Machines (SVM) better
  - Designed to search for optimal solutions
  - Consistently better accuracies than DT
    - (e.g., Huang et al. 2002; Foody and Mathur 2004; Pal and Mather 2005; Mountrakis et al. 2011)
  - More CPU intensive



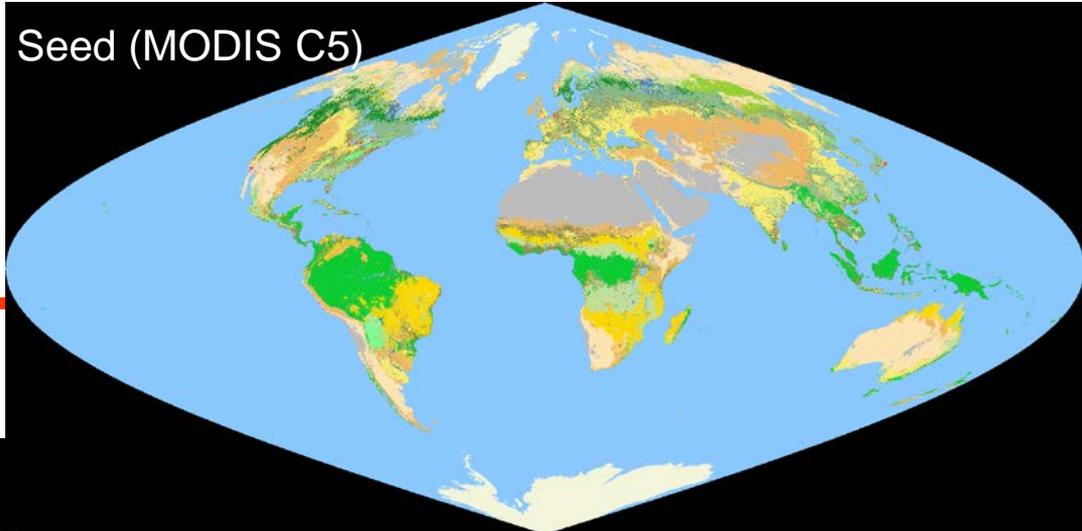


# Preliminary QST IP from SVM

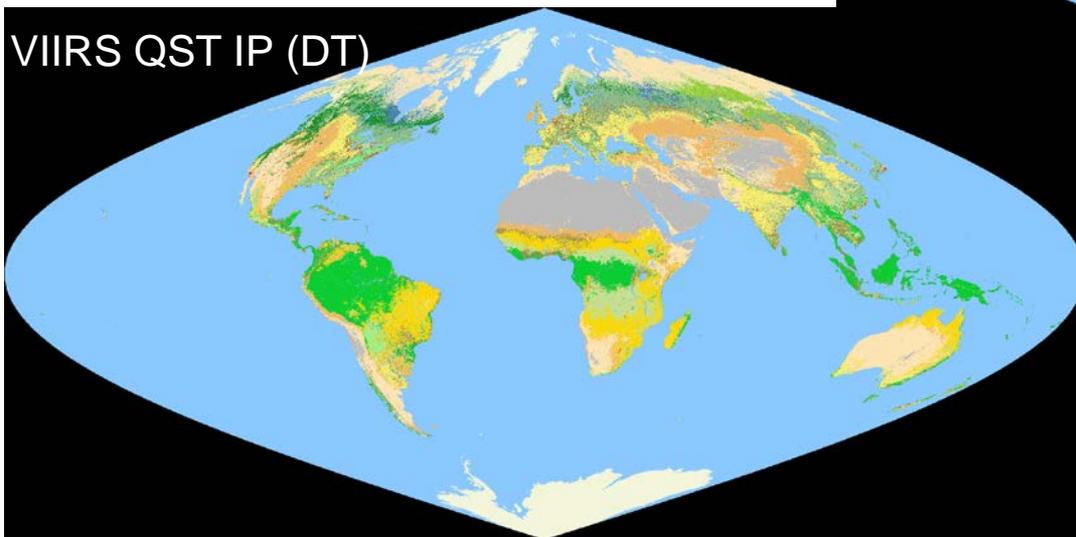




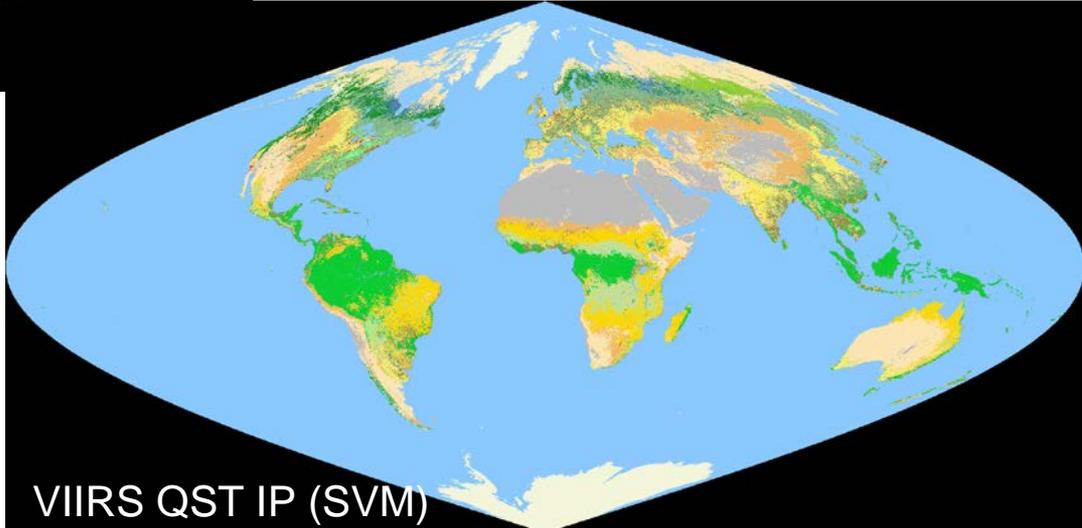
Seed (MODIS C5)



VIIRS QST IP (DT)

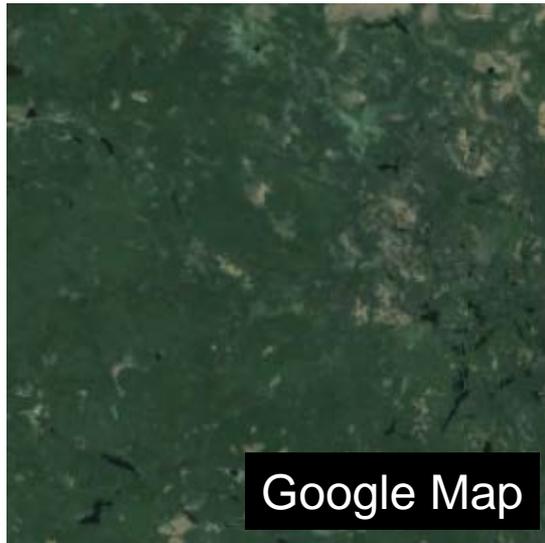


VIIRS QST IP (SVM)

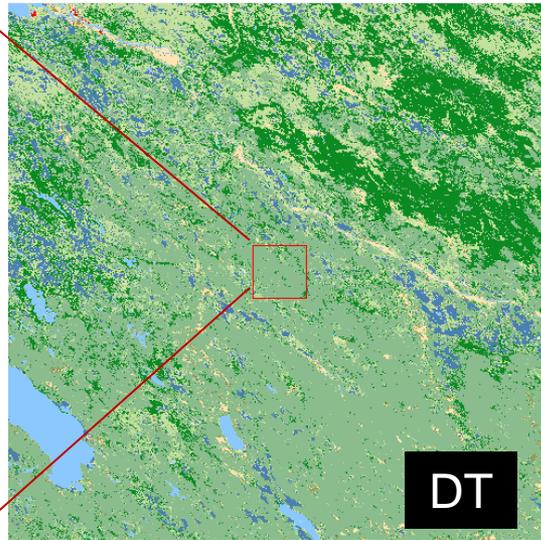




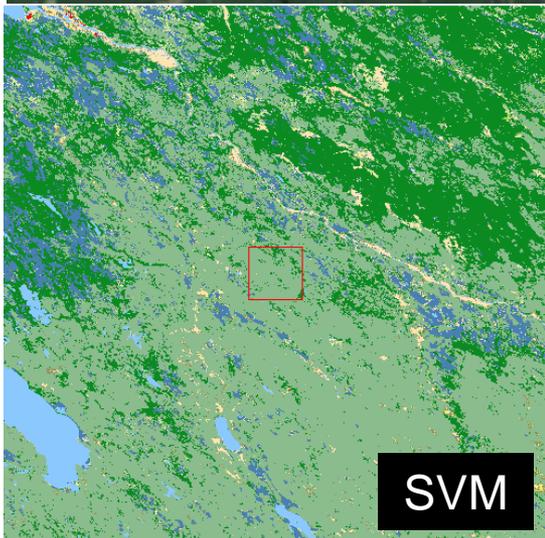
# Similar in Forested Areas (Northern Europe)



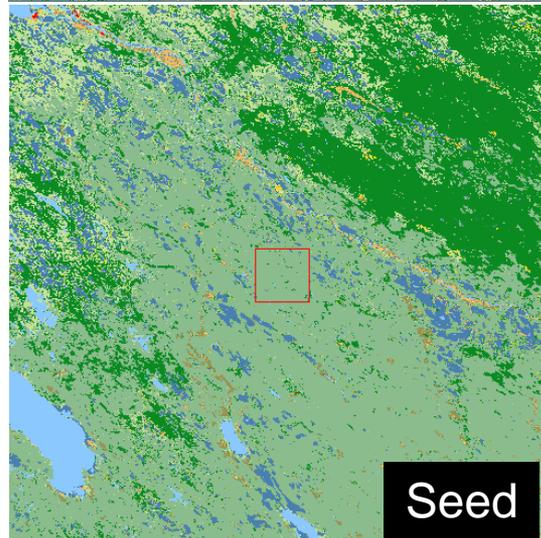
Google Map



DT



SVM



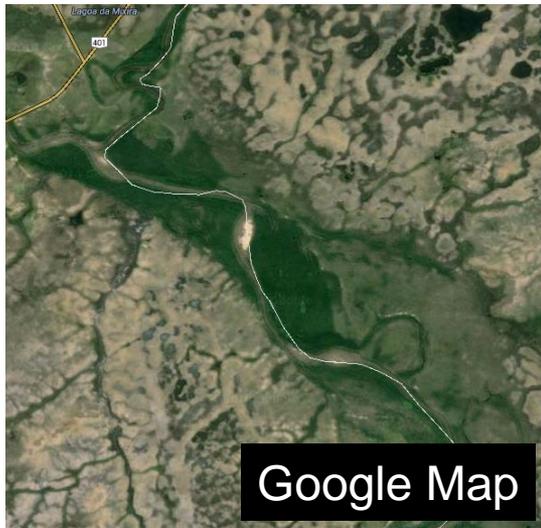
Seed

## Legend

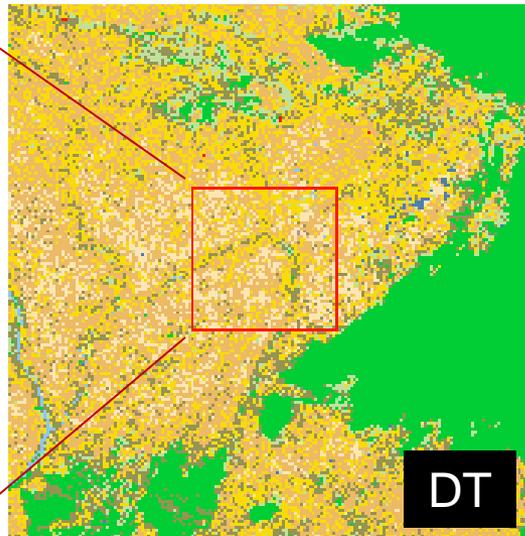
- Evergreen Needleleaf Forest
- Evergreen Broadleaf Forest
- Deciduous Needleleaf Forest
- Deciduous Broadleaf Forest
- Mixed Forest
- Closed Shrublands
- Open Shrublands
- Woody Savannas
- Savannas
- Grasslands
- Permanent Wetlands
- Croplands
- Urban and Built-Up
- Cropland/Natural Vegetation Mosaic
- Snow and Ice
- Barren or Sparsely Vegetated
- Water Bodies



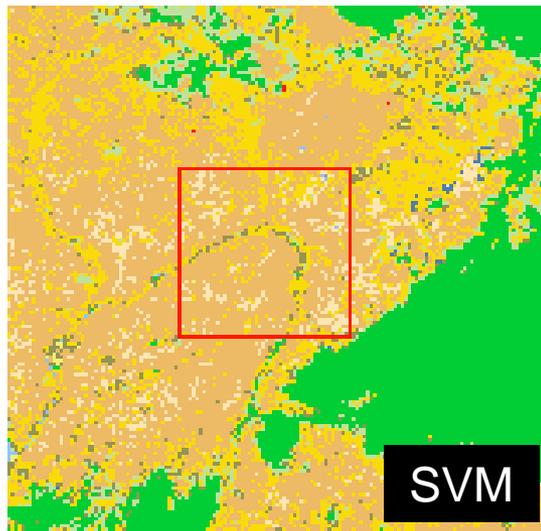
# SVM Less Salt-Pepper than DT (South America)



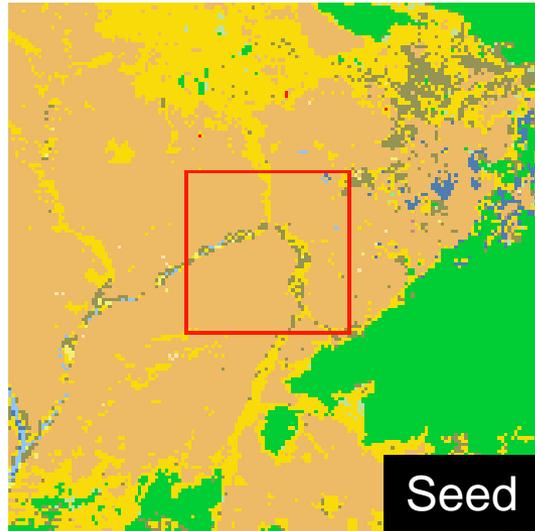
Google Map



DT



SVM



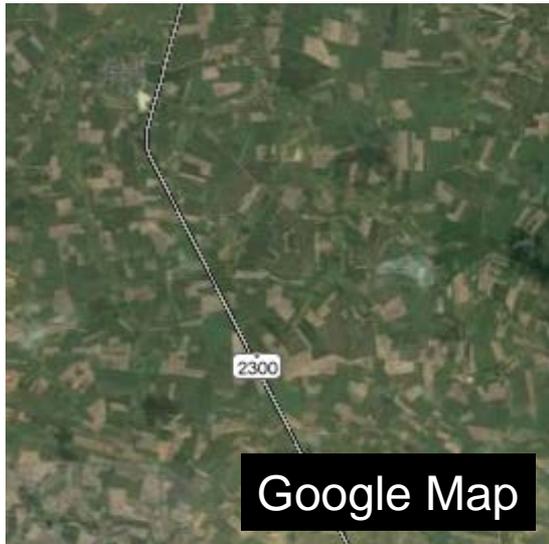
Seed

## Legend

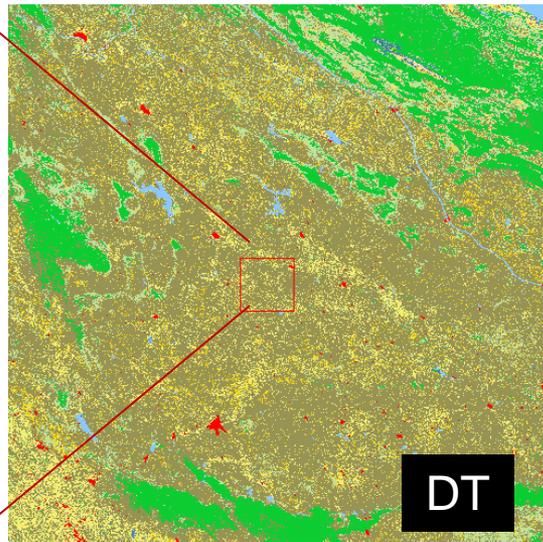
- Evergreen Needleleaf Forest
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- Cropland/Natural Vegetation Mosaic
- Snow and Ice
- Barren or Sparsely Vegetated
- Water Bodies



# Post-Classification Modeling Needed for Crop and Crop Mosaics (Southeastern Asia)



Google Map



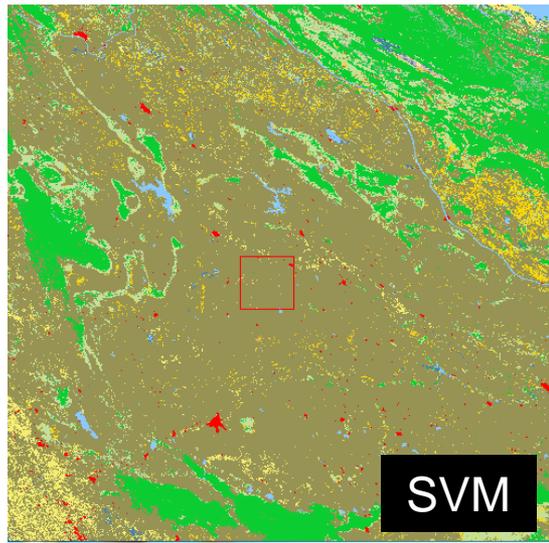
DT

**Cropland**

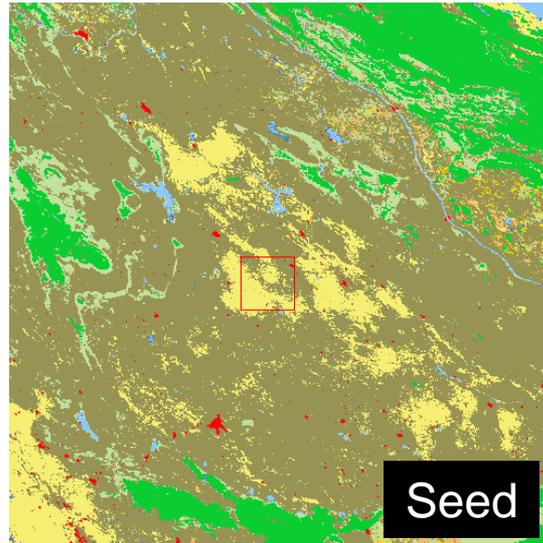
Lands covered with temporary crops followed by harvest and a bare soil period (e.g., single and multiple cropping systems).

**Cropland/Natural Vegetation Mosaics**

Lands with a mosaic of croplands, forest, shrublands, and grasslands in which no one component comprises more than 60% of the landscape.



SVM



Seed



# Next Steps



- More comprehensive assessment of SVM results
  - Accuracy assessment using validation data (BU)
- Post-classification modeling
  - Cropland
- Use multi-year VIIRS data
  - Reduce cloud contamination
  - Reduce impact of inter-annual variability
  - 3 years used in MODIS C5
- Improve training data representativeness



# Future Plans



- Replace DT with SVM in JPSS-1 QST algorithm
  - Further evaluations and comparisons are needed.
- Better characterize classes inherently challenging, e.g. urban, wetland
  - Mostly mixed
  - Subpixel fraction estimation more appropriate
- Harness knowledge in existing products
  - Agreements -> class prior probability
  - Disagreements -> focus of improvement effort
- More comprehensive validation strategy
- Change products



# VIIRS Surface Type Algorithm Summary



- Two algorithms
  - Surface Type EDR algorithm
    - Operational on IDPS
    - Perform as designed
    - Issues identified and addressed
  - QST IP algorithm
    - Off-line algorithm running outside IDPS
    - Heritage DT algorithm produces results comparable with MODIS LC
    - Improvements identified
      - Needed to meet requirement