

# Potential Yield Mapping of Dedicated Energy Crops

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# Sun Grant Initiative

- Consortium of the nation's land-grant universities addressing national bioenergy and bioproduct challenges
- Five Regional University Centers
- Engaging agricultural and natural resource colleges in every state and territory





## U.S. Department of Energy

- Regional Biomass Feedstock Partnership
- Regional Competitive Grants



## U.S. Department of Agriculture

- Sustainable Feedstock Production
- Regional Competitive Grants

## Feedstock Partnership

- Field studies
- Production potentials
- Economic practicality
- Composition and utility



### Feedstock Development

- Plant Breeding
- Agronomic Management
- Sustainable Production
- Equipment Technology

### Logistics

- Feedstock Production
- Harvest, Delivery, and Storage
- Transportation
- Pre-Processing

### Conversion Processes

- Conversion Technologies
- Cost of Production
- Biological Conversion
- Thermochemical Conversion

### System Analysis

- Industrial Ecology
- Feedstock Transport
- Biofuels Transport
- Delivery Infrastructure

### Economics, Marketing, and Policy

- Economics and Policy
- Impact on Food, Feed, and Fiber Markets
- Economic Return
- Production Economics

### Environmental Impacts

- Life Cycle Analysis
- Greenhouse Gas Emissions
- Carbon and Energy Balance
- NOX Emissions

# An Environmental Suitability Modeling Framework (PRISM-EM)

- Develop gridded, “first-guess” maps of feedstock relative yield across the entire conterminous US, based on known tolerances to **climate and soil characteristics**
- Provide a spatial framework for assimilating and interpreting field data, which in turn, **refines the first guess maps and allows conversion to actual yield**

# PRISM Environmental Model

## “Limiting Factor” Approach

Final Relative Yield (0,100%) =

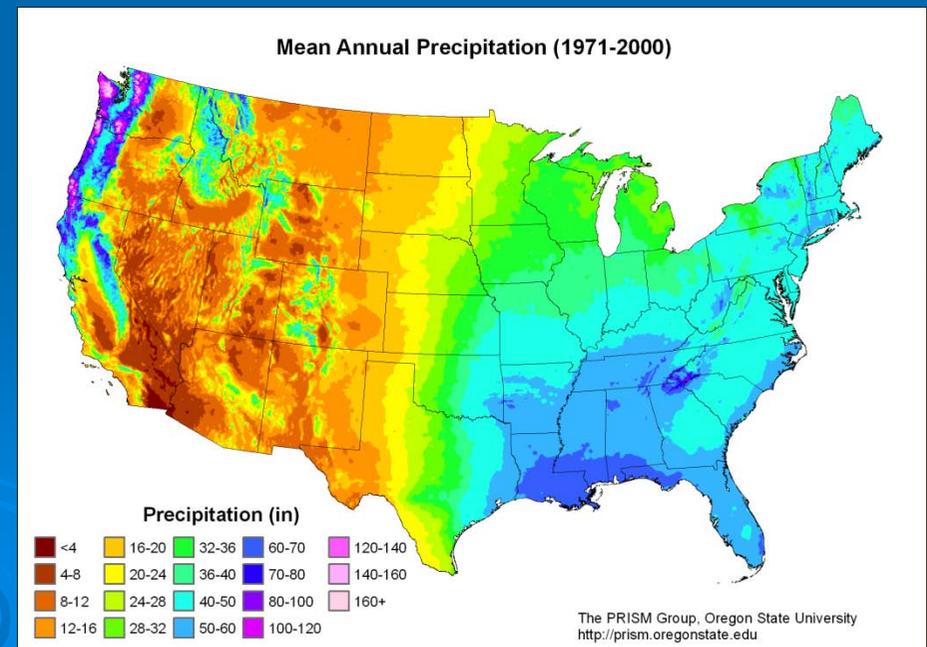
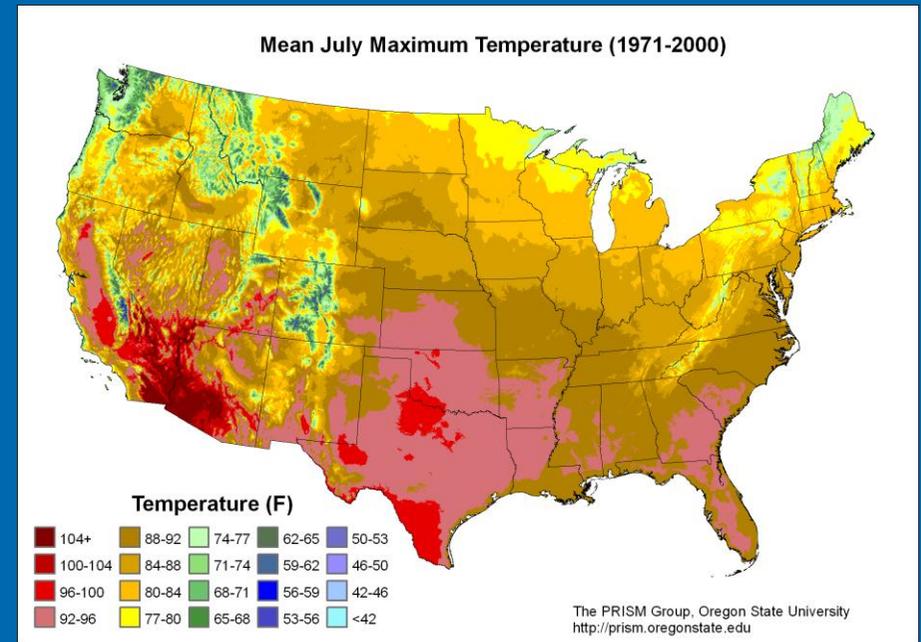
**Lowest** relative yield resulting from the following functions:

- Water Balance Simulation
- Winter Low Temperature Constraint
- Summer High Temperature Constraint
- Soil pH
- Soil Salinity
- Soil Drainage



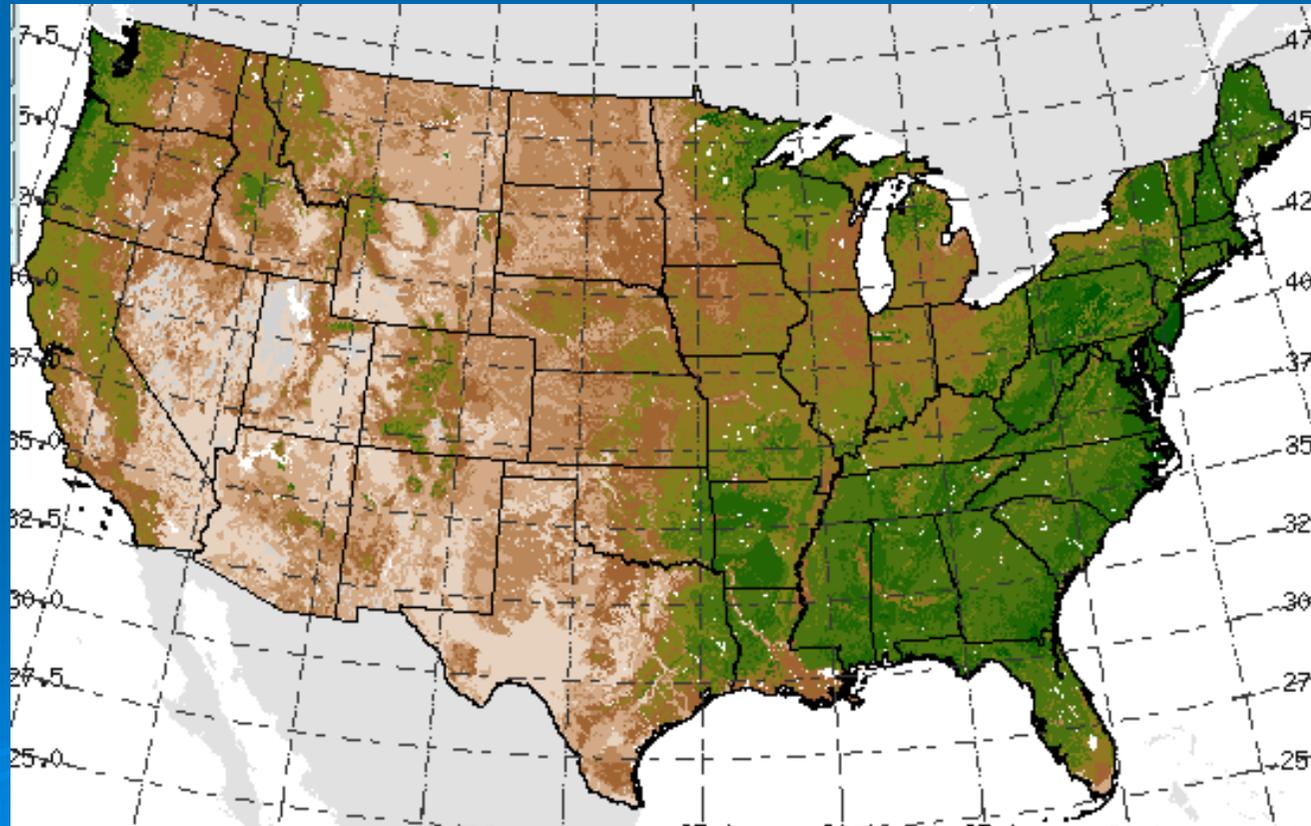
# PRISM Climate Mapping

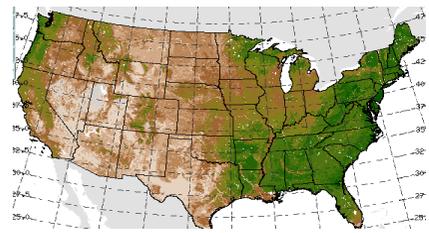
- The world's most advanced climate mapping science
- Developed and operated by the PRISM Climate Group, Oregon State University
- Accounts for variations in climate due to elevation rain shadows, coastal effects, temperature inversions, and more
- Mean temp and precipitation provided to PRISM-EM twice monthly



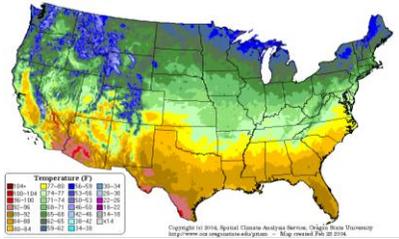
# NRCS SSURGO Soils Data

- National coverage
- Provides soils information to the model:
  - Available Water Content
  - pH
  - Salinity
  - Drainage

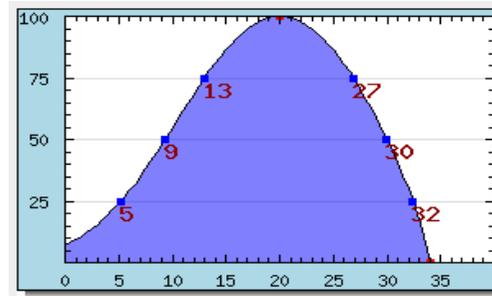




SSURGO Soil Maps

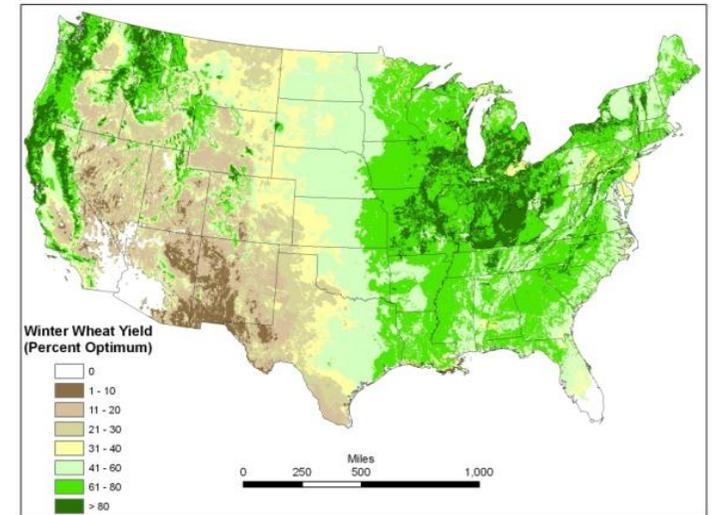


PRISM Climate Maps

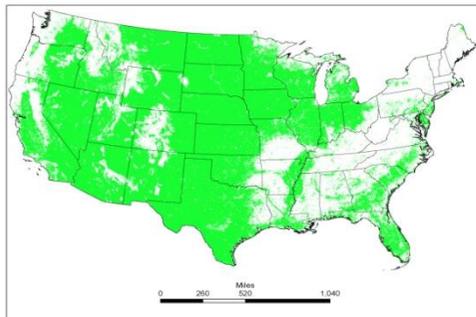


Environmental Model  
PRISM-EM

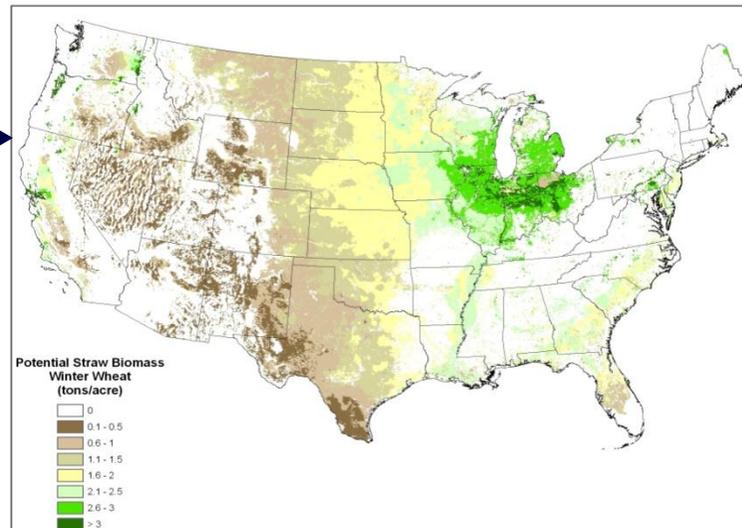
Percent of Maximum Yield



Biomass Yield



Terrain/Land Cover  
Constraints  
(Optional)

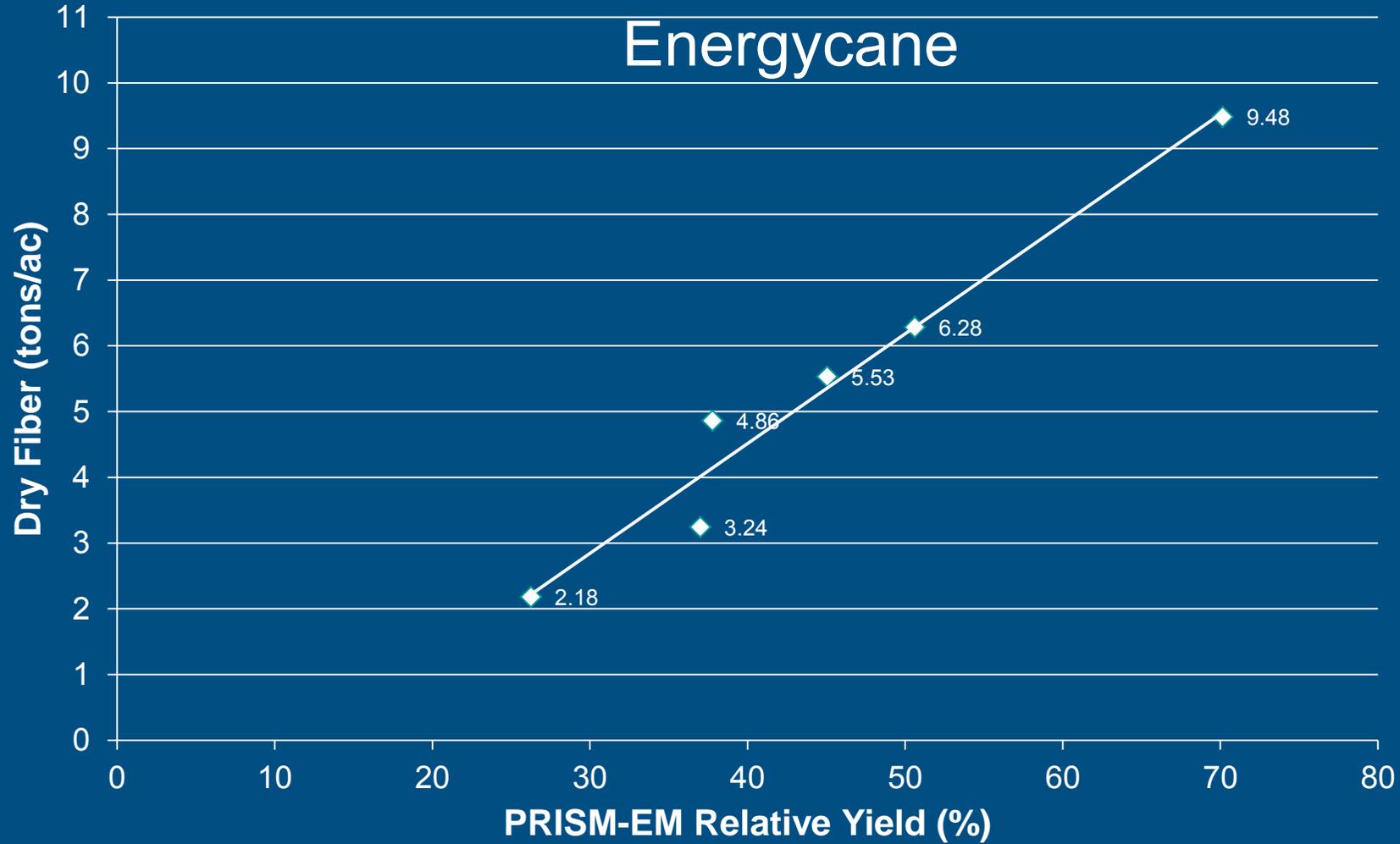


Observed Yield

# 3-year Average Dry Fiber vs. 3-year Average PRISM-EM Relative Yield

$$y = 0.167x - 2.1655$$
$$R^2 = 0.9648$$

## Energycane



# Relative Yield Modeling Assumptions

- Climate:
  - 30-year average conditions (1981-2010)
  - Does not account for damaging events, such as hail, flooding, and wind
- Irrigation: Non-irrigated conditions
- Soil pH and drainage improvements: “Reasonable” soil liming and tiling (economic considerations)
- Cultivar selection: “Best local cultivar”
- Harvest frequency: Once per year, but does not apply well to woody perennials



# More Assumptions

- Yield Gap: Account for “yield gap” between test plot and farm
- Establishment: Assume perennial crop has been established
- Fertilizer Application: “Sustainable” application rate
- Fungicide/Pesticide Application: Varies by crop, usually minimal

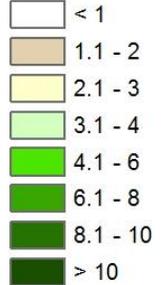


# Average Annual Yield Potential, 1981 - 2010 Energycane

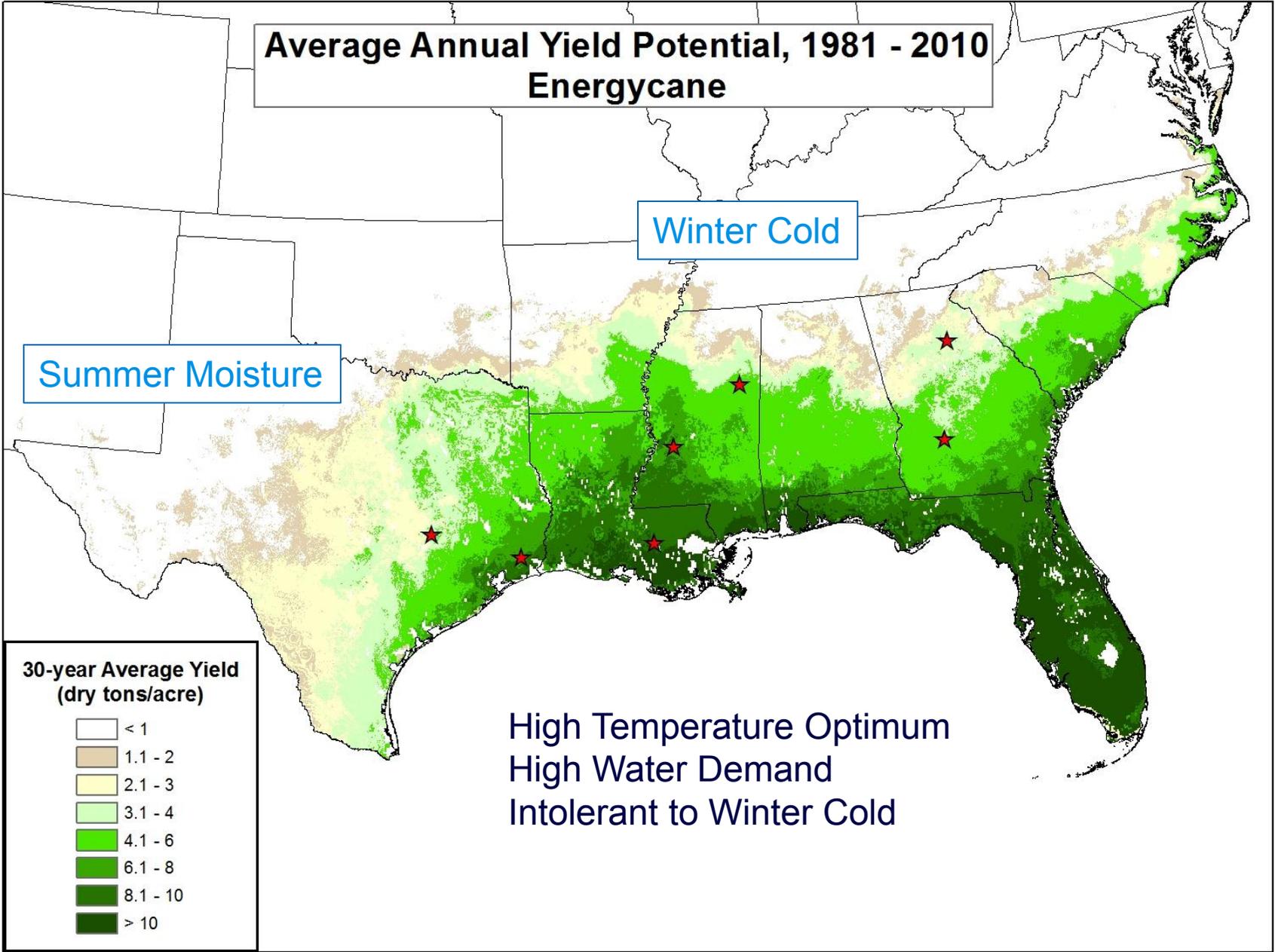
Summer Moisture

Winter Cold

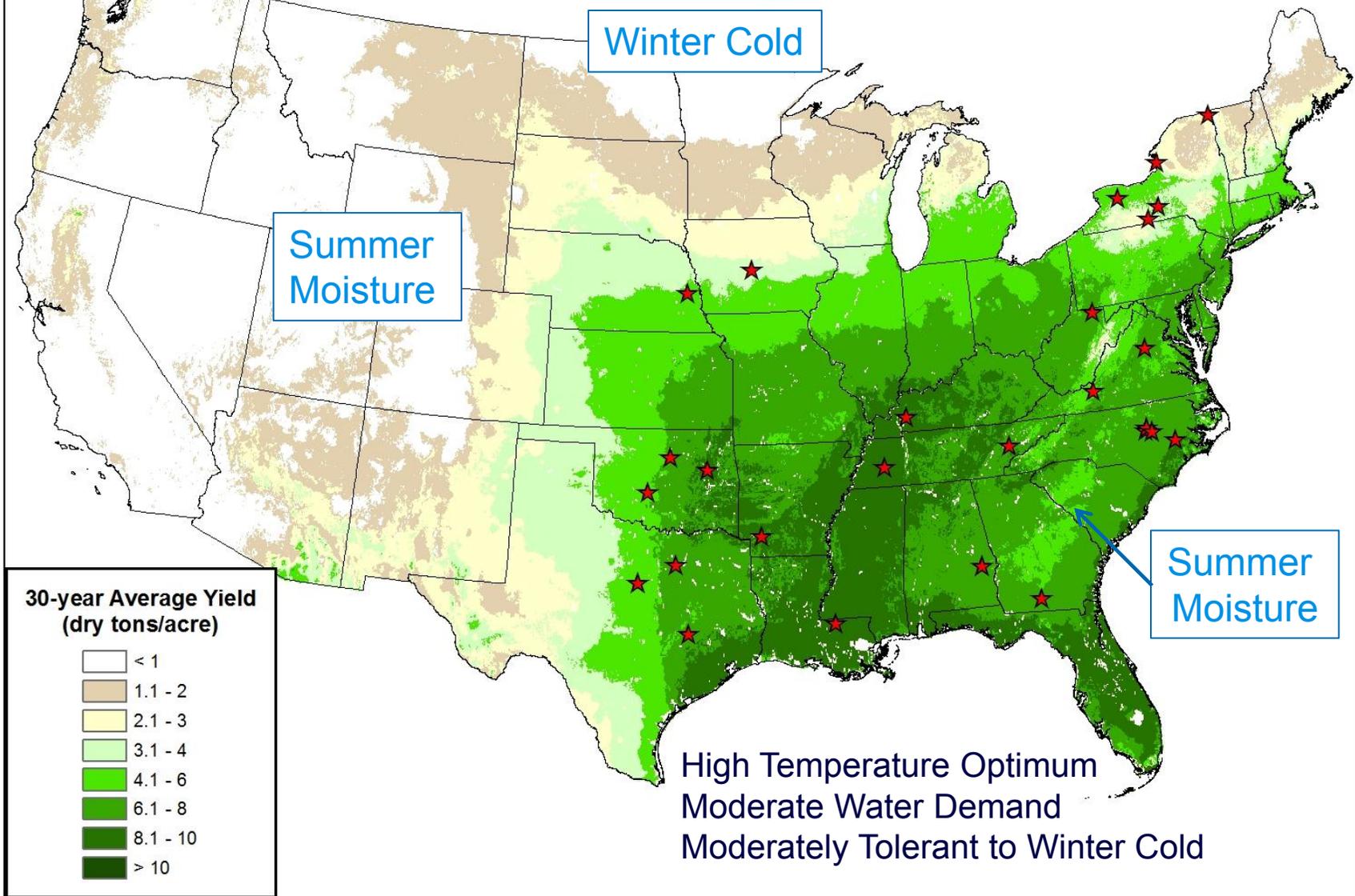
30-year Average Yield  
(dry tons/acre)



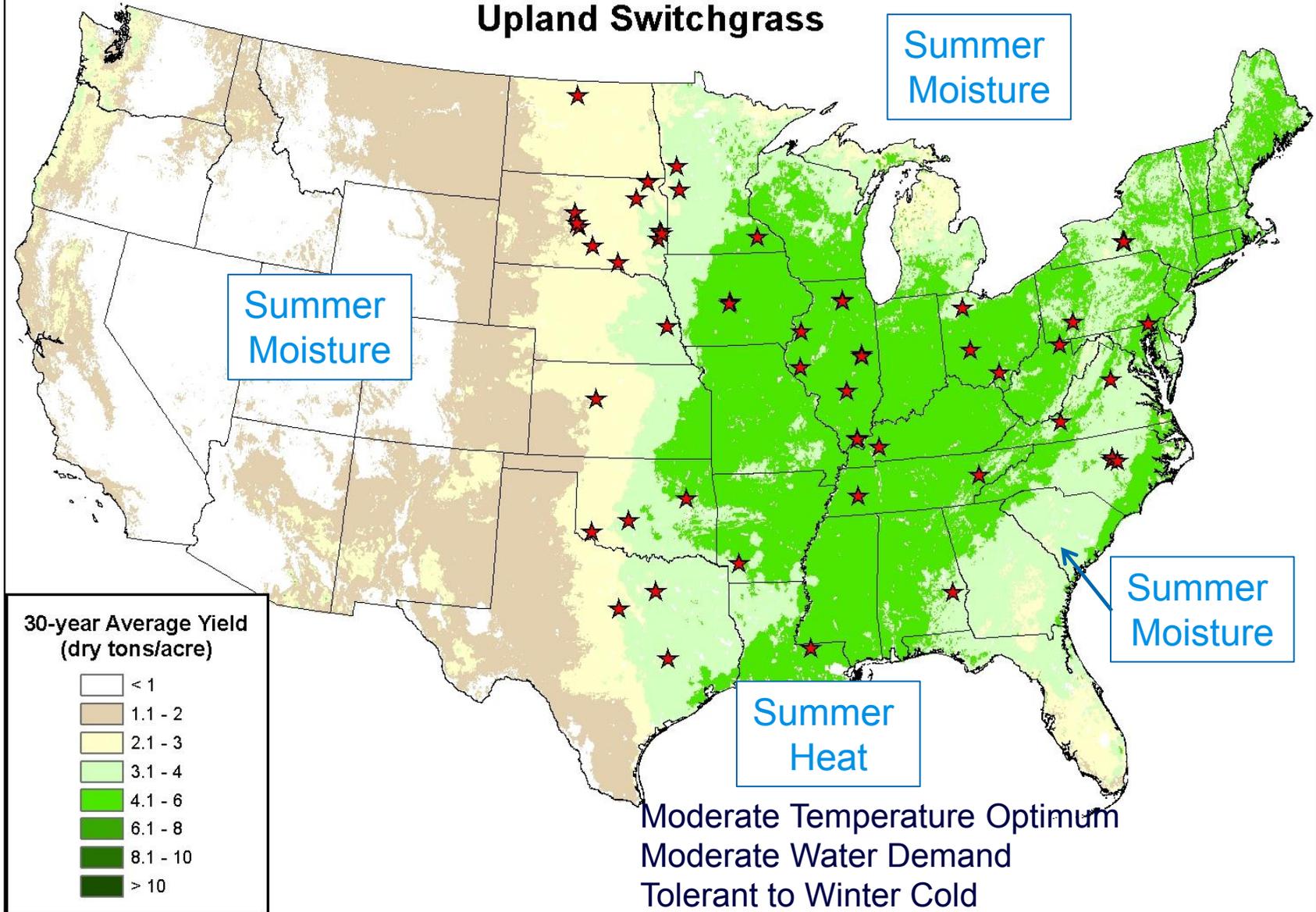
High Temperature Optimum  
High Water Demand  
Intolerant to Winter Cold



# Average Annual Yield Potential, 1981 - 2010 Lowland Switchgrass



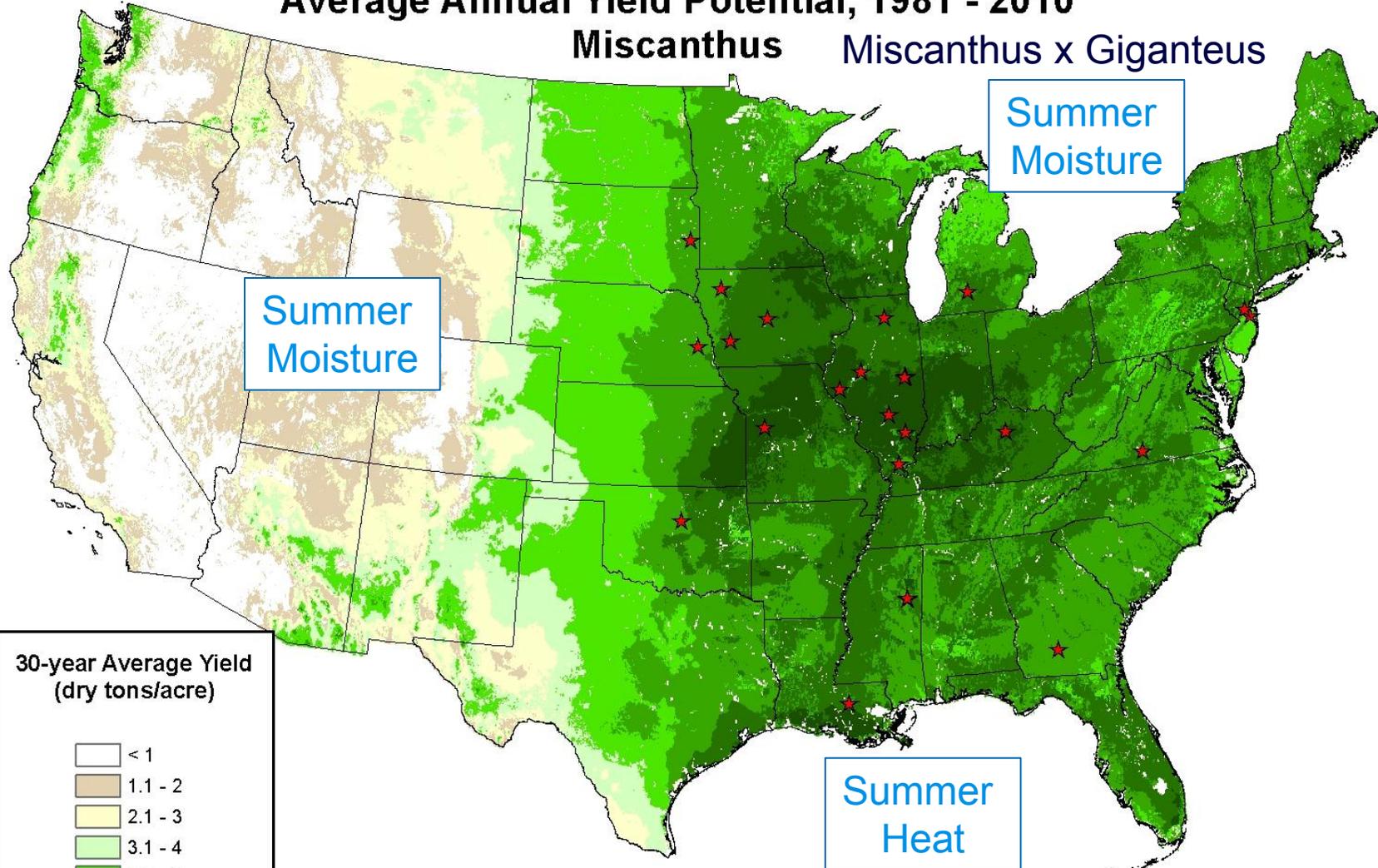
# Average Annual Yield Potential, 1981 - 2010 Upland Switchgrass



# Average Annual Yield Potential, 1981 - 2010

Miscanthus

Miscanthus x Giganteus



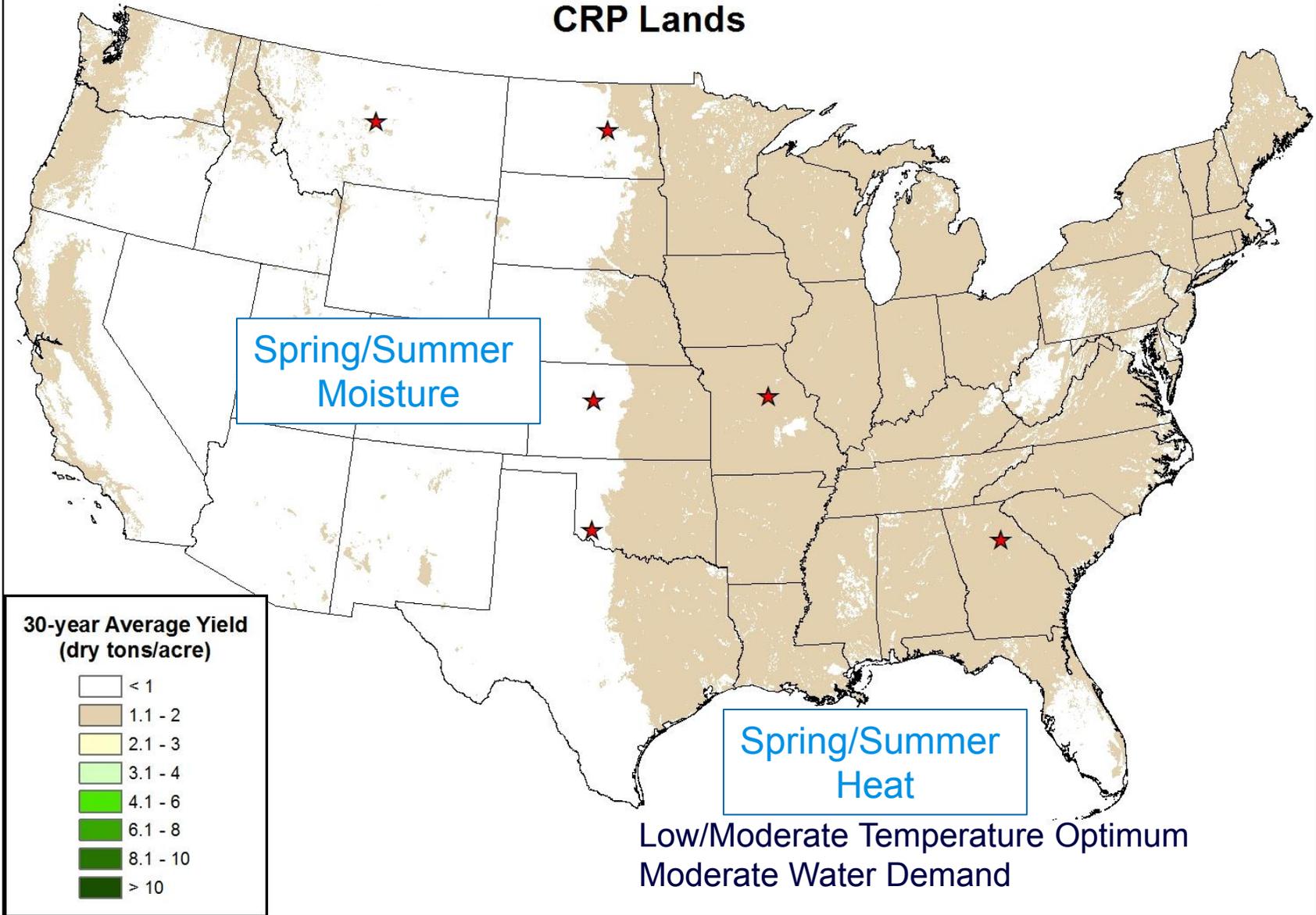
30-year Average Yield  
(dry tons/acre)

- < 1
- 1.1 - 2
- 2.1 - 3
- 3.1 - 4
- 4.1 - 6
- 6.1 - 8
- 8.1 - 10
- > 10

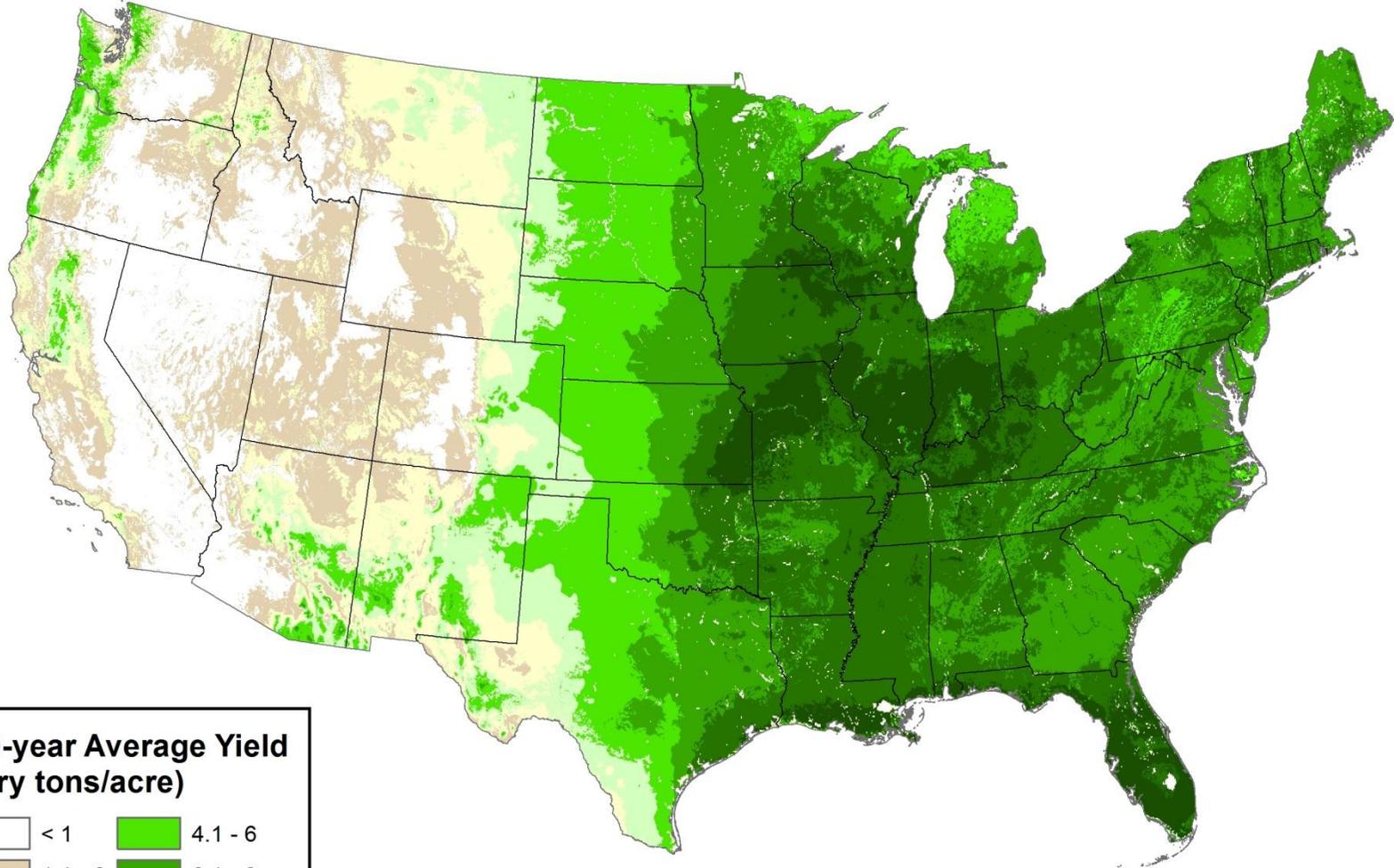
Summer  
Heat

Moderate Temperature Optimum  
Low/Moderate Water Demand

# Average Annual Yield Potential, 1981 - 2010 CRP Lands



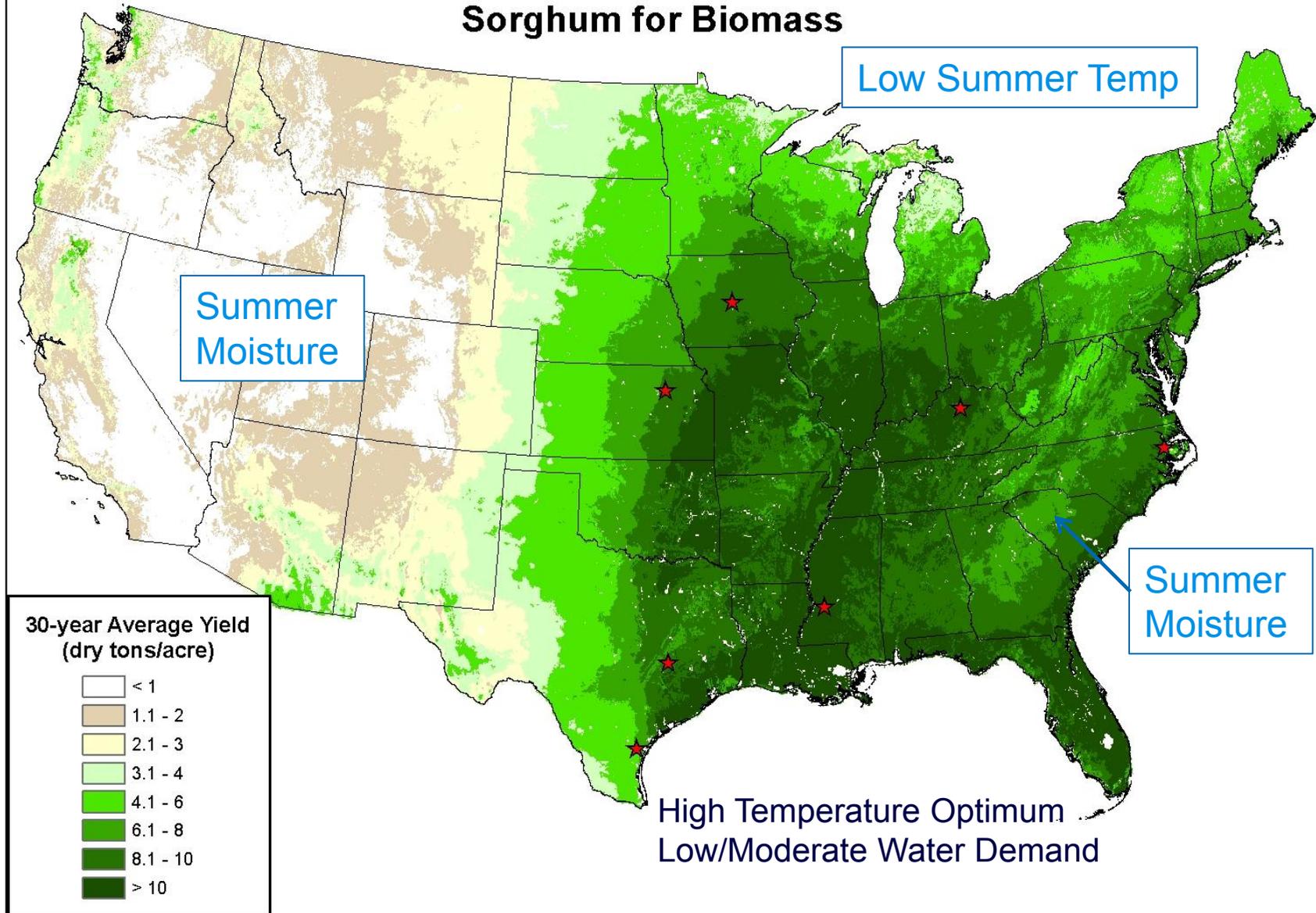
# Maximum Average Annual Yield Potential, 1981-2010 Perennial Herbaceous Feedstocks



## 30-year Average Yield (dry tons/acre)

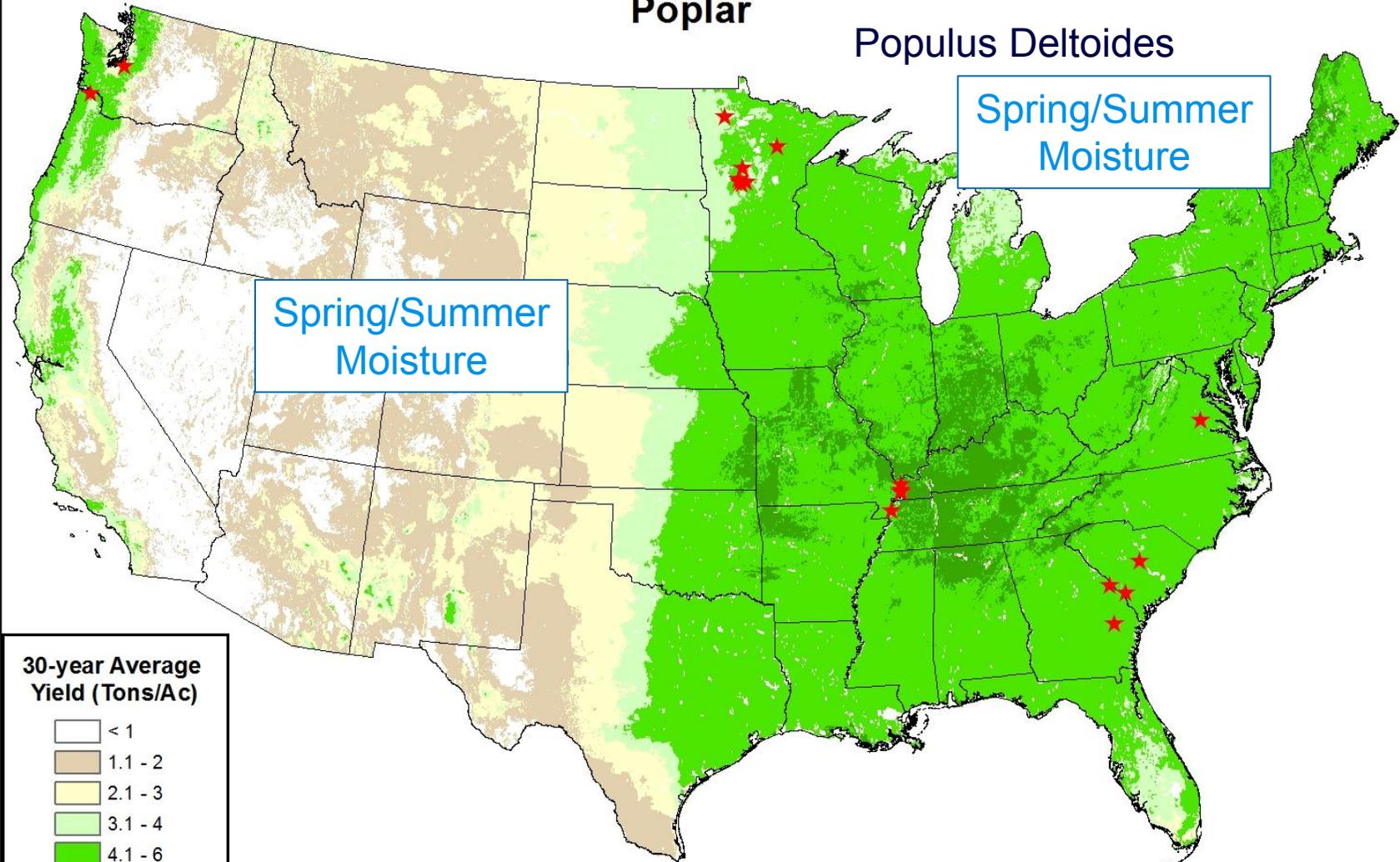
	< 1		4.1 - 6
	1.1 - 2		6.1 - 8
	2.1 - 3		8.1 - 10
	3.1 - 4		> 10

# Average Annual Yield Potential, 1981 - 2010 Sorghum for Biomass

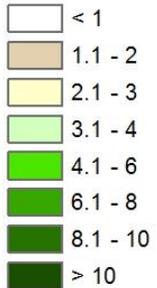


# Average Annual Yield Potential, 1981 - 2010 Poplar

Populus Deltoides



30-year Average  
Yield (Tons/Ac)



Moderate Temperature Optimum  
Moderate Water Demand

# Average Annual Yield Potential, 1981 - 2010 Willow

Winter Cold

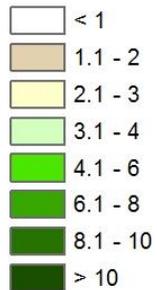
Salix Purpurea

Spring/Summer  
Moisture

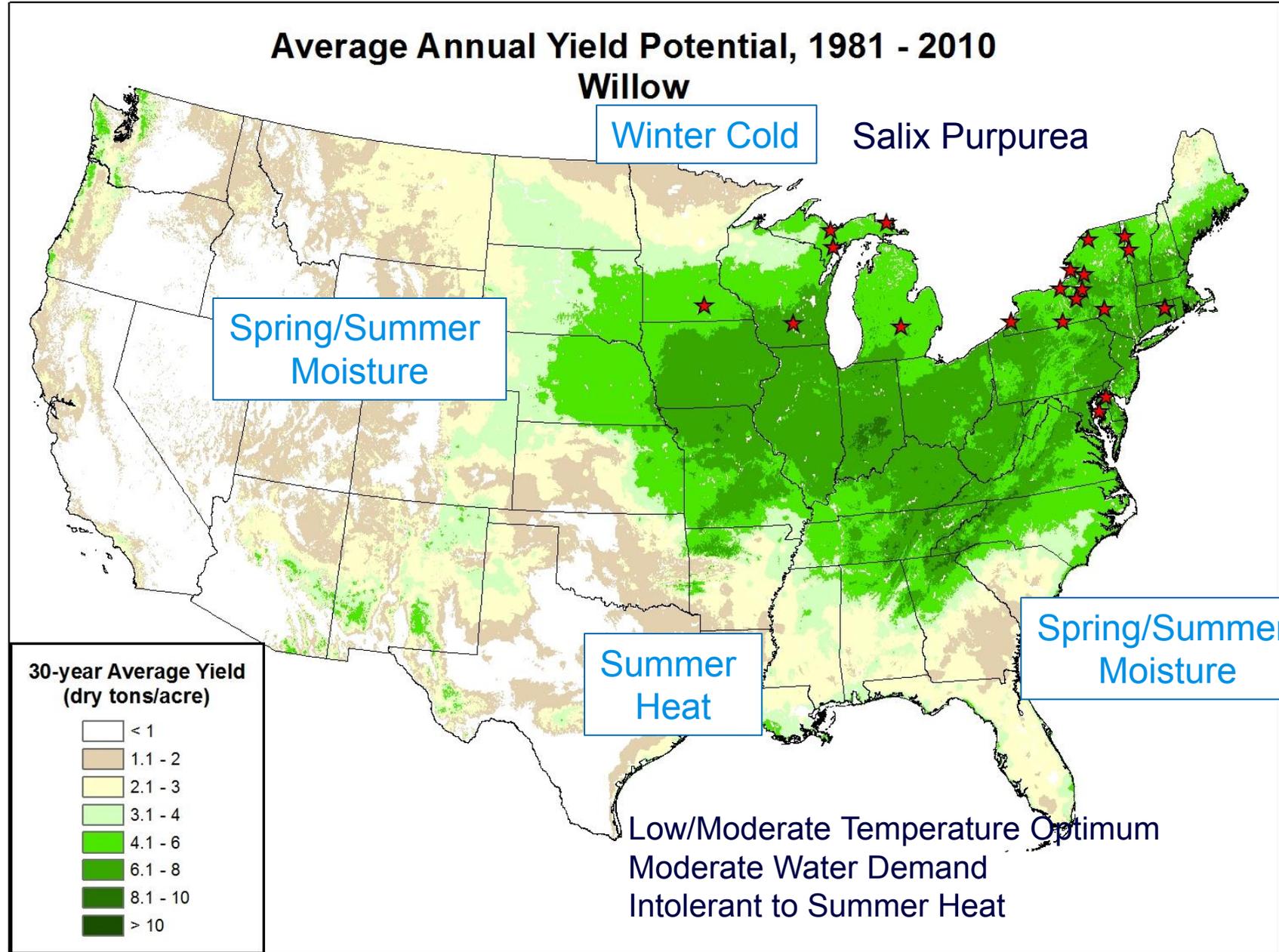
Summer  
Heat

Spring/Summer  
Moisture

30-year Average Yield  
(dry tons/acre)



Low/Moderate Temperature Optimum  
Moderate Water Demand  
Intolerant to Summer Heat



# Average Annual Yield Potential, 1981 - 2010 Pine

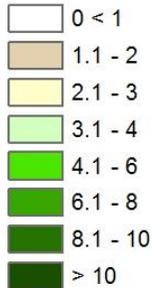
Pinus Taeda

Winter Cold

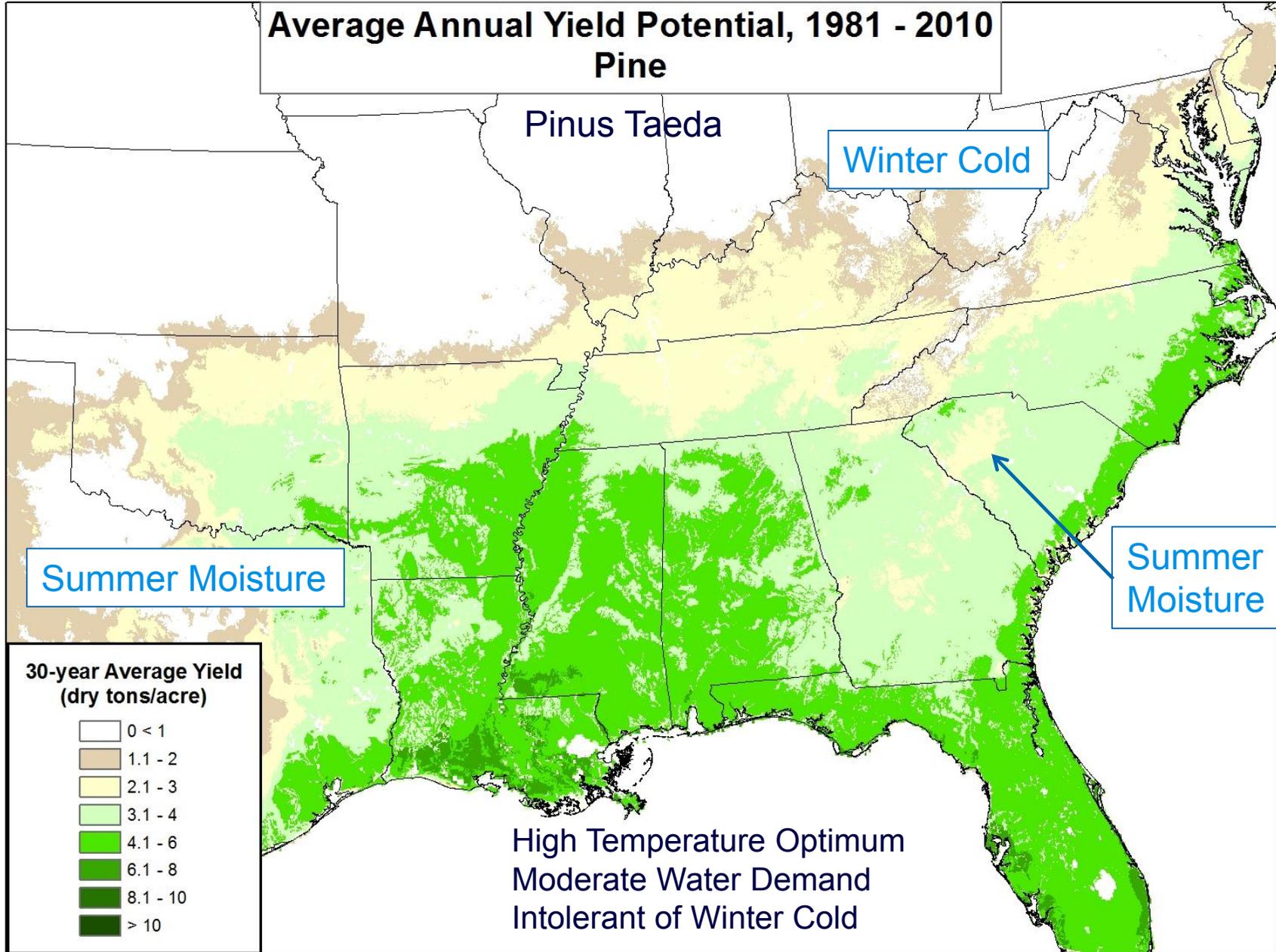
Summer Moisture

Summer Moisture

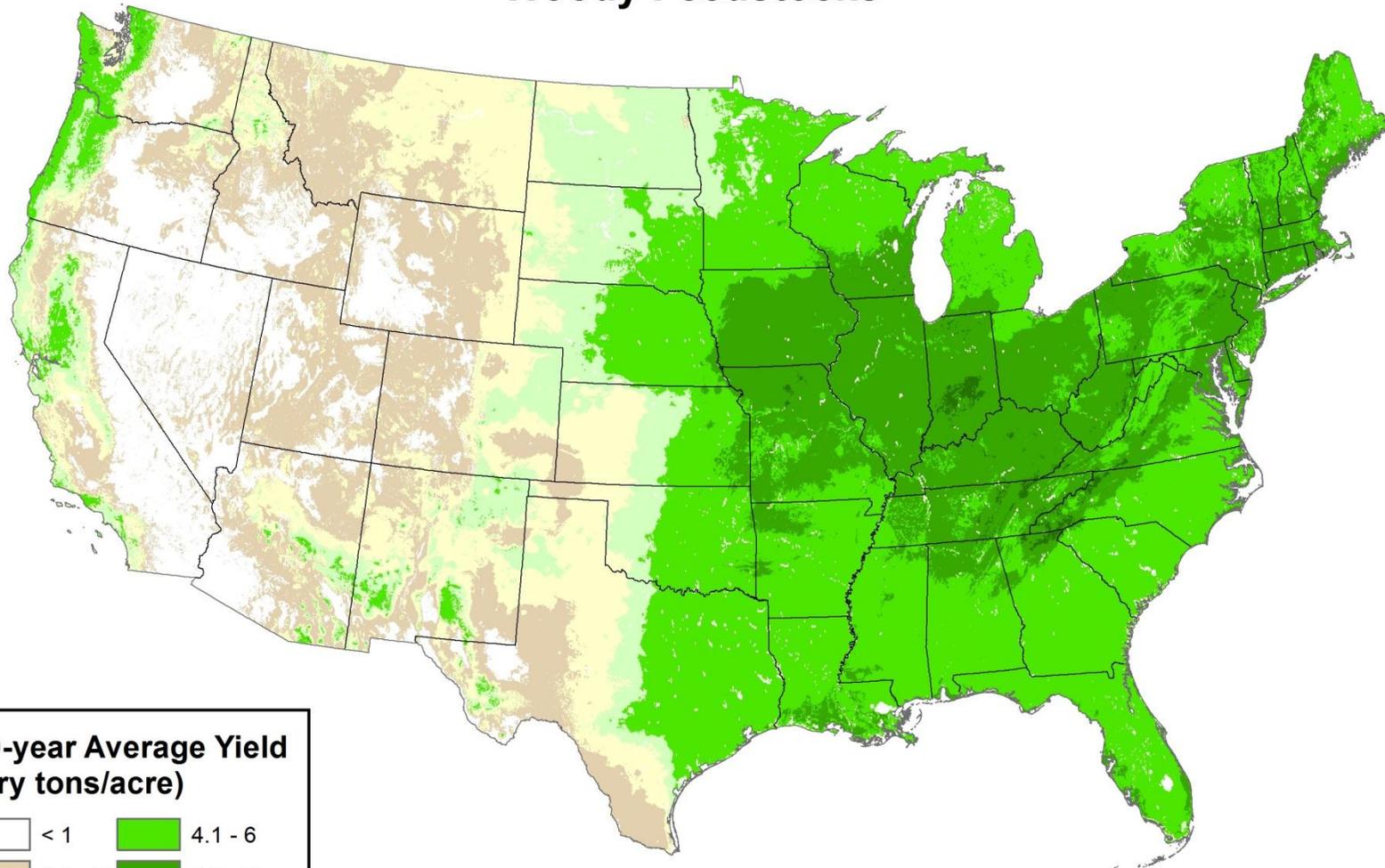
30-year Average Yield  
(dry tons/acre)



High Temperature Optimum  
Moderate Water Demand  
Intolerant of Winter Cold



## Maximum Average Annual Yield Potential, 1981-2010 Woody Feedstocks



### 30-year Average Yield (dry tons/acre)

	< 1		4.1 - 6
	1.1 - 2		6.1 - 8
	2.1 - 3		8.1 - 10
	3.1 - 4		> 10

# Closing Notes

- PRISM-EM provides potential yield distribution maps of biomass feedstocks; these serve as inputs to economic analyses
- Sun Grant field trials provided essential yield data under consistent, coordinated management conditions – more years needed!
- Face-to-face meetings with species experts were a key element to the process
- Maps will be updated with additional yield data and new varieties (maps based on varieties planted in 2008)
- Next Step: Temporal variability/risk maps

