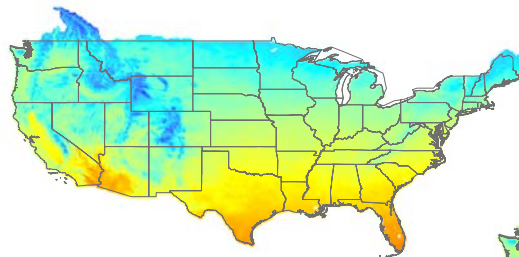


# Climate Change and the Biogeography of Troublesome Weed Species

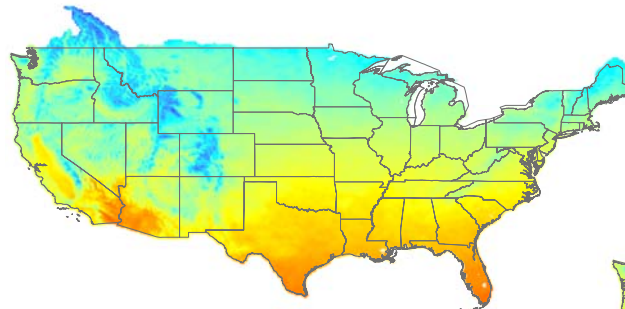
---

**A.J. McDonald** ([ajm9@cornell.edu](mailto:ajm9@cornell.edu))

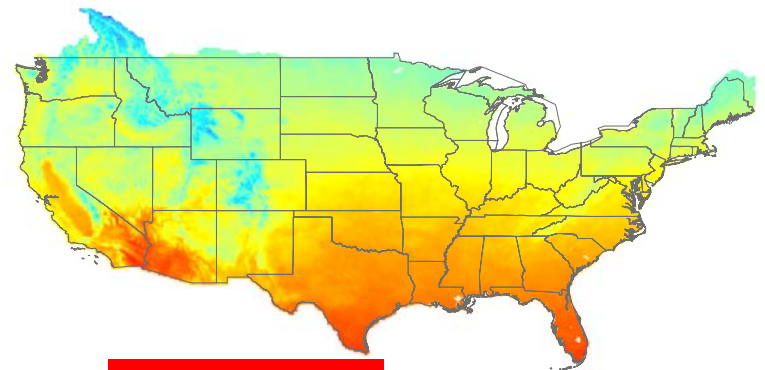
with **S.J. Riha, A. DiTommaso, & A. DeGaetano**



1961 - 1990



2016- 2045



2070- 2099



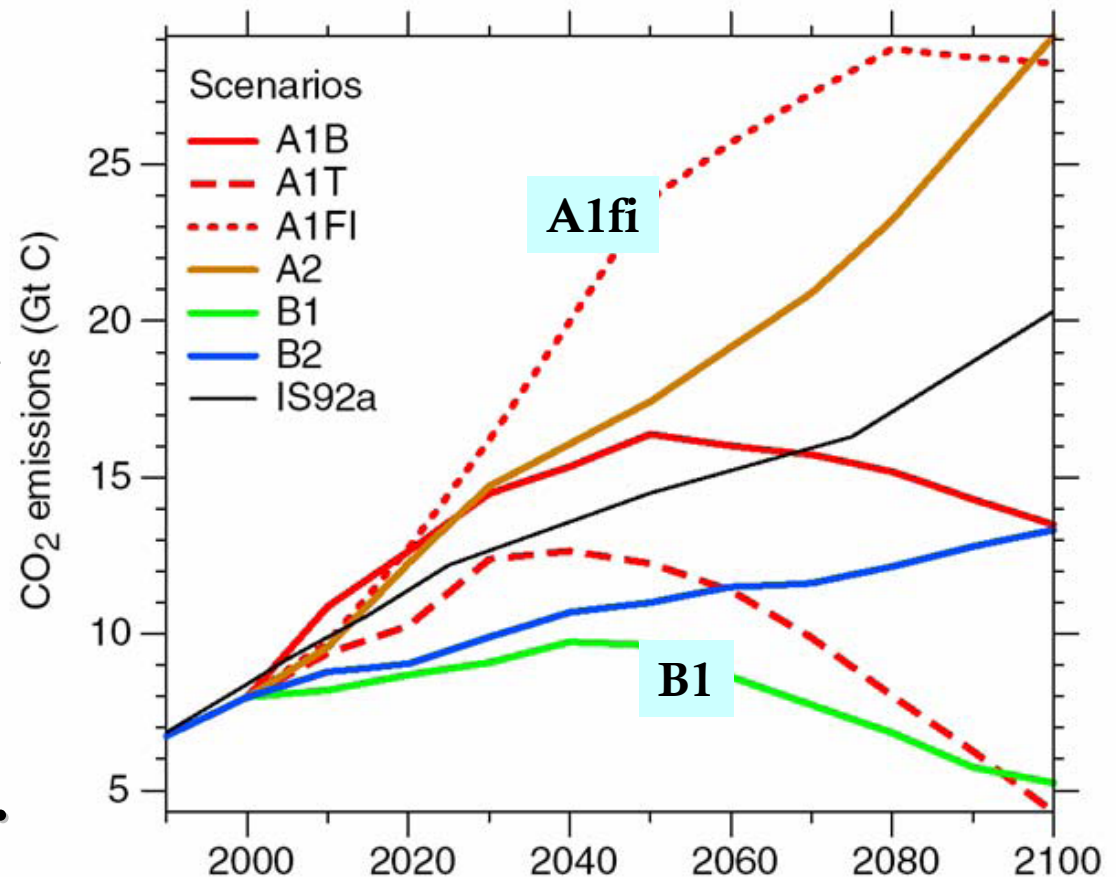
Cornell University

# IPCC Emission Scenarios (IPCC, 2000)

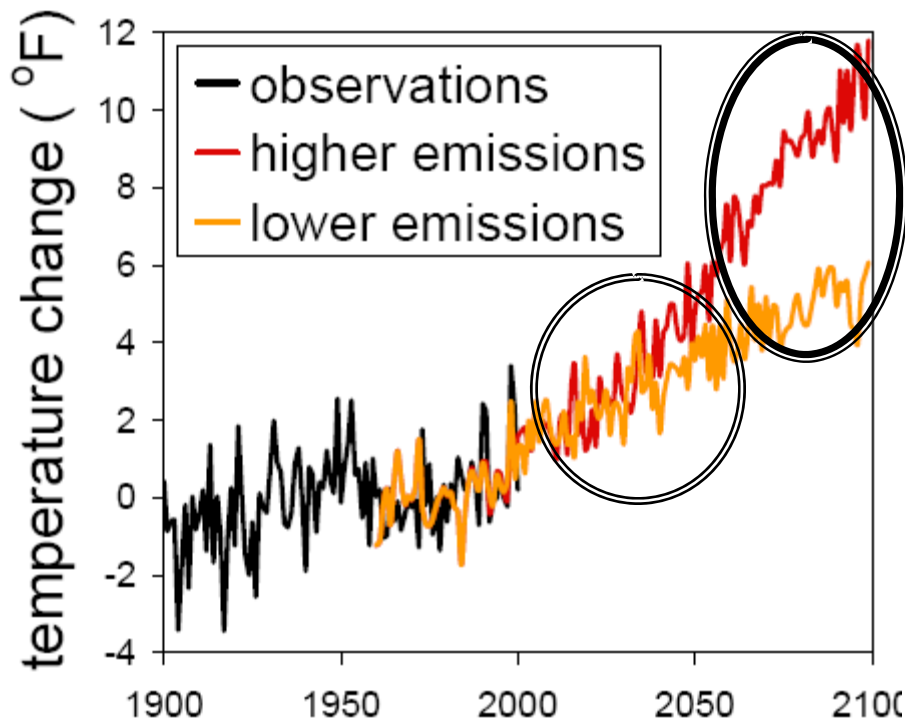
*range of plausible futures*

- **A1fi**: Dependence on fossil fuels and rapid economic growth throughout the next century. **[CO<sub>2</sub>] 940 ppm by 2100**
- **B1**: Global solutions to sustainability. Rapid transitions to efficient energy technologies. **[CO<sub>2</sub>] 550 ppm by 2100.**

**Present-day [CO<sub>2</sub>] 380 ppm**



# Temperature projections for the NE

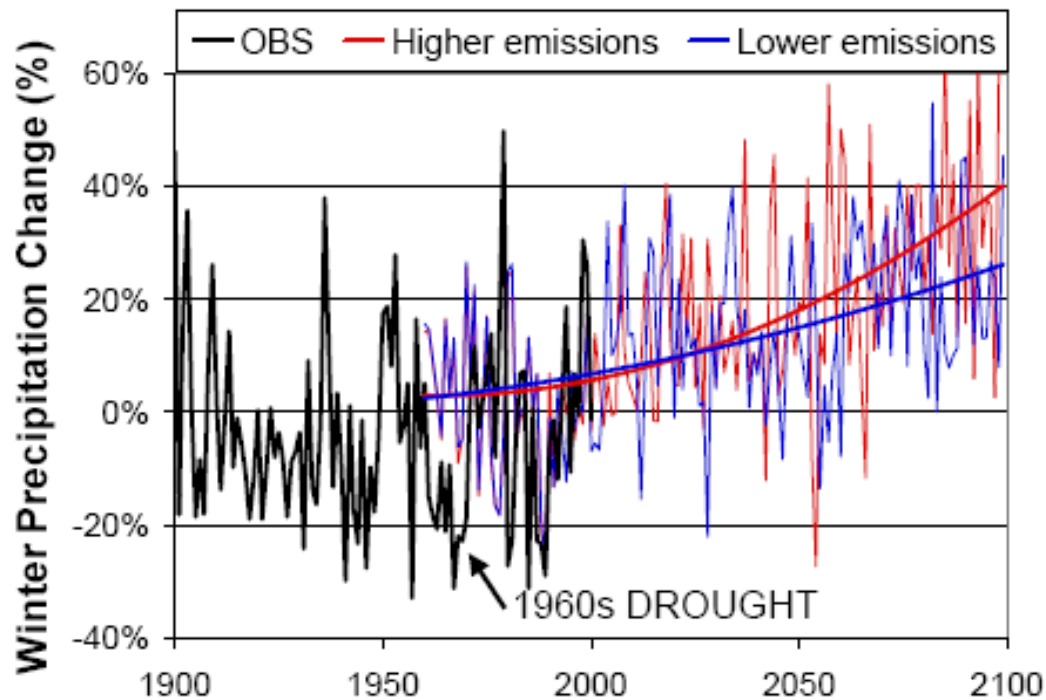


**Ensemble AOGCM forecasts of annual temperature, downscaled to  $1/8^\circ$  for the Northeast (NECIA, 2006)**

**Until mid-century,**  
“commitment” to a certain amount of warming, independent of GHG emissions.

**At the end of the century,**  
the B1 scenario will stabilize temperatures around  $4 - 6^\circ$  F higher than historical levels, whereas A1fi may result in a 10 to 12.5° F increase.

# NE precipitation projections



Ensemble AOGCM forecasts of annual temperature, downscaled to  $1/8^\circ$  for the Northeast (NECIA, 2006)

- Little change in summer precipitation in any emission scenario.
- Significant increases in winter precipitation, especially under higher emissions.
- Total precipitation will increase by  $\sim 15\%$  by end of century under higher emissions scenario.

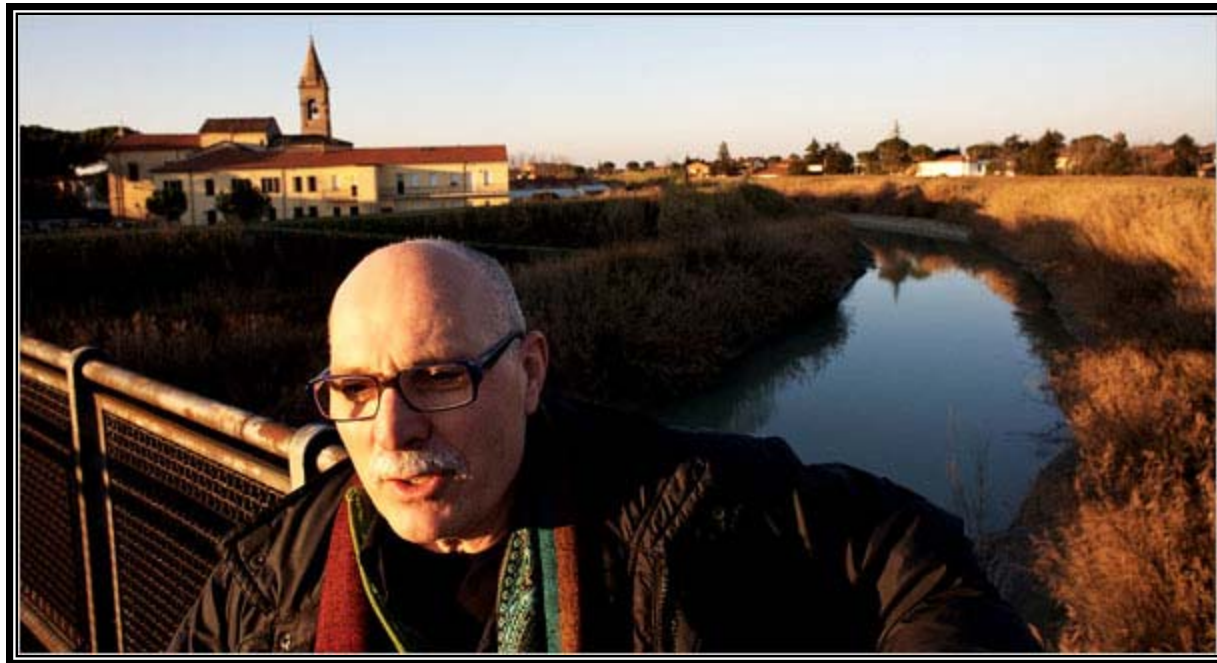
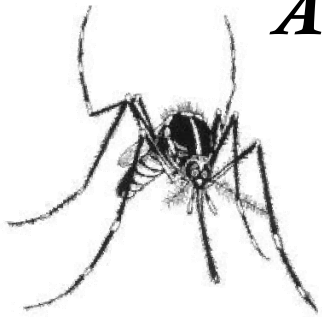
*The Predictable*

# Chikungunya in Southern Europe

---

*As Earth Warms Up, Tropical Virus Moves to Italy*

NY Times, 12/23/07



# *The Unexpected*

## Global change and the price of *beer*?

---

**CLIMATE CONSENSUS**



**BIOFUEL EXPANSION**

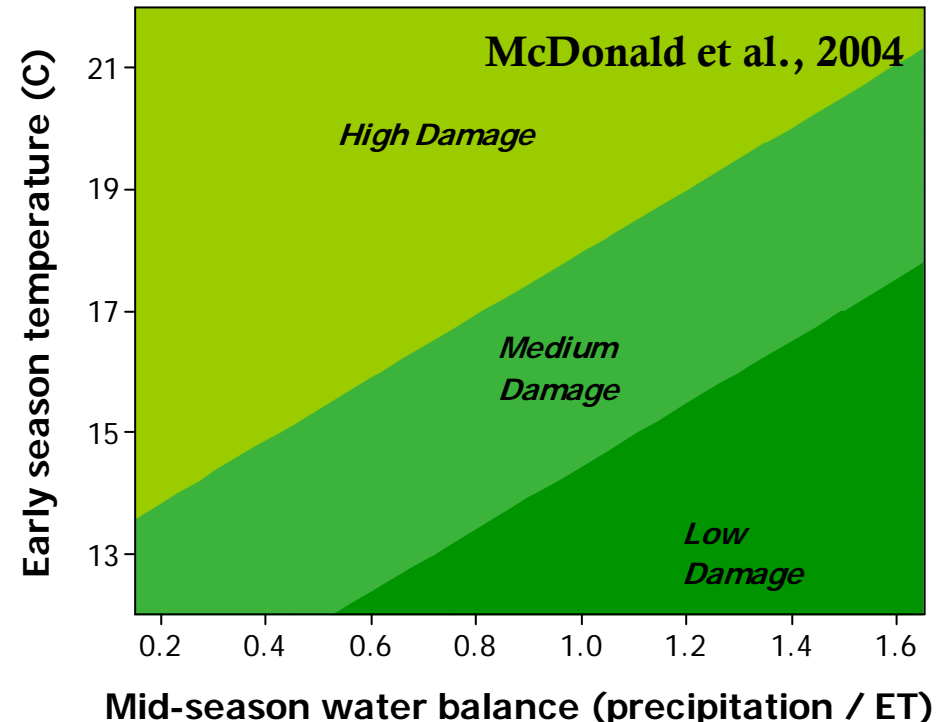


**SHORTAGE OF HOPS & BARLEY**



# Direct effects of climate change on weeds (I)

**In-season competition:**  
growing-season weather  
has a strong influence on  
the dynamics crop-weed  
interference

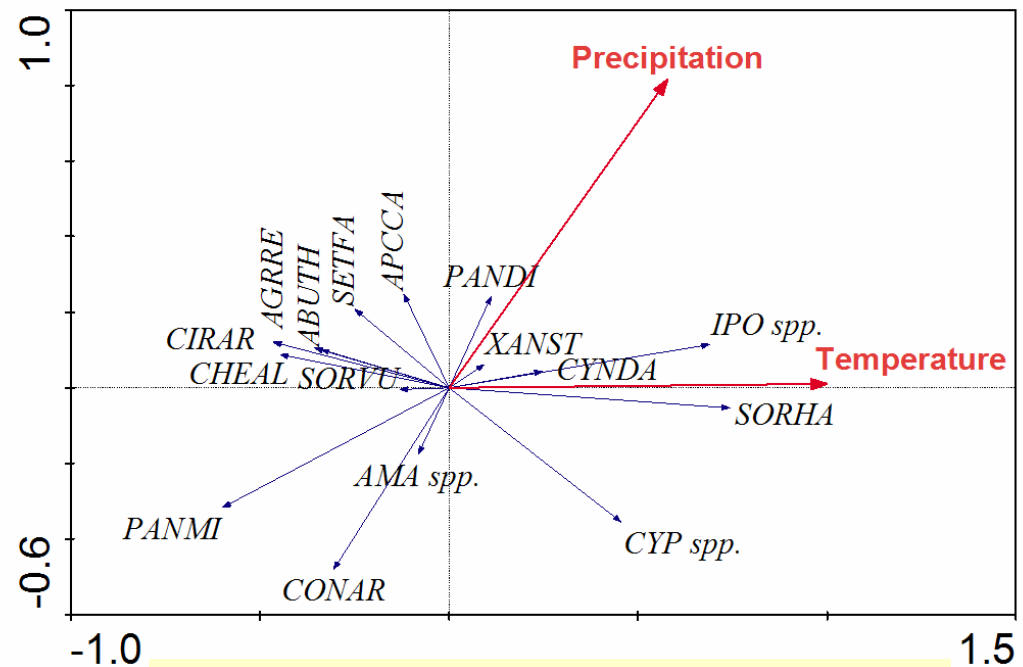


**Climate change and increased weather variability:  
more difficult to anticipate competitive outcomes?**

*Adaptive management strategies to cope with uncertainty*

# Direct effects of climate change on weeds (II)

**Weed populations:**  
climate (i.e. long-term weather) has a strong influence on weed community composition



Ordination of weed species in maize

**Biogeography:** study of where organisms live, at what abundance, and *why*

*As the climate warms, geographic range for species will shift*



# Bioclimatic Niche

*resource “rules” that govern potential geographic distribution*

## Hierarchy of resource factors

Climate factors

Topography

LU / LC

Soils

### SCALE

Global to  
Regional

Local to  
Field

**Bioclimatic Niche**  
*potential distribution based  
on limiting resource factors*

**Dispersal Factors**  
*Vectors, barriers, etc.*

**Disturbance Factors**  
*Extreme events, etc.*

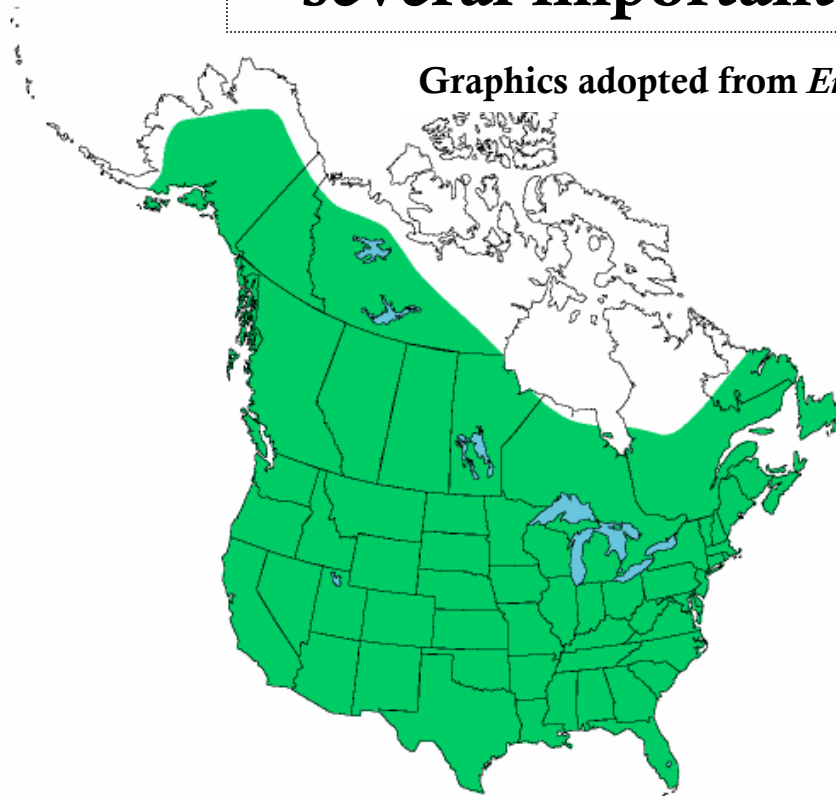
**Realized Distribution**

(adopted from Pearson & Dawson, 2003)

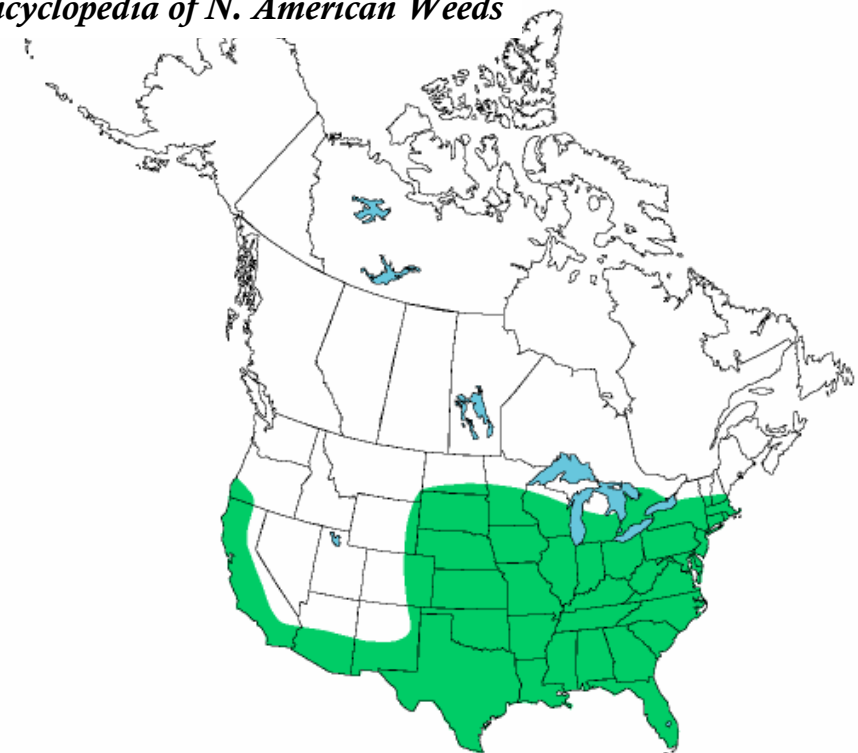
# Will climate change matter to the geographic range of US agronomic weeds?

**Extensive bioclimatic niche for several important agronomic weeds**

Graphics adopted from *Encyclopedia of N. American Weeds*



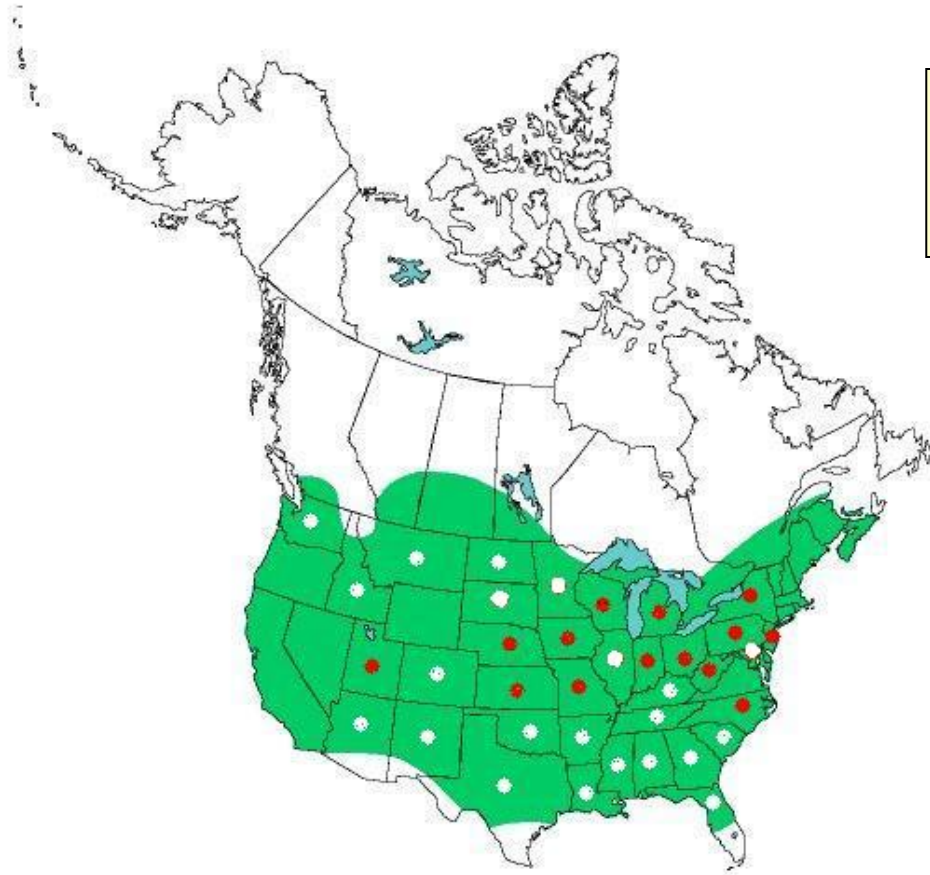
*C. album* distribution



*S. halepense* distribution

**Damage Niche:** *environmental conditions where species are abundant & damaging to specific crops, not simply present*

---



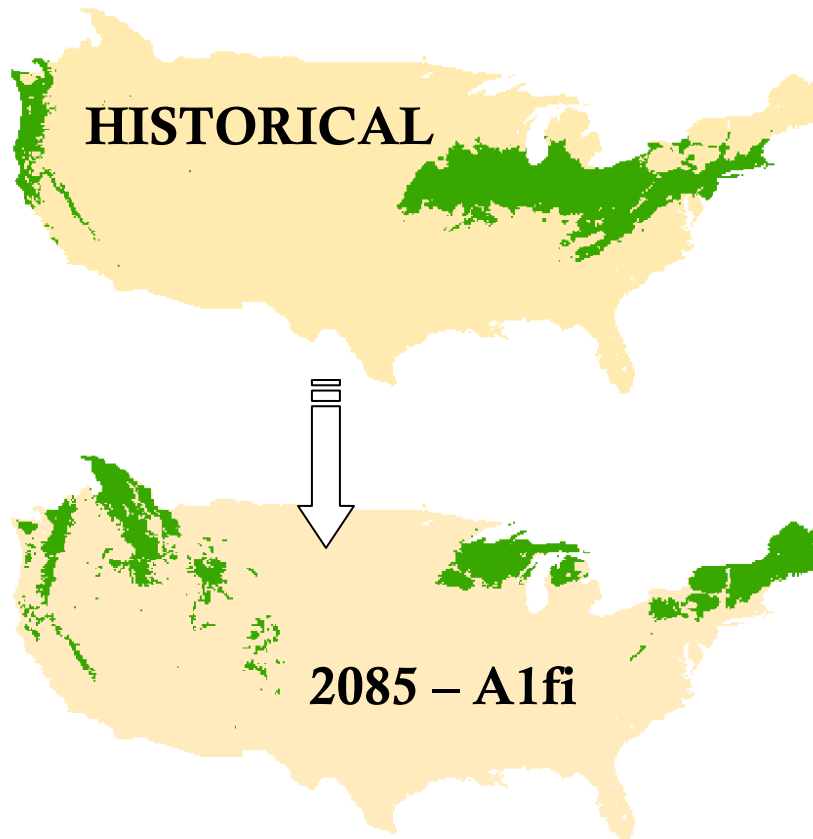
***Challenge to biogeography  
in agricultural systems:***

**Determining the  
damage niche, rather  
than the broader  
bioclimatic niche, for  
important weed species**

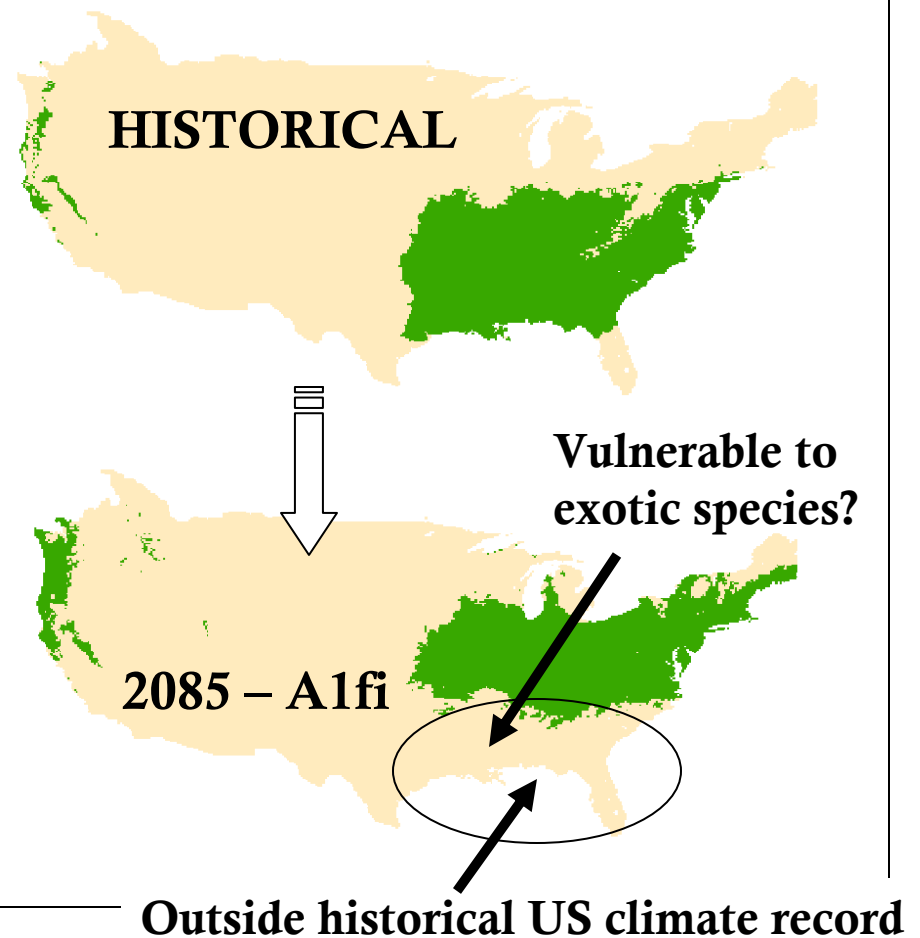
*A. theophrasti* is considered troublesome to maize in only 14 of 38 States where maize is cultivated (Bridges, 1992).

# Bridges Data *rough guide to damage niche geography for widely-distributed species*

**ABUTH damage niche range**



**SORHA damage niche range**



# Biogeography Methods: *What weed species will be damaging to crops in a changing climate and where?*

---

- 1. Ecophysiological studies and mechanistic modeling** (*difficult to test multiple resource factors and interactions, results not readily extrapolated to field conditions*)
- 2. Bioclimatic niche modeling** With high-resolution survey data of troublesome species (e.g. finer than state-level), use quantitative statistical techniques to correlate environment factors with geographic distribution of damage (*survey data does not yet exist*).
- 3. Space-for-time substitution** With existing low-resolution survey data for troublesome weeds (i.e. Bridges, 1992), identify historical analogues for projected climates.

# Space-for-Time Substitution *based on annual state climatology and Bridges survey data*

---

## WEED SURVEY

- **Bridges (1992) “top-ten” survey of troublesome weeds in corn** for different US states (corn has the widest geographic range of any agronomic crop, hence was used in this analysis).

## CLIMATE DATA

- **A1fi emissions scenario**
- **Historical data and ensemble AOGCM projections for mean annual precipitation and temperature** (aggregated to state-level from downscaled projections, Hayhoe et al., 2006)
- **Three time periods for state climatology:** historical (1961 – 1990), coming decades (2016 – 2045), end of century (2070 – 2099)

# Analysis Caveats (selected!)

---

- ❑ Suggests **potential weed community changes** based on climate factors. Actual changes will be influenced by other factors such as dispersal processes.
- ❑ Does not account for the role of **climate variability** or increasing **atmospheric CO<sub>2</sub>**
- ❑ Cannot be used for **emergent climate conditions** (e.g. in southern US) and other states with no historical analogue

# Results

---

## **Nine States**

**Appalachia – Kentucky**

**Southeast – Alabama, South Carolina**

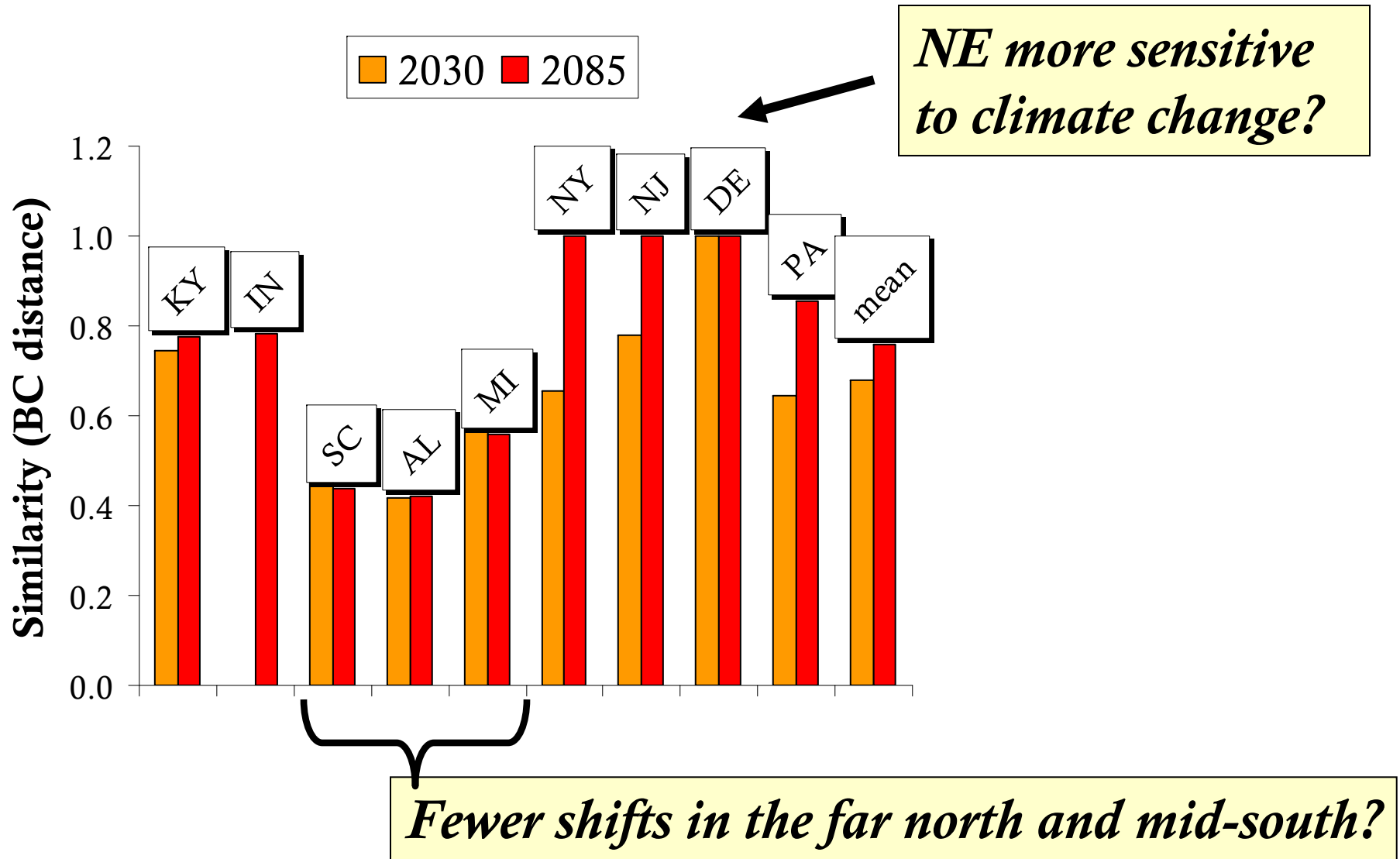
**Lake States – Michigan**

**Northeast – Delaware, New York,  
New Jersey, Pennsylvania**



# Troublesome weed community changes

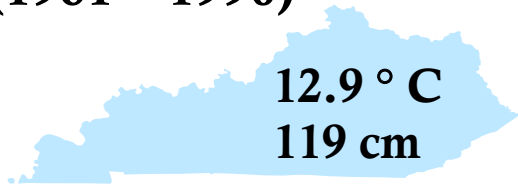
*(Bray – Curtis Similarity, weighted by damage rank)*



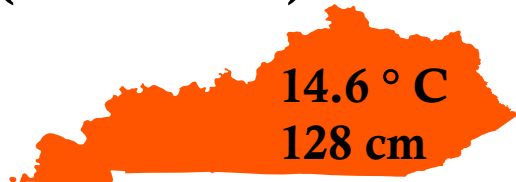
# Appalachia

## Kentucky: A1F1 Emissions Scenario

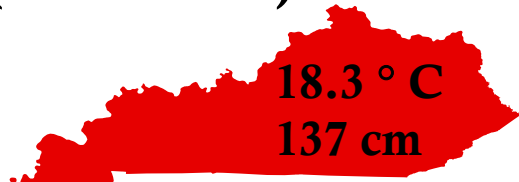
Historical  
(1961 – 1990)



Coming Decades  
(2016 – 2045)



End of Century  
(2070 – 2099)



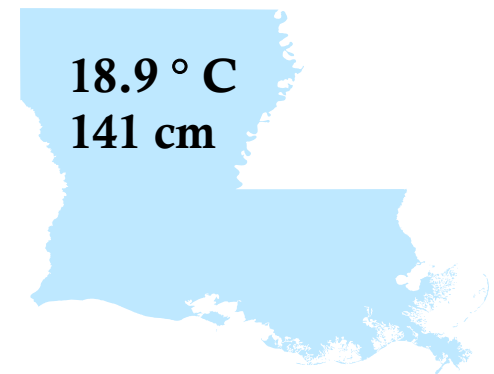
**Annual Mean Climatology:  
Precipitation & Temperature**

RESEMBLING HISTORICAL

NC



LA



# Kentucky (A1fi scenario)

## *Potential* troublesome weed species in maize



### KENTUCKY

1. *S. halepense*
2. *S. vulgare*
3. *A. trifida*
4. *C. laeve*
5. *P. dichotomiflorum*
6. *S. angulatus*
7. *C. radicans*
8. *C. arvensis*
9. *I. hederacea*
10. *X. strumarium*

### N. CAROLINA

1. *S. halepense*
2. *U. texana*
3. *U. platyphylla*
4. *S. obtusifolia*
5. *Ipomoea spp.*
6. *Cyperus spp.*
7. *S. angulatus*
8. *S. carolinense*
9. *A. theophrasti*
10. *C. dactylon*

**Retained: 2 / 10**

### LOUISIANA

1. *S. halepense*
2. *R. cochinchinensis*
3. *U. platyphylla*
4. *Ipomoea spp*

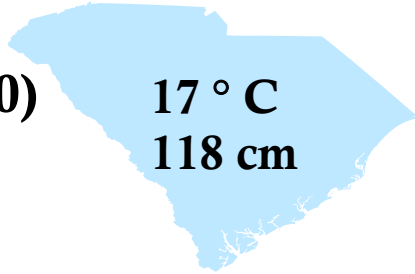
**Retained: 1 / 10**

# *Southeast*

## South Carolina: A1fi Emissions Scenario

### Historical

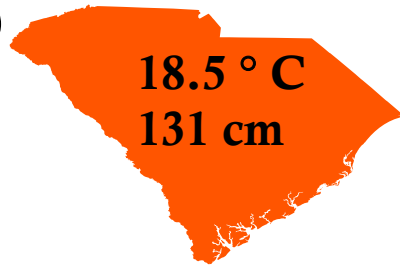
(1961 – 1990)



**Annual Mean Climatology:  
Precipitation & Temperature**

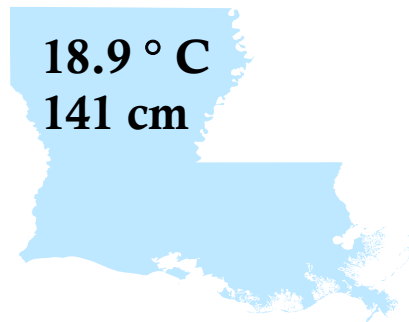
### Coming Decades

(2016 – 2045)



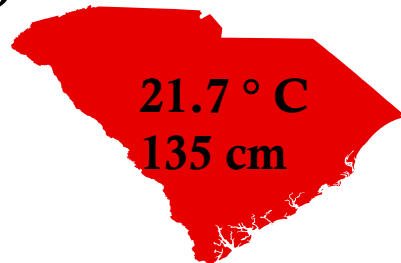
### RESEMBLING HISTORICAL

LA

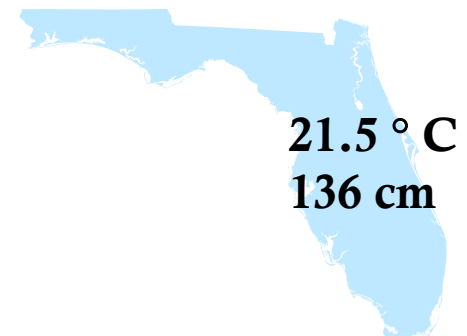


### End of Century

(2070 – 2099)



FL



# South Carolina (A1fi scenario)

## *Potential* troublesome weed species in maize



### SOUTH CAROLINA

1. *C. dactylon*
2. *U. texana*
3. *U. platyphylla*
4. *S. halepense*
5. *Ipomoea spp.*
6. *Cyperus spp.*
7. *C. obtusifolia*
8. *P. dichotomiflorum*
9. *A. palmeri*
10. *X. strumarium*

### LOUISIANA

1. *S. halepense*
2. *R. cochinchinensis*
3. *U. platyphylla*
4. *Ipomoea spp.*

**Retained: 3 / 8**

### FLORIDA

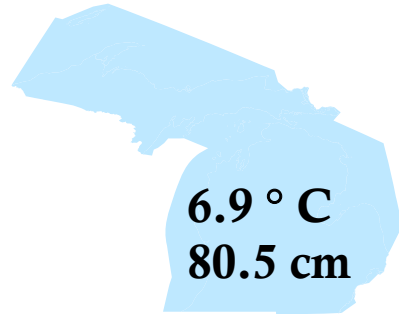
1. *U. texana*
2. *D. tortuosum*
3. *C. obtusifolia*
4. *S. halepense*
5. *X. strumarium*
6. *Ipomoea spp.*
7. *A. hispidum*
8. *Cyperus spp.*
9. *Amaranthus spp.*
10. *Digitaria spp.*

**Retained: 6 / 8**

# Lake States

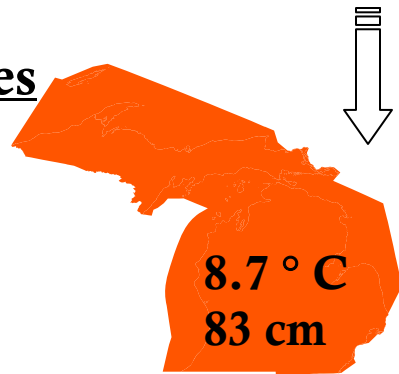
## Michigan: A1fi Scenario

Historical  
(1961 – 1990)



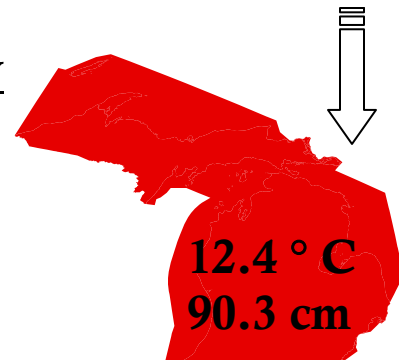
**Annual Mean Climatology:  
Precipitation & Temperature**

Coming Decades  
(2016 – 2045)

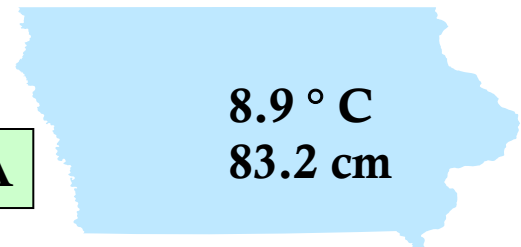


RESEMBLING HISTORICAL

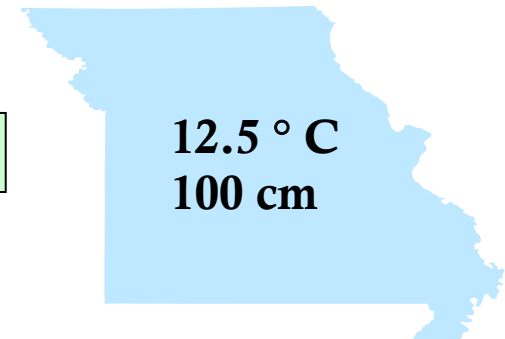
End of Century  
(2070 – 2099)



IA



MO



# Michigan (A1fi scenario)

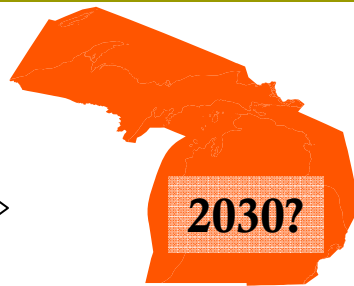
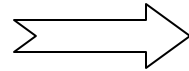
## *Potential* troublesome weed species in maize



Historical

### MICHIGAN

1. *A. theophrasti*
2. *P. dichotomiflorum*
3. *E. repens*
4. *C. album*
5. *C. arvense*
6. *A. cannabinum*
7. *C. arvensis*
8. *D. sanguinalis*
9. *S. faberi*

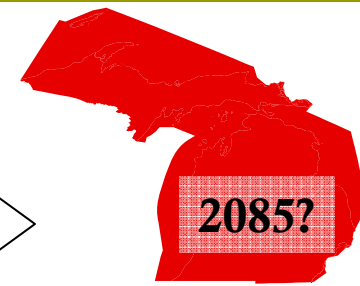
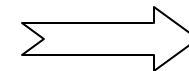


2030?

### IOWA

1. *S. faberi*
2. *A. theophrasti*
3. *Amaranthus* spp.
4. *C. album*
5. *X. strumarium*
6. *P. pensylvanicum*
7. *H. annuus*
8. *S. bicolor*
9. *E. villosa*
10. *E. repens*

Retained: 4 / 9



2085?

### MISSOURI

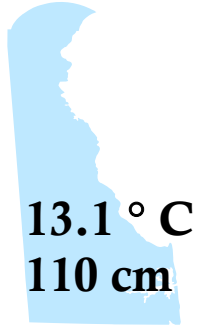
1. *A. theophrasti*
2. *S. bicolor*
3. *S. faberi*
4. *A. rudis*
5. *P. dichotomiflorum*
6. *A. syriaca*
7. *A. cannabinum*
8. *S. halepense*
9. *C. album*
10. *X. strumarium*

Retained: 5 / 9

# Northeast

## Delaware: A1fi Scenario

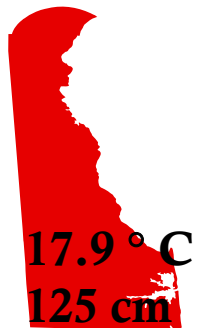
Historical  
(1961 – 1990)



Coming Decades  
(2016 – 2045)



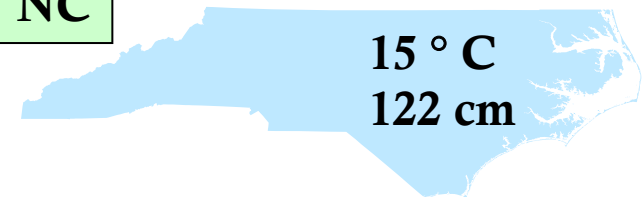
End of Century  
(2070 – 2099)



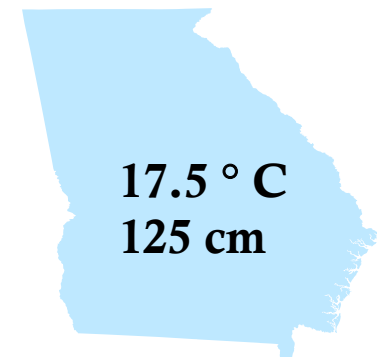
**Annual Mean Climatology:  
Precipitation & Temperature**

RESEMBLING HISTORICAL

NC



GA



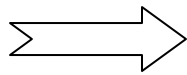


# Delaware (A1fi scenario)

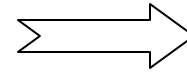
## *Potential* troublesome weed species in maize



Historical



2030?



2085?

### DELAWARE

1. *C. arvense*
2. *P. dichotomiflorum*
3. *A. cannabinum*
4. *S. faberi*
5. *Amaranthus* spp.

### N. CAROLINA

1. *S. halepense*
2. *U. texana*
3. *U. platyphylla*
4. *C. obtusifolia*
5. *Ipomoea* spp.
6. *Cyperus* spp.
7. *S. angulatus*
8. *S. carolinense*
9. *A. theophrasti*
10. *C. dactylon*

**Retained: 0 / 10**

### GEORGIA

1. *U. texana*
2. *Ipomoea* spp.
3. *X. strumarium*
4. *C. obtusifolia*
5. *C. occidentalis*
6. *S. halepense*

**Retained: 0 / 10**

# *Northeast*

## Pennsylvania: A1fi Scenario

Historical  
(1961 – 1990)

8.9 ° C  
106 cm

**Annual Mean Climatology:  
Precipitation & Temperature**

Coming Decades  
(2016 – 2045)

10.7 ° C  
113 cm

RESEMBLING HISTORICAL

WV

10.5 ° C  
111 cm

End of Century  
(2070 – 2099)

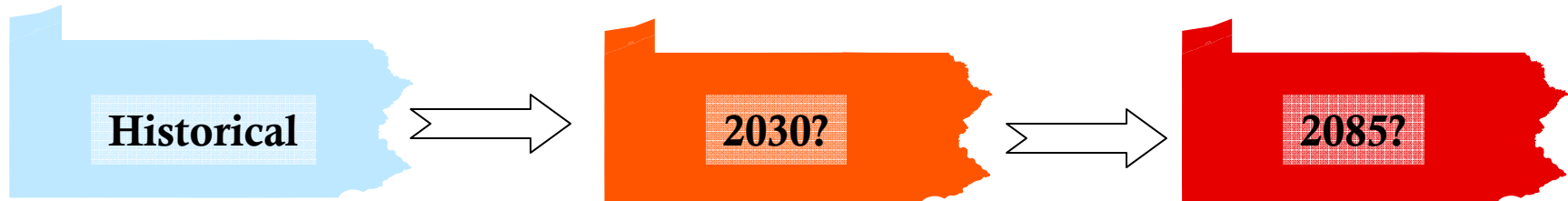
14.3 ° C  
120 cm

NC

15 ° C  
122 cm

# Pennsylvania (Alfi scenario)

## *Potential* troublesome weed species in maize



### PENNSYLVANIA

1. *A. artemisiifolia*
2. *A. cannabinum*
3. *S. carolinense*
4. *M. frondosa*
5. *R. fruticosus*
6. *E. repens*
7. *A. theophrasti*
8. *S. angulatus*
9. *C. arvensis*
10. *C. album*

### W. VIRGINIA

1. *S. halepense*
2. *A. retroflexus*
3. *C. album*
4. *A. theophrasti*
5. *M. frondosa*
6. *E. repens*
7. *Cyperus* spp.
8. *A. syriaca*
9. *A. cannabinum*
10. *S. angulatus*

**Retained: 6 / 10**

### N. CAROLINA

1. *S. halepense*
2. *U. texana*
3. *U. platyphylla*
4. *C. obtusifolia*
5. *Ipomoea* spp.
6. *Cyperus* spp.
7. *S. angulatus*
8. *S. carolinense*
9. *A. theophrasti*
10. *C. dactylon*

**Retained: 3 / 10**

# Conclusions

## *Climate change and the geography of damage*

---

- ❑ **Geographic distribution** of troublesome species is likely to be significantly transformed
- ❑ In some states, potential **nearer-term changes** are commensurate to those possible by the end of the century
- ❑ Weed communities in the **NE** may experience more significant changes than other US regions
- ❑ Emerging climate niches in the South suggests new vulnerabilities to **exotics**
- ❑ Projections could be useful for targeting climatically-favored species for **control**

# Refining results

## *improved survey data of troublesome weed species*

---

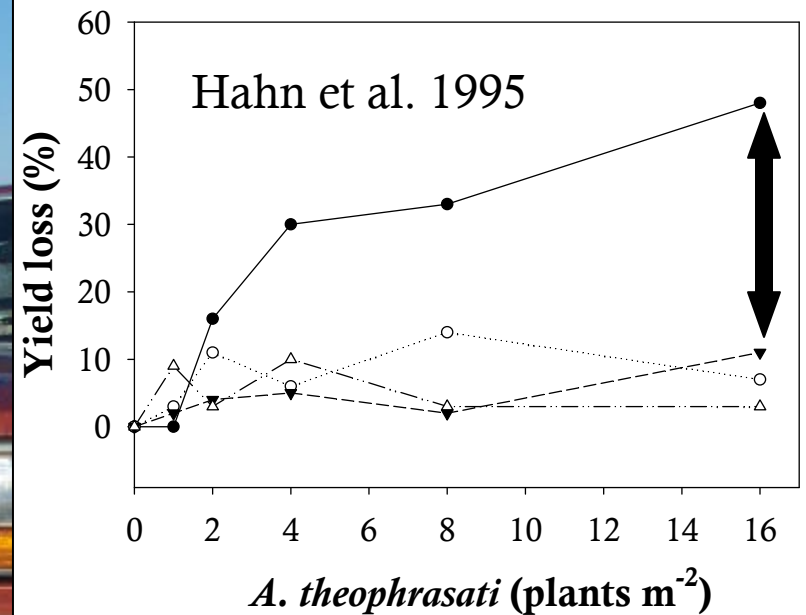
- ❑ **Finer geographic scale** (e.g. NOAA climate divisions, or physiographic regions of a state)
- ❑ Account for major **management factors** like tillage systems and irrigation
- ❑ Consistent definition of **‘troublesome’**
- ❑ **Multiple respondents** for each survey area (reduce influence of observer bias)

# Competition is a dynamic process....



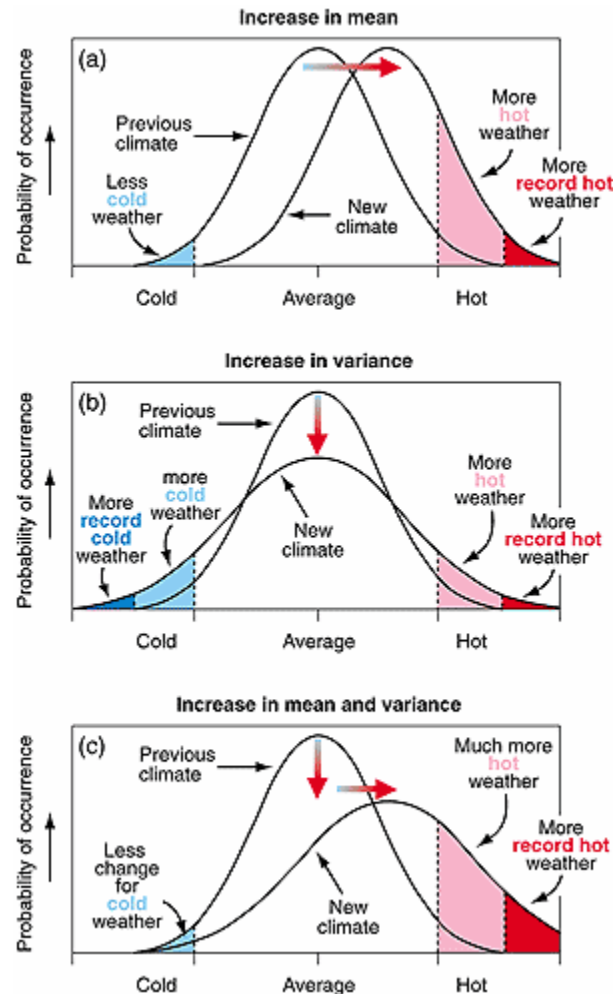
*Chenopodium album*

*Abutilon theophrasti*



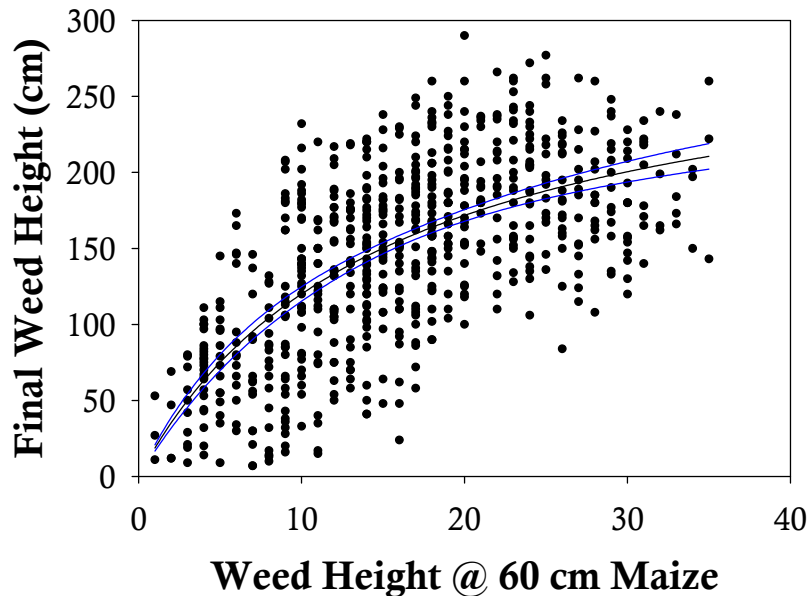
*and weather is an important driver*

# With climate change, historical outcomes may be an increasingly poor guide to management



**Challenge for adaptation:**  
devise simple, reliable  
methods for predicting weed  
interference that integrate  
weather & other important  
drivers of competition

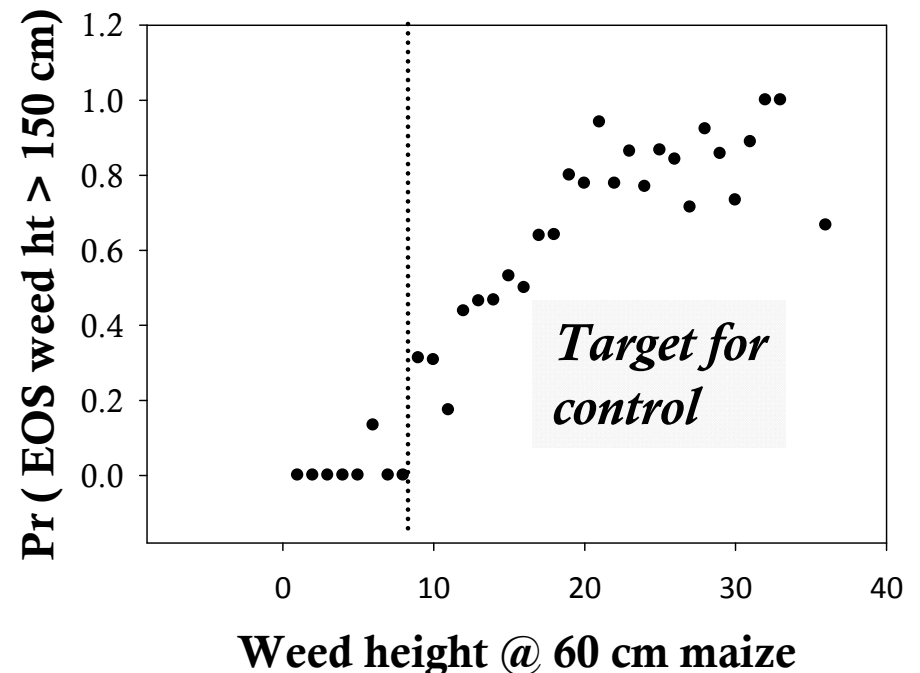
# Early weed height as a robust indicator of damage potential in maize?



## Field experiments

- 4 weed species
- 4 planting dates
- 3 relative emergence times
- 2 growing seasons
- 700+ weed individuals

When weeds were  $\leq 8$  cm at 60 cm maize, **Pr weed would be competitive was less than 2%** (2 out of 108 cases)





## Hierarchy-based, selective management *targeting individuals for POST control based on early height*

---

- Retard the evolution of **herbicide resistance** (e.g. glyphosate stewardship)
- Promote in-field **biodiversity & ecosystem services**
- Reduce the economic and environmental **costs** of weed control, while maintaining high yields and limiting seedbank additions
- Help producers adapt to increased **weather uncertainty** in a changing climate



---

**QUESTIONS?**



---

# **ADDITIONAL MATERIAL**

# Corn Belt

## Indiana: A1fi Emissions Scenario

Historical  
(1961 – 1990)



Coming Decades  
(2016 – 2045)

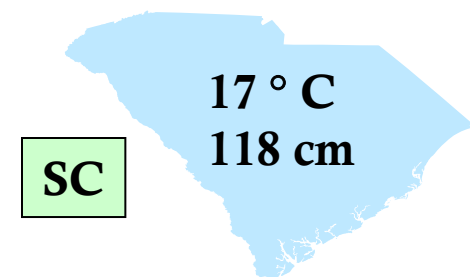
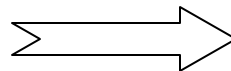
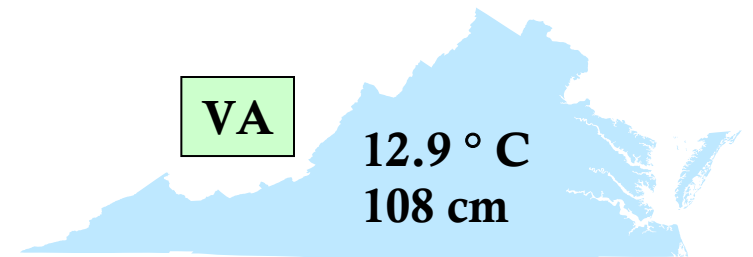
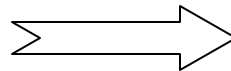


End of Century  
(2070 – 2099)



**Annual Mean Climatology:  
Precipitation & Temperature**

RESEMBLING HISTORICAL



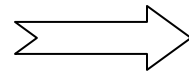
# Indiana (Alfi scenario)

## *Potential* troublesome weed species in maize



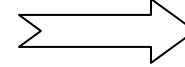
INDIANA

1. *A. theophrasti*
2. *A. trifida*
3. *S. halepense*
4. *C. arvensis*
5. *X. strumarium*
6. *S. faberi*
7. *Ipomoea spp.*
8. *S. angulatus*
9. *A. cannabinum*
10. *D. stramonium*



VIRGINIA

???



SOUTH CAROLINA

1. *C. dactylon*
2. *U. texana*
3. *U. platyphylla*
4. *S. halepense*
5. *Ipomoea spp.*
6. *Cyperus spp.*
7. *C. obtusifolia*
8. *P. dichotomiflorum*
9. *A. palmeri*
10. *X. strumarium*

**Retained: 3 / 10**

# *Southeast*

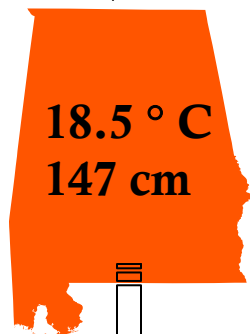
## Alabama: A1fi Emissions Scenario

Historical  
(1961 – 1990)



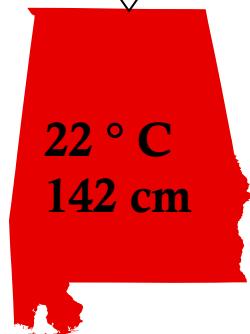
**Annual Mean Climatology:  
Precipitation & Temperature**

Coming Decades  
(2016 – 2045)



RESEMBLING HISTORICAL

End of Century  
(2070 – 2099)



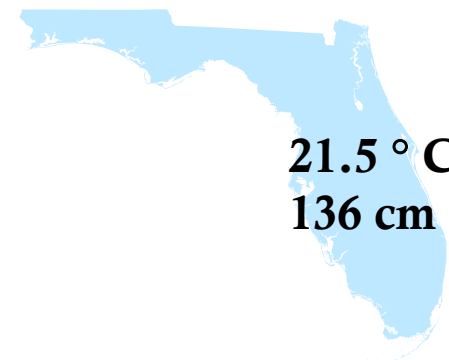
LA

18.9 °C  
141 cm



FL

21.5 °C  
136 cm



# Alabama (Alfi scenario)

## *Potential* troublesome weed species in maize



Historical

### ALABAMA

1. *S. halepense*
2. *U. texana*
3. *U. platyphylla*
4. *Ipomoea spp.*
5. *P. dichotomiflorum*
6. *C. obtusifolia*
7. *Amaranthus spp.*
8. *Cyperus spp.*



2030?

### LOUISIANA

1. *S. halepense*
2. *R. cochinchinensis*
3. *U. platyphylla*
4. *Ipomoea spp.*

**Retained: 3 / 8**



2085?

### FLORIDA

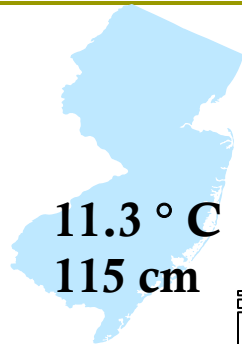
1. *U. texana*
2. *D. tortuosum*
3. *C. obtusifolia*
4. *S. halepense*
5. *X. strumarium*
6. *Ipomoea spp.*
7. *A. hispidum*
8. *Cyperus spp.*
9. *Amaranthus spp.*
10. *Digitaria spp.*

**Retained: 6 / 8**

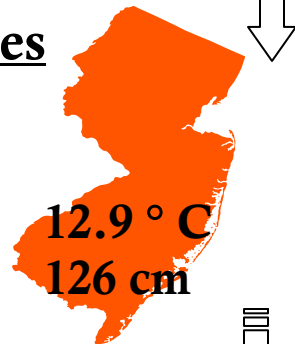
# Northeast

## New Jersey: A1fi Scenario

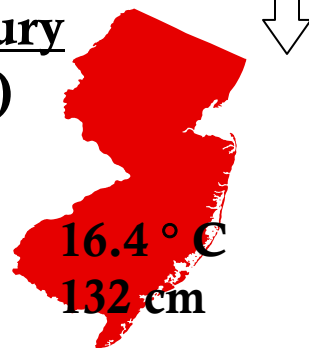
Historical  
(1961 – 1990)



Coming Decades  
(2016 – 2045)



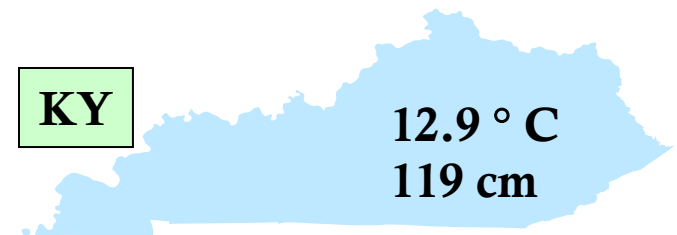
End of Century  
(2070 – 2099)



**Annual Mean Climatology:  
Precipitation & Temperature**

RESEMBLING HISTORICAL

KY



AL



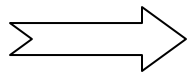


# New Jersey (Alfi scenario)

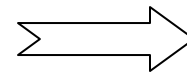
## *Potential* troublesome weed species in maize



Historical



2030?



2085?

### NEW JERSEY

1. *A. cannabinum*
2. *S. bicolor*
3. *A. theophrasti*

### KENTUCKY

1. *S. halepense*
2. *S. vulgare*
3. *A. trifida*
4. *A. albidus*
5. *P. dichotomiflorum*
6. *S. angulatus*
7. *C. radicans*
8. *C. arvensis*
9. *I. hederacea*
10. *X. strumarium*

**Retained: 0 / 3**

### ALABAMA

1. *S. halepense*
2. *U. texana*
3. *U. platyphylla*
4. *Ipomoea spp.*
5. *P. dichotomiflorum*
6. *C. obtusifolia*
7. *Amaranthus spp.*
8. *Cyperus spp.*

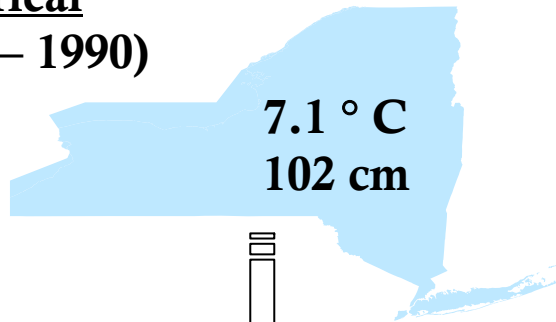
**Retained: 0 / 3**

# *Northeast*

## New York: A1fi Emissions Scenario

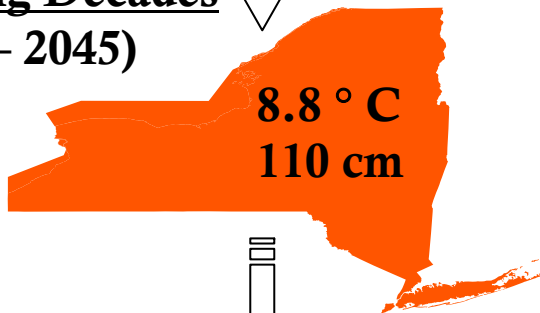
### Historical

(1961 – 1990)



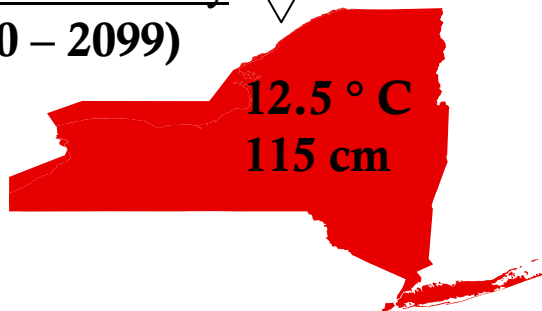
### Coming Decades

(2016 – 2045)



### End of Century

(2070 – 2099)



**Annual Mean Climatology:  
Precipitation & Temperature**

### RESEMBLING HISTORICAL

PA

8.9 ° C  
106 cm

KY

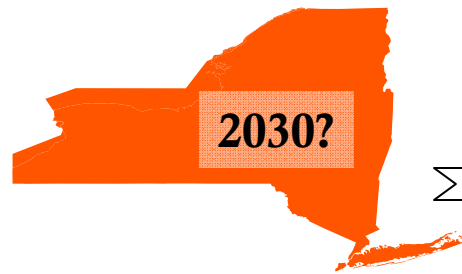
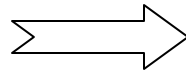
12.9 ° C  
119 cm

# New York (A1fi scenario)

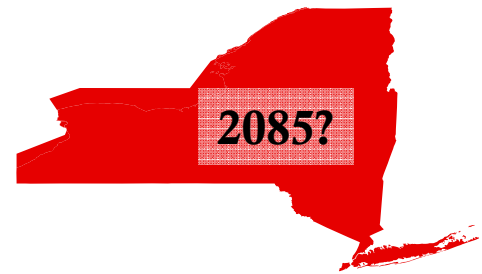
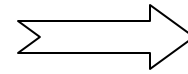
## *Potential* troublesome weed species in maize



Historical



2030?



2085?

### NEW YORK

1. *A. theophrasti*
2. *C. album*
3. *M. frondosa*
4. *A. syriaca*
5. *S. carolinense*
6. *C. sepium*
7. *S. faberi*

### PENNSYLVANIA

1. *A. artemisiifolia*
2. *A. cannabinum*
3. *S. carolinense*
4. *M. frondosa*
5. *R. fruticosus*
6. *E. repens*
7. *A. theophrasti*
8. *S. angulatus*
9. *C. arvensis*
10. *C. album*

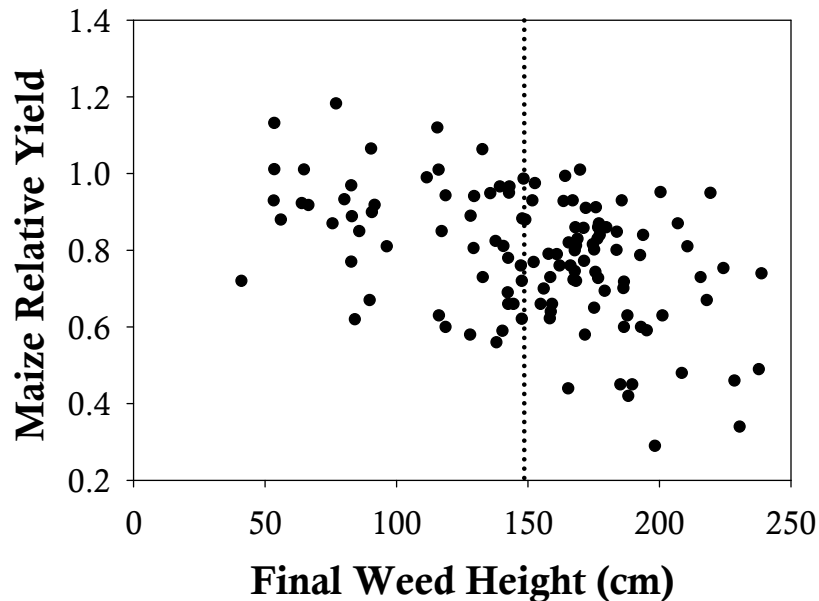
Retained: 4 / 7

### KENTUCKY

1. *S. halepense*
2. *S. vulgare*
3. *A. trifida*
4. *C. laeve*
5. *P. dichotomiflorum*
6. *S. angulatus*
7. *C. radicans*
8. *C. arvensis*
9. *I. hederacea*
10. *X. strumarium*

Retained: 0 / 7

# When do weeds become troublesome?



**Yield loss** in maize intensifies when weed canopy height exceeds 150 cm

**Fecundity** (ABUTH) increases rapidly when individual plants grow larger than 150 cm

