



Institute for Climate and Atmospheric Science

UNIVERSITY OF LEEDS

Andrew Challinor

A.J.Challinor@leeds.ac.uk

Developing adaptation options
using ensemble climate and crop
yield forecasting

Context

Dangerous rates of climate change:
those for which adaptation is difficult or impossible

Need to know:

1. The impact of climate change
2. Whether or not adaptation is possible

1. The impact of climate change on yield

2 x CO ₂ N. America	Wheat	-100 to +234%	Reilly and Schimmelpfennig, 1999
2080s Africa	Cereals	-10 to +3%	Parry et al., 1999
+4°C local ΔT 'low latitude'	Wheat	-60 to +30%	IPCC AR4, chap. 5 (Easterling et al., 2007)
+4°C local ΔT 'mid- to high- latitude'	Wheat	-30 to +40%	IPCC AR4, chap. 5 (Easterling et al., 2007)

See Challinor et al. (2007a)

Context

- Dangerous rates of climate change: those for which adaptation is difficult or impossible.
- Need to know:
 1. The impact of climate change
 2. Whether or not adaptation is possible

At both of these stages

Aim to make probabilistic statements, rather than provide subjective ranges

i.e. objective quantification of uncertainty

Otherwise conclusions regarding adaptation may be incorrect

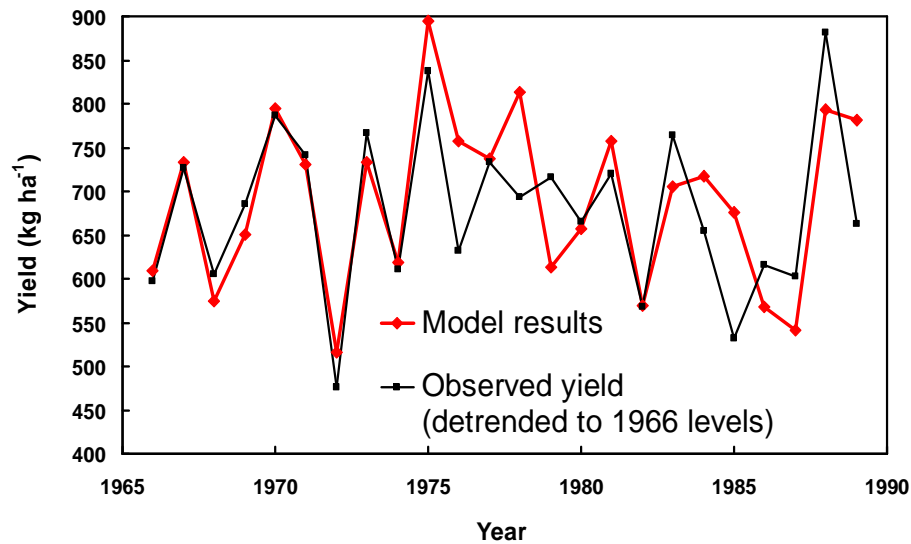


Ensemble climate and crop yield forecasting

- Vary climate and crop model parameters**
- Use observations to constrain ensemble output**

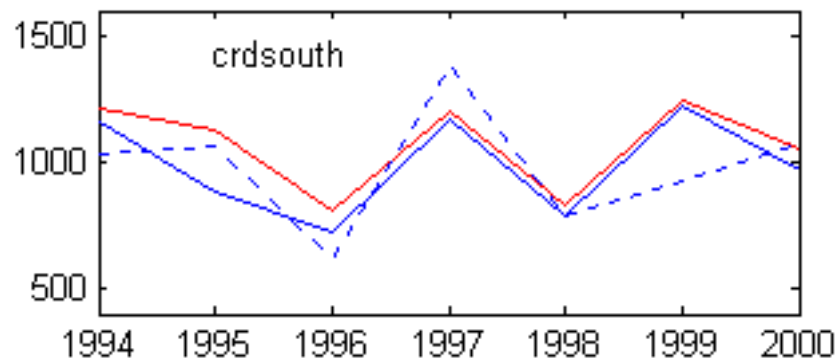
General Large Area Model for annual crops

Combines the benefits of empirical and process-based approaches

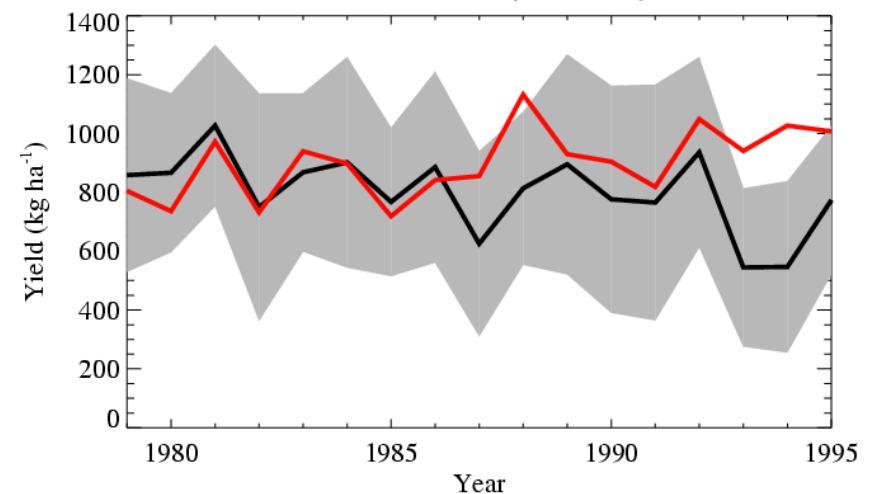


Challinor et al. (2004)

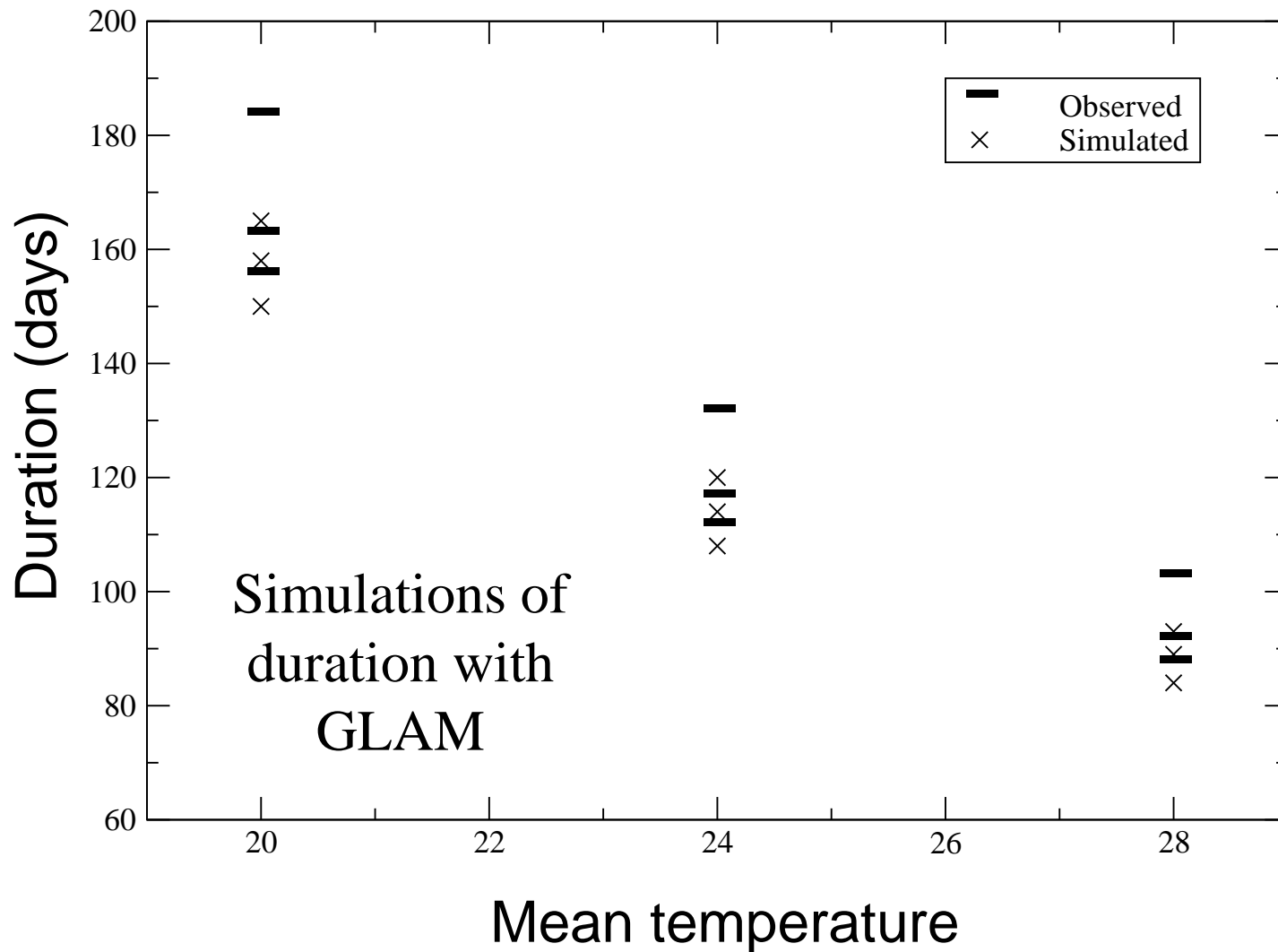
Chee-Kiat (2006)



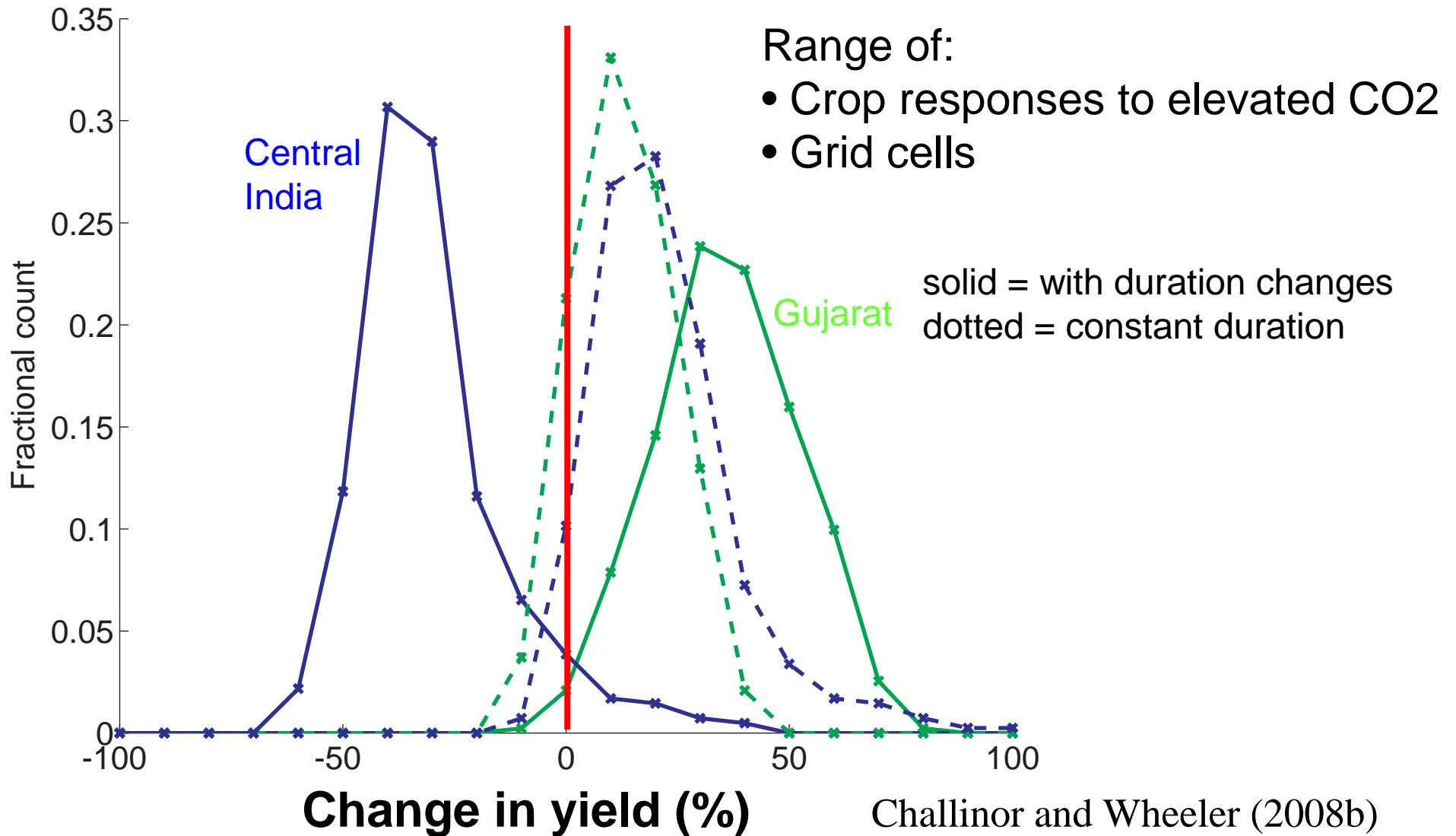
Osborne (2004)



The impact of mean temperature on crop development rate



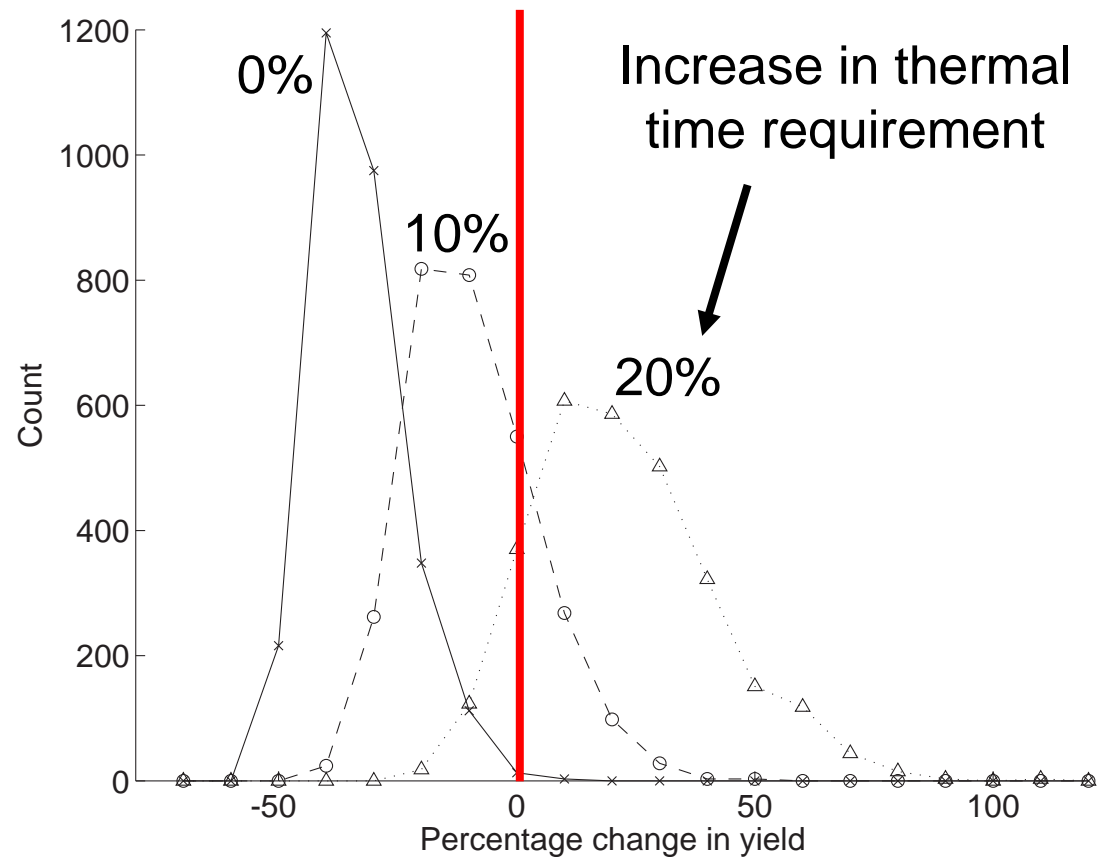
Impact of mean temperature increases on yield



2. Assessing adaptive capacity

180,000+ crop simulations, varying both climate (QUMP) and crop response to doubled CO₂

- Further simulations and analysis of crop cardinal temperatures suggest a **30% increase may be needed**
- Field experiments suggest the potential for a **14 to 40% increase within current germplasm**
- Suggests some capacity for adaptation

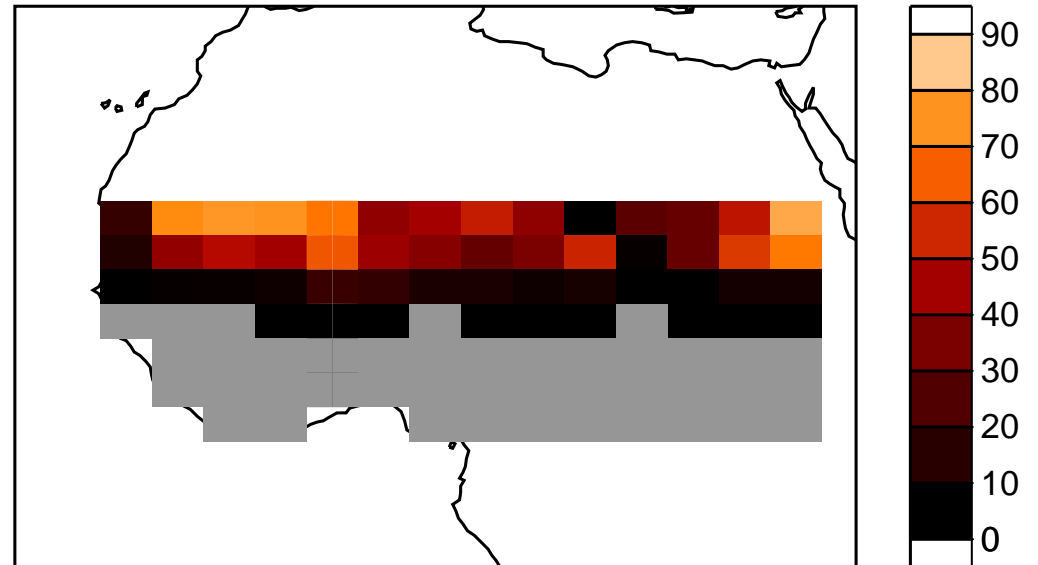


Challinor et al. (2008b)

The impact of temperature extremes



(a) Number of days warmer than 33°C, 1971-89



(b) Differences between 2081-99 and 1971-89

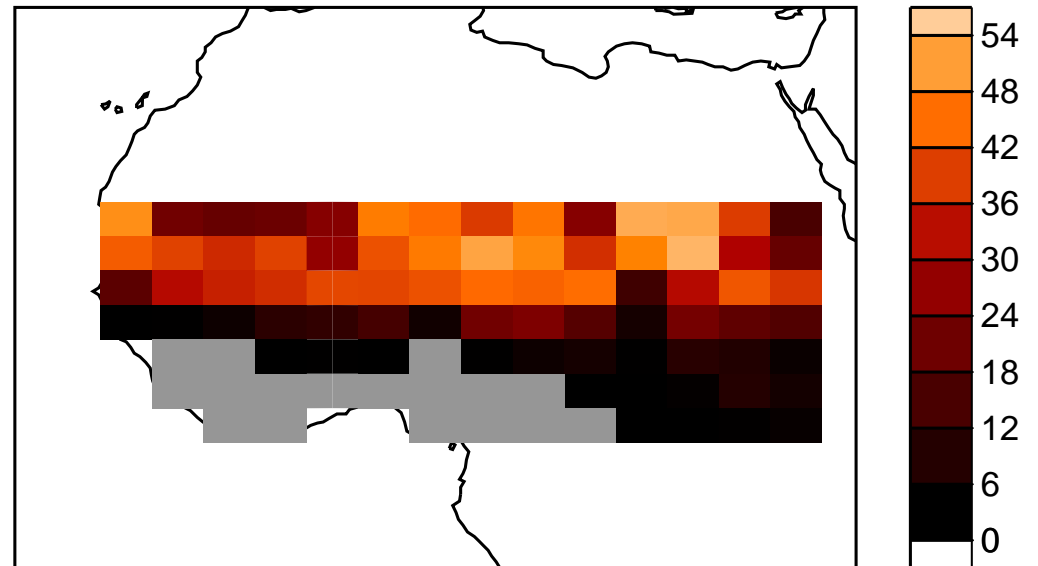
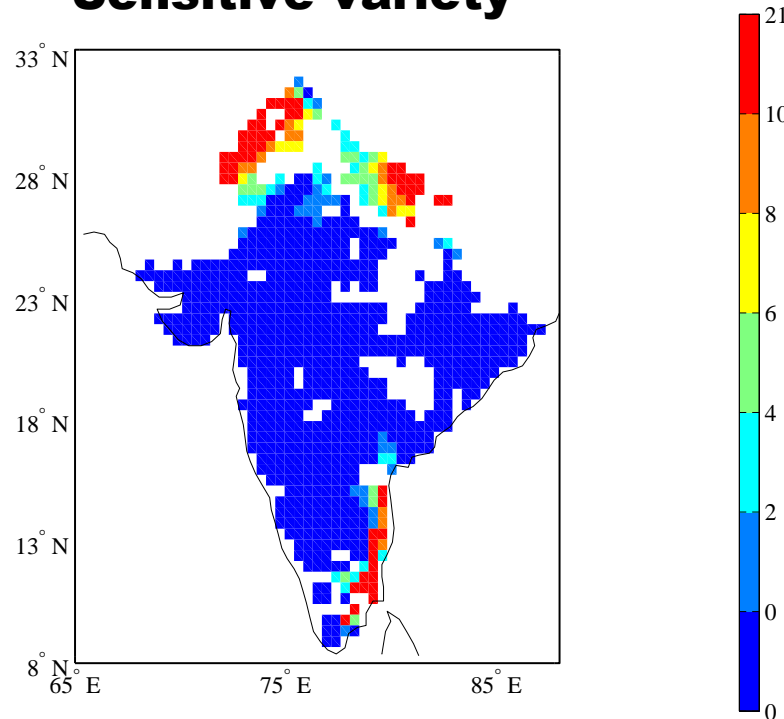


Photo: Tim Wheeler Plot: Huntingford et al (2005)

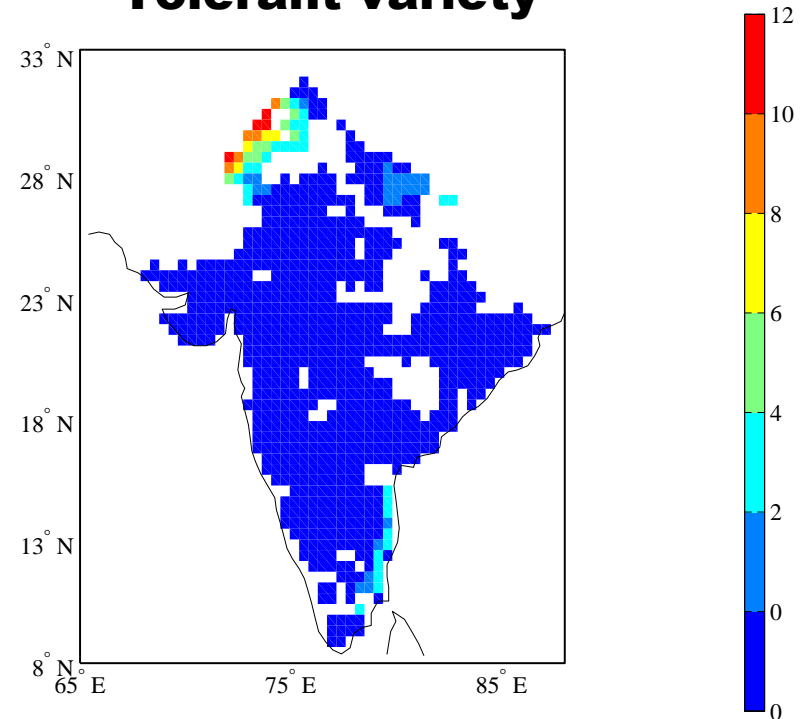
Adaptation to temperature extremes across India

Hadley Centre PRECIS model, A2 (high emission) scenario 2071-2100
Number of years when the total number of pods setting is below 50%.

Sensitive variety

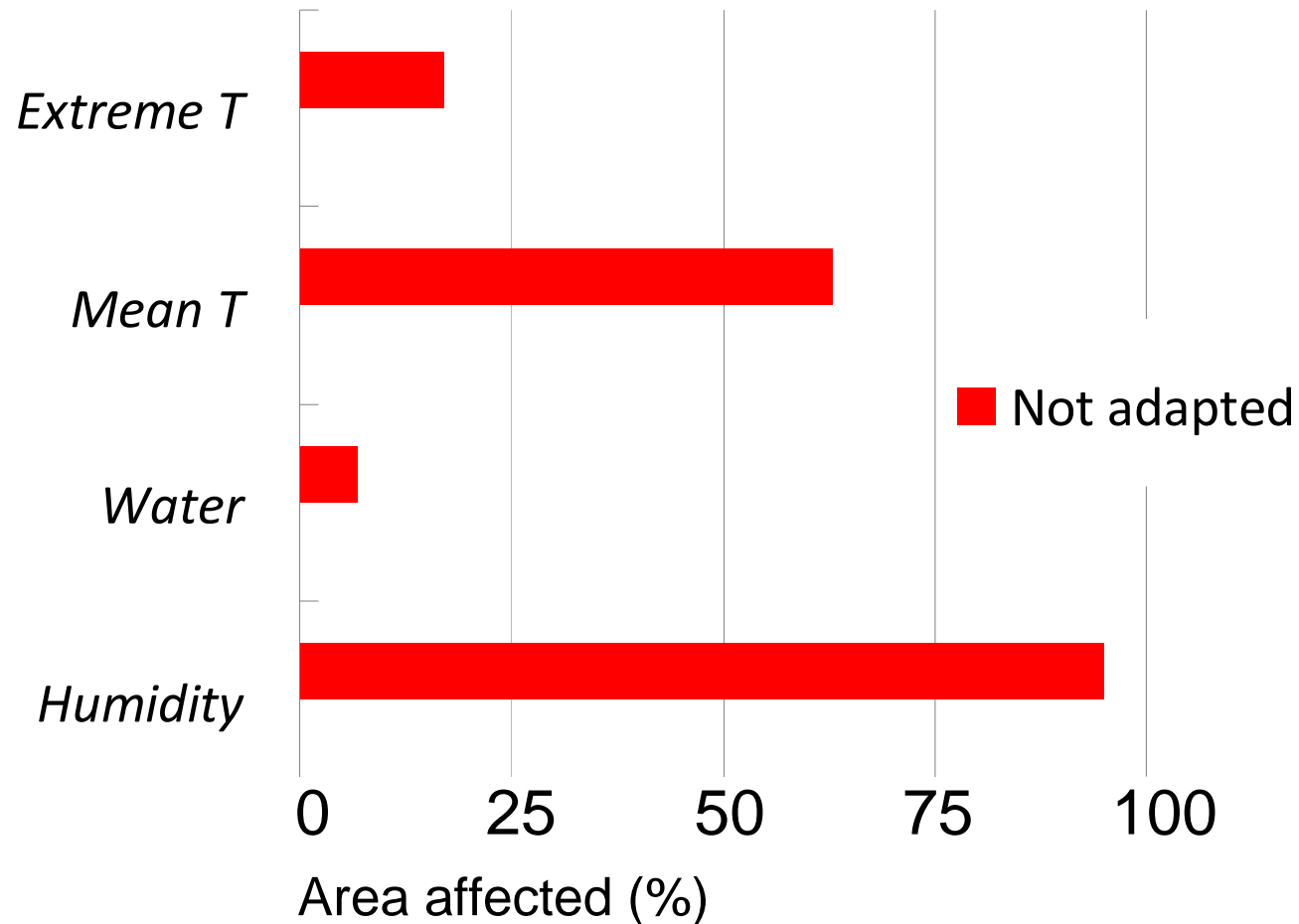


Tolerant variety

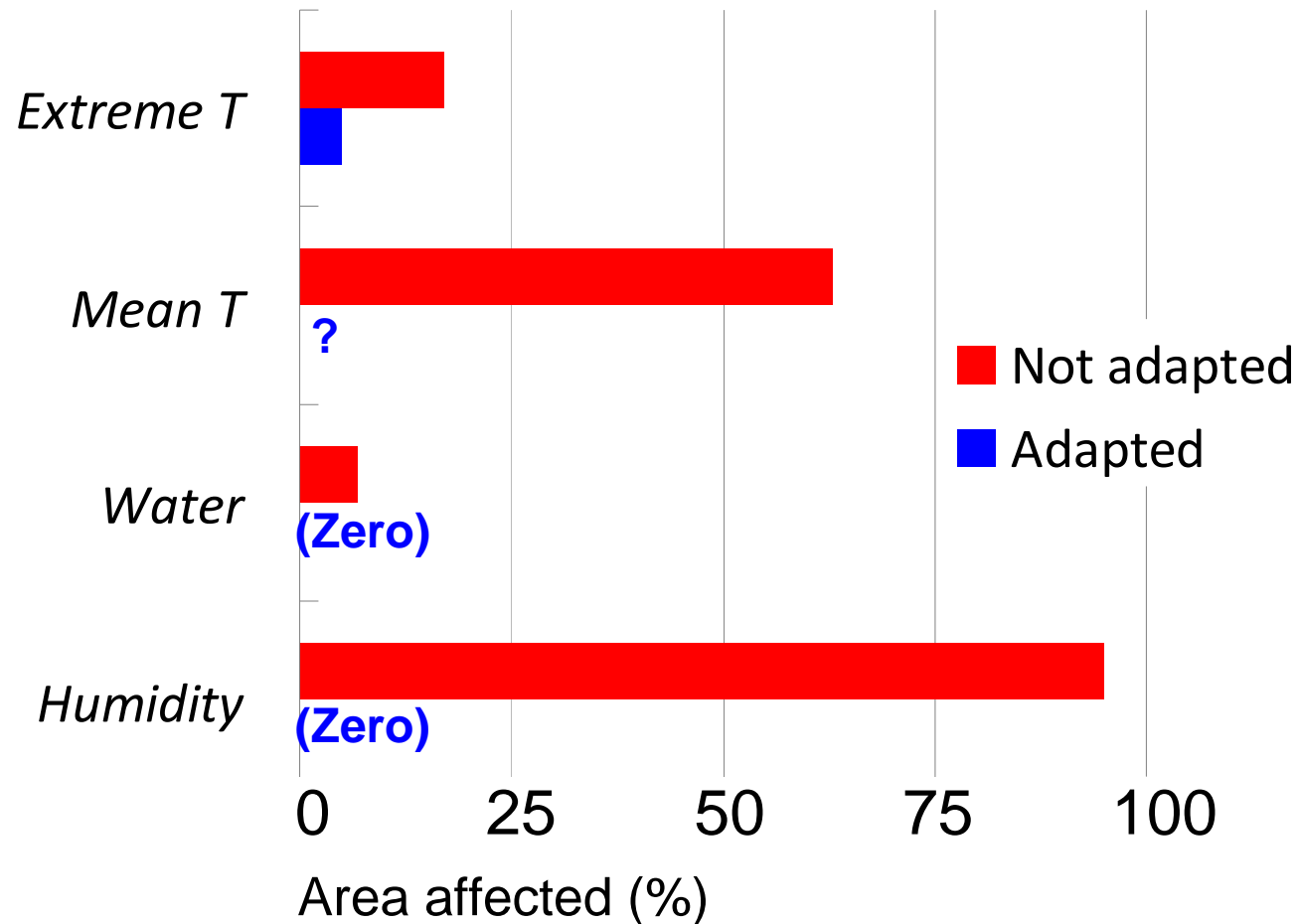


Challinor et al. (2007b)

Assessing adaptive capacity to a range of processes



Assessing adaptive capacity to a range of processes



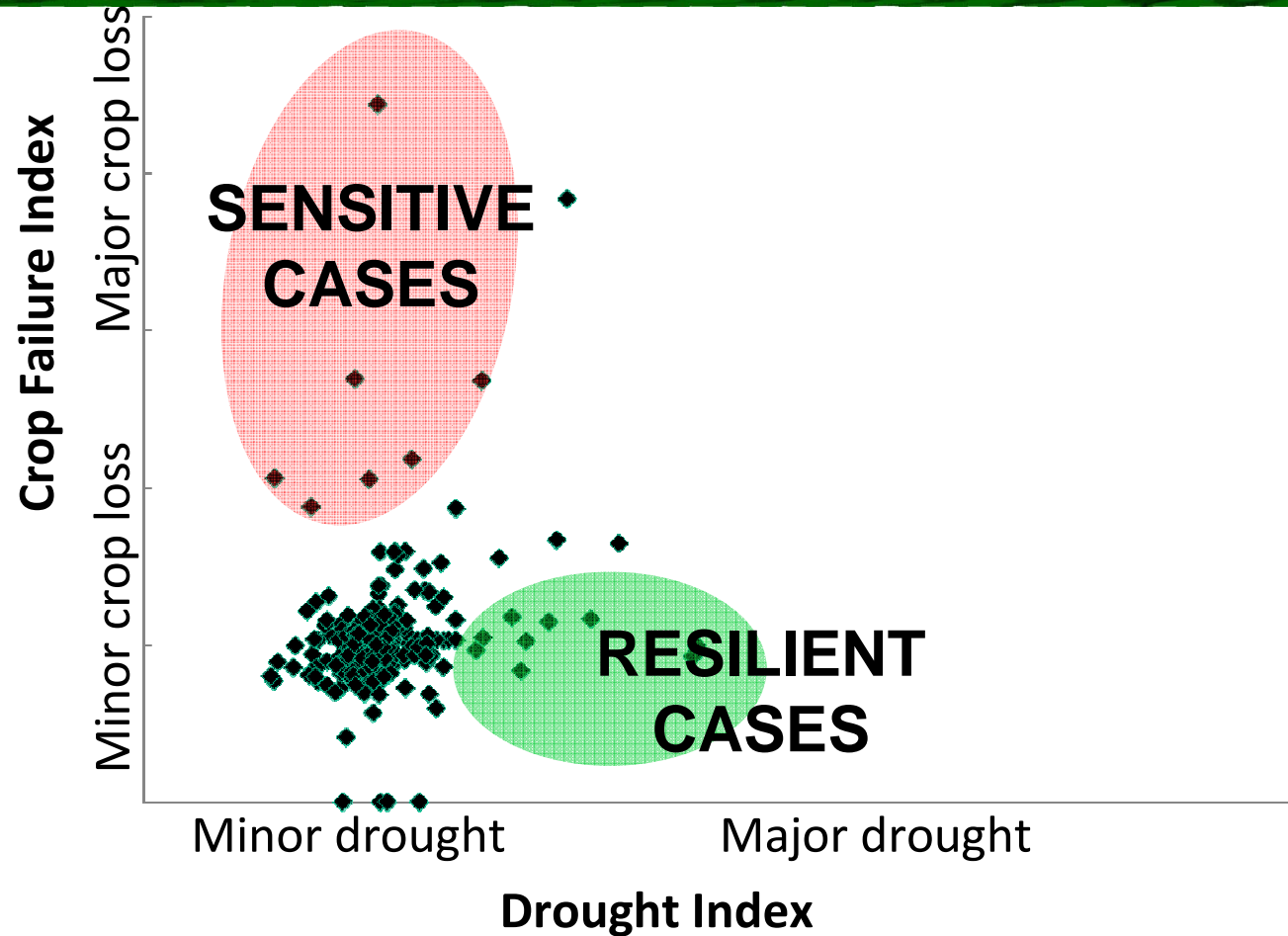
Adaptation at shorter timescales

- Dangerous rates of climate change: those for which adaptation is difficult or impossible.
- Need to know:
 1. The impact of climate change
 2. Whether or not adaptation is possible

Also need to account for autonomous adaptation

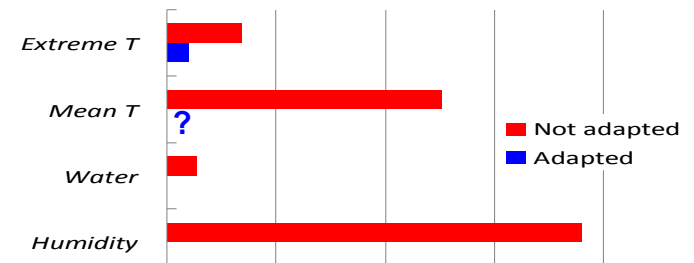
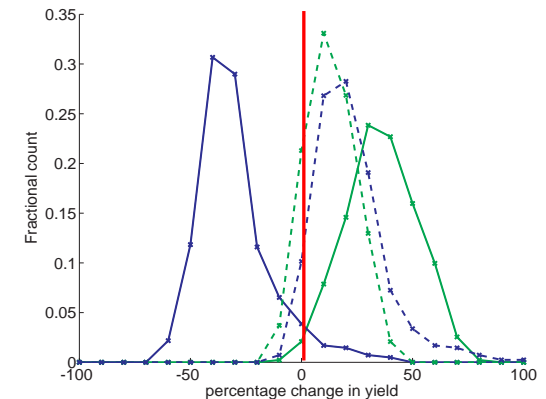
- Implies focus on farmer action at shorter timescales
- Ensemble seasonal prediction can support adaptation
 - Prediction of crop failure (Challinor et al., 2005a)

Focussing on the farmer: identifying sensitivity to drought



Conclusions

- Quantifying uncertainty does not preclude high confidence in some statements
- Confidence increases when spatial domain is restricted (up to a point)
- We can link climate prediction to adaptive capacity (i.e. existing germplasm)



Acknowledgements

Elisabeth Simelton

Evan Fraser

Tim Wheeler

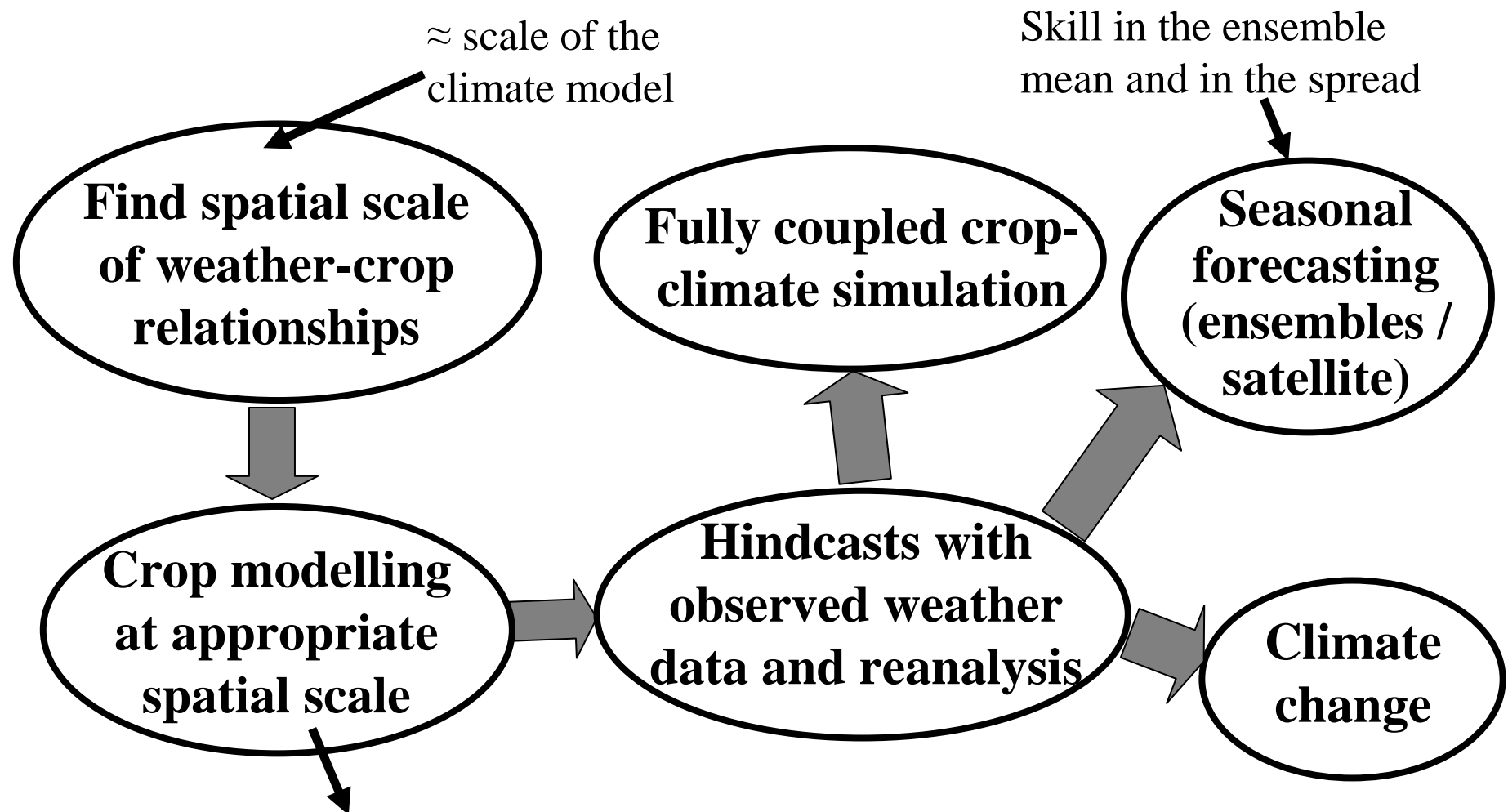
Tom Osborne

Francisco Doblás-Reyes





Combining crop and climate models



General Large Area Model for Annual Crops

Combines the benefits of empirical and process-based approaches

Method: QUMP simulations

- Climate model parameters varied one at a time using expert opinion to determine the values
- 53 Present-day and 53 doubled-CO₂ runs carried out
- 20-year time series
- 12 (current climate) or 54 (doubled-CO₂) GLAM parameter perturbations
- 1 grid cell used

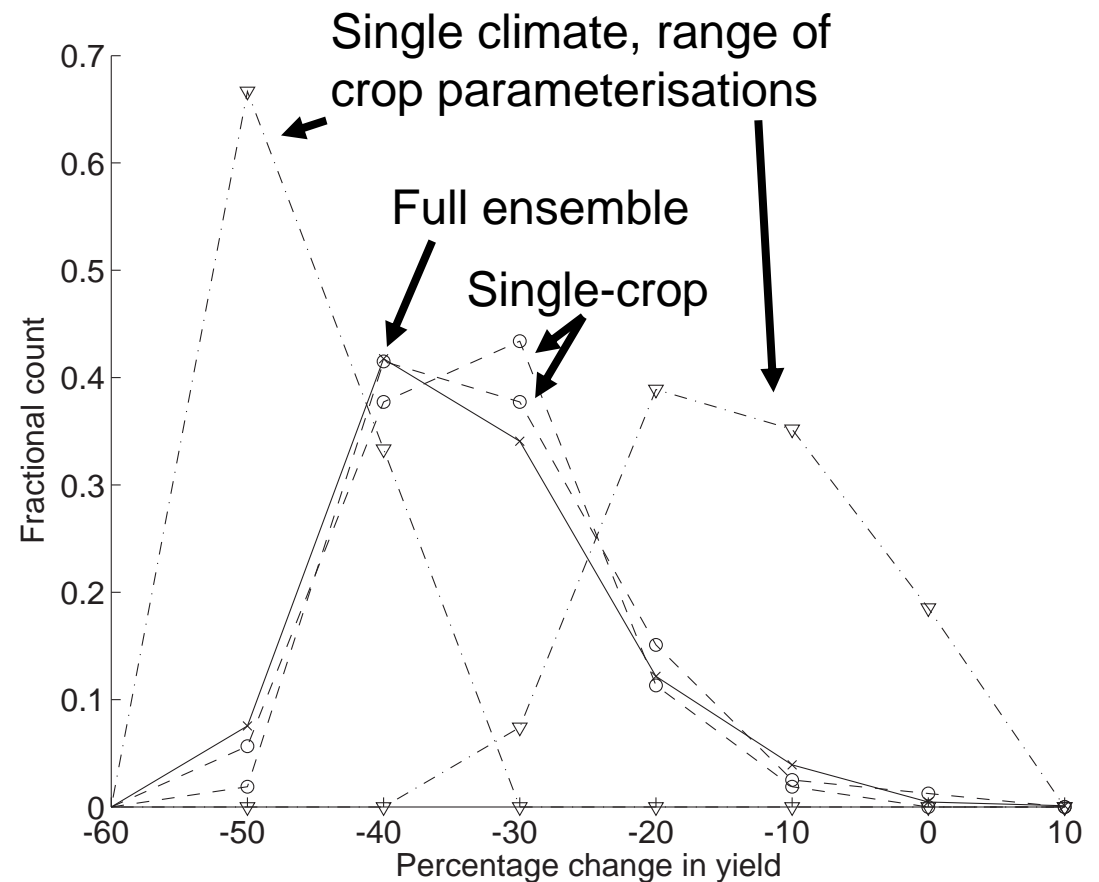
Resulting in

12,720 baseline GLAM simulations

57,240 doubled CO₂ GLAM simulations

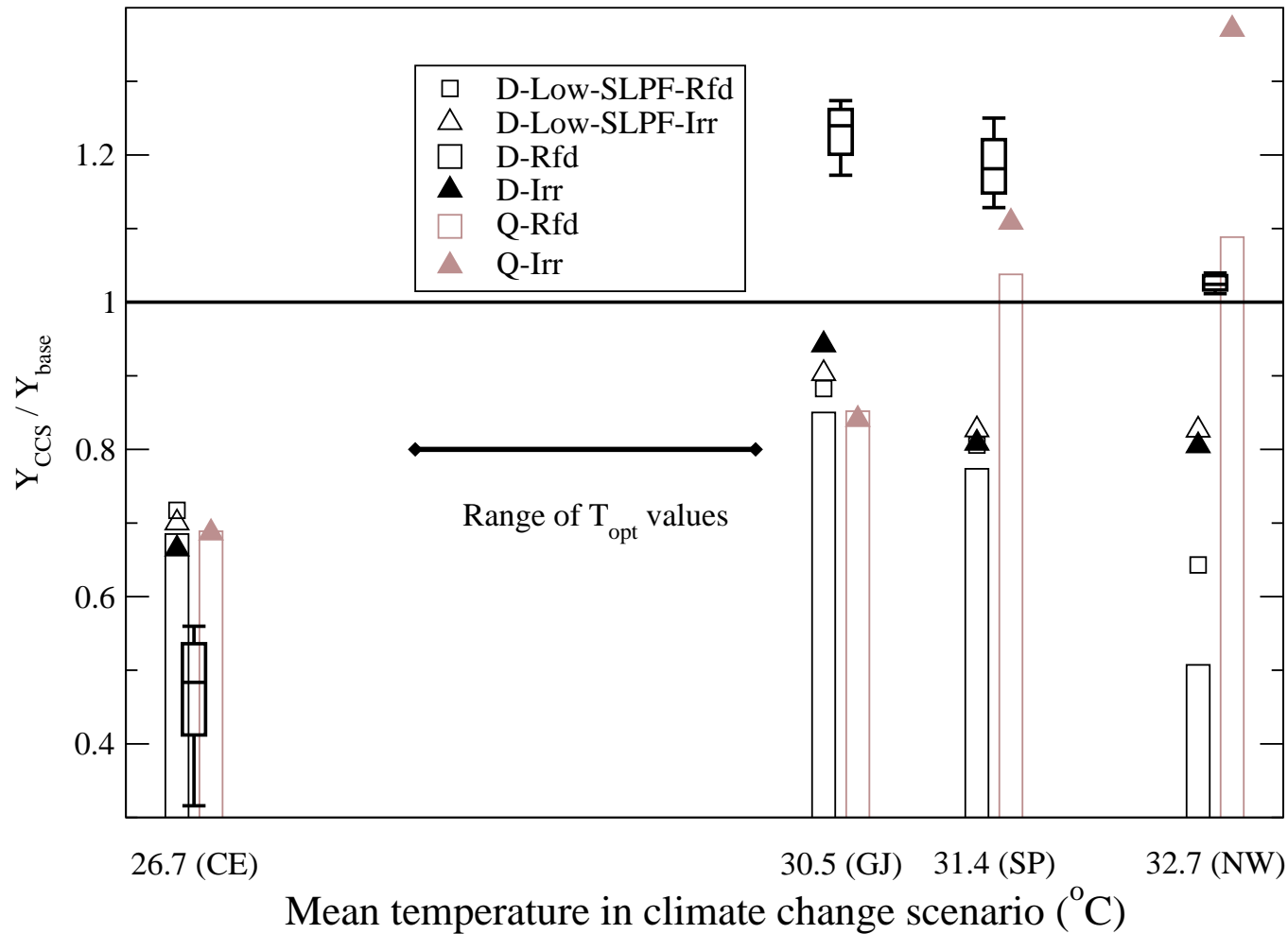
Results

- Mean yield loss of 30-40%
- Large number of simulations enables crop and climate to be held constant in turn
 - Plot the two single-ensembles that show the largest and the smallest mean change in yield
 - Can capture most of the range of uncertainty using climate perturbations alone
 - This result contrasts with previous study



Does not capture constraint of

Impact of large mean temperature increases · DSSAT Output and GIAM



On longer timescales: will farmers have access to the genetic resources for adaptation?

‘Genetic erosion’

- Tendency towards fewer crop varieties
- Caused by (Gepts, 2006):
 - the need for increased production => focus on high-yielding varieties
 - The globalisation of trade

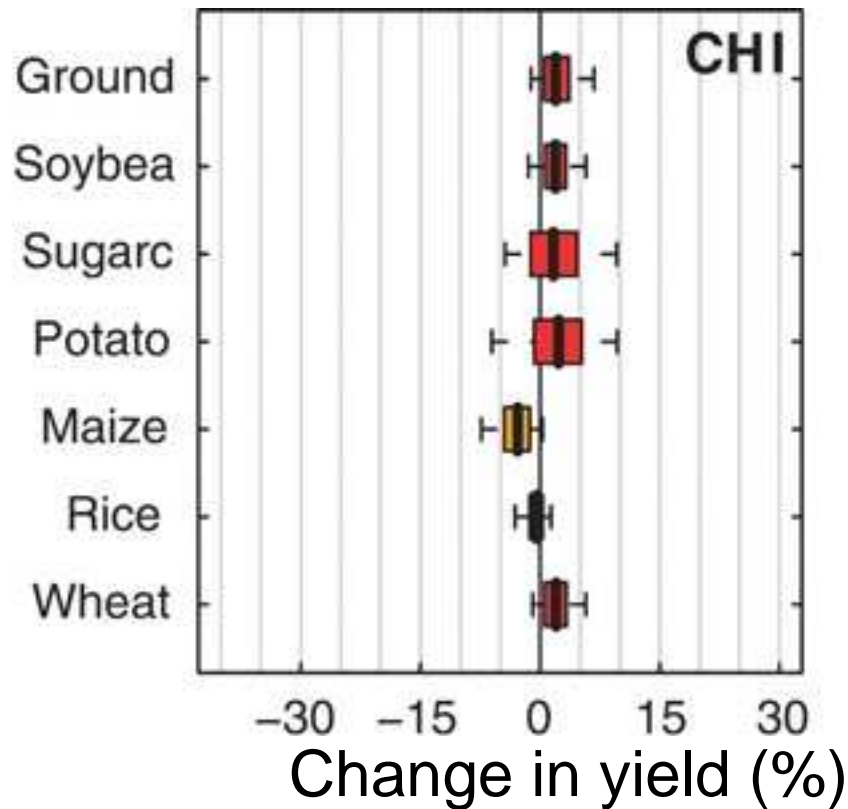


Why so much uncertainty?

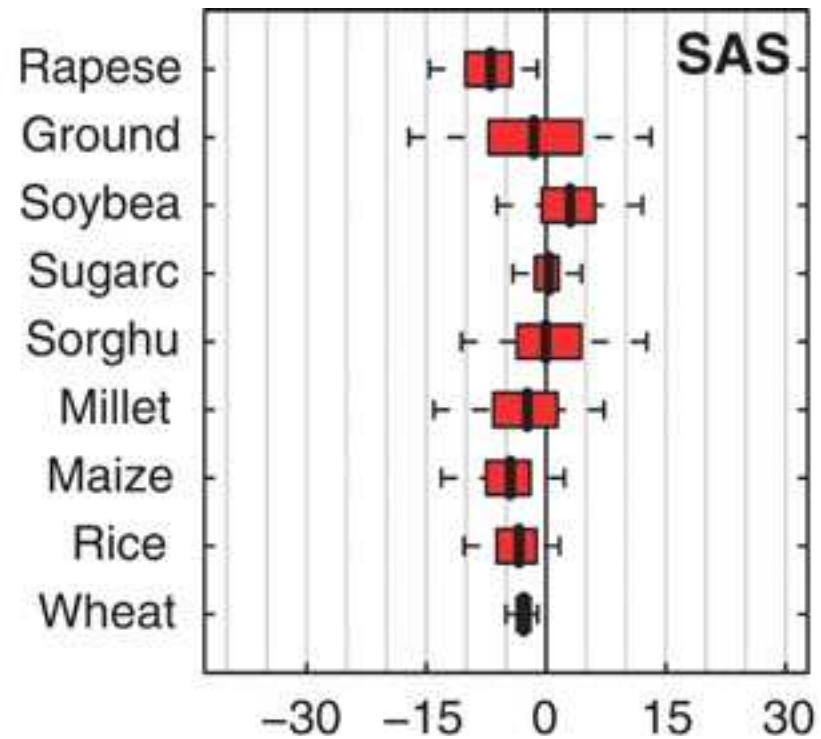


-
- Multiple nonlinear processes acting on crop yield.
 - Both positive and negative effects.
 - These can interact.
 - Not only biophysical processes
 - Soil nutrient status
 - crop management: variety, irrigation, pest(icide)
 - Many of these processes happen at the farm level
 - => High spatial heterogeneity
 - Climate and crop model uncertainty
 - Including disparity in spatial scale

China



South Asia

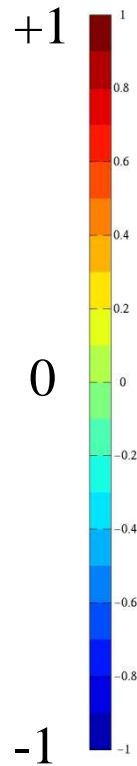
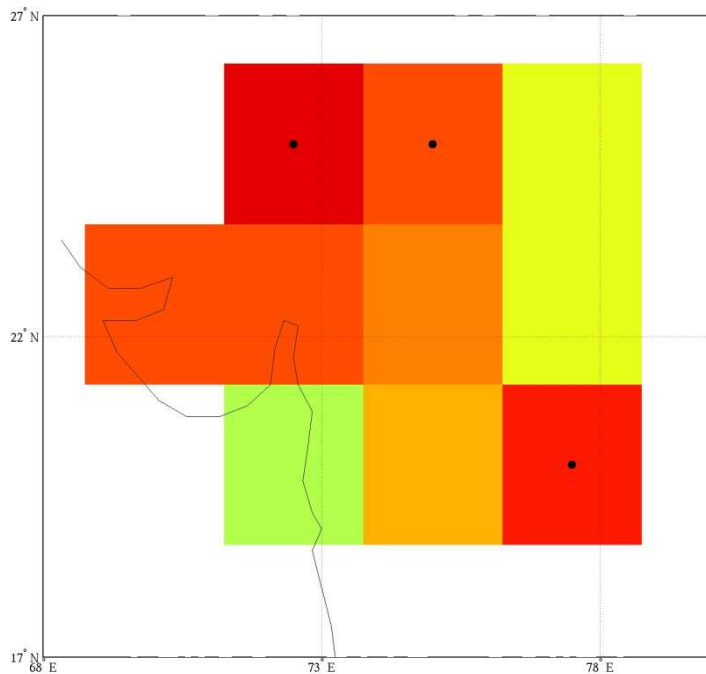


Lobell et al. (2008). Prioritizing Climate Change Adaptation Needs for Food Security in 2030. *Science* 319.

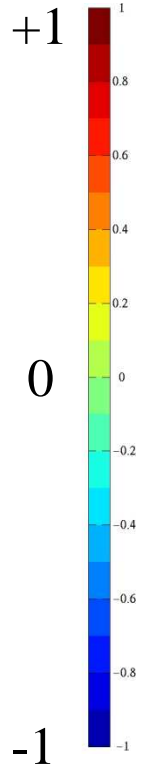
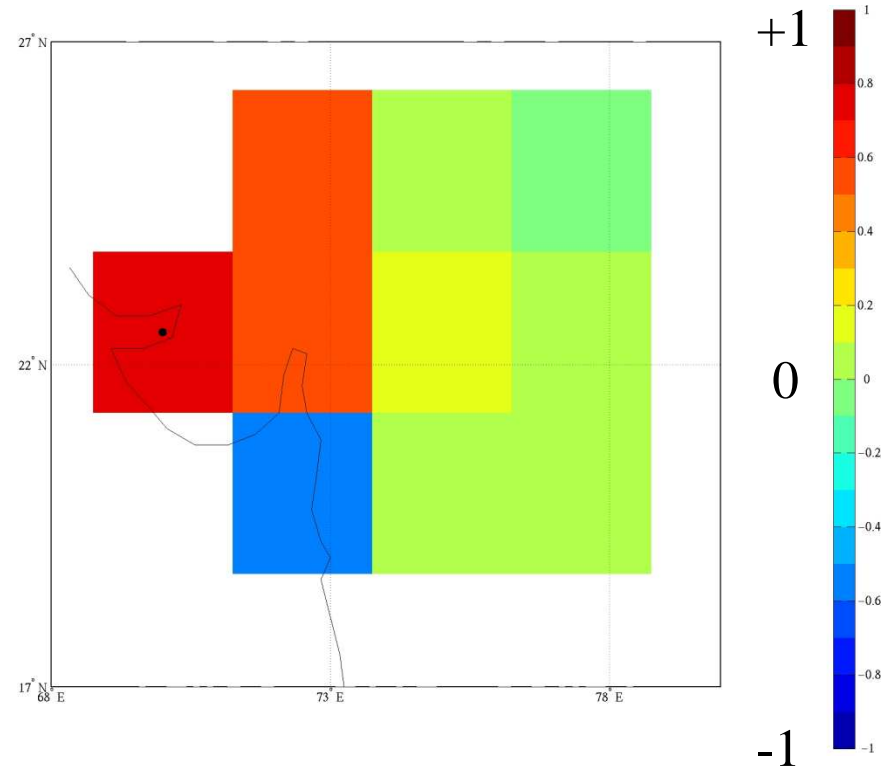
Ensemble prediction can support adaptation

Correlation coefficients between observed and simulated yield

Ensemble mean



ERA40



Challinor et al. (2005a)