

Global climate change impacts on cocoa



RESEARCH PROGRAM ON
Climate Change,
Agriculture and
Food Security



Cocoa climate zones in a changing climate

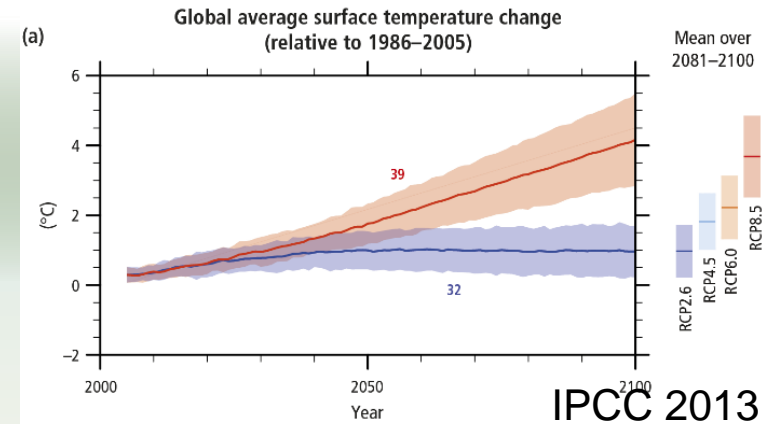


2017 International Symposium on Cocoa Research
(ISCR), Lima, Peru, 13-17 November 2017

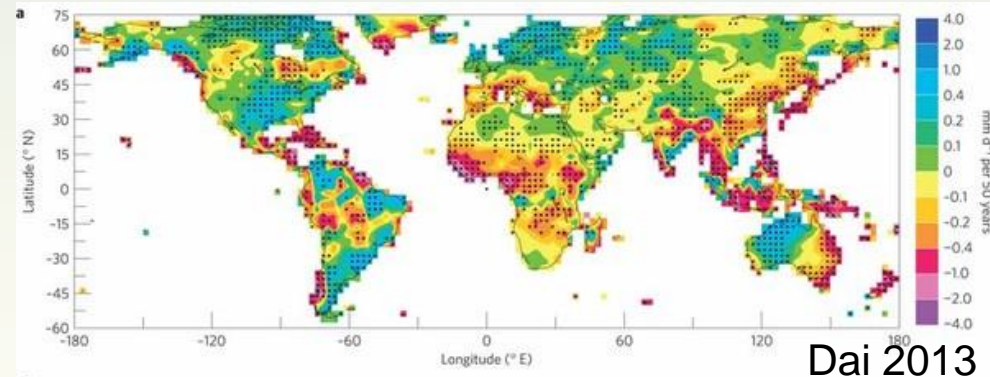


Climate change trends and projections

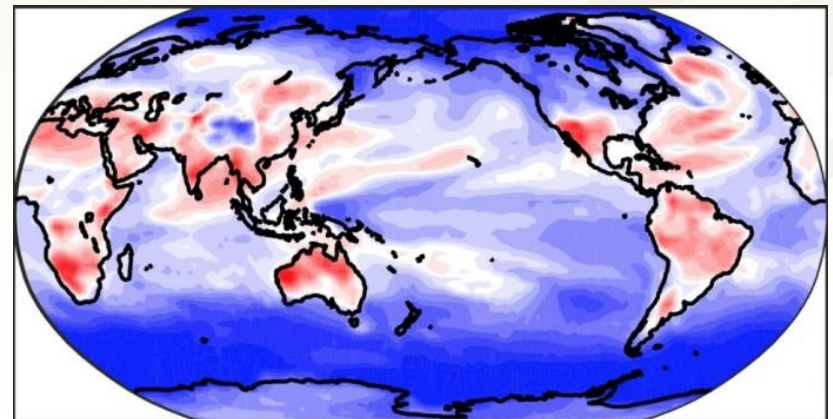
- Increasing temperatures



- Precipitation projections
 - Regionally differentiated
 - Highly uncertain



- Climate variability likely to increase in tropics, but magnitude uncertain



Input data



Occurrence locations

- Cocoa occurrence location



24 Bioclimatic variables from monthly data

20ArcMin resolution

Current climate data: WorldClim interpolated data

2050s climate data: 10 Global climate models RCP 6.0

Random Forests for classification

Random Forests are decision tree ensembles

1. Unsupervised learning to identify groups

- a) 250 forests
- b) 100 trees each
- c) 4 variables picked

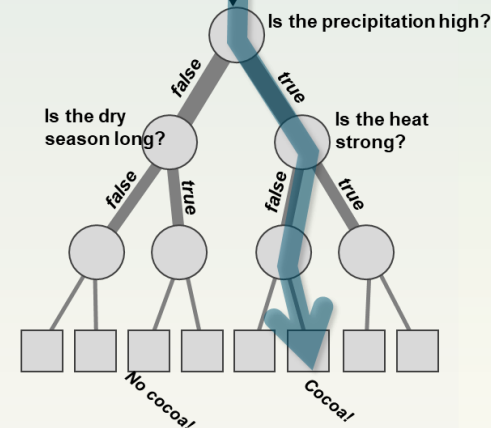
2. Supervised learning on specified groups

- a) Balanced training set
- b) 5 forests
- c) 200 trees
- d) 6 variables picked
- e) Node size 2

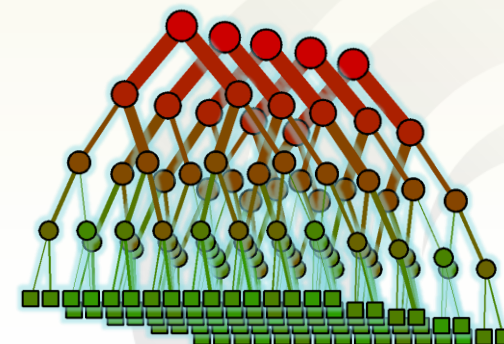
3. Evaluation of climate data

- a) Classification into groups
- b) Votes for occurrence groups ("Suitability")
- c) Novelty detection using proximity matrix on

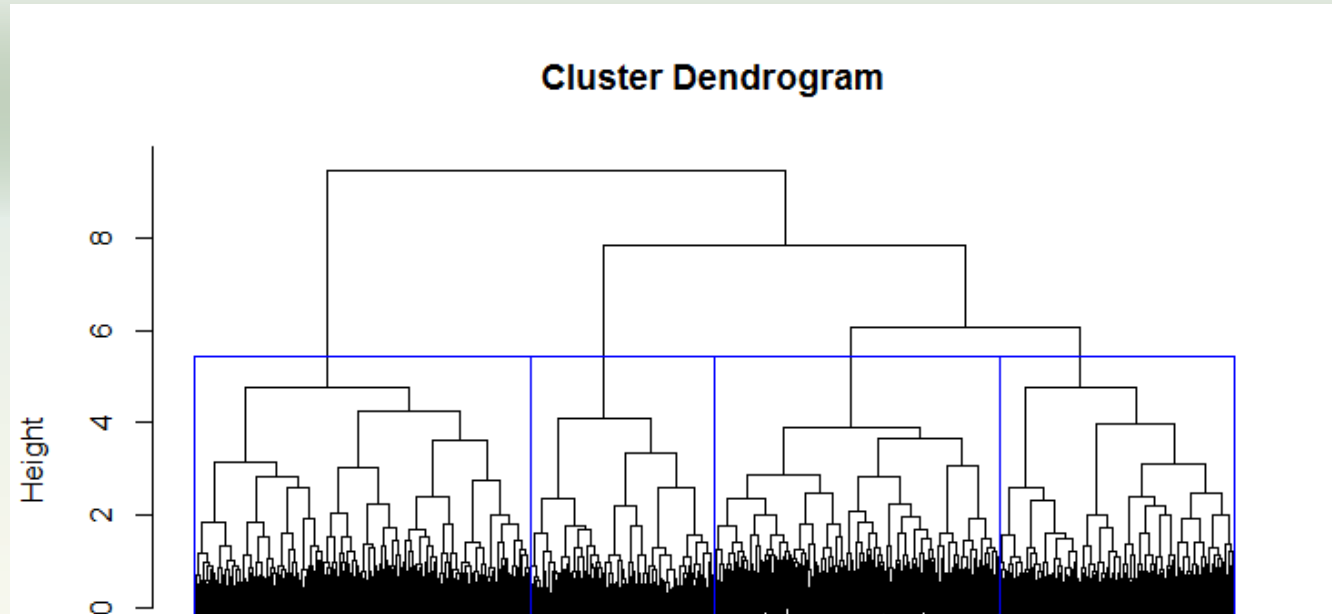
Decision
tree
approach



Source: Criminisi et al 2013

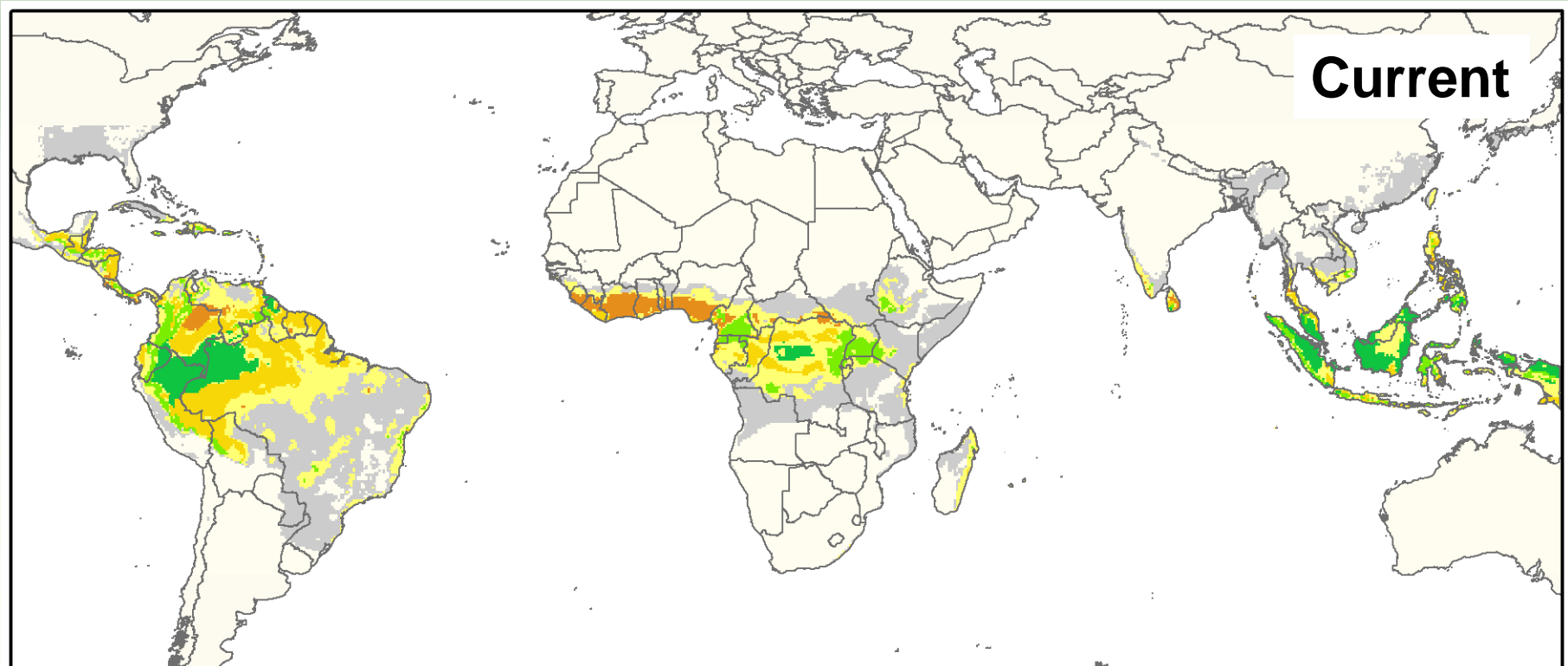


Climate zones for cocoa



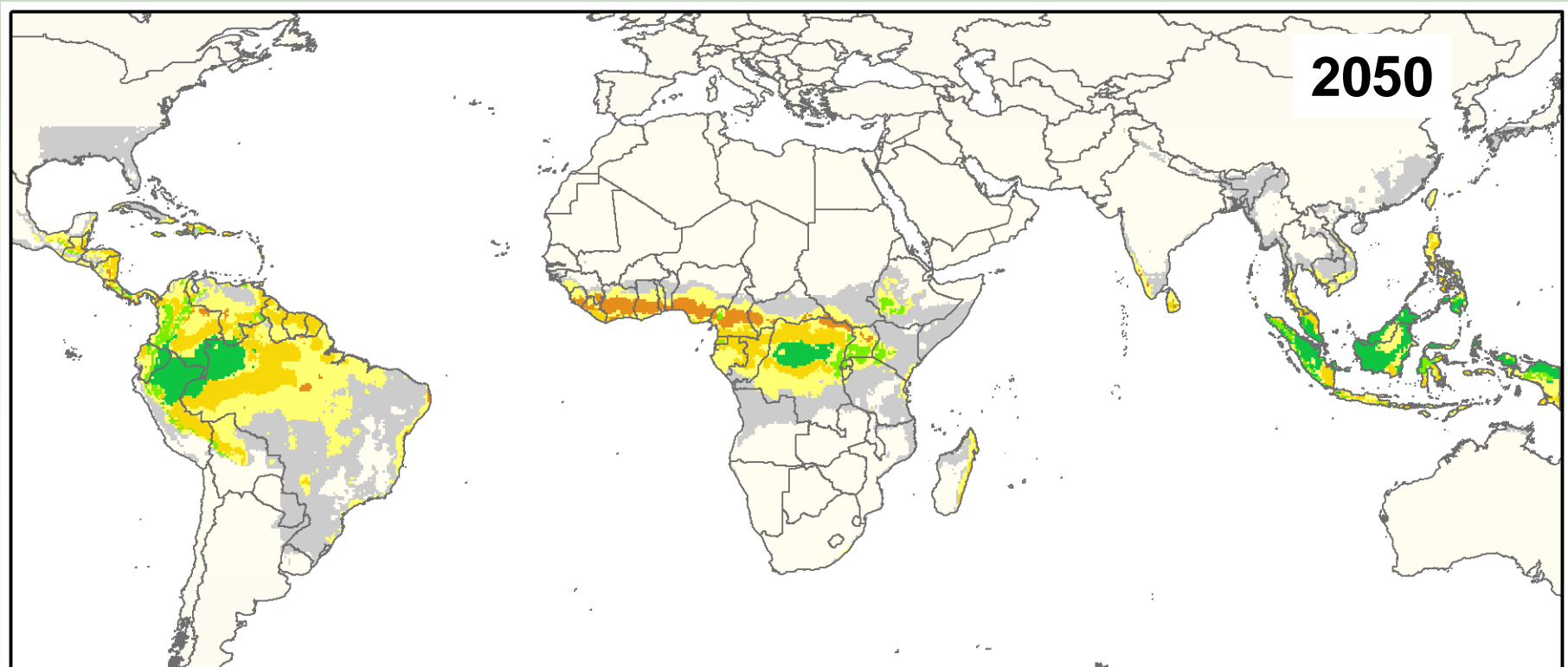
CLUSTER	SYMBOL	TYPICAL REGION	TEMPERATURE	PRECIPITATION
1	WA	West Africa	High	Low, seasonal
2	SLA	Seasonal Latin America	Average	High, seasonal
3	High	Highlands	Low	Low
4	Ama	Amazon	Even	High

Climate zones for cocoa



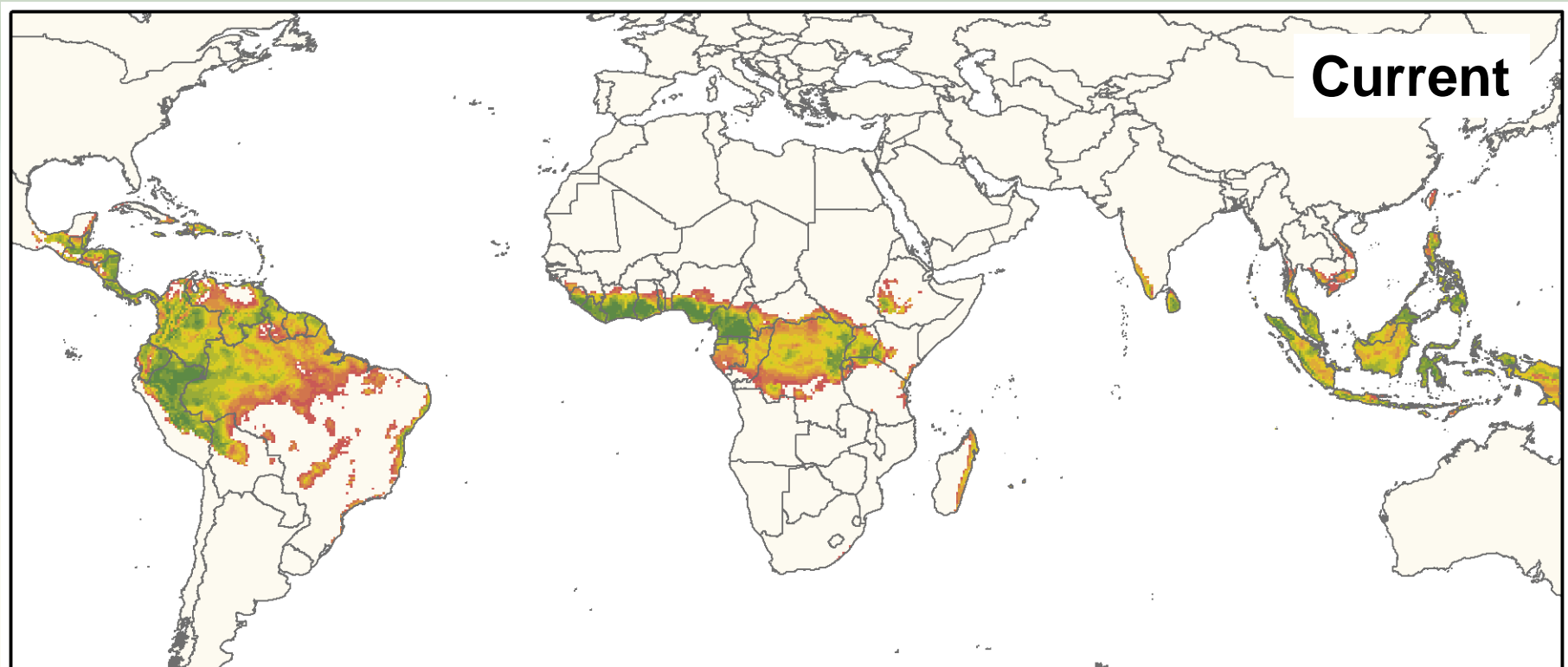
Cocoa climate types
Current

Climate zones for cocoa



**Cocoa climate types
2050**

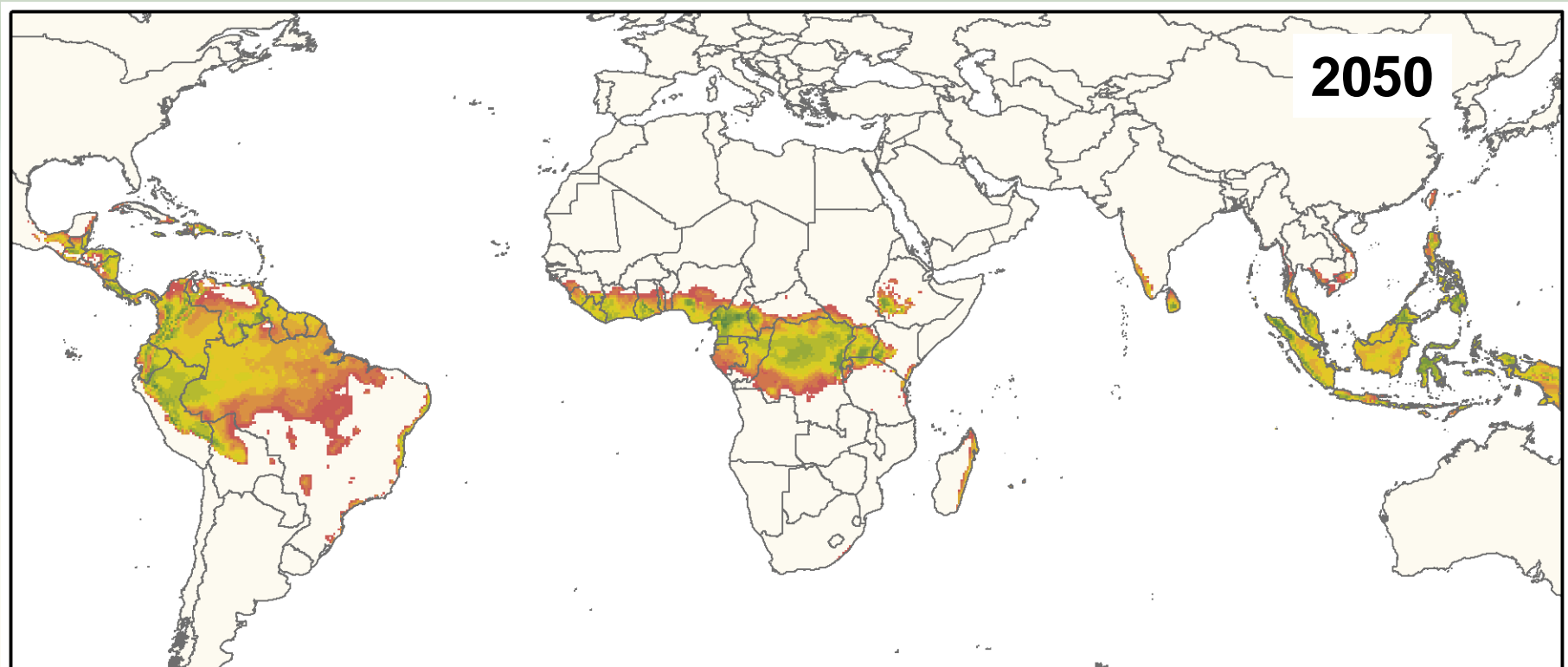
Climate suitability for cocoa



**Cocoa suitability score
Current**



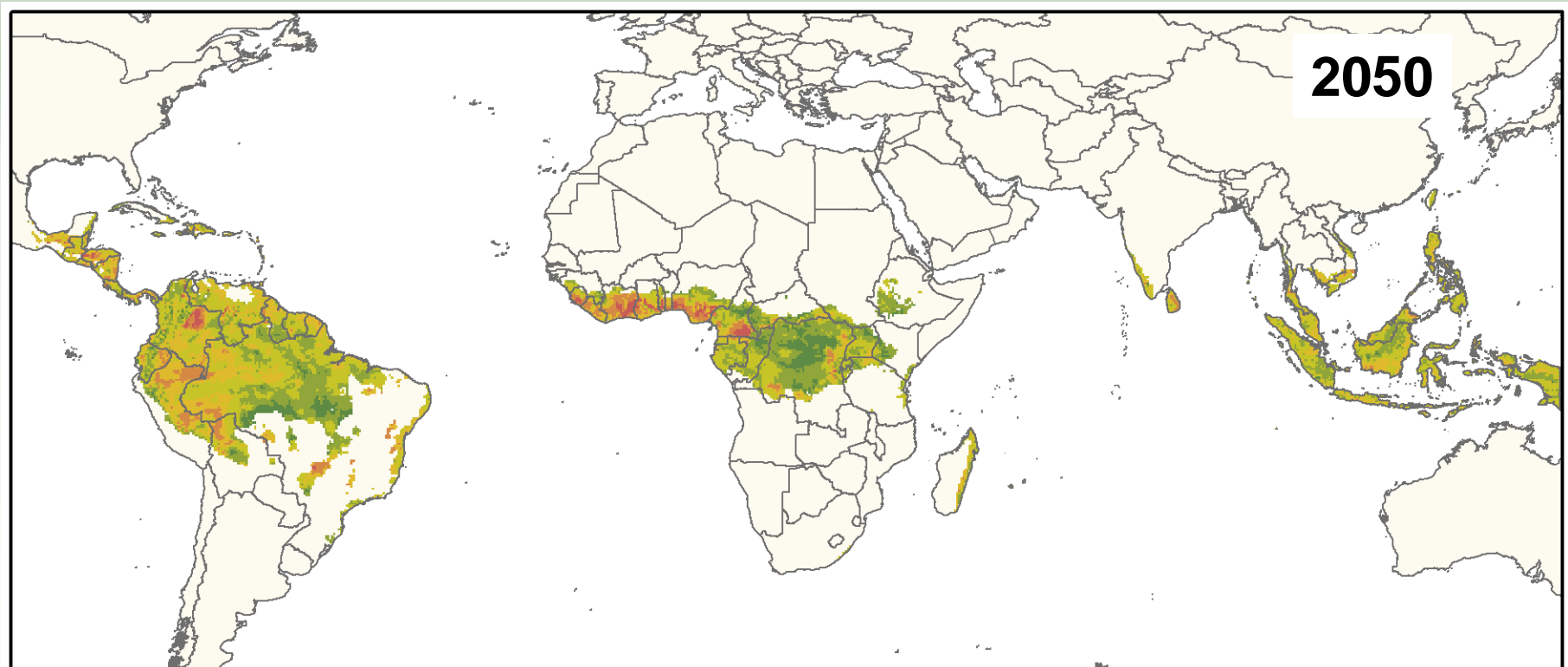
Climate suitability for cocoa



**Cocoa suitability score
2050**



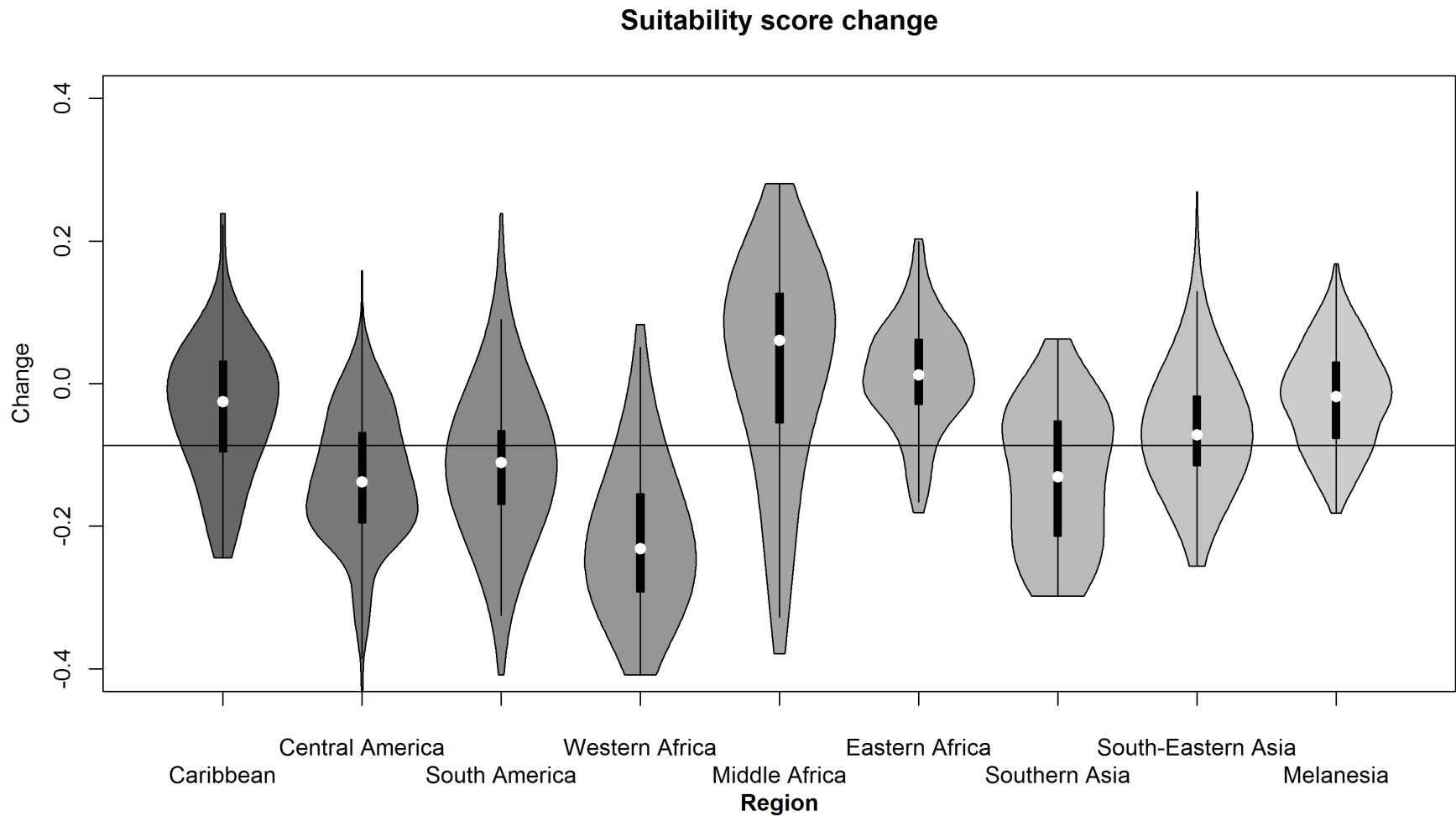
Climate suitability for cocoa - change



**Cocoa suitability score
Change - 2050**



Climate suitability for cocoa - change



Conclusions



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- Global climate models lack the skill for unambiguous projections
- West Africa and Highland climate most likely to face negative impacts
- Central Africa, SE Asia and Caribbean relatively less affected
- Risk of further deforestation driven by cocoa

Thank you!



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Christian Bunn, M Lundy, P Laederach, F Castro et al.
International Symposium on Cocoa Research, Lima, Peru, 13 Nov 2017

