



Utrecht University

Department of Physics



# Uncertainty quantification of climate sensitivity: State-dependence, extreme values and the probability of tipping

Anna von der Heydt<sup>1,2</sup>

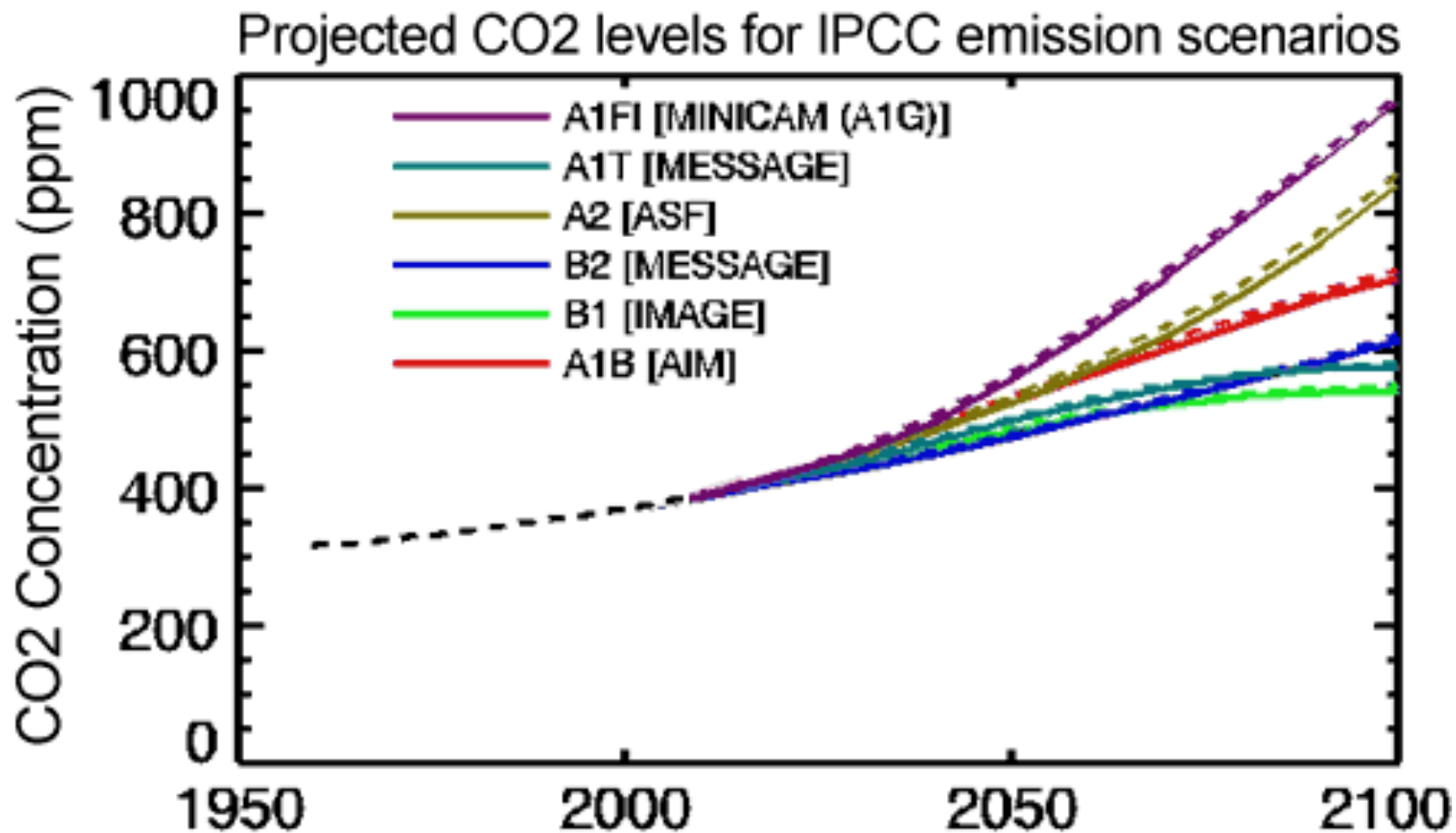
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2. Centre for Complex Systems Studies, Utrecht University, Utrecht, The Netherlands.



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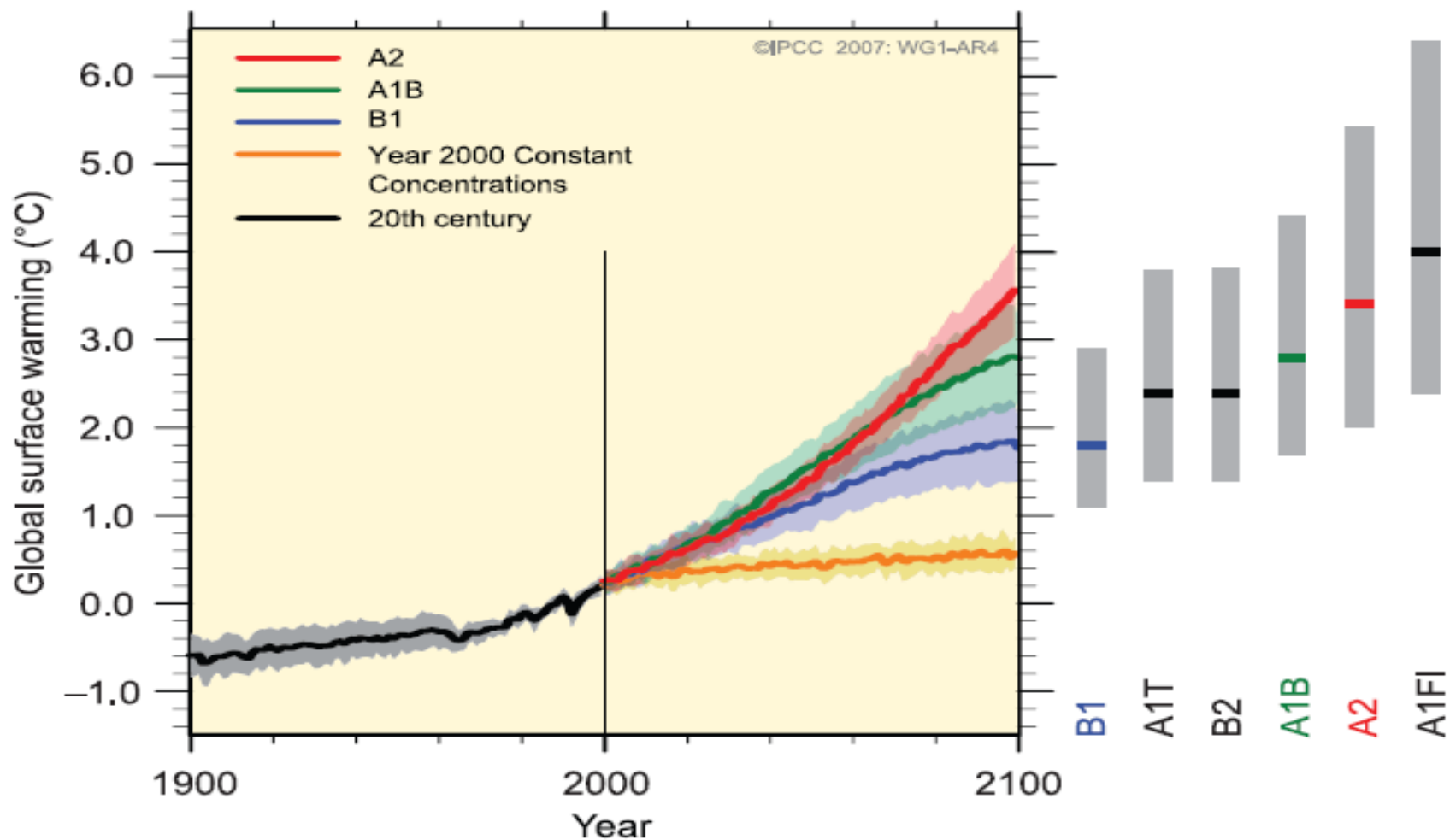


# Climate forcing...

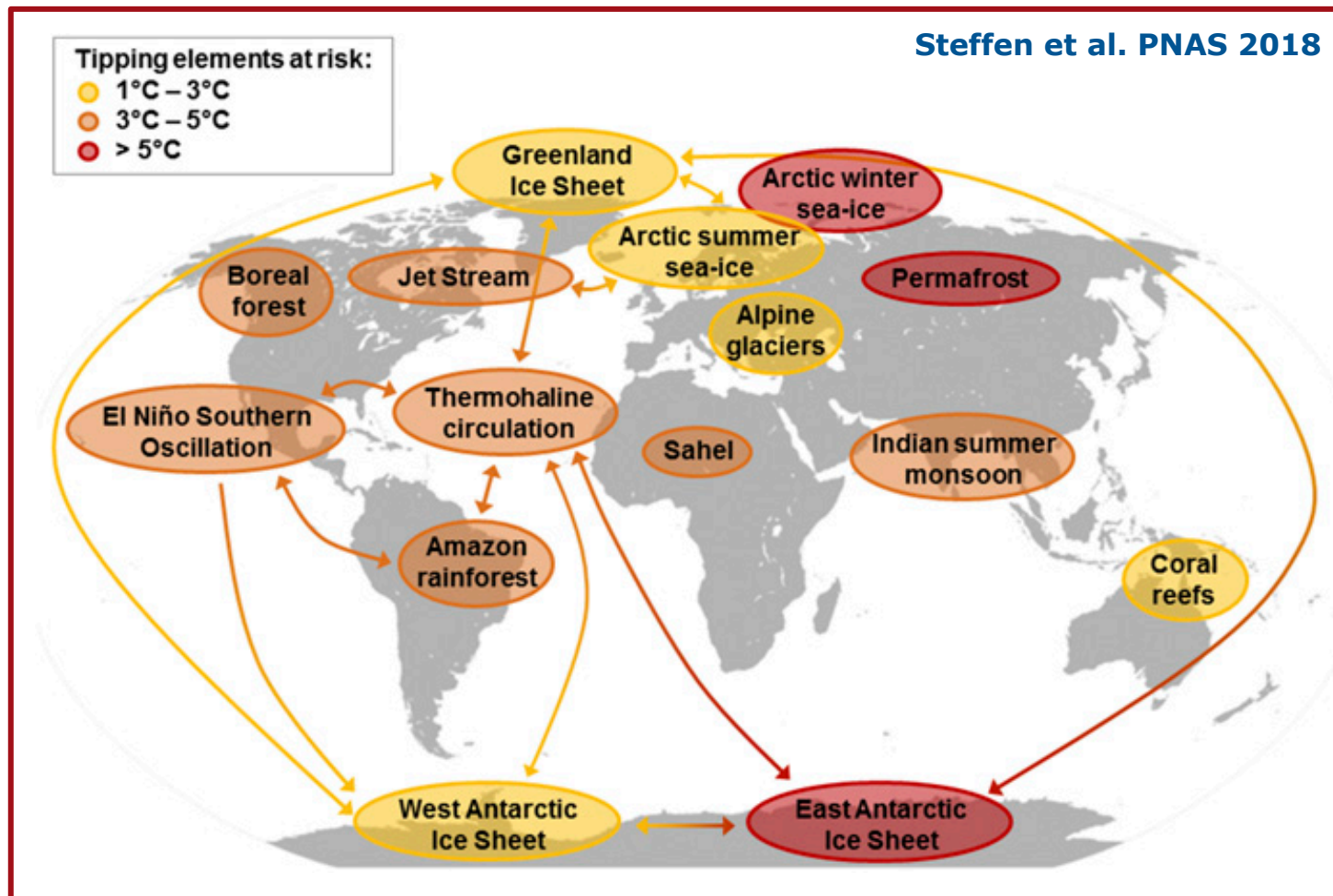


## ... Models' Response

Shaded area includes results of > 20 climate models (GCMs)



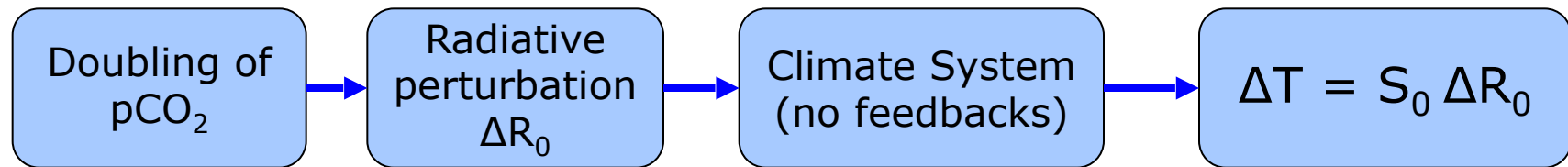
# Tipping elements in the climate system



**Need a comprehensive framework to quantify the Climate Response!**

# What is climate sensitivity?

- Equilibrium change in global mean surface temperature after a doubling of the atmospheric CO<sub>2</sub> concentration.

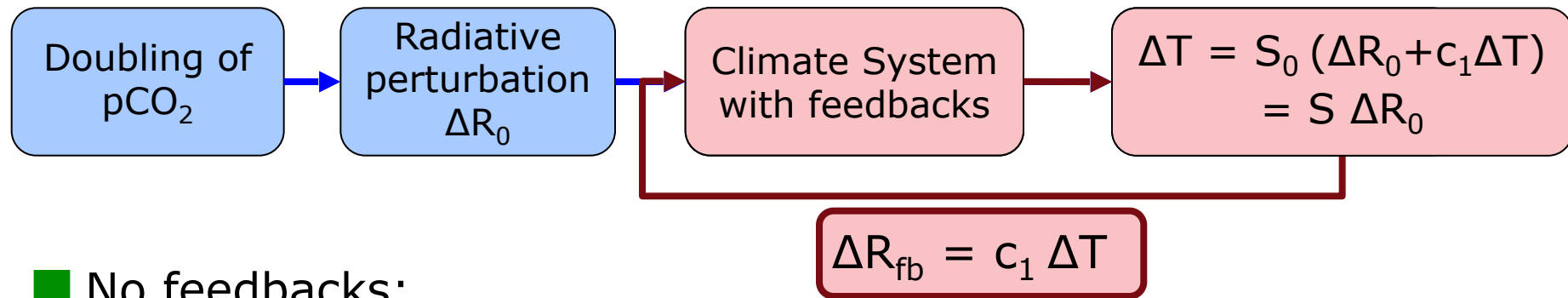


- No feedbacks:

Planck response  $S_0 = 0.3 \text{ K}/(\text{W}/\text{m}^2)$

# What is climate sensitivity?

- Equilibrium change in global mean surface temperature after a doubling of the atmospheric CO<sub>2</sub> concentration.



- No feedbacks:

Planck response  $S_0 = 0.3 \text{ K}/(\text{W}/\text{m}^2)$

- With feedbacks:

$$S = \Delta T / \Delta R_0$$

# Quantifying climate sensitivity: problems

## ■ Timescales and equilibrium

- ★ Slow and fast feedback processes.
- ★ Timescale separation.

## ■ Dependence on the background climate

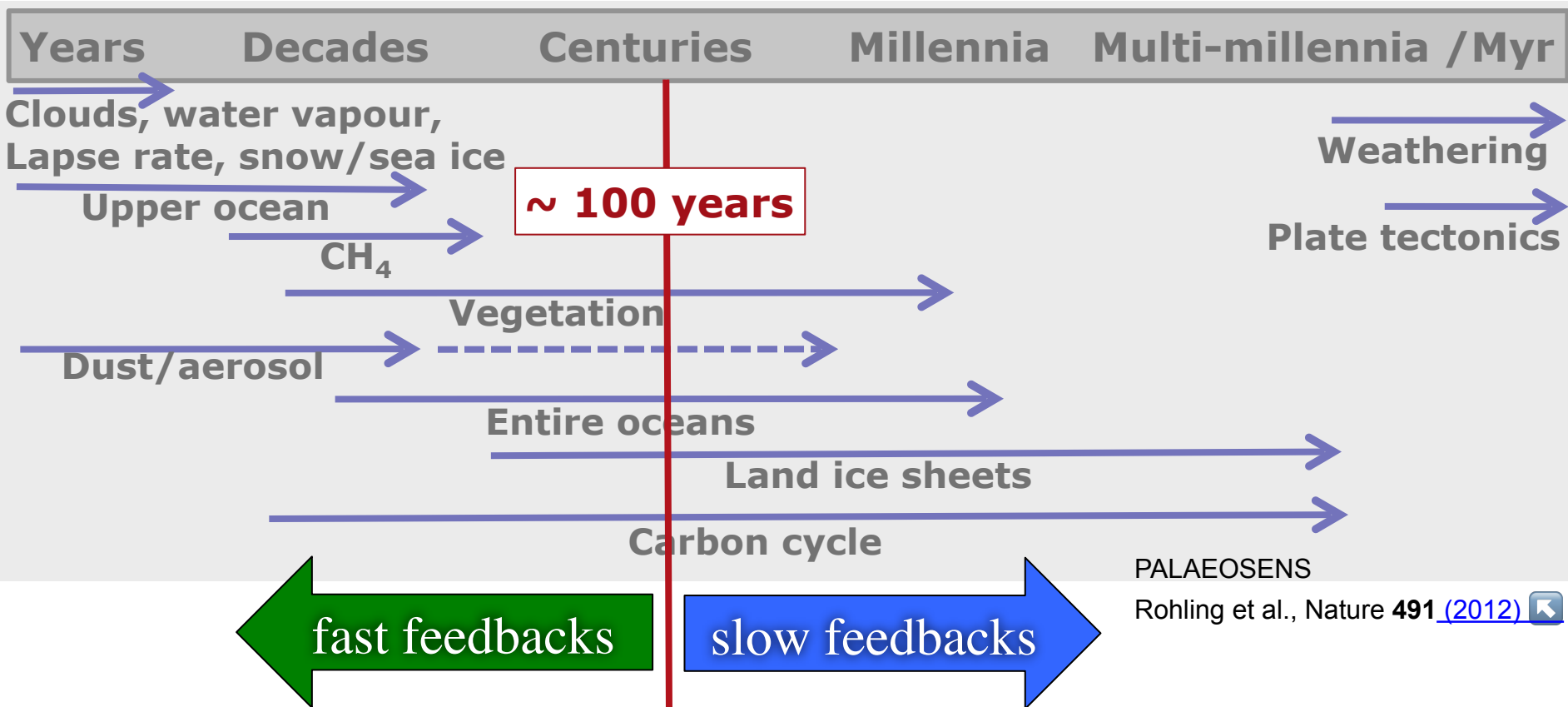
- ★ (Fast) feedback processes are not “constant”.

## ■ Tipping points in the climate system

- ★ New ‘flavours’ of climate sensitivity.
- ★ Extremes in climate sensitivity vs probability of tipping.



# Time scales & equilibrium



**Earth system sensitivity**

**'Correct' for slow feedbacks, e.g.**

**'Equilibrium' sensitivity S:**

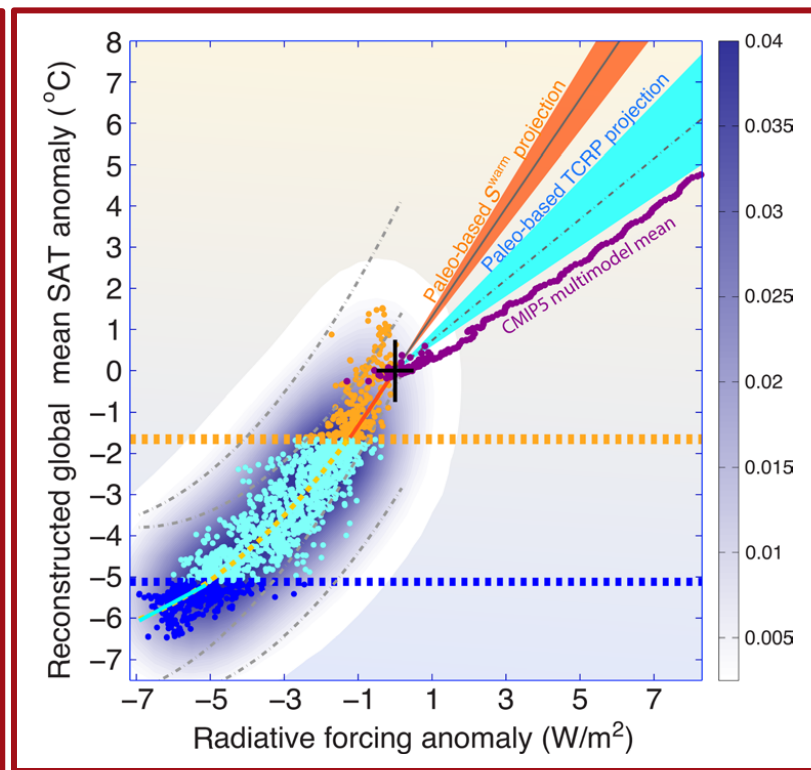
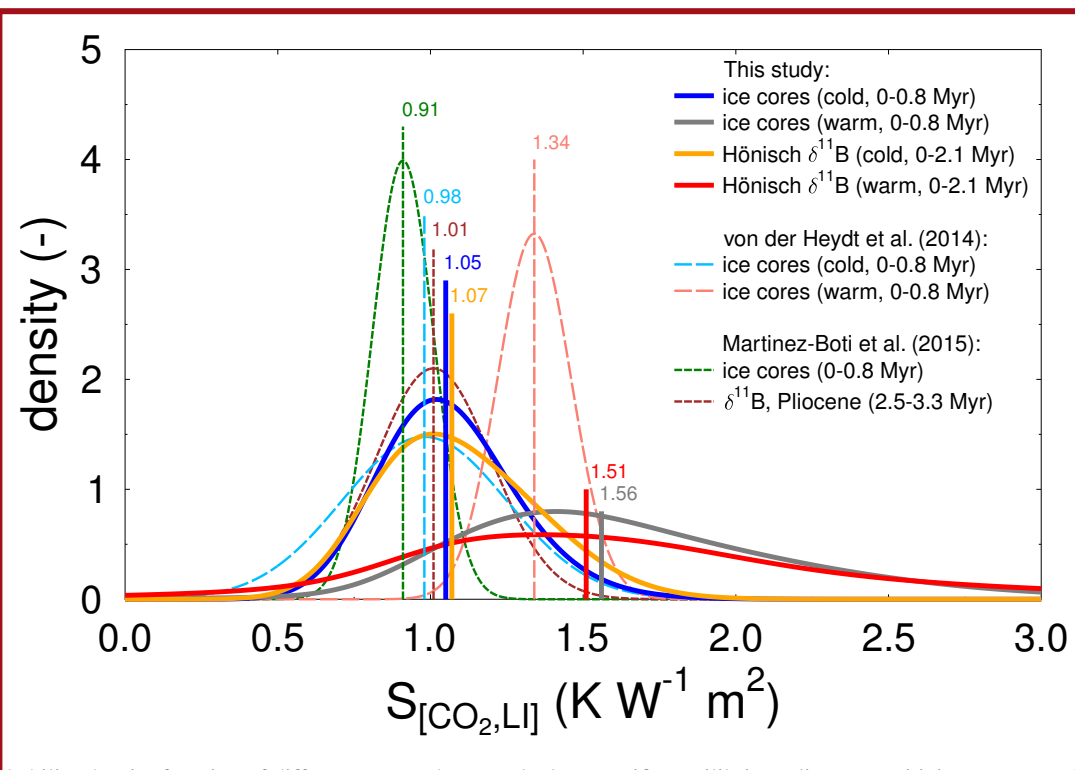
$$S^p = S_{[\text{CO}_2]} = \frac{\Delta T}{\Delta R_{[\text{CO}_2]}}$$

$$S_{[\text{CO}_2, LI]} = \frac{\Delta T}{\Delta R_{[\text{CO}_2]} + \Delta R_{[LI]}}$$

$$S_{\text{forcing, slow}} = \frac{\Delta T}{\Delta R_{\text{forcing}} + \Delta R_{\text{slow}}}$$



# Last 800 kyr: State dependent feedbacks



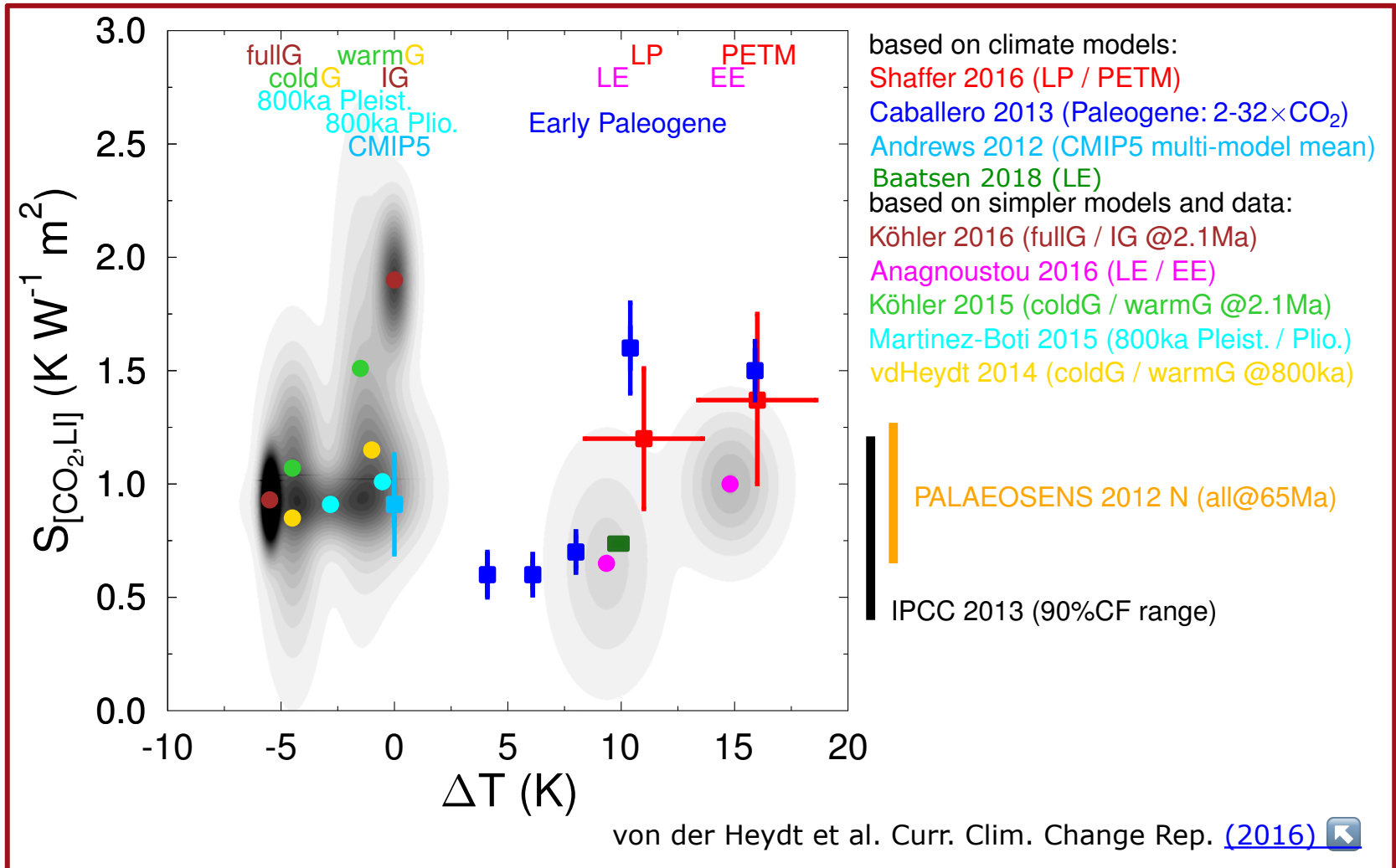
Köhler, von der Heydt, et al. Clim. Past [\(2015\)](#)

Friedrich et al. Sci. Adv. (2016)

von der Heydt et al. Curr. Clim. Change Rep. [\(2016\)](#)

**Equilibrium climate sensitivity (ECS) is higher during interglacials than in cold periods.**

# State dependent ECS from palaeoclimate data and models



# Distributions of climate sensitivity - origin of uncertainty?

## ■ Uncertainty from observations, model, unaccounted processes

- ★ Big uncertainties in quantification for radiative forcing.
- ★ Palaeoclimate: Big uncertainty in climate reconstruction.

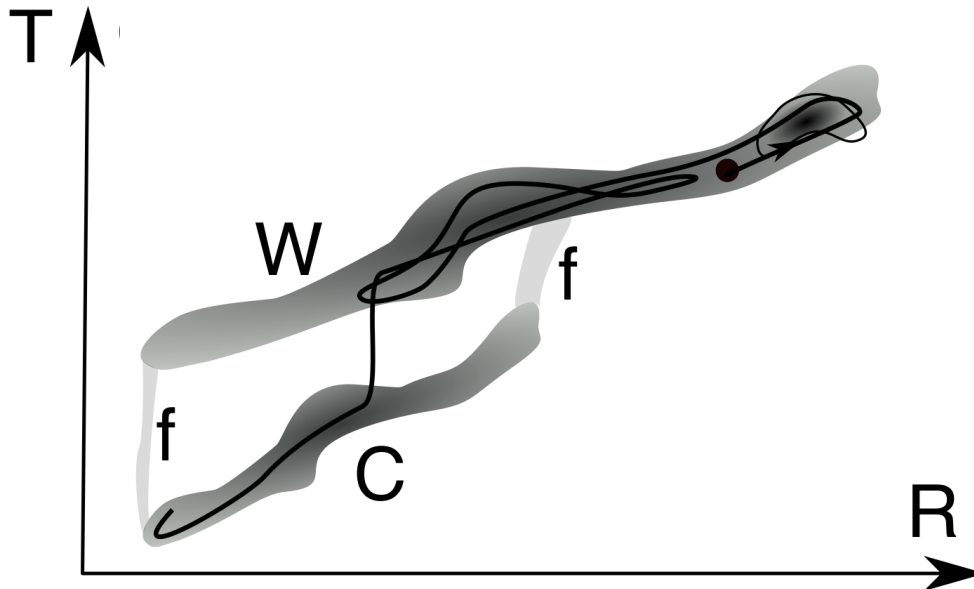
## ■ Climate dynamics:


- ★ feedback processes change with background climate!
- ★ Very high climate sensitivity:
  - nonlinearities in the climate system - evidence for tipping?

# Palaeoclimate sensitivity S: trajectory on a 'climate attractor'

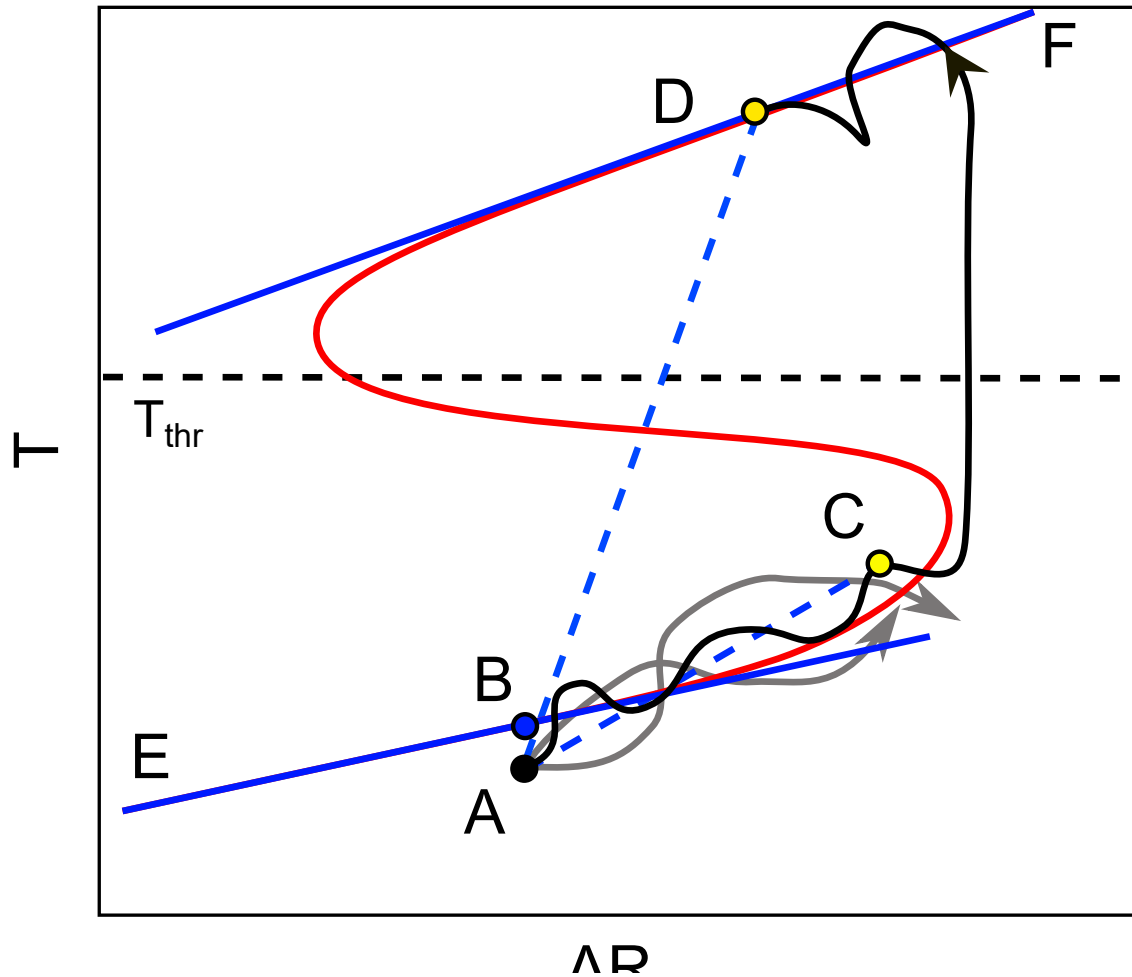
$$c_T \frac{dT}{dt} = R_{\text{forcing}} + R_{\text{slow}} + R_{\text{fast}} - R_{\text{OLW}}$$


$$S_{\text{forcing,slow}} = \frac{\Delta T}{\Delta R_{\text{forcing}} + \Delta R_{\text{slow}}} \approx \frac{dT}{d(R_{\text{forcing}} + R_{\text{slow}})}$$



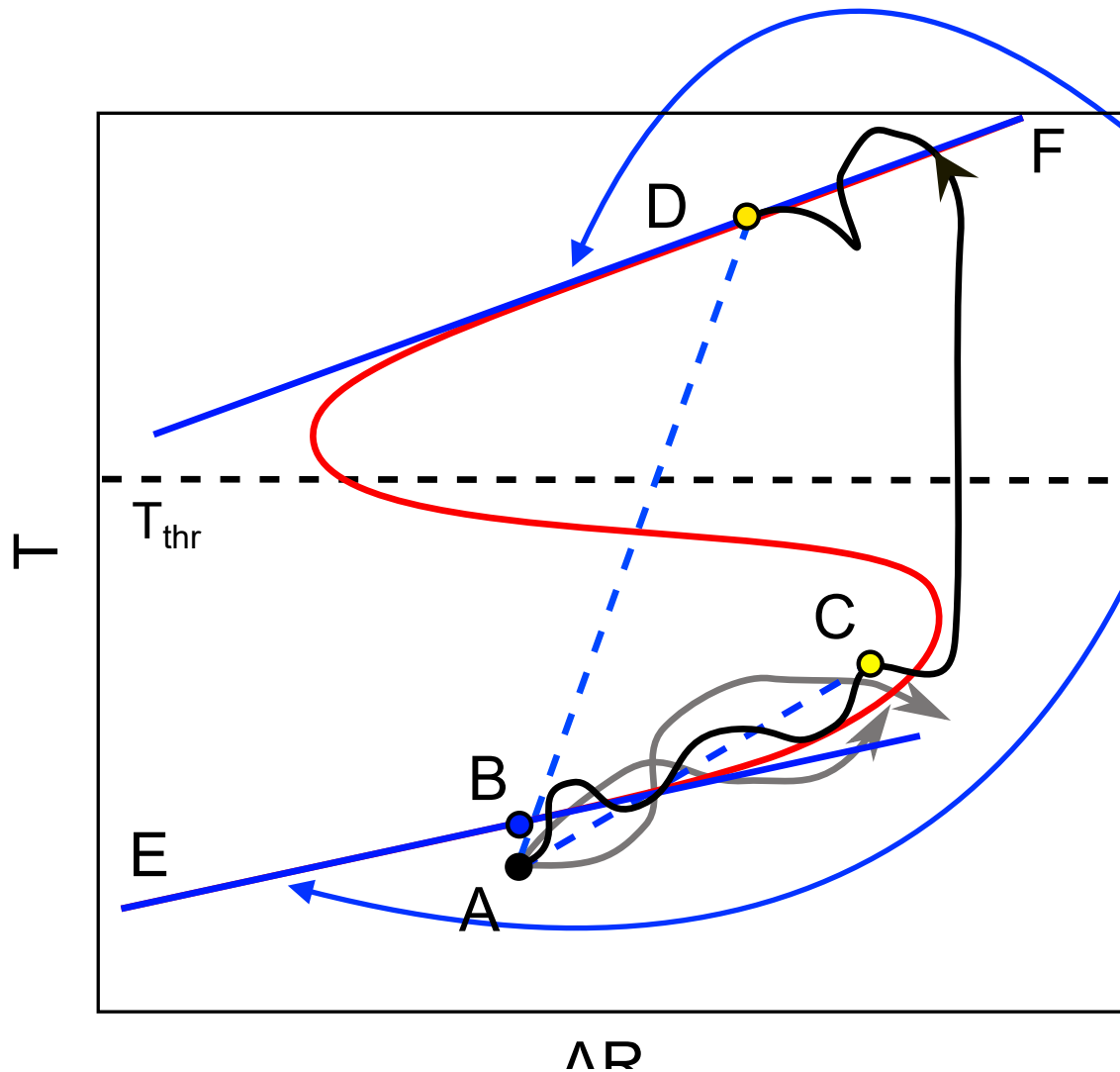
von der Heydt & Ashwin, Dyn. Stat. Clim. Syst. **1** dzx001 [\(2016\)](#) 

# The 'climate attractor'



Ashwin & von der Heydt, J. Stat. Phys. (2019) 

# The 'climate attractor'

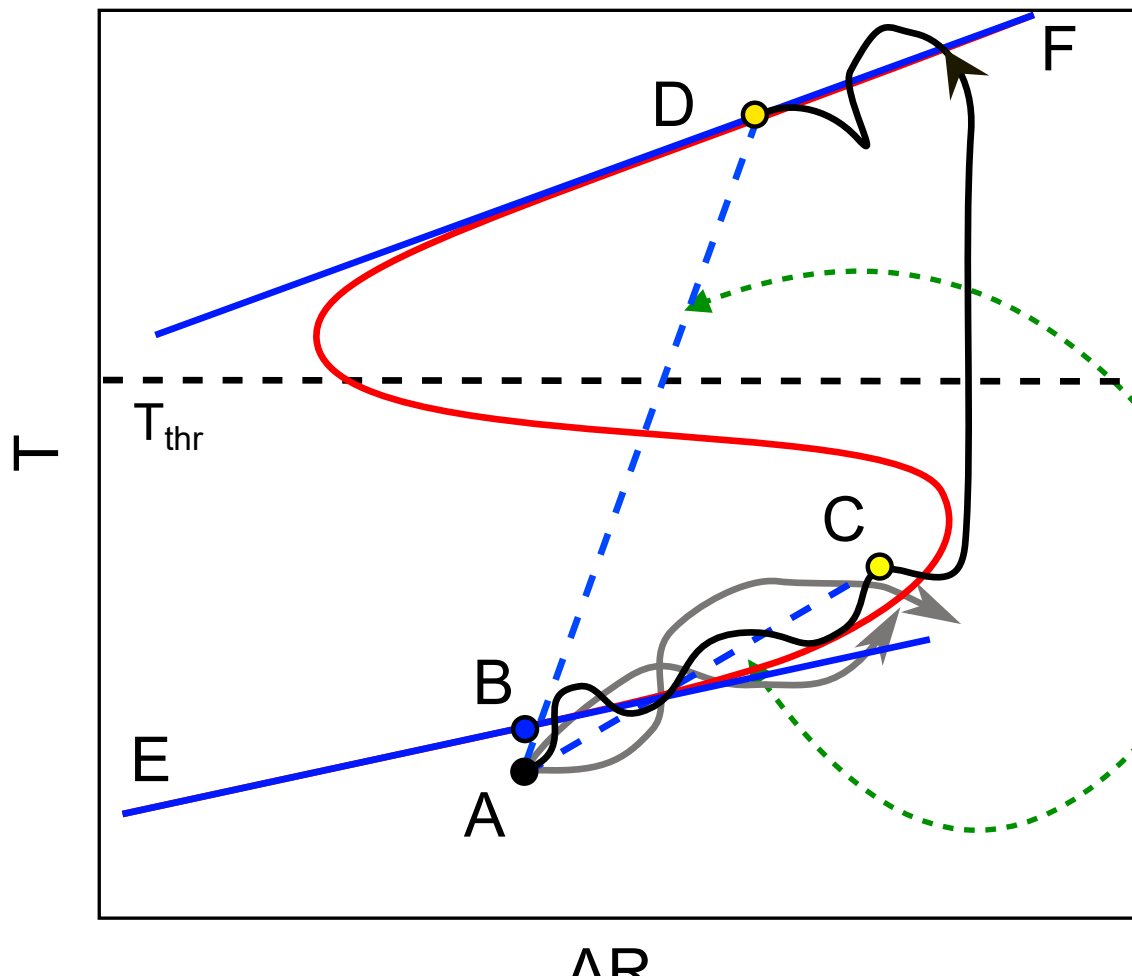


Instantaneous/Local  
slope sensitivity

$$S = \left[ \frac{d}{dT} \Delta R_{[CO_2]} \right]^{-1}$$

Ashwin & von der Heydt, J. Stat. Phys. (2019)

# The 'climate attractor'



Instantaneous/Local  
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$$S = \left[ \frac{d}{dT} \Delta R_{[CO_2]} \right]^{-1}$$

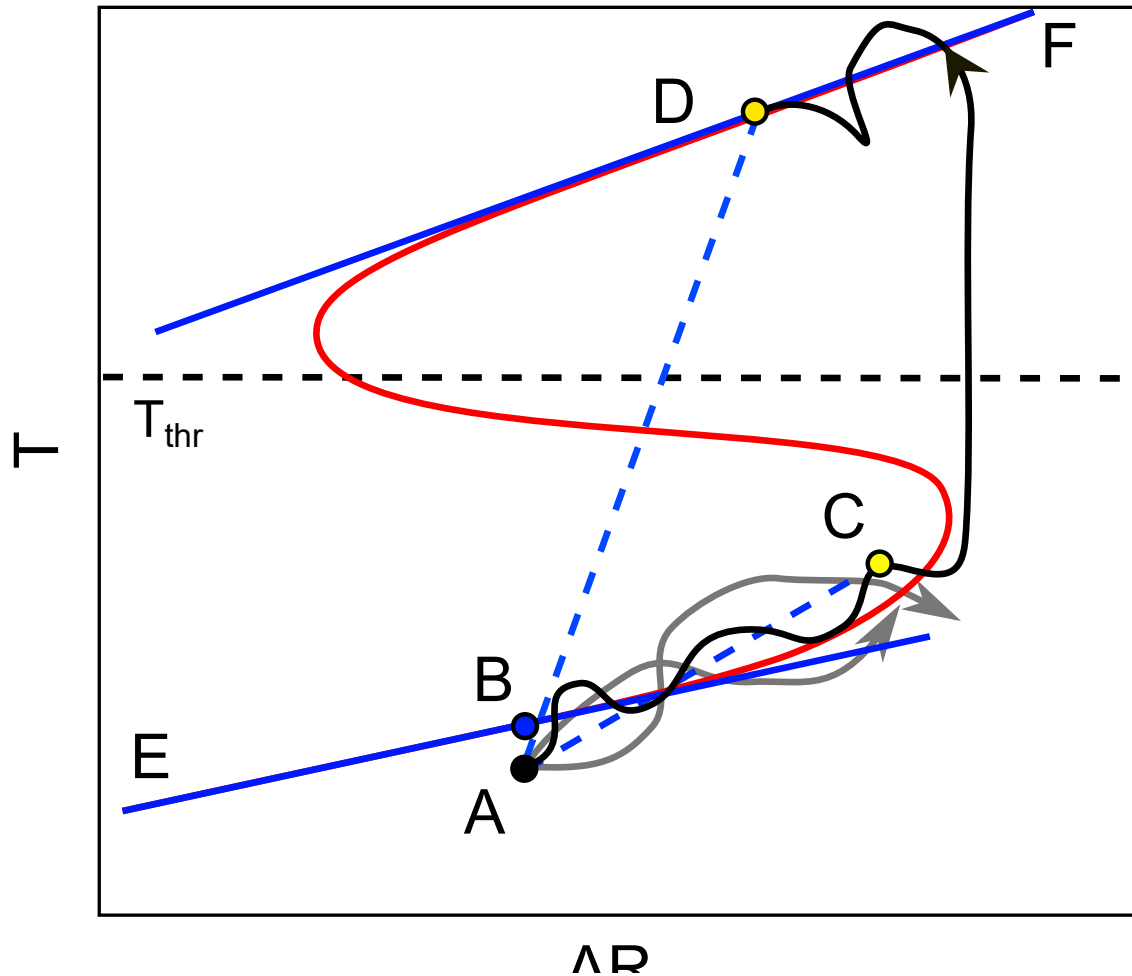
Incremental  
sensitivity (fixed  $\Delta t$ )

$$S_0^{\Delta t}(x) = \frac{T(\varphi_{\Delta t}(x)) - T_0}{R(\varphi_{\Delta t}(x)) - R_0}$$

Ashwin & von der Heydt, J. Stat. Phys. (2019)



# The 'climate attractor'



Instantaneous/Local  
slope sensitivity

$$S = \left[ \frac{dT}{dR} \Delta R_{[CO_2]} \right]^{-1}$$

Incremental  
sensitivity (fixed  $\Delta t$ )

$$S_0^{\Delta t}(x) = \frac{T(\varphi_{\Delta t}(x)) - T_0}{R(\varphi_{\Delta t}(x)) - R_0}$$

Two-point  
sensitivity (all  $\Delta t$ )

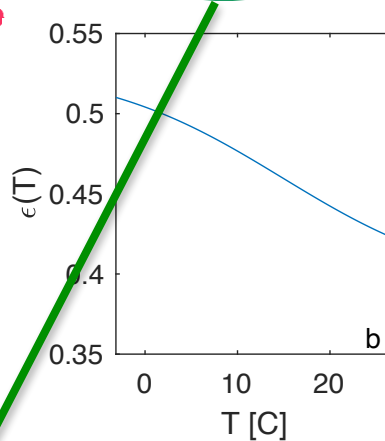
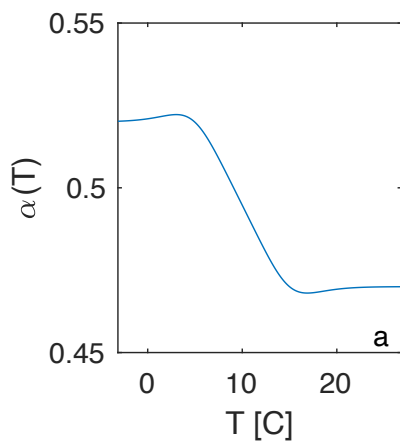
$$S_{0,1}^{\infty} = \frac{T_1 - T_0}{R_1 - R_0}$$

Ashwin & von der Heydt, J. Stat. Phys. (2019)

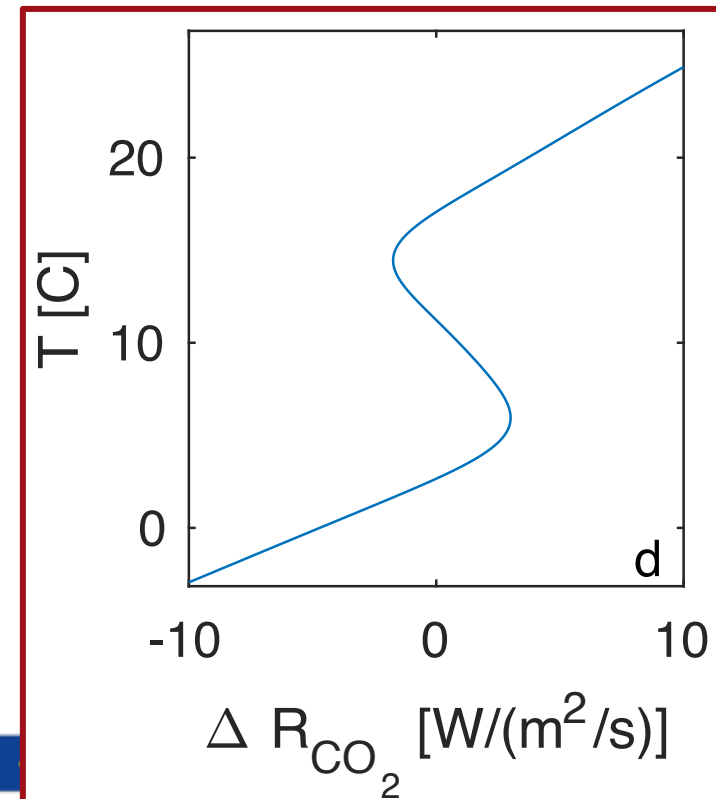
# Energy Balance model

$$C_T dT = \left[ Q_0 (1 - \alpha(T)) + \underbrace{A \ln\left(\frac{C}{C_0}\right)}_{\Delta R_{CO_2}} - \epsilon(T) \sigma T^4 \right] dt + \underbrace{\eta_T \omega_T}_{\text{noise}}$$

↑ albedo      ↑ emissivity

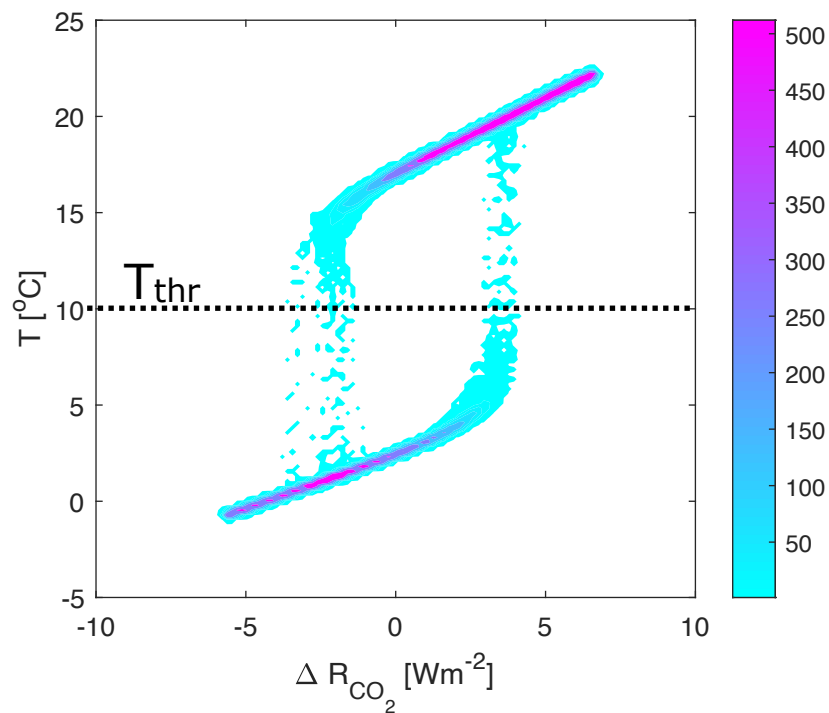


wandering CO<sub>2</sub> = additional noise



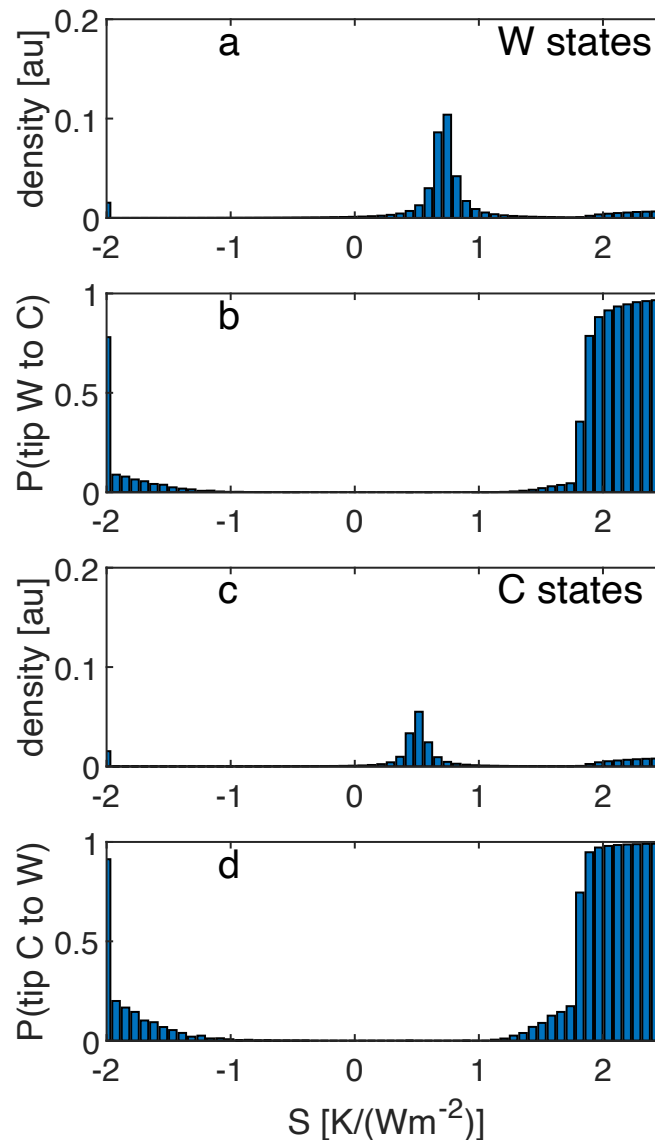
Ashwin & von der Heydt, J. Stat. Phys. (2019)

# Two-point sensitivity



Conditional, incremental sensitivity  
for all delays up to 20kyr

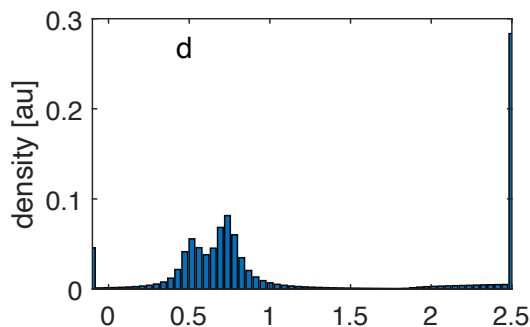
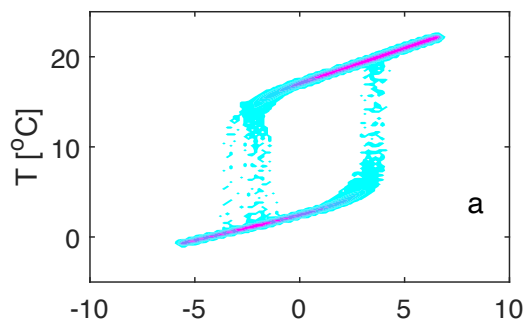
Ashwin & von der Heydt, J. Stat. Phys. (2019)



Plotting for the two-point sensitivity

# Skewed PDFs of two-point sensitivity

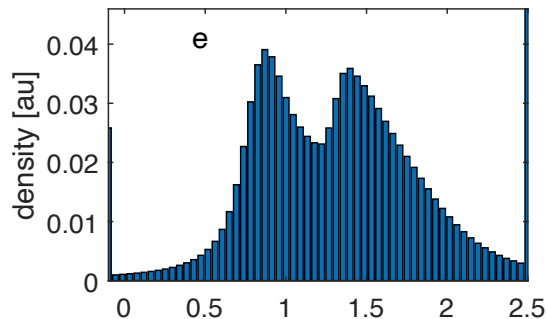
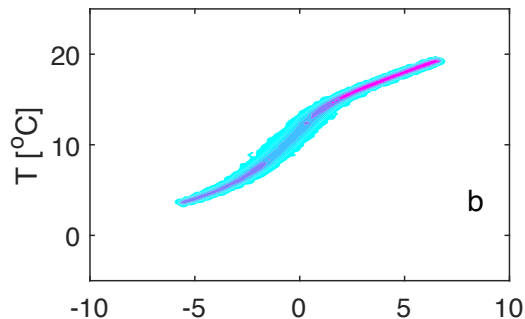
**Standard albedo contrast**



**Tipping and state-dependence of feedbacks**

non-constant feedback factors

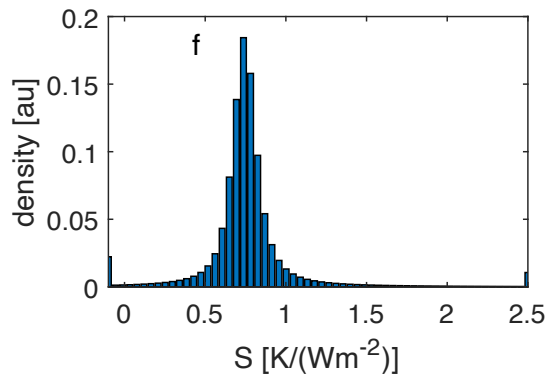
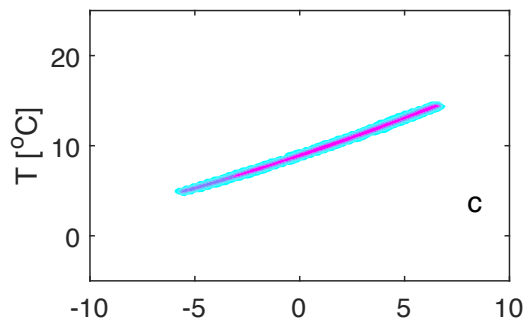
**Low albedo contrast**



**Only state-dependence of feedbacks**

non-constant feedback factors

**NO albedo contrast**

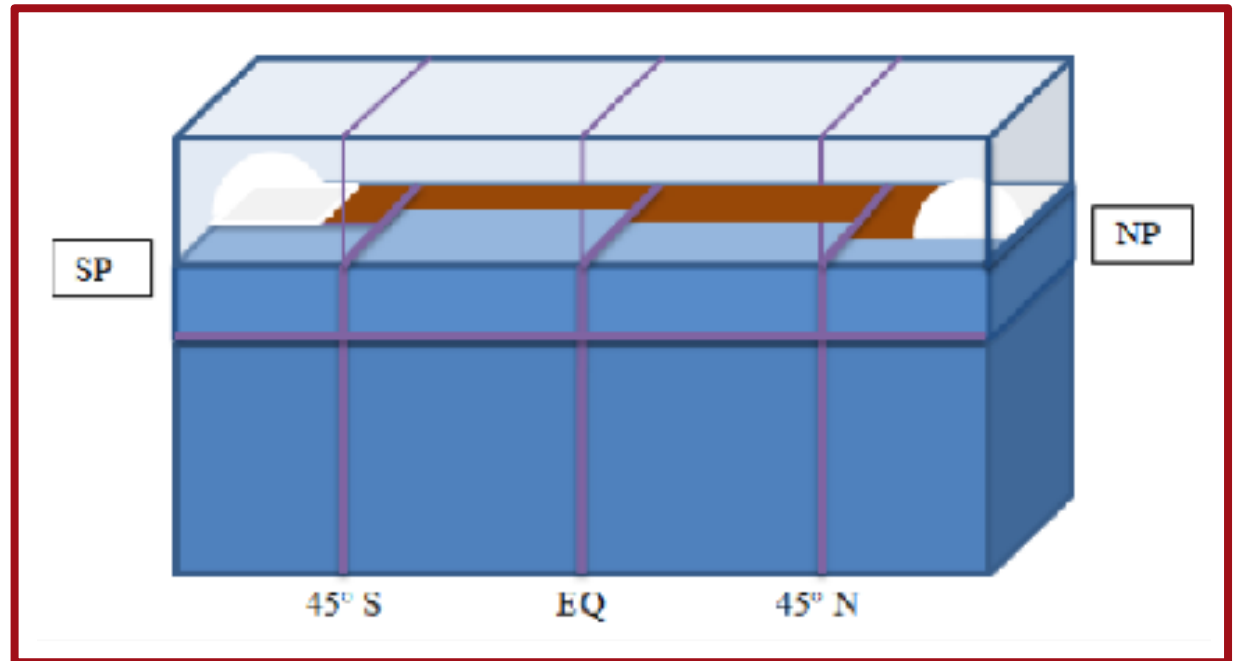


**No state-dependence of feedbacks**

constant feedback factors  
~ Gaussian PDF

# Conceptual climate model

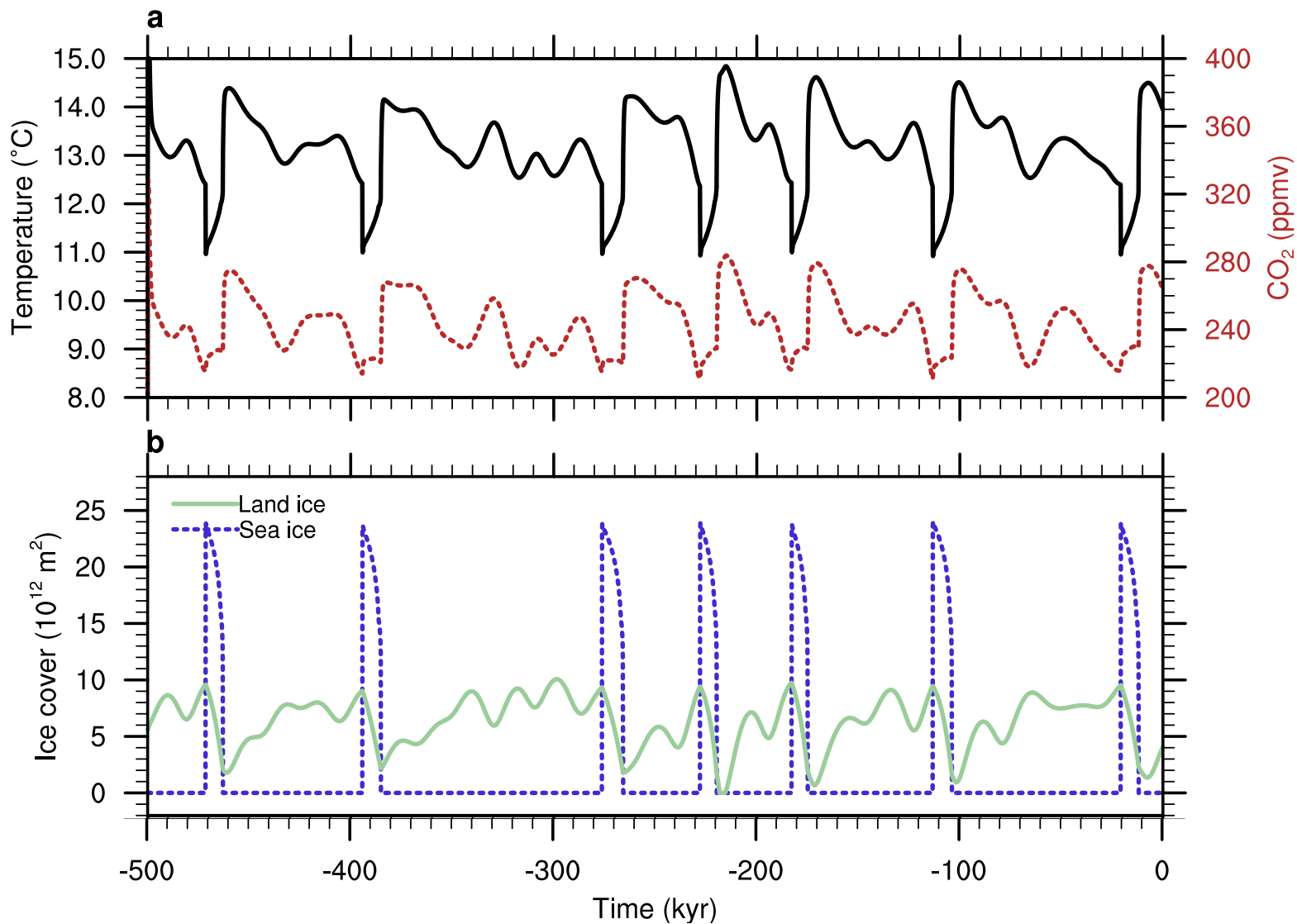
Simple Earth System model: Gildor & Tziperman 2000, 2001, 2002



- ★ Atmosphere,
- ★ Ocean,
- ★ Sea ice,
- ★ Land ice,
- ★ Ocean biogeochemistry & dynamic atmospheric  $p\text{CO}_2$ ,
- ★ Milankovitch forcing: insolation per box & NH land ice ablation.

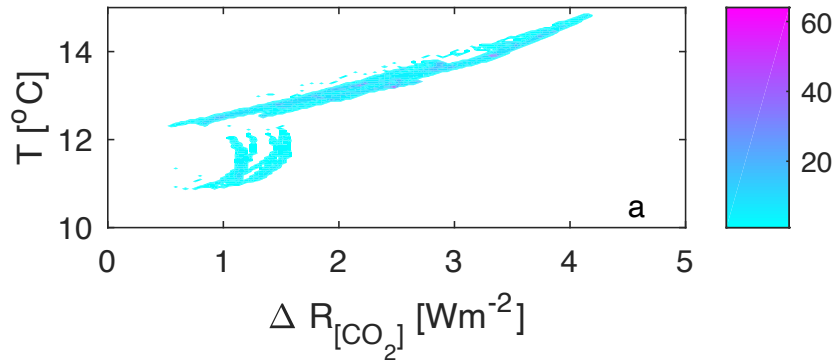
von der Heydt & Ashwin, Dyn. Stat. Clim. Syst. **1** dzx001 [\(2016\)](#) 

# Model glacial-interglacial cycles



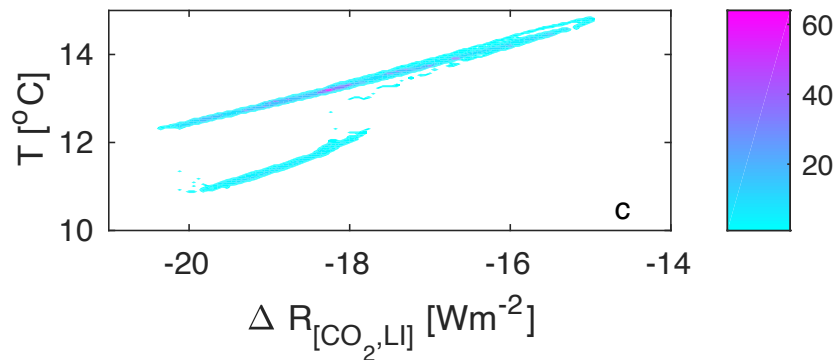
von der Heydt & Ashwin, Dyn. Stat. Clim. Syst. **1** dzx001 (2016)

# State dependent CS glacial cycles (conceptual climate model)



## Earth System Sensitivity

'forcing' = only CO<sub>2</sub>



## Equilibrium Climate Sensitivity

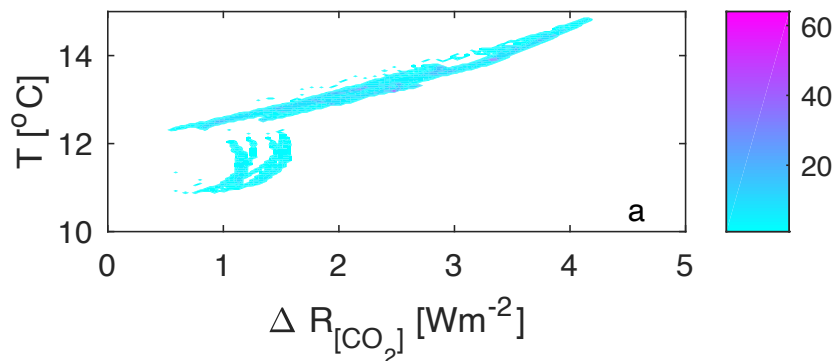
'forcing' = CO<sub>2</sub> + Land Ice

ESS corrected for slow feedbacks

Ashwin & von der Heydt, J. Stat. Phys. [\(2019\)](#)

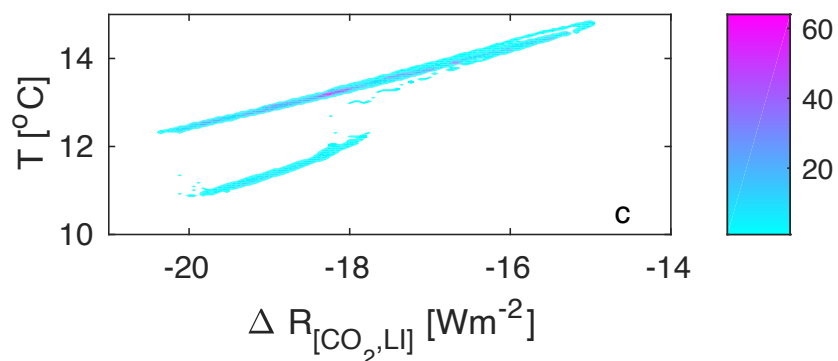


# State dependent CS glacial cycles (conceptual climate model)



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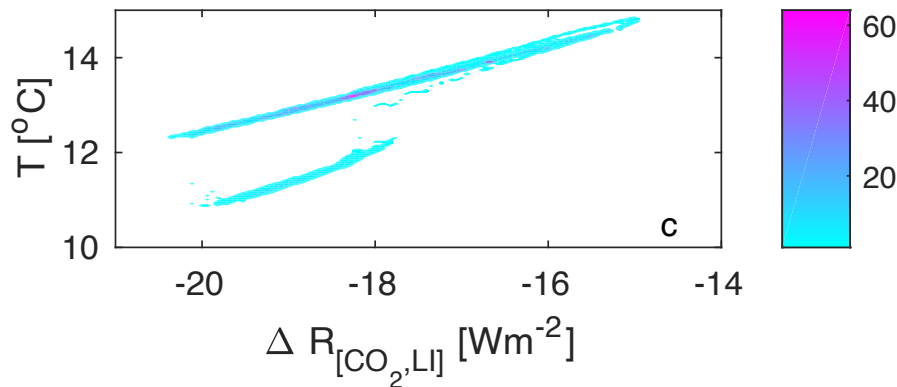
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Ashwin & von der Heydt, J. Stat. Phys. (2019)

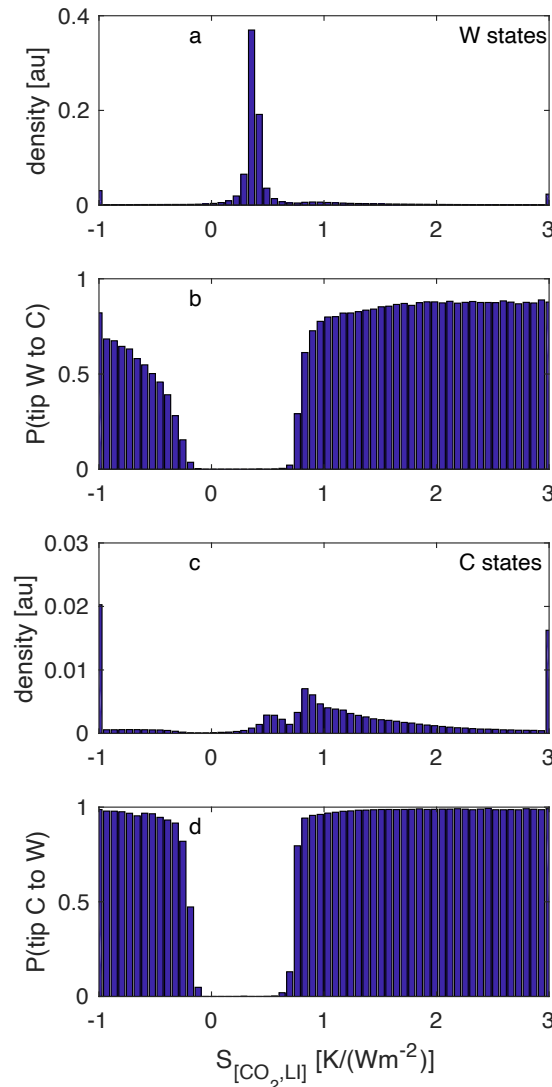
# Two-point sensitivity & probability of tipping (conceptual climate model)



As in energy balance model:

High values of  $S_{[CO_2, LI]}$  correspond to high probability of regime (cold/warm) transition

Ashwin & von der Heydt, J. Stat. Phys. (2019)



# Conclusions

- Climate sensitivity depends on the background climate state:
  - ★ non-constant fast feedback processes,
  - ★ multiple equilibrium or oscillatory states ('tipping').
- 'Flavours' of (palaeo)climate sensitivity on the 'climate attractor':
  - ★ instantaneous S: available from underlying model ('nearest equilibrium'),
  - ★ incremental S: fixed delay  $\Delta t$ ,
  - ★ two-point S: all delays, two points on attractor.
- Nonlinearities lead to skewed PDFs of measured climate sensitivity
  - ★ Extremes of climate sensitivity seem to relate to high probability of tipping.