

# Tipping Points: towards a quantitative understanding?

Corentin Herbert



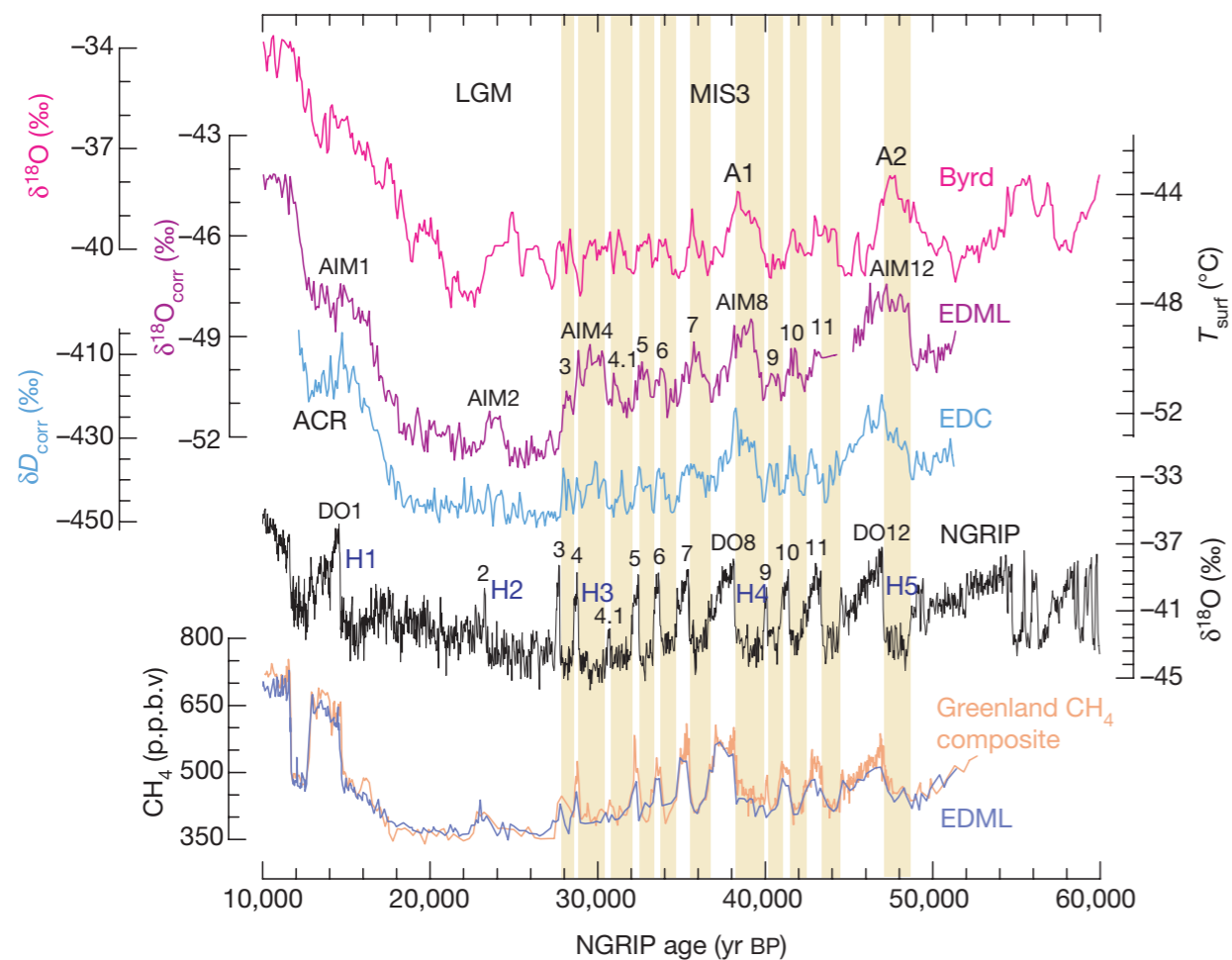
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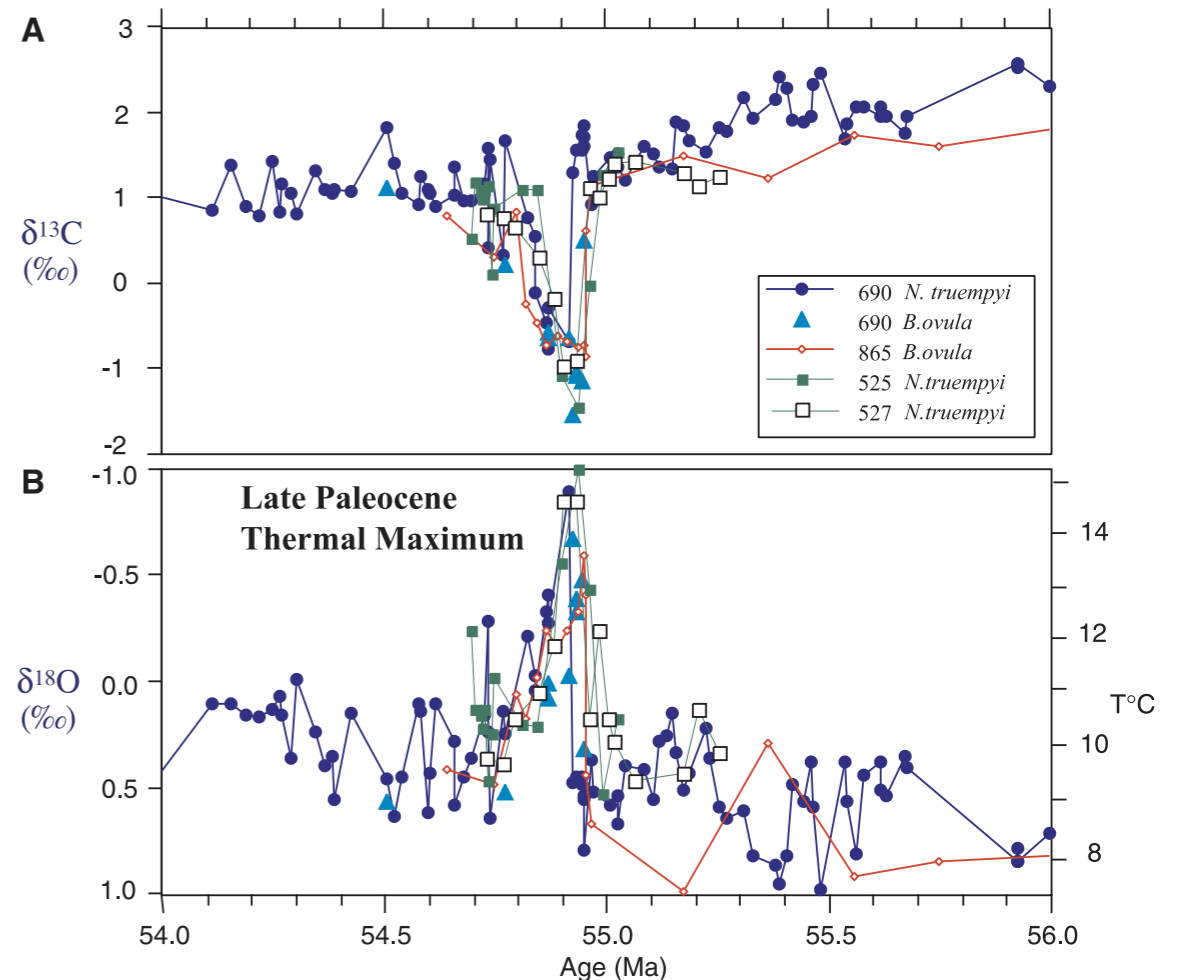
Picture from R. Saravanan's blog

# Can climate change abruptly?

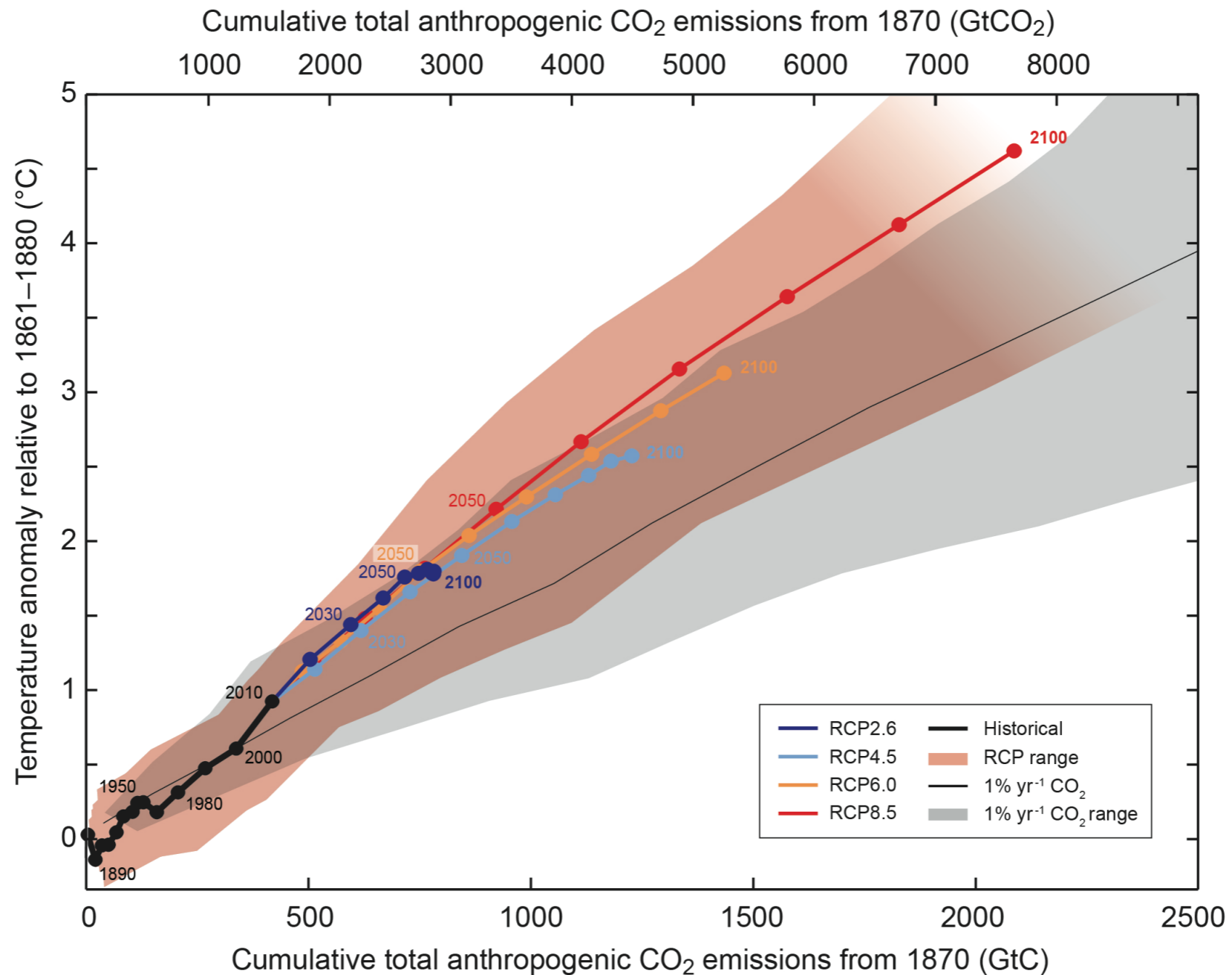
Abrupt events recorded in paleoclimate data for the last glacial period...



...and at the Paleocene-Eocene Thermal Maximum



# Can climate change abruptly?



**Model projections for 21st century do not exhibit abrupt changes**

# Main questions

- **Which physical mechanisms can lead to abrupt climate change?**
- **Are they represented reliably in climate models?**
- **If abrupt climate changes are controlled by external parameters, do we know the thresholds?**
- **If abrupt climate changes are due to internal fluctuations, can we estimate their probability?**
- **Are abrupt climate changes predictable?**

# Outline

**I. Tipping points in current models: state-of-the-art and limitations**

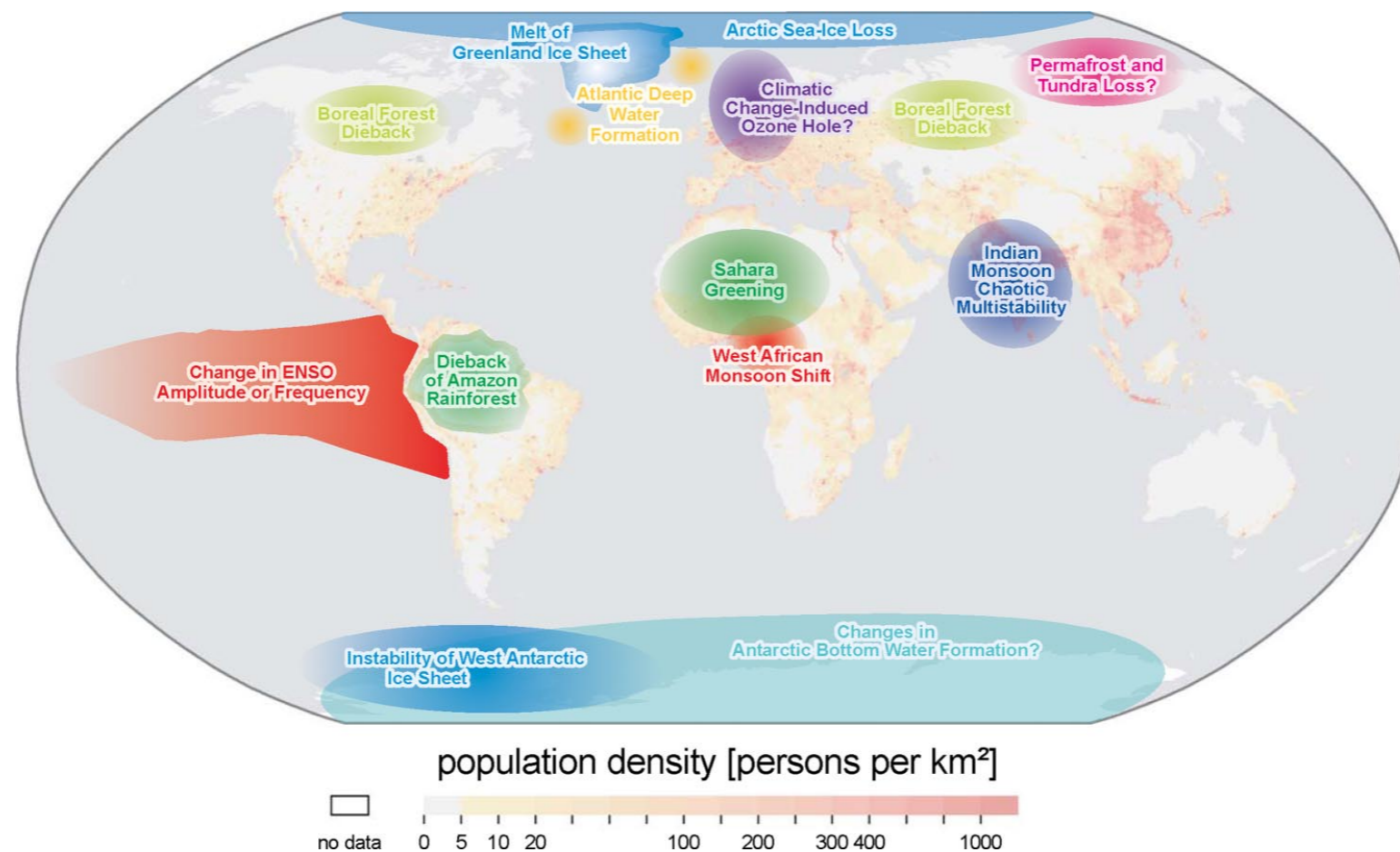
II. Towards a quantitative study of tipping points

1. Transitions in turbulent flows

2. New theoretical tools

III. Conclusions

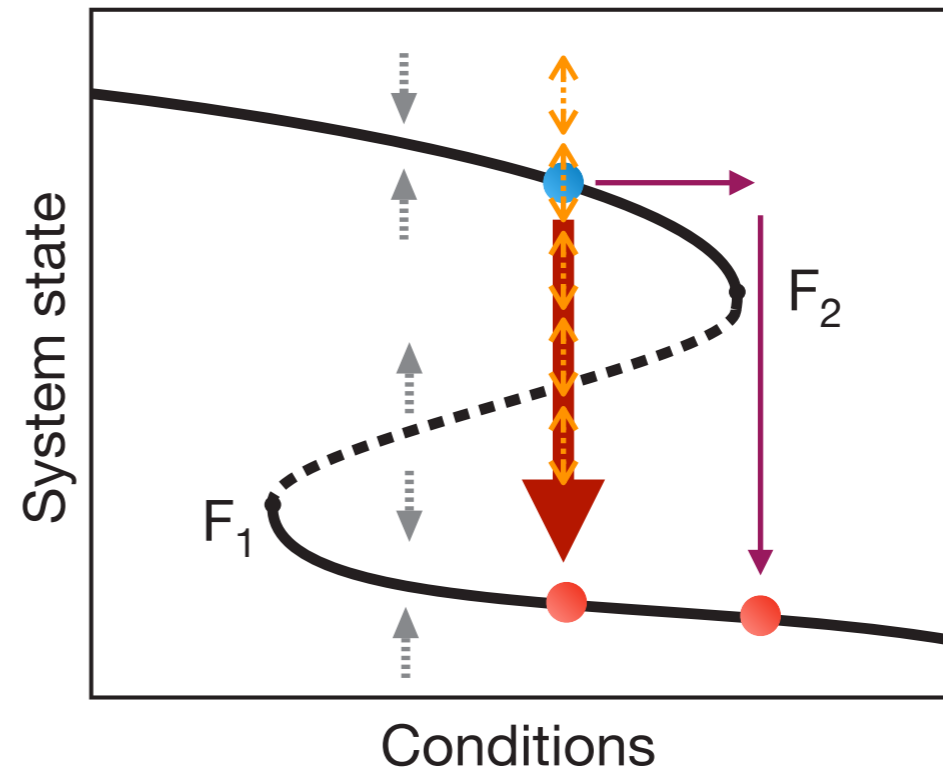
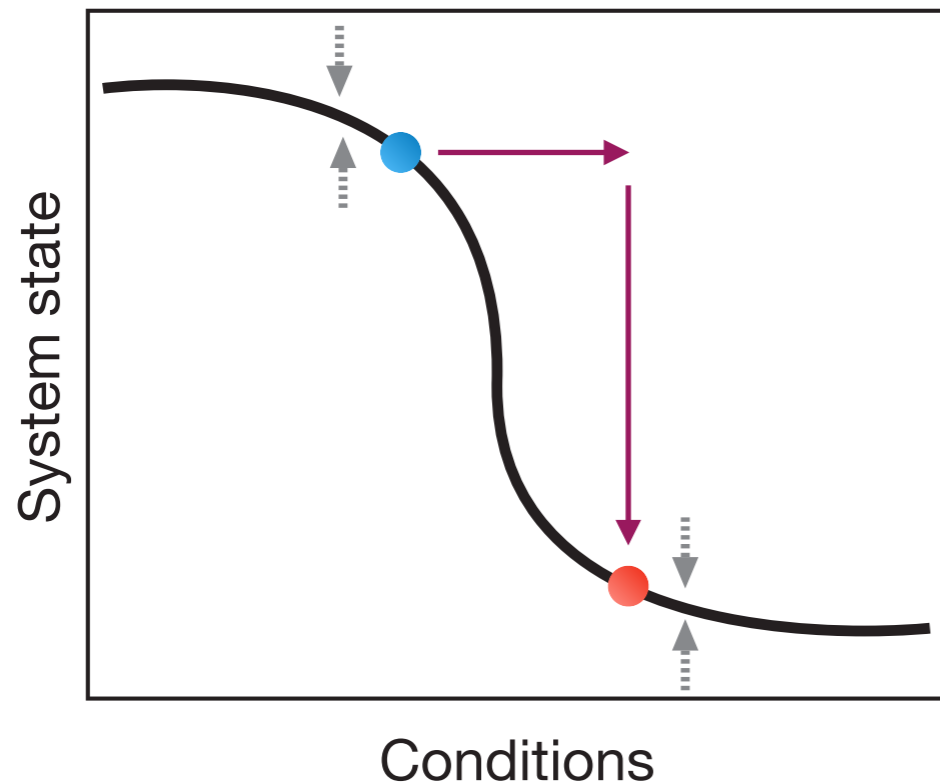
# Potential climate tipping points



Lenton et al. (2008)

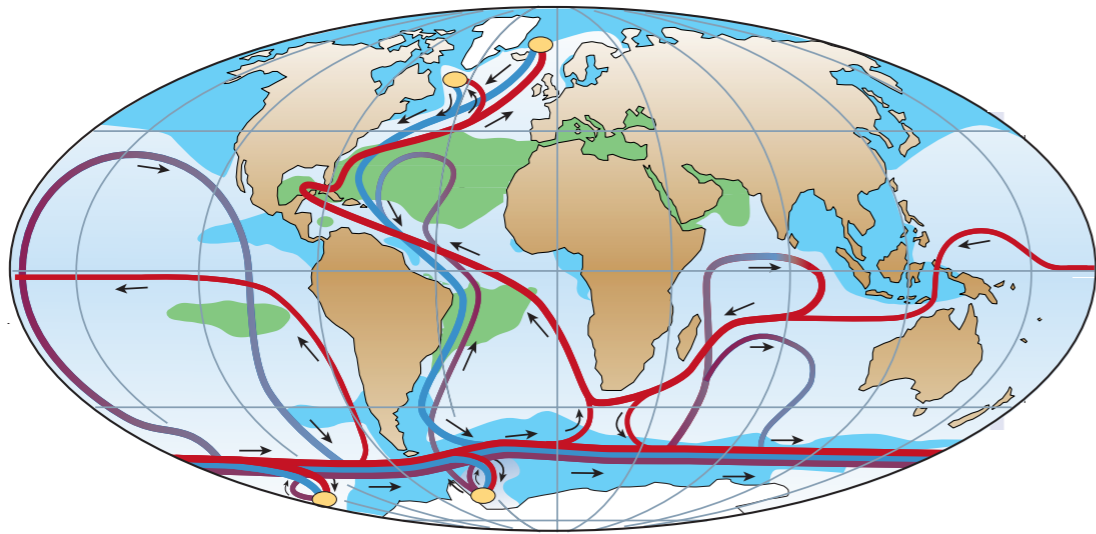
- **Some of these tipping points are found in climate models (known knowns)**
- **Other tipping points might exist but are not represented in current models (known unknowns)**
- **Yet others might exist but are not found in climate models due to inaccurate representation of physical processes (unknown unknowns)**

# Bifurcations and noise-induced transitions



- Transition due to loss of stability when external parameter changes (bifurcation). Irreversibility of the transition (hysteresis).
- Transition due to external forcing across the separatrix (shock) in the bistability regime.
- Transition due to internal fluctuations (noise) in the instability regime.
- More sophisticated behaviors are also possible (Hopf bifurcation, noise-induced transitions between chaotic attractors,...)

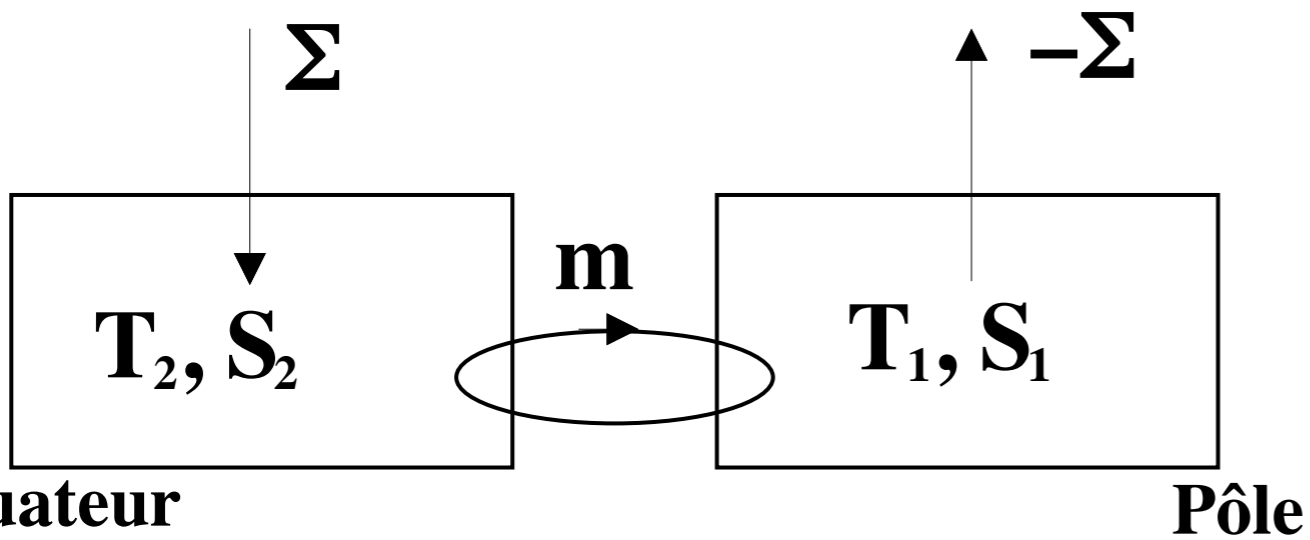
# AMOC bistability in box models



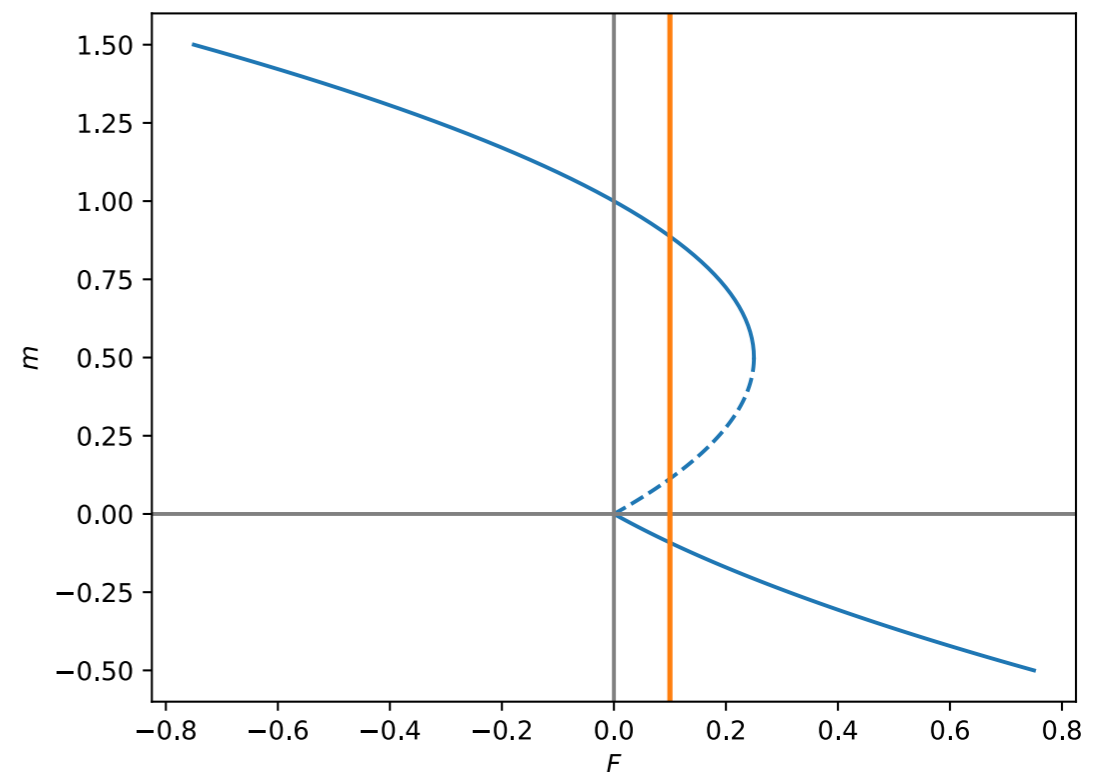
Steady state:

$$\Sigma = \mu |\alpha\Delta T - \beta\Delta S| \Delta S,$$

$$F = |1 - x|x, \quad F = \frac{\Sigma\beta}{\mu(\alpha\Delta T)^2}, \quad x = \frac{\beta\Delta S}{\alpha\Delta T}$$

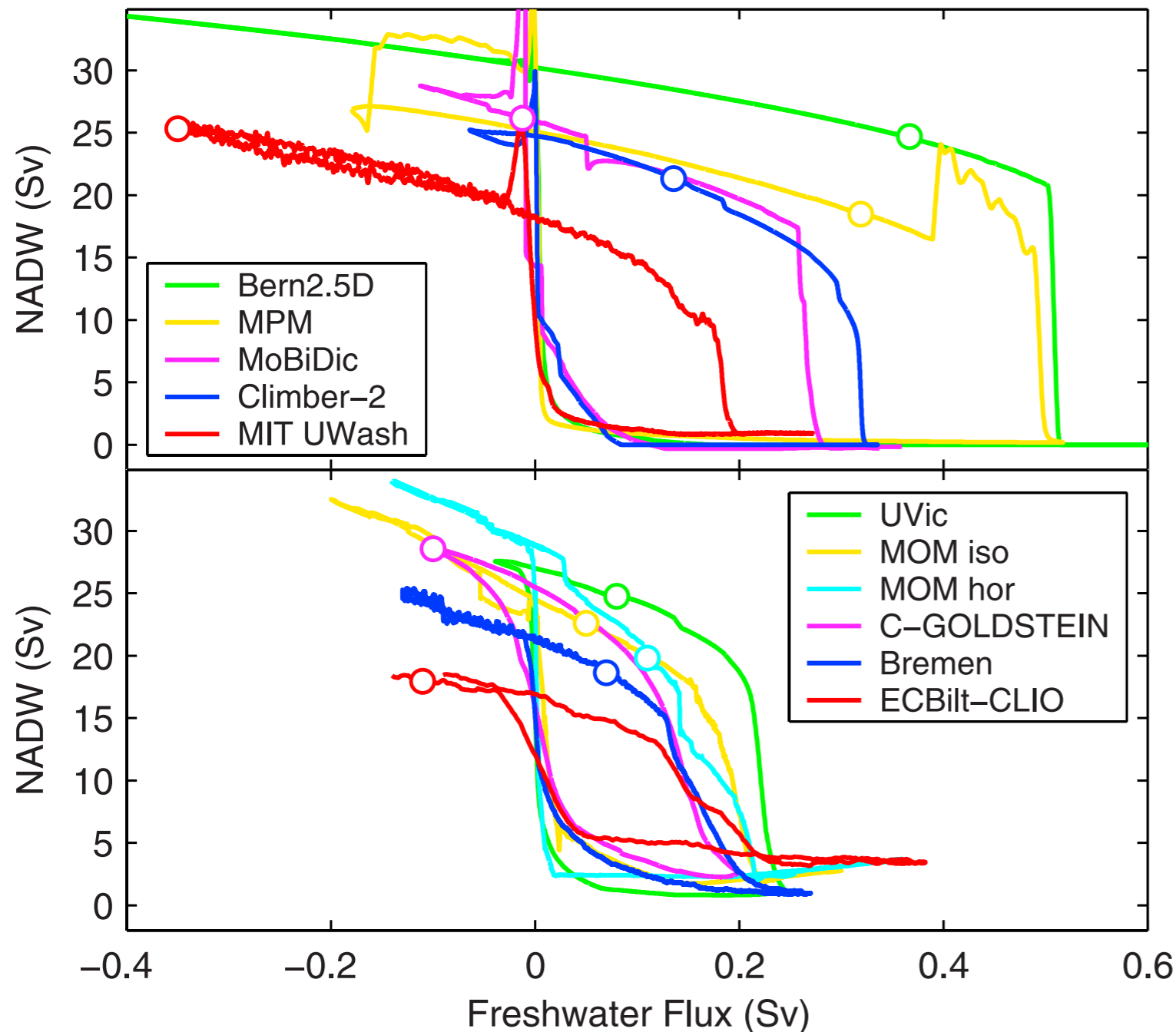


$$\begin{aligned} m &= \mu(\rho_1 - \rho_2) \\ &= \mu(\alpha(T_2 - T_1) - \beta(S_2 - S_1)) \\ &= \mu(\alpha\Delta T - \beta\Delta S) \end{aligned}$$





# AMOC bistability in many intermediate complexity models

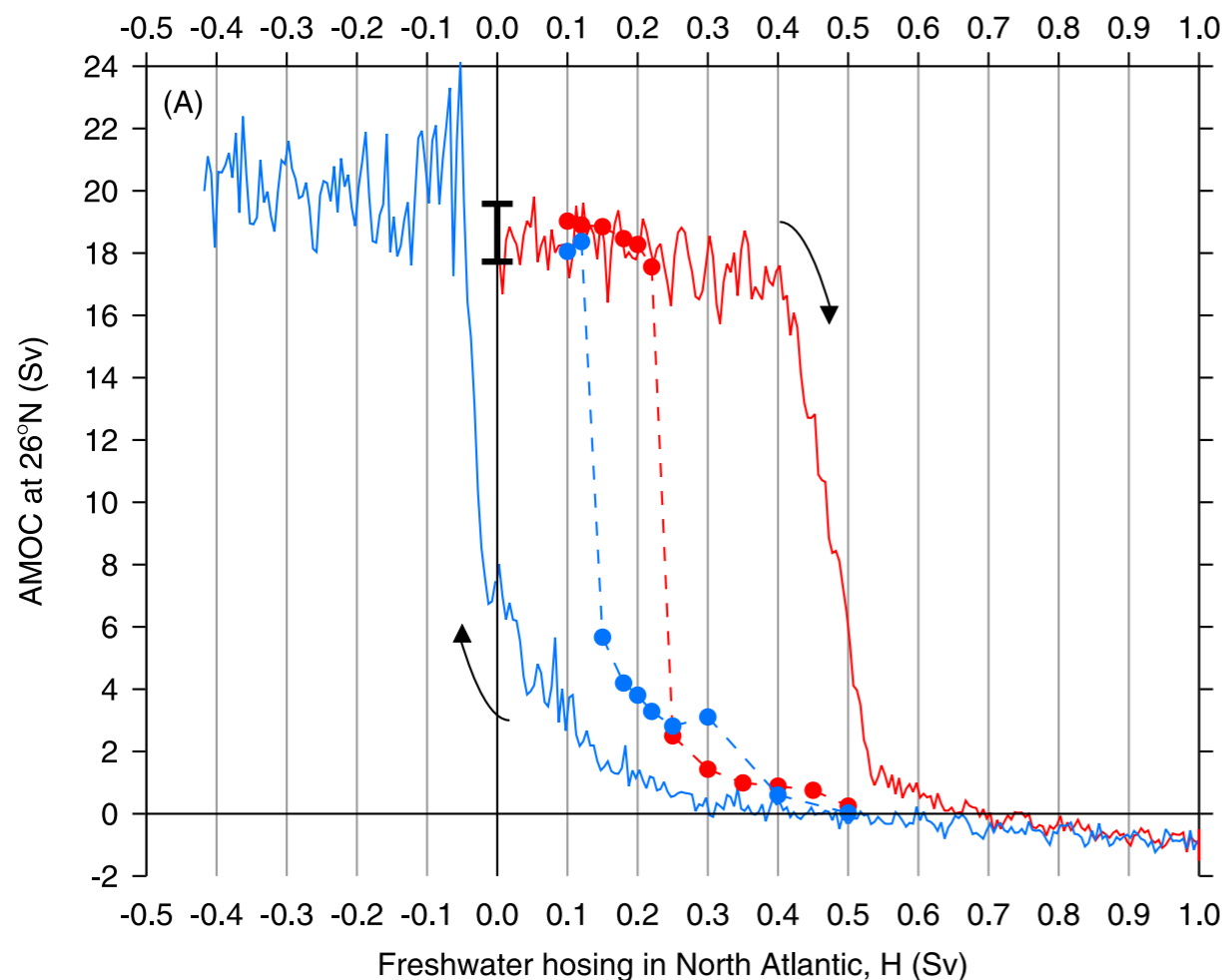


Model Name	Ocean Component	Atmosphere Component
Bern 2.5D	zonally averaged, 3 basins	zonally averaged energy moisture
Bremen	large-scale geostrophic	energy balance
Climber-2	zonally averaged, 3 basins	statistical-dynamical
ECBilt-CLIO	3D primitive equations	quasi-geostrophic
C-GOLDSTEIN	3D simplified	energy-moisture balance
MIT_UWash	3D prim. equations, square basins	zonally averaged
MoBiDic	zonally averaged, 3 basins	zonally averaged
MOM-hor	3D primitive equations (MOM)	simple energy balance
MOM-iso	as above, with isopycnal mixing	simple energy balance
MPM	zonally averaged, 3 basins	energy-moisture balance
UVic	3D primitive equations (MOM)	energy-moisture balance

- **All models exhibit hysteresis**
- **They disagree about the position of the bifurcation**
- **Is present day climate mono-stable or bistable?**

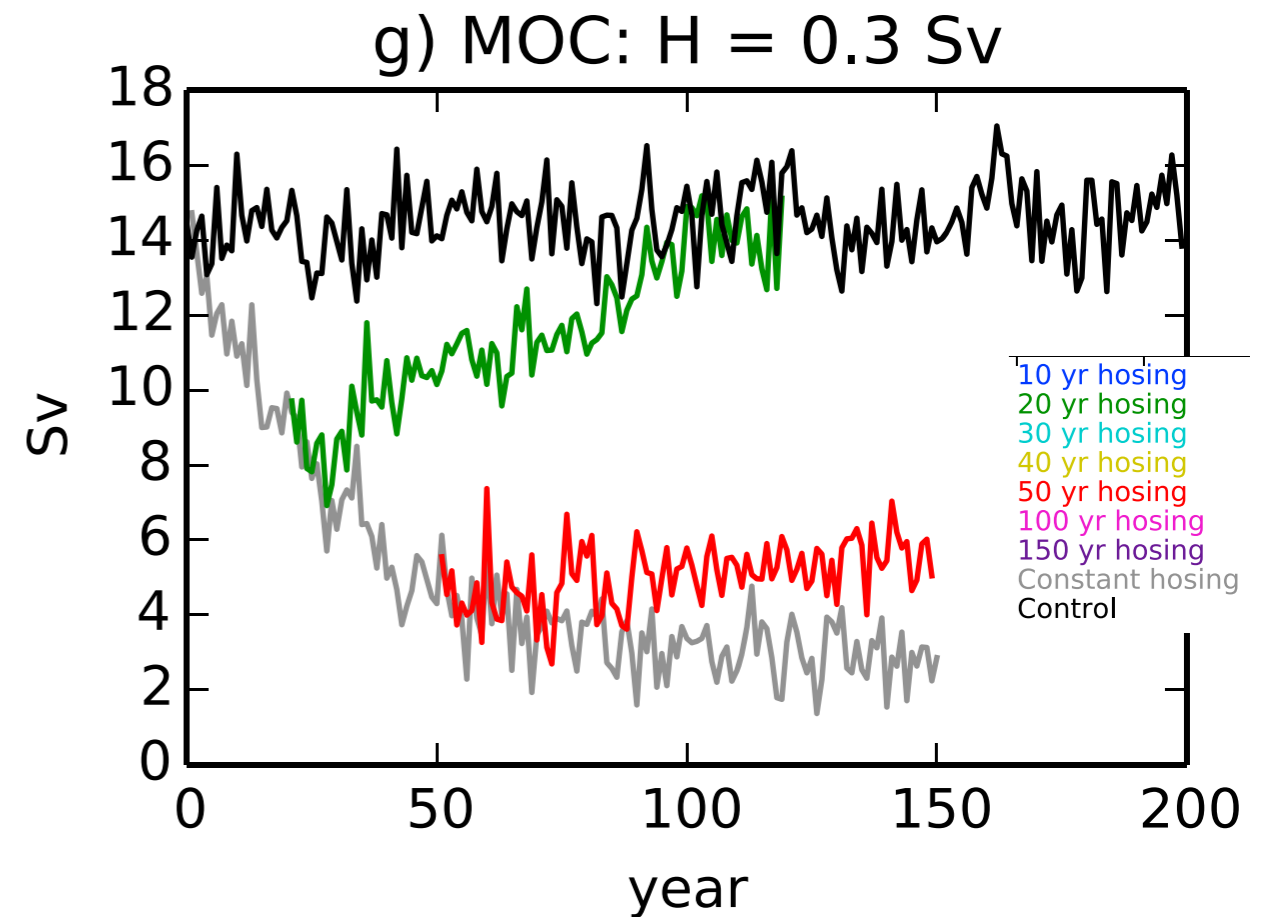
# AMOC bistability in ocean GCMs

low-resolution GCM (FAMOUS)



Hawkins et al. (2011)

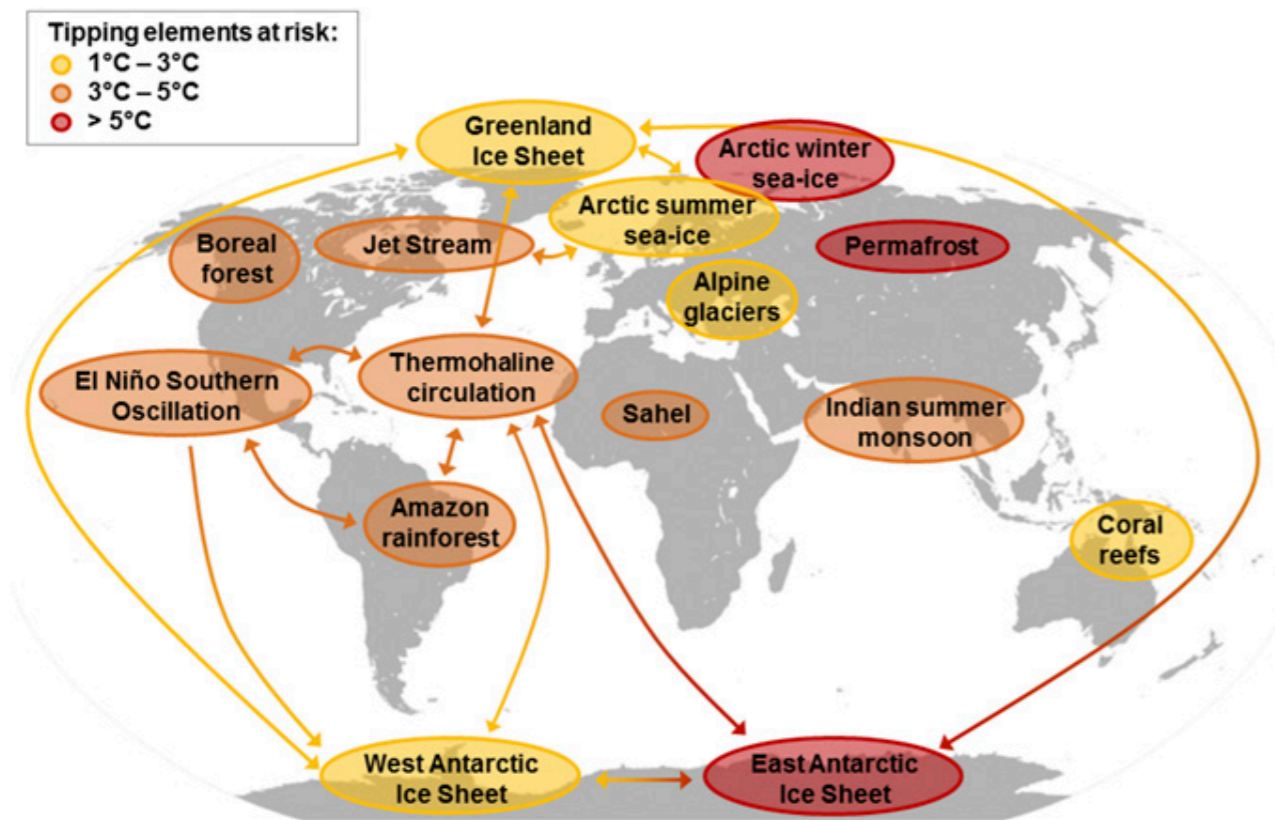
Eddy-permitting model (HadGEM3-GC2)



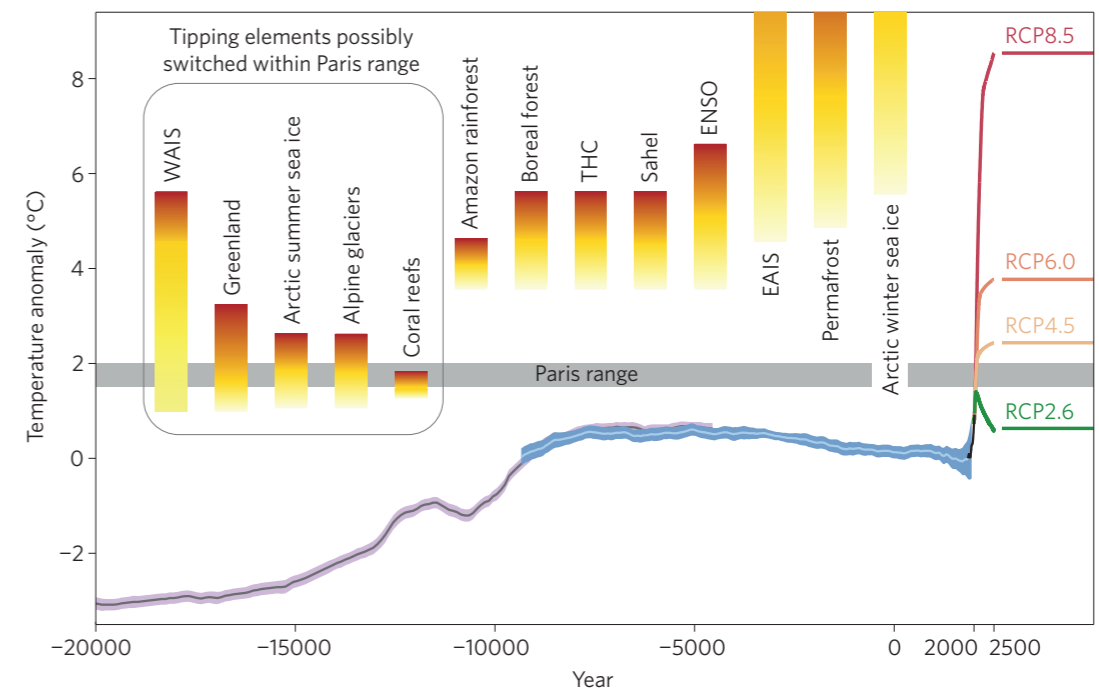
Jackson & Wood (2018)

- Some GCMs exhibit AMOC bistability, but not all of them
- For those which do, it depends on details of the experiment

# Thresholds for Tipping Points



Steffen et al (2018)

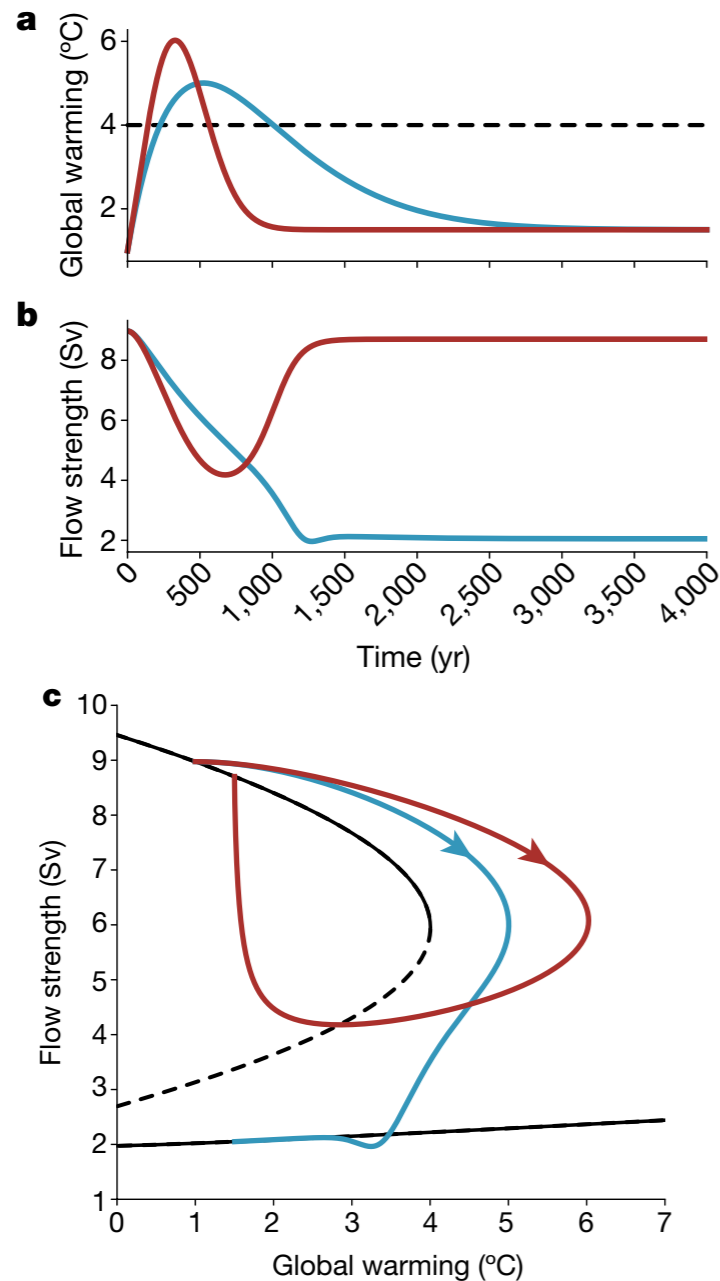


Schellnhuber et al. (2016)

- These are “expert elicitations”, not direct simulation results
- Uncertainties are large
- Tipping points studied separately with idealized forcing, while they are coupled in reality (*tipping cascades*)
- Timescale of forcing matters (e.g. *overshooting*)

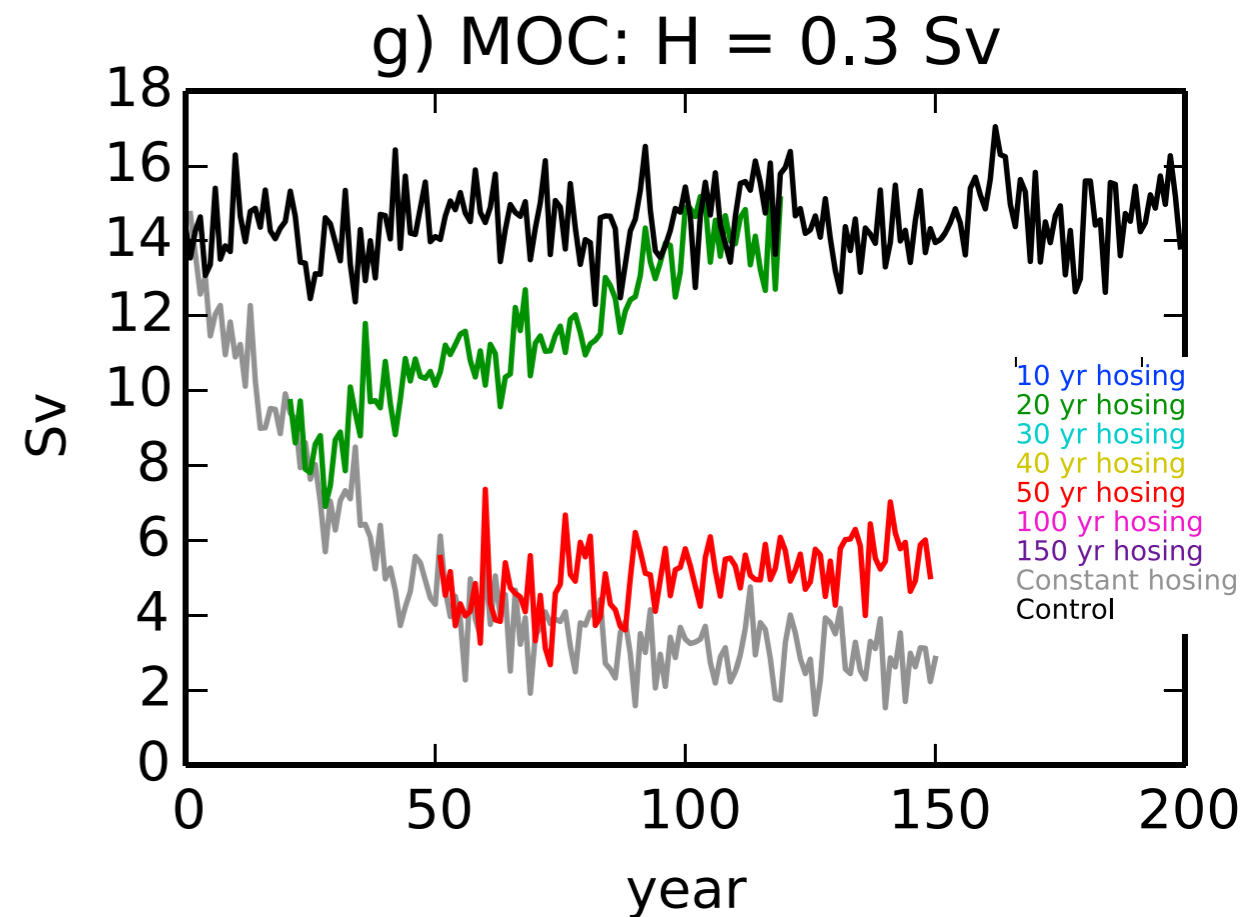
# Overshooting

Can we safely overshoot tipping points if we go back below the threshold sufficiently fast?



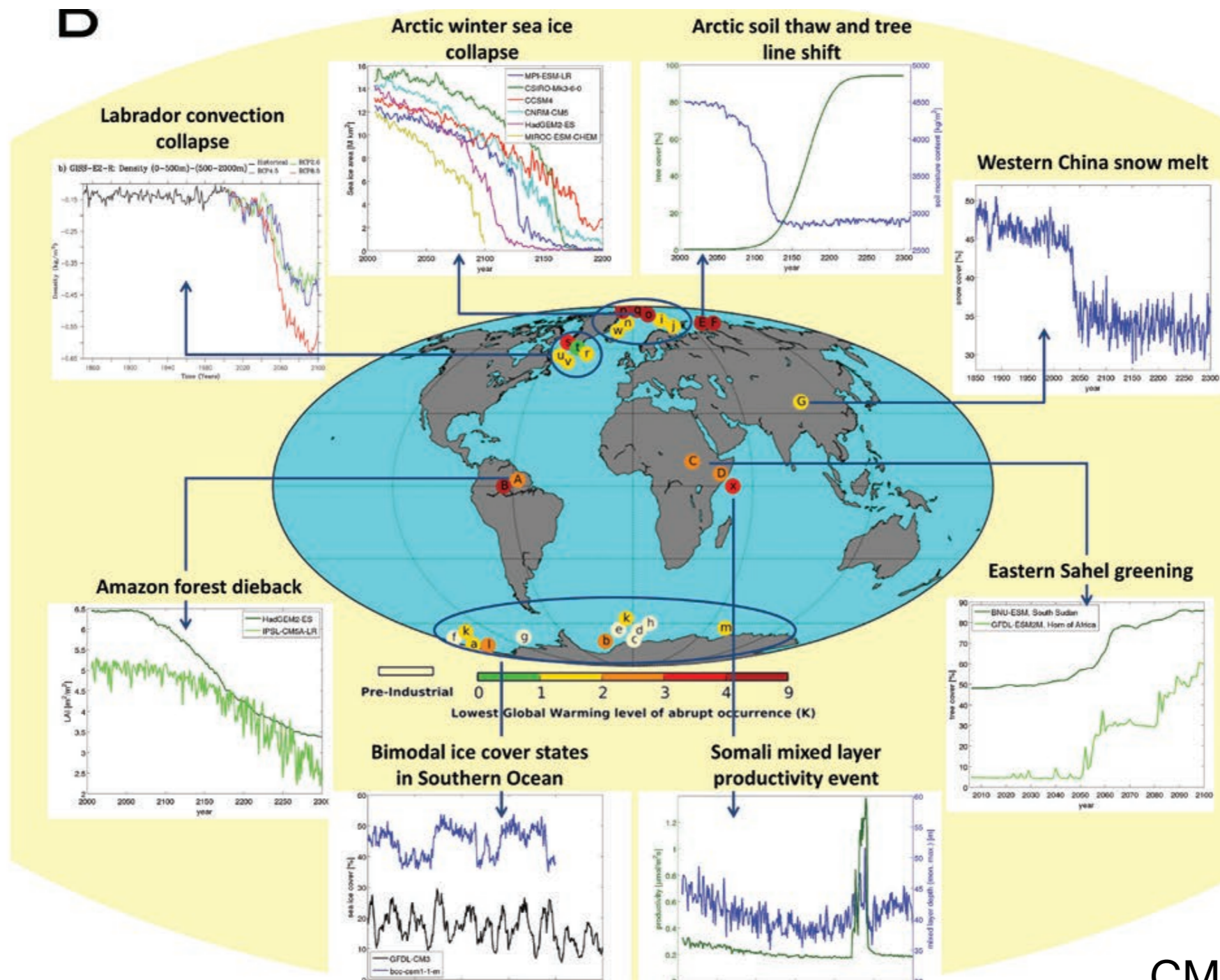
Ritchie et al (2021)

Eddy-permitting model (HadGEM3-GC2)



Jackson & Wood (2018)

# Spontaneous transitions in climate models

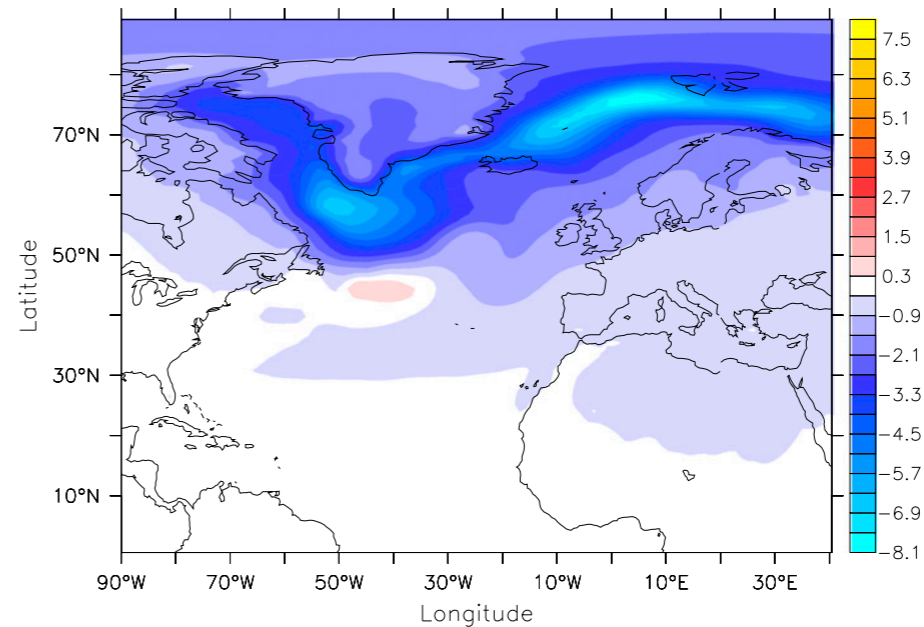
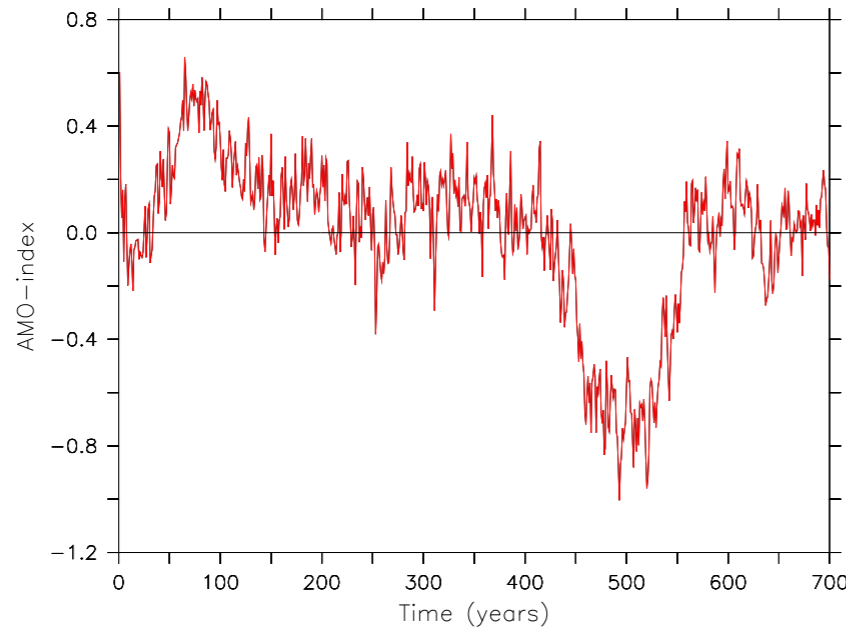


CMIP5 simulations

Bathiany et al. (2016), after Drijfhout et al. (2015)

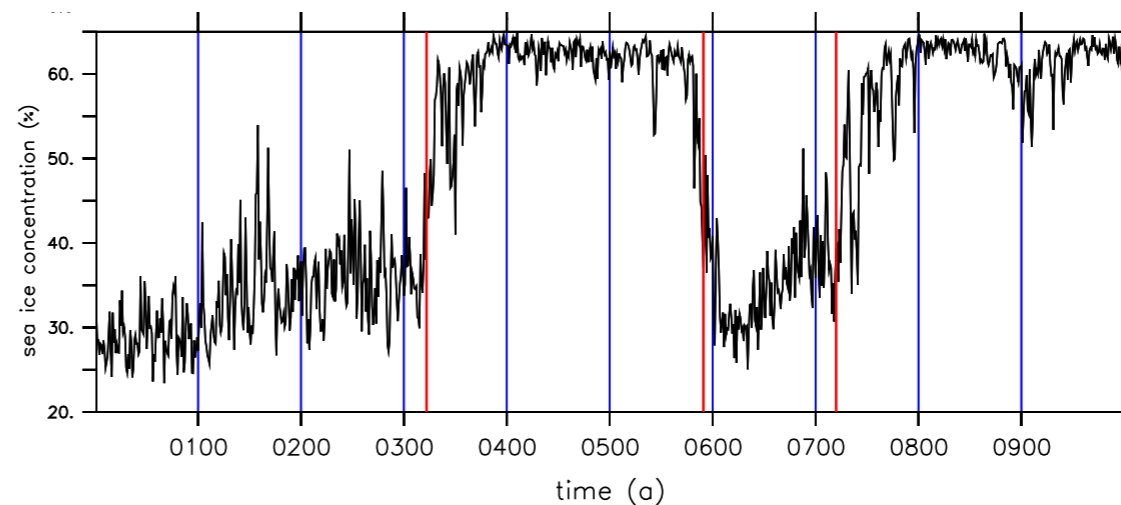
# Spontaneous transitions in climate models

**Abrupt events reported in pre-industrial control runs:**



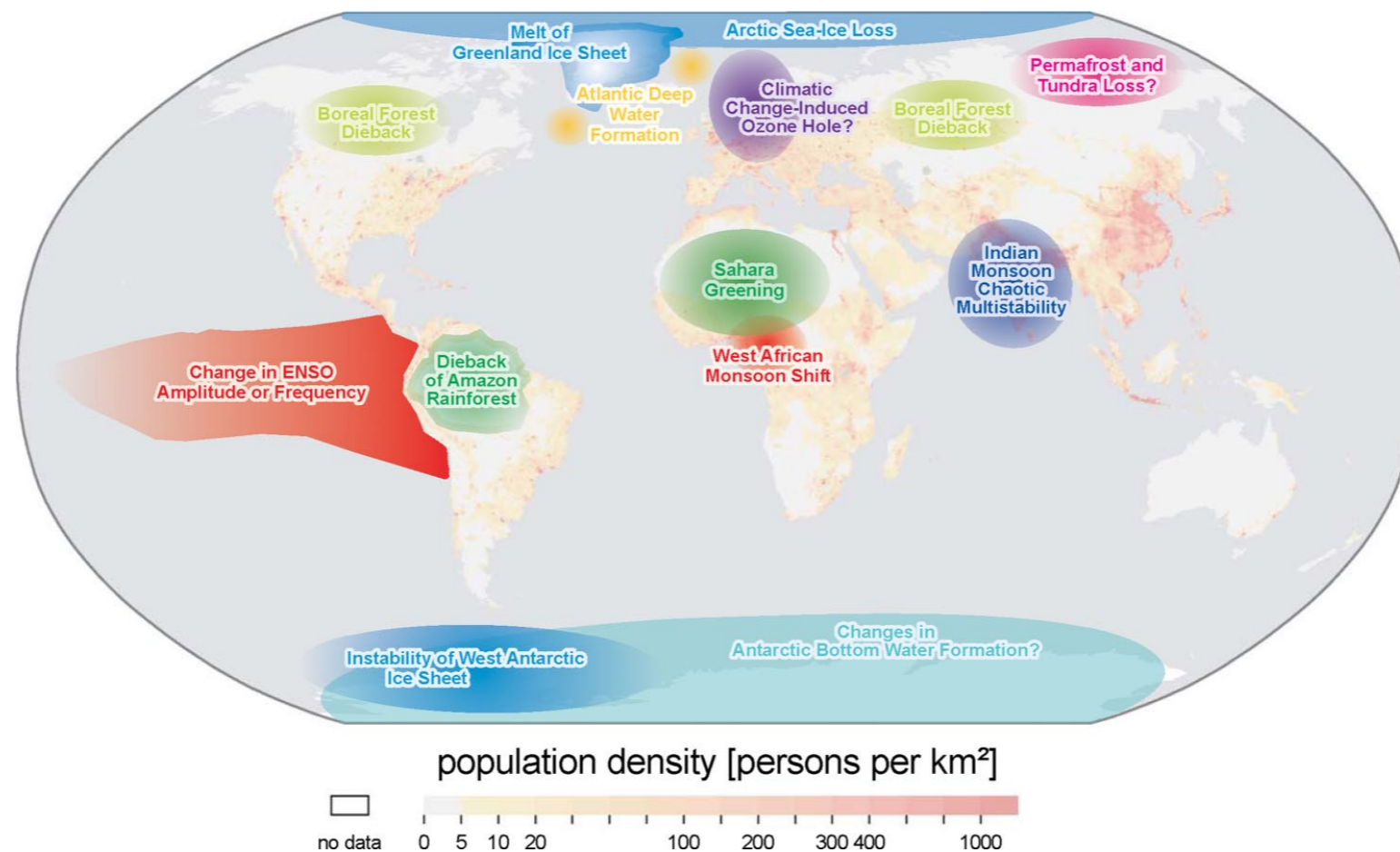
SAT anomaly  
y 450-550

Drijfhout et al. (2013), EC-Earth



Kleppin et al. (2015), CESM

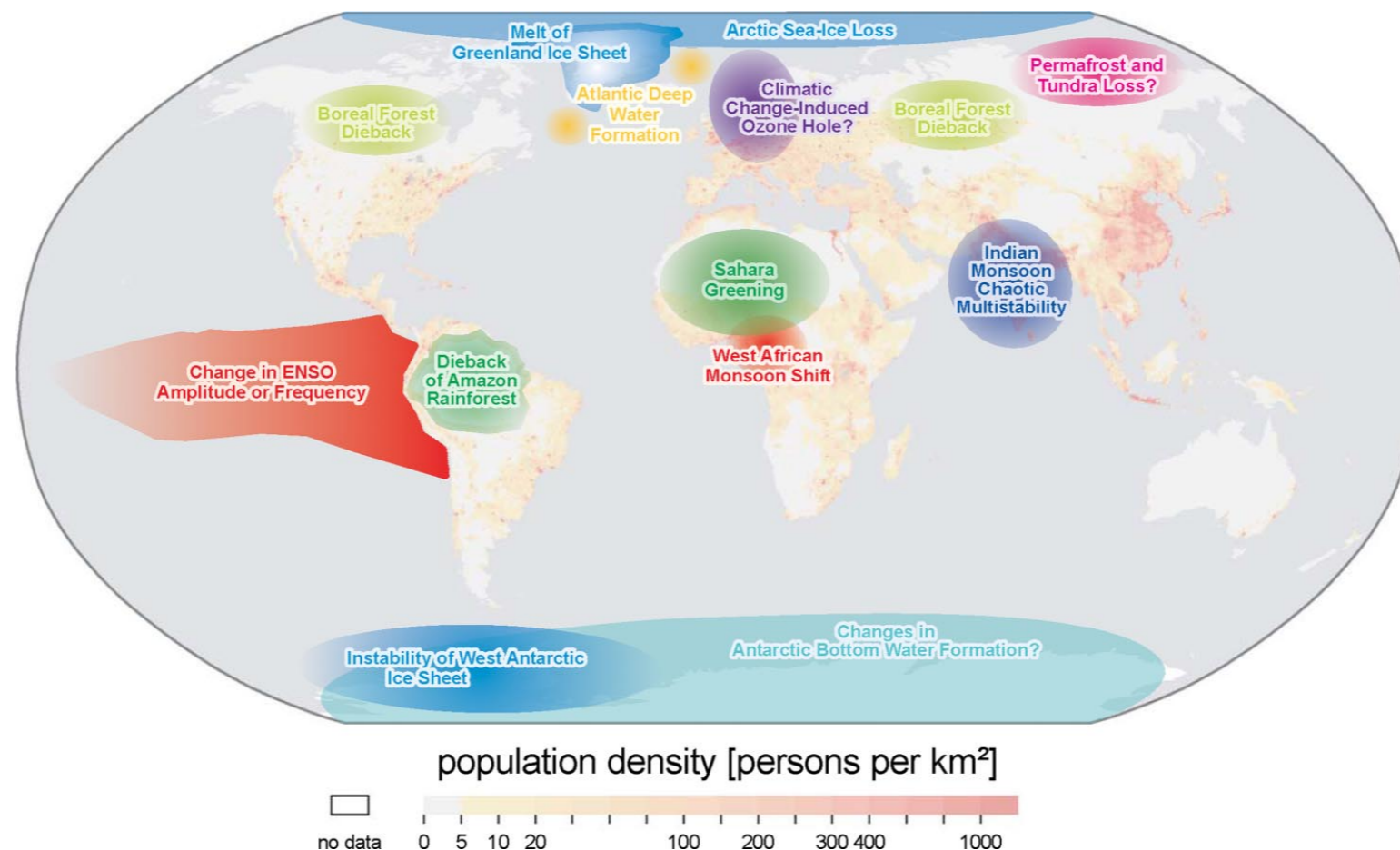
# Potential climate tipping points



Lenton et al. (2008)

- **Some of these tipping points are found in climate models (known knowns)**
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# Potential climate tipping points



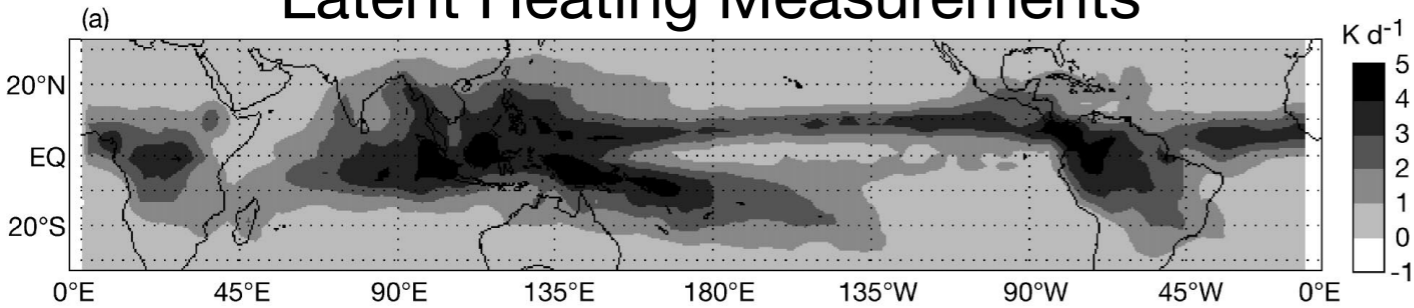
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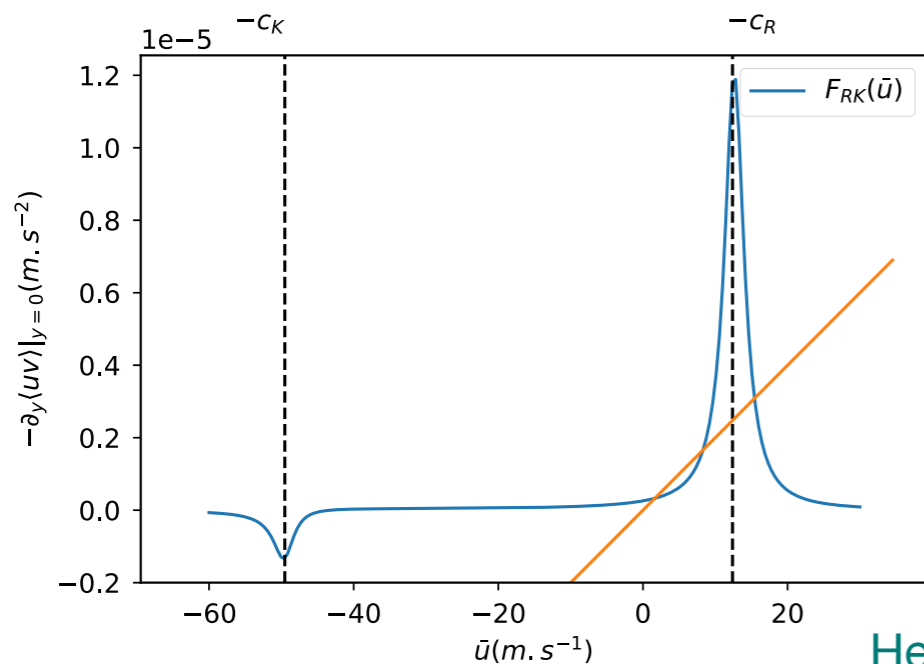
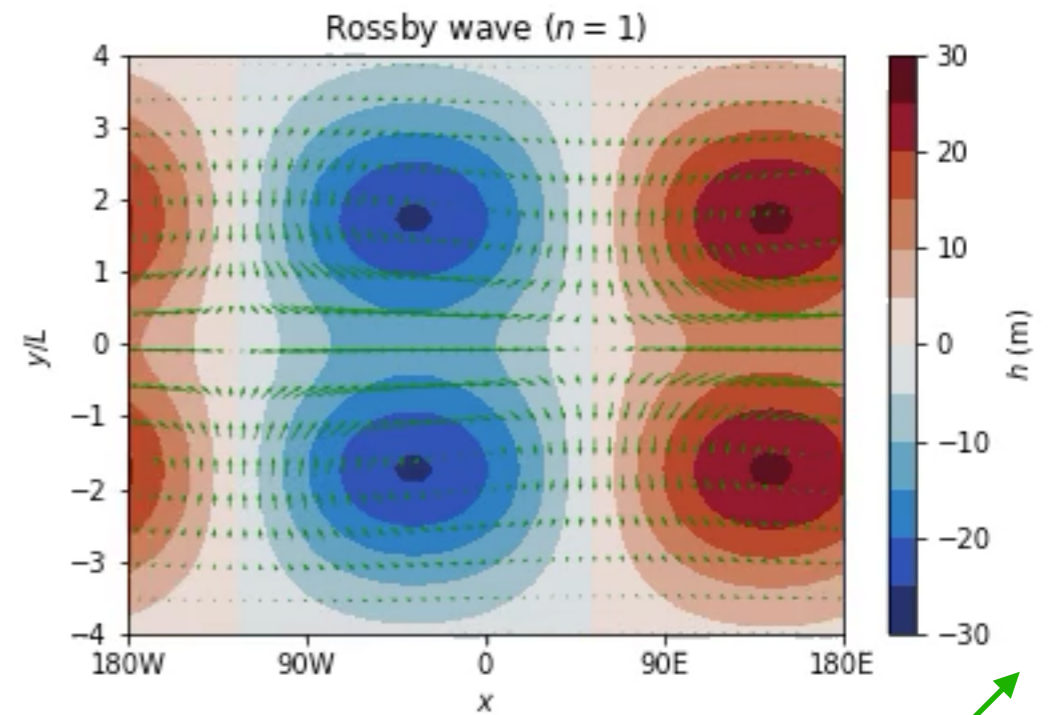
# Tipping points in the large-scale atmospheric circulation?

Latent Heating Measurements



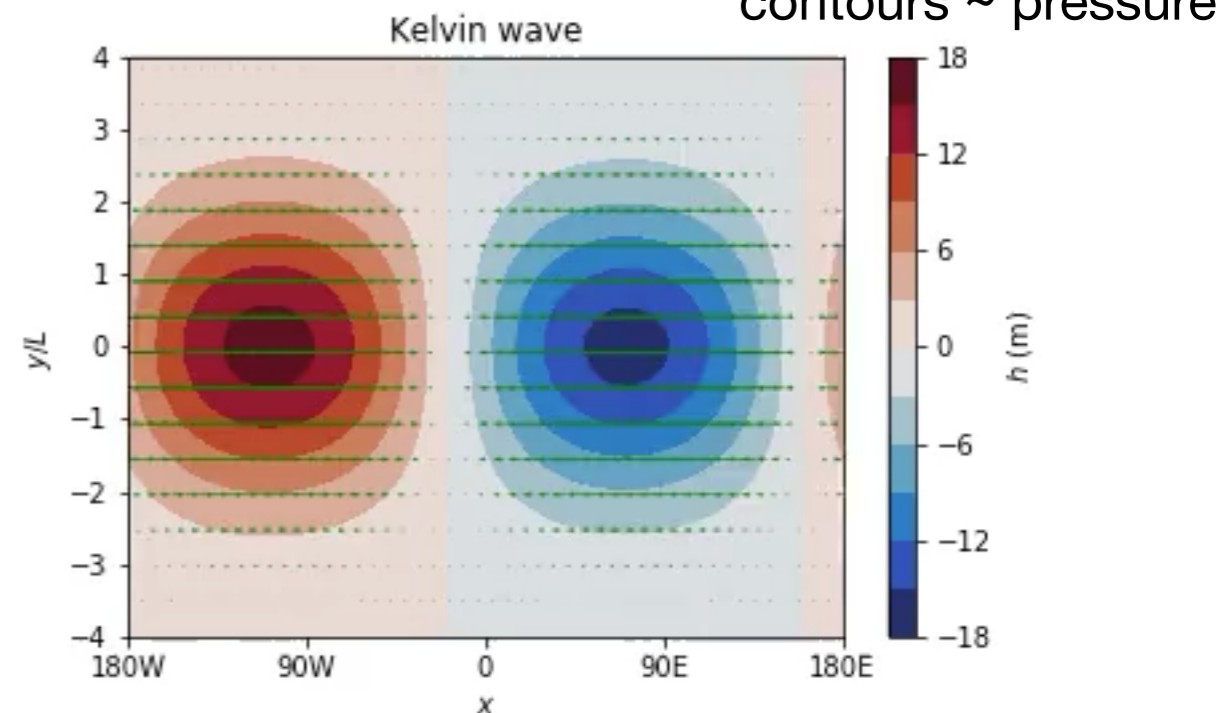
Schumacher et al (2004)

**Tropical convection generates waves which interact with the underlying mean-flow**



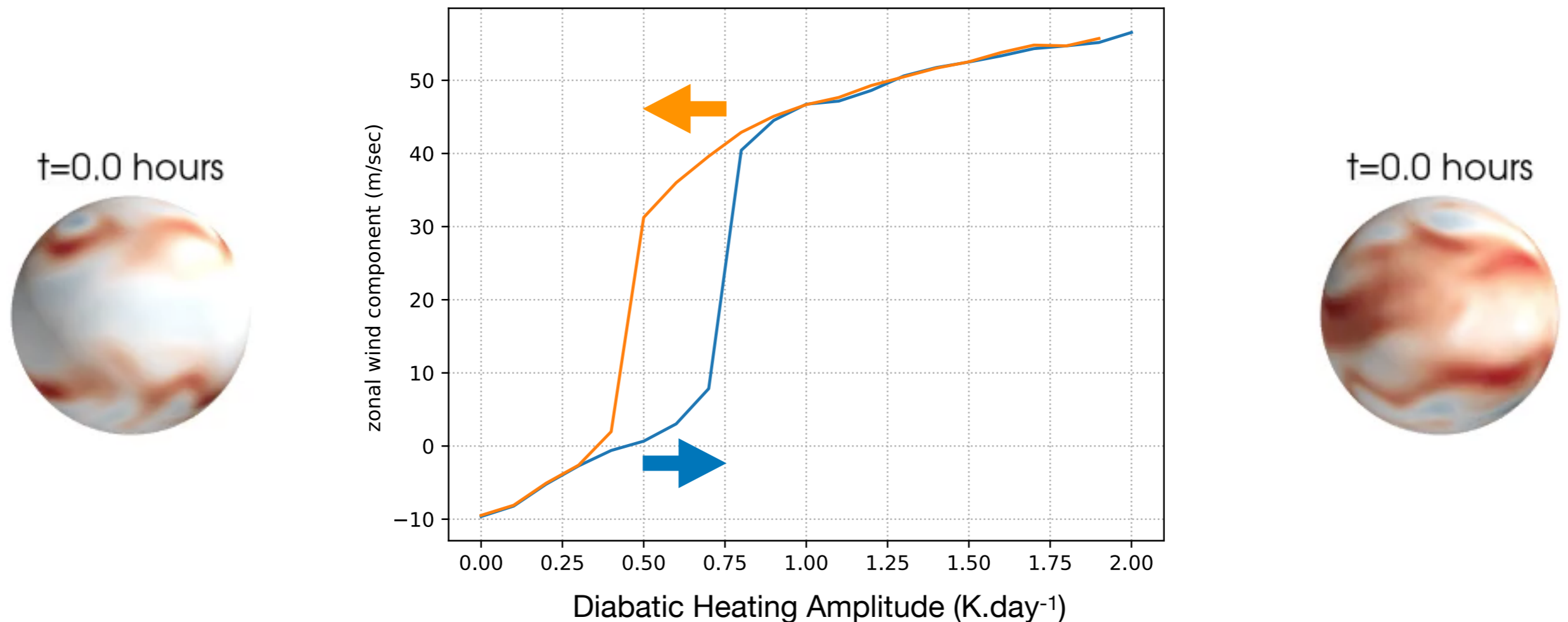
Herbert et al (2020)

**Simple model for bistability**



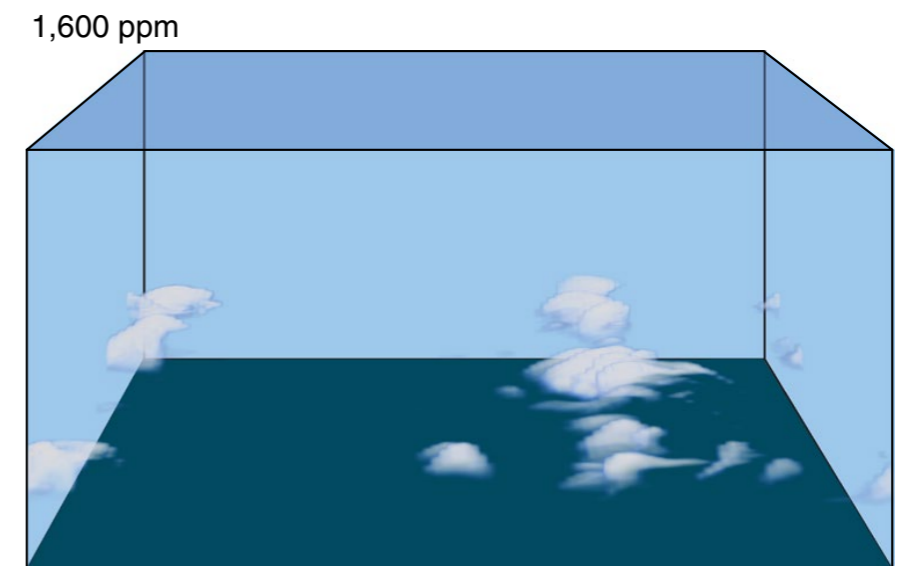
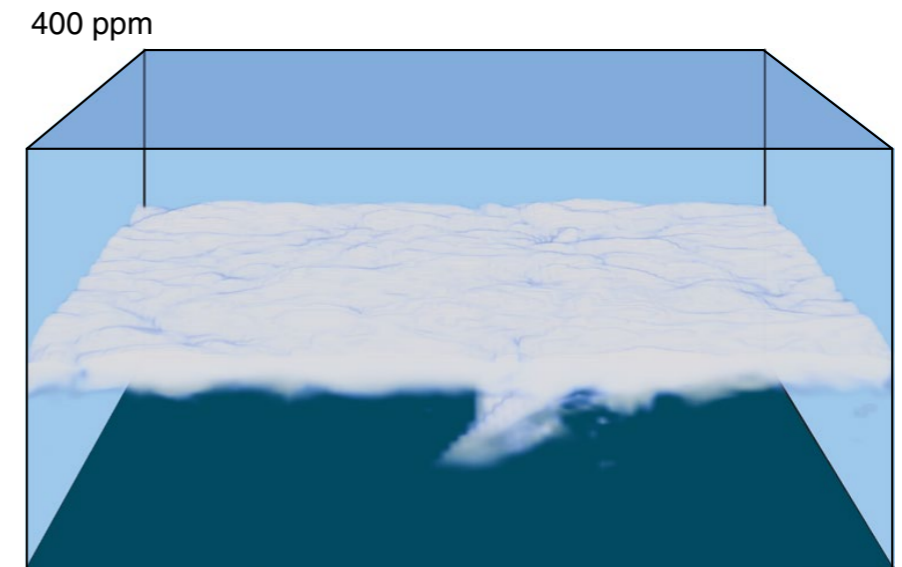
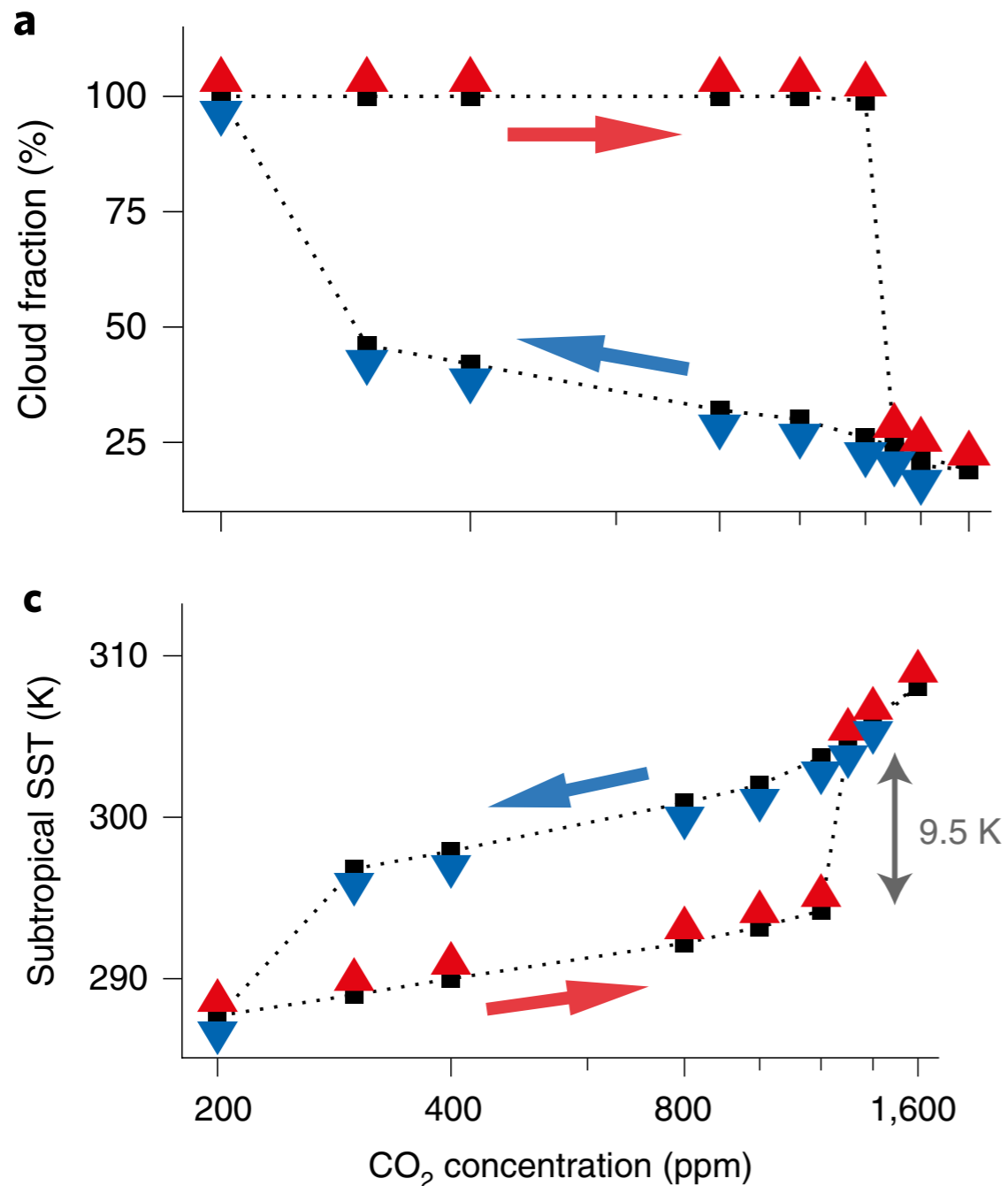
# Tipping points in the large-scale atmospheric circulation?

Transition driven by diabatic heating in the tropics



**3D dry primitive equations exhibits hysteresis between conventional circulation and superrotating state in some parameter regimes (weak baroclinicity or weak boundary layer friction)**

# Clouds and turbulence



**Abrupt breakup of stratocumulus decks in coupled cloud LES/  
tropical atmosphere column model**

# Outline

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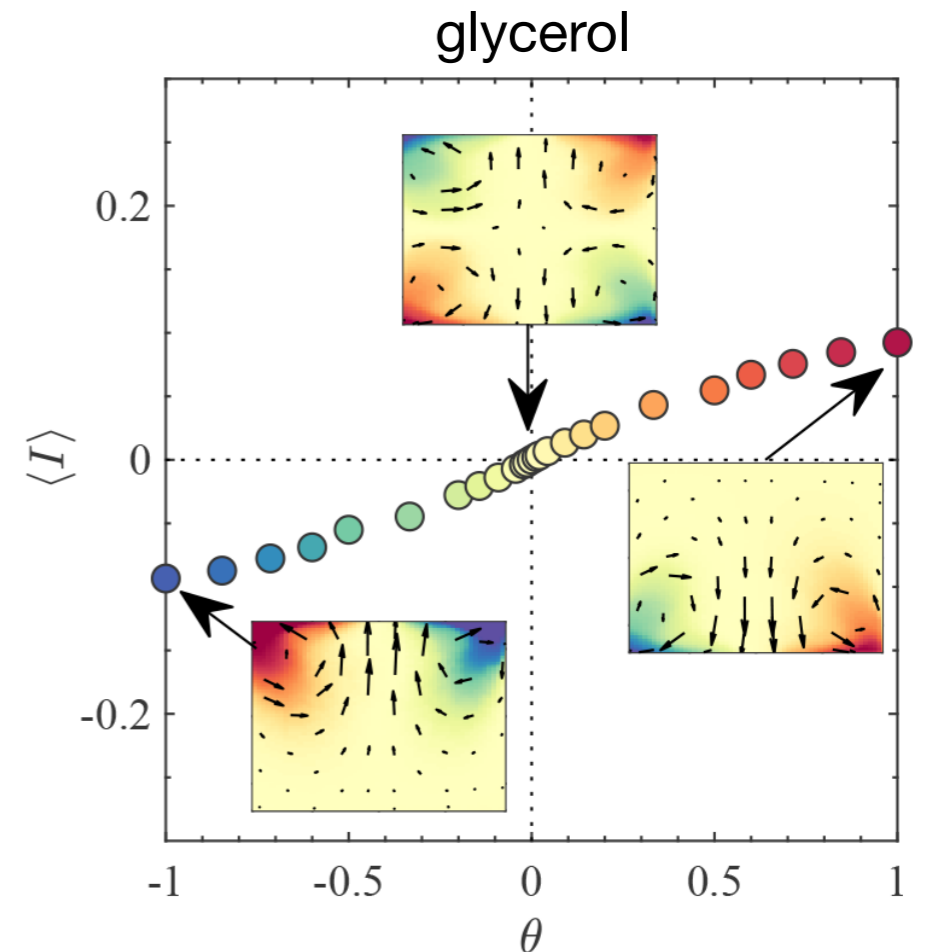
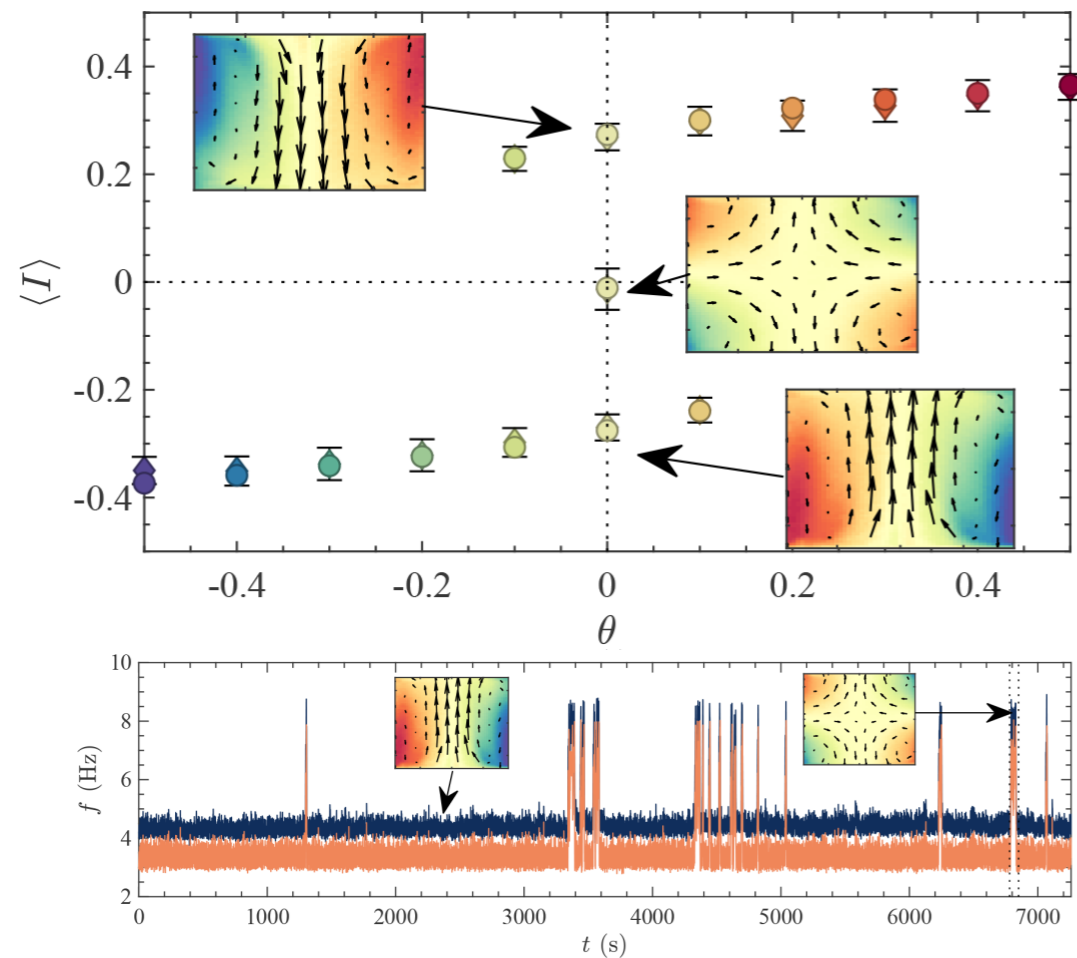
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**1. Transitions in turbulent flows**

2. New theoretical tools

III. Conclusions

# Von Karman Flow

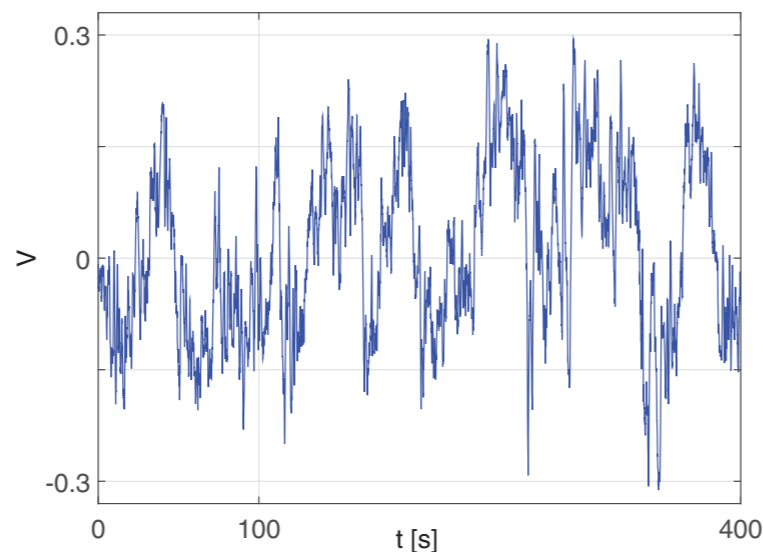
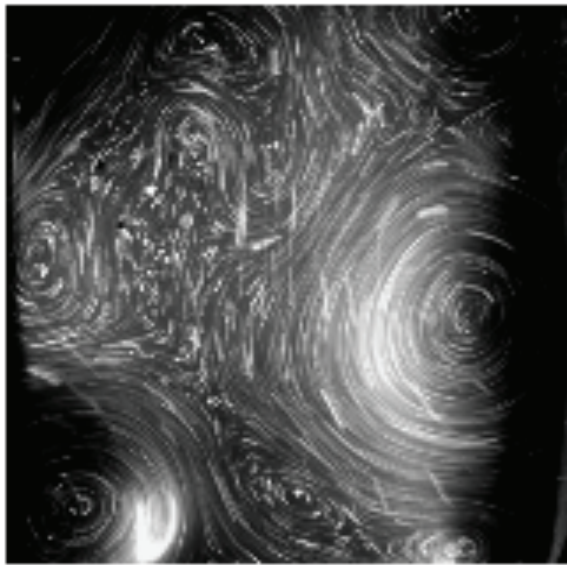


- **Hysteresis and spontaneous transitions observed in turbulent flow**
- **The nature of the transition depends on the viscosity**
- **Fluctuations at very-small scales (sub-Kolmogorov) might matter for those transitions**

Ravelet (2005)  
Torre & Burgete (2007)  
Berhanu et al. (2007)  
Saint-Michel et al. (2013)  
Dubrulle et al. (2022)

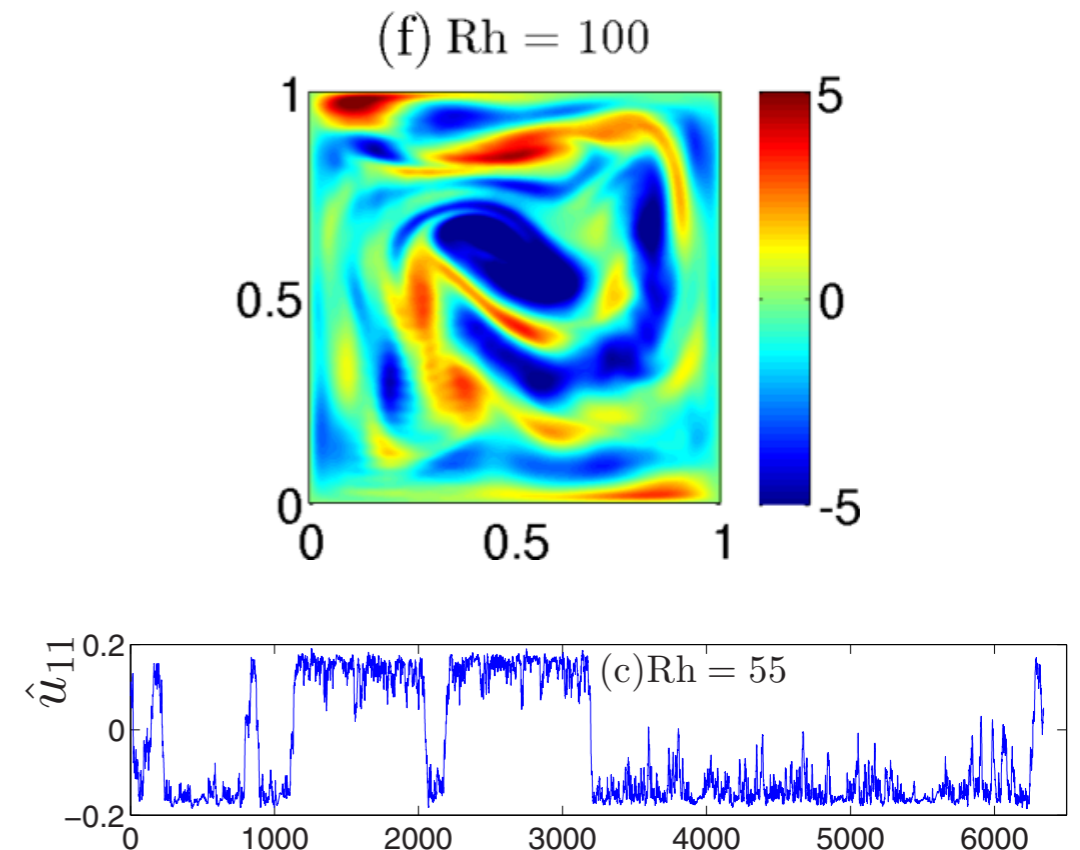
# Quasi-bidimensional flow

## Experiment



Michel et al. (2016)

## Numerical Simulations



Mishra et al. (2015)

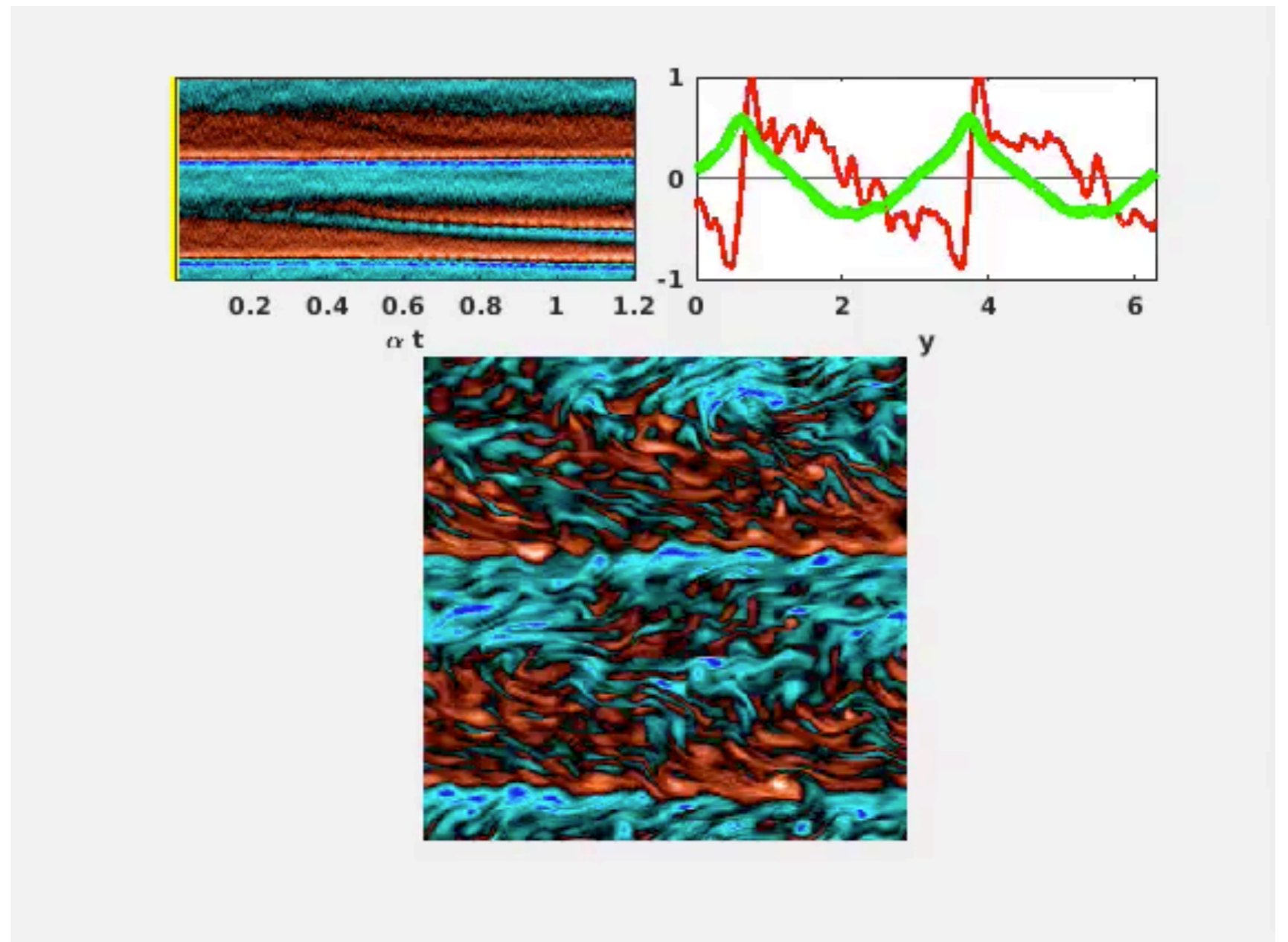
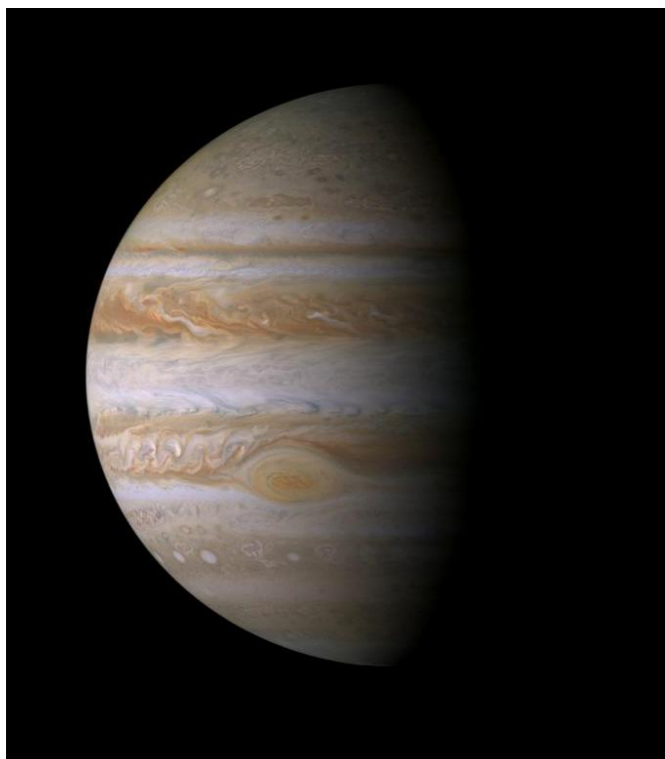
- Random reversals of large-scale flow in electromagnetically forced thin fluid layer
- Bifurcation structure studied in details
- Both large-scale friction and molecular viscosity matter

See also Herault et al. (2015), Shukla et al. (2016), Pereira et al. (2019), Dallas et al. (2020)

# Barotropic Jets

Model for Jupiter jets

$$\partial_t \omega + \mathbf{u} \nabla \omega + \beta v = \nu \Delta \omega - \alpha \omega$$



**Rare jet nucleation and merging**

Bouchet et al. (2019)  
Simonnet et al. (2021)

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I. Tipping points in current models: state-of-the-art and limitations

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# Towards a quantitative study of transitions

Many new theoretical and numerical tools have been developed over the past years and used to study precise properties of transitions in complex systems.

## Conceptual issues

What are the relevant statistical quantities?

Which properties of abrupt transitions are generic and predictable?

*Large deviation theory, Transition path theory...*

## Practical issues

How to sample events of interest, which are rare, with costly numerical models?

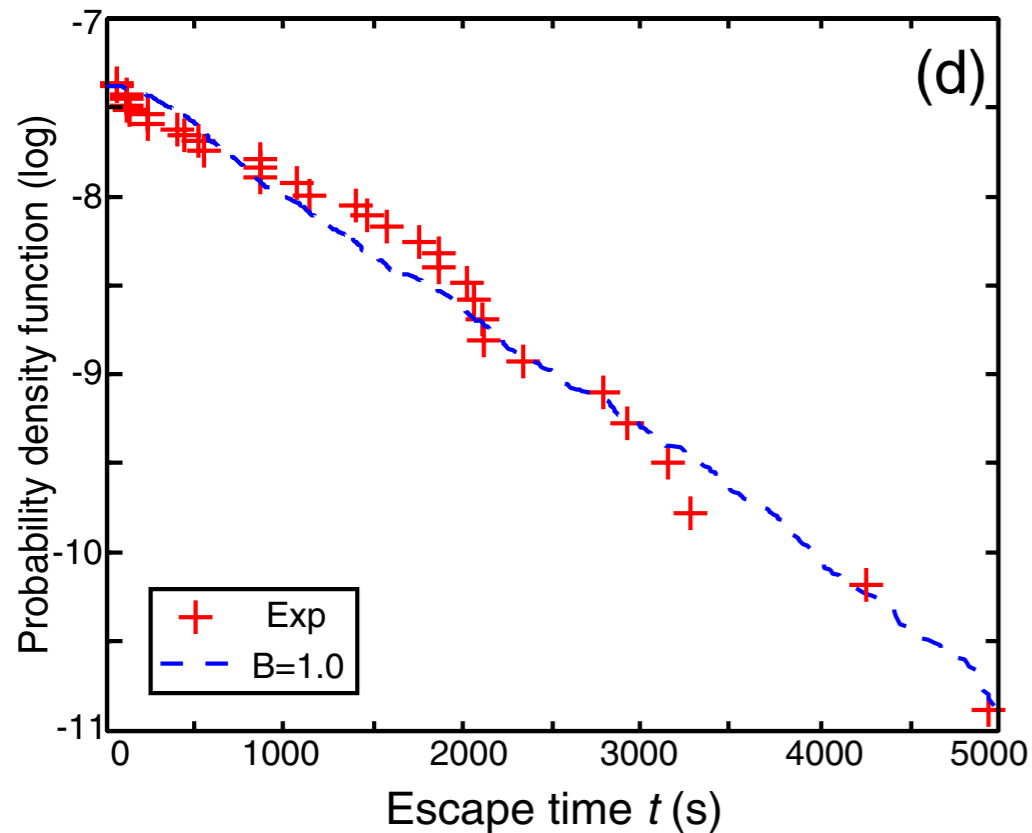
How to make an optimal use of the available data?

*Rare event algorithms, data-based methods (including machine learning)...*

# Transition time statistics

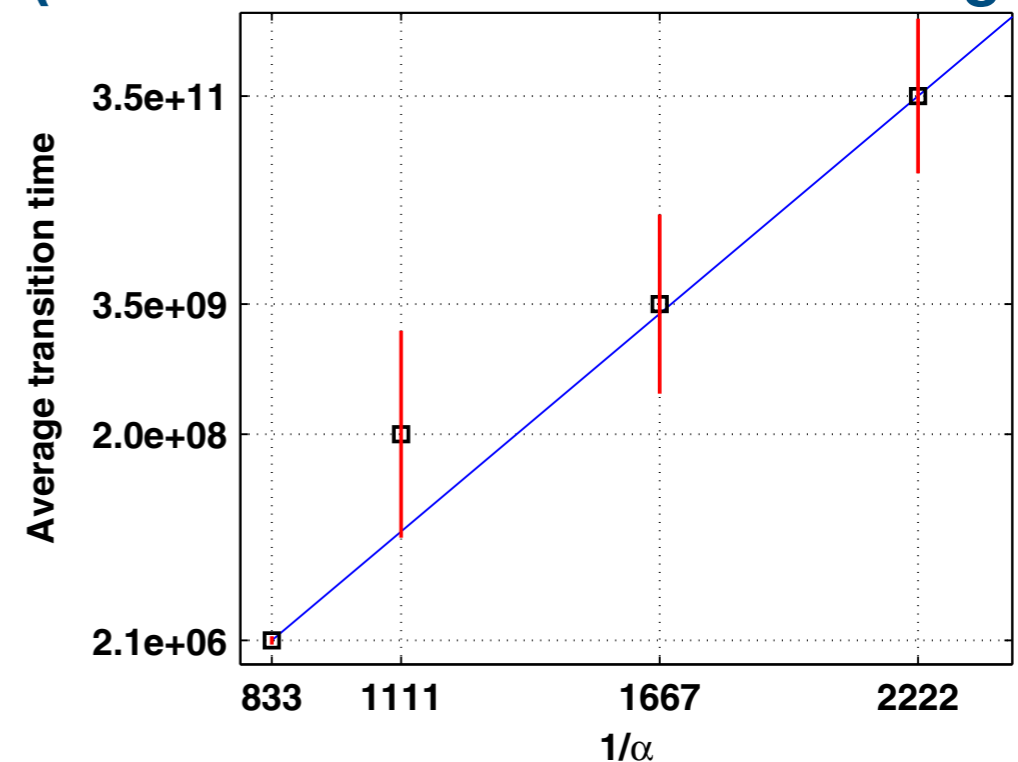
Goal: estimate the probability/return time of transitions

## Von Karman Flow (experiment)



Torre & Burgete (2007)

## Barotropic Jets (simulation with a rare event algorithm)



Bouchet et al. (2019)

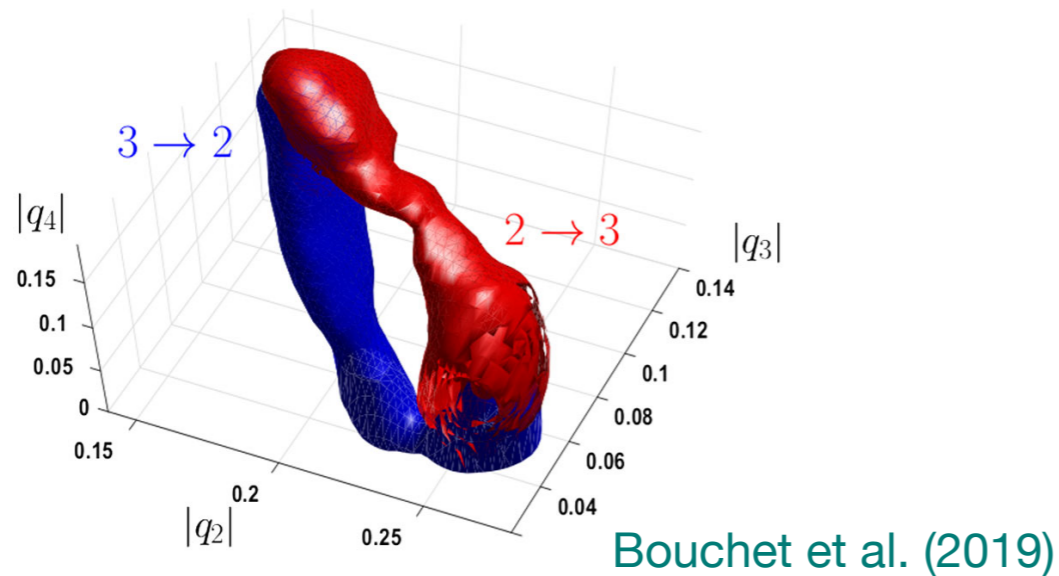
Phenomenology similar to classical results (Kramers, Eyring...)

- Transitions form a Poisson point process
- Arrhenius law:  $\mathbb{E}[\tau] \propto e^{\Delta V/\varepsilon}$

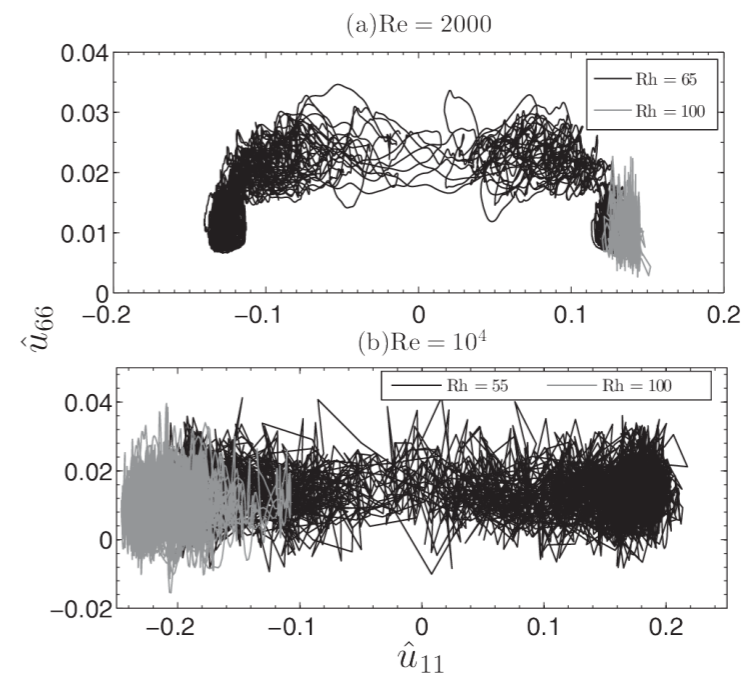
# Instanton-like behavior

Goal: characterize the dynamics of the transition

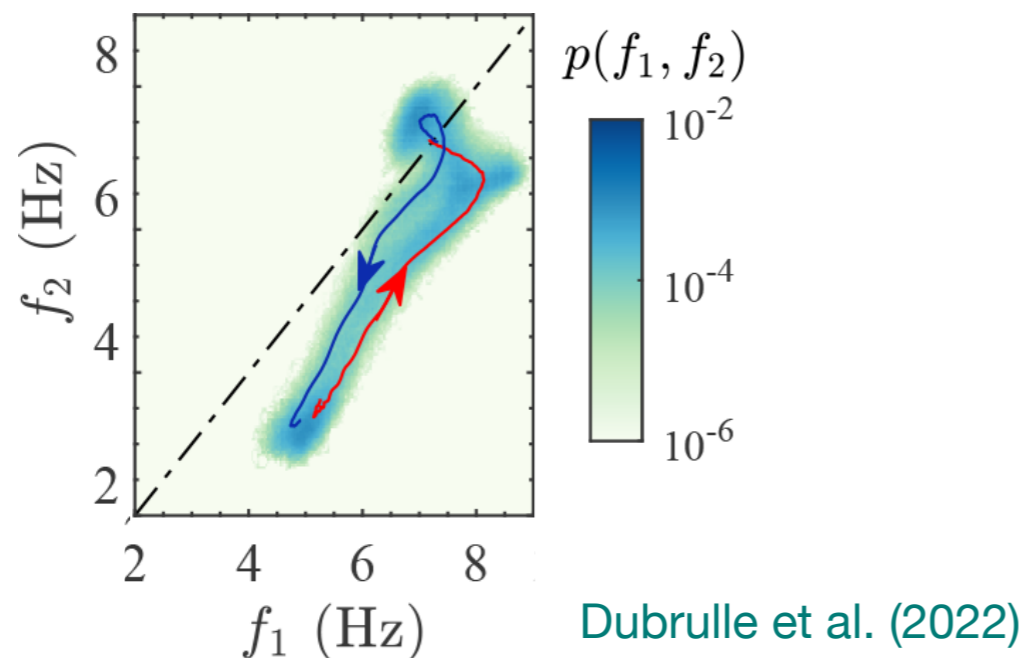
## Barotropic Jets



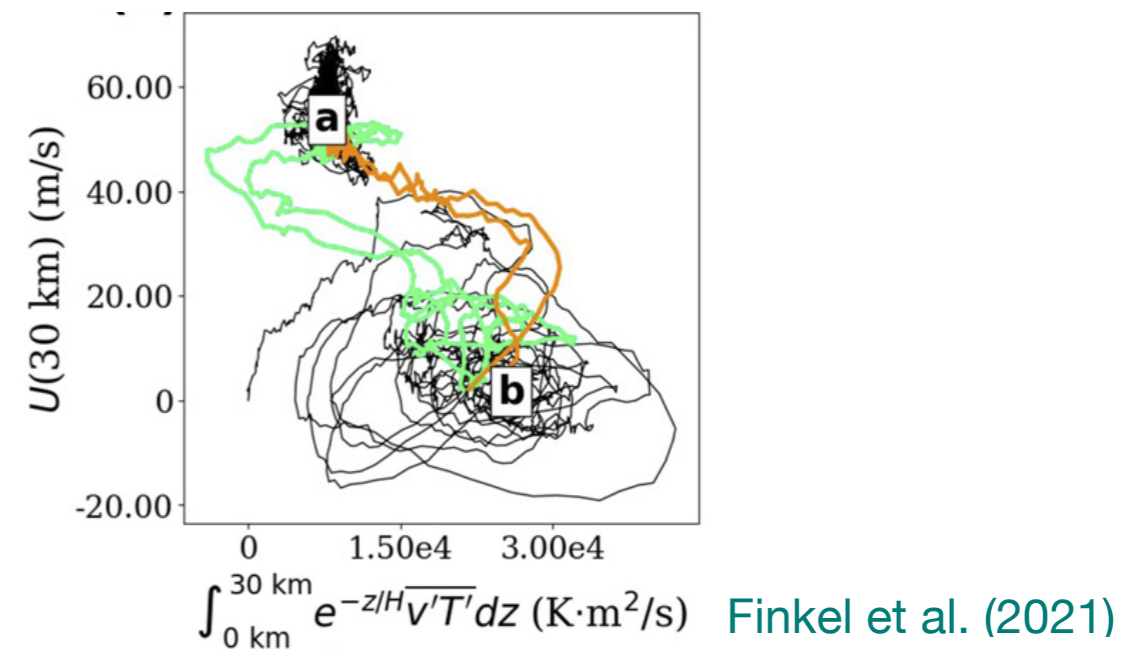
## 2D vortex condensate



## Von Karman Flow

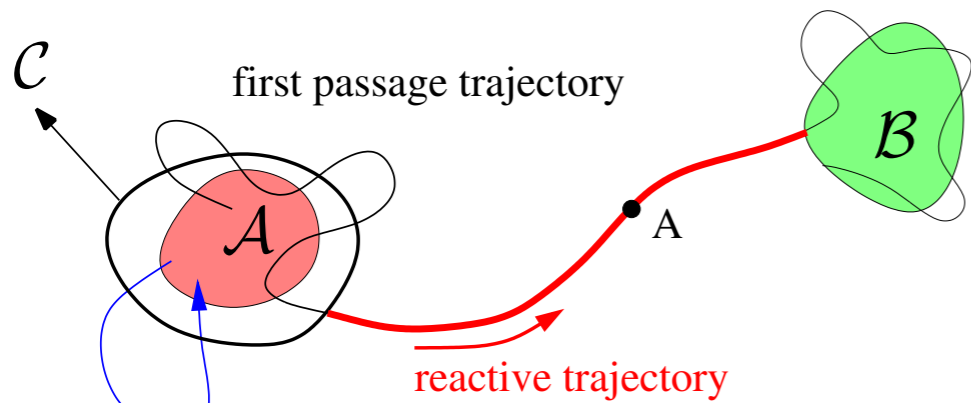


## Sudden Stratospheric Warmings



# Committer Functions

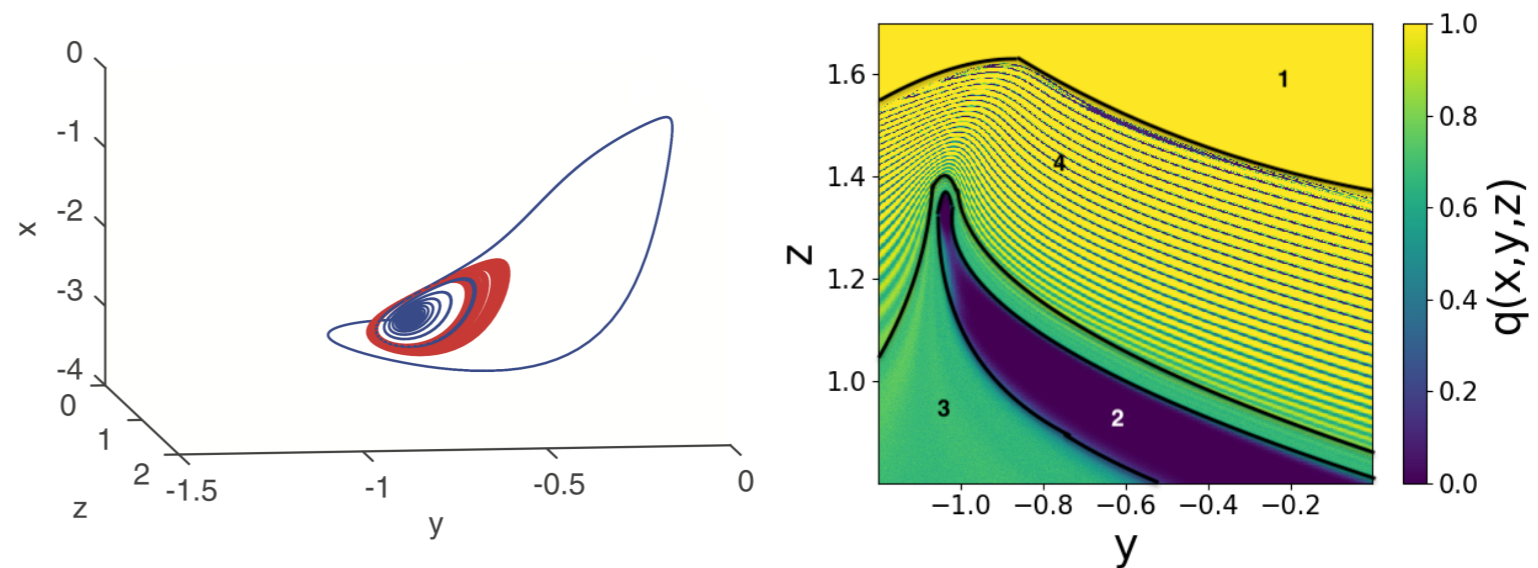
## Definition



$$q(x) = \mathbb{P}[\tau_{\mathcal{B}} < \tau_{\mathcal{A}} | X_0 = x]$$

$$\tau_{\mathcal{C}} = \inf\{t > 0 | X_t \in \mathcal{C}\}$$

## Example: committor function for toy model of El Niño



Lucente et al. (2022)

**Several groups are currently developing tools to compute committor functions in complex systems such as climate models.** [Lucente et al. \(2019\)](#), [Thiede et al. \(2019\)](#), [Khoo et al. \(2019\)](#), [Finkel et al. \(2021\)](#), [Jacques-Dumas et al. \(2022\)](#), [Lucente et al. \(2022\)](#)

## Applications:

- early-warning signal, prediction problems
- Improving efficiency of rare-event algorithms for complex systems

# Conclusions

**Tipping points are one of the fundamental aspects of the climate system, important for past and future climates, which are still lacking proper understanding**

## **Modelling challenges**

- **Some tipping points are seen in climate models but are still marred by large uncertainties**
- **There are probably many other tipping points which are not currently represented in models**
- **Tipping points are still studied mostly independently from one another**

## **Prospects for a quantitative study of tipping points**

- **Improved representation of dissipative processes, convection, clouds, etc in models**
- **Insight from controlled turbulence experiments**
- **Leveraging new theoretical and numerical tools**