

# Carbon Cycle results in CMIP6: implications for carbon budgets and next steps

Chris Jones

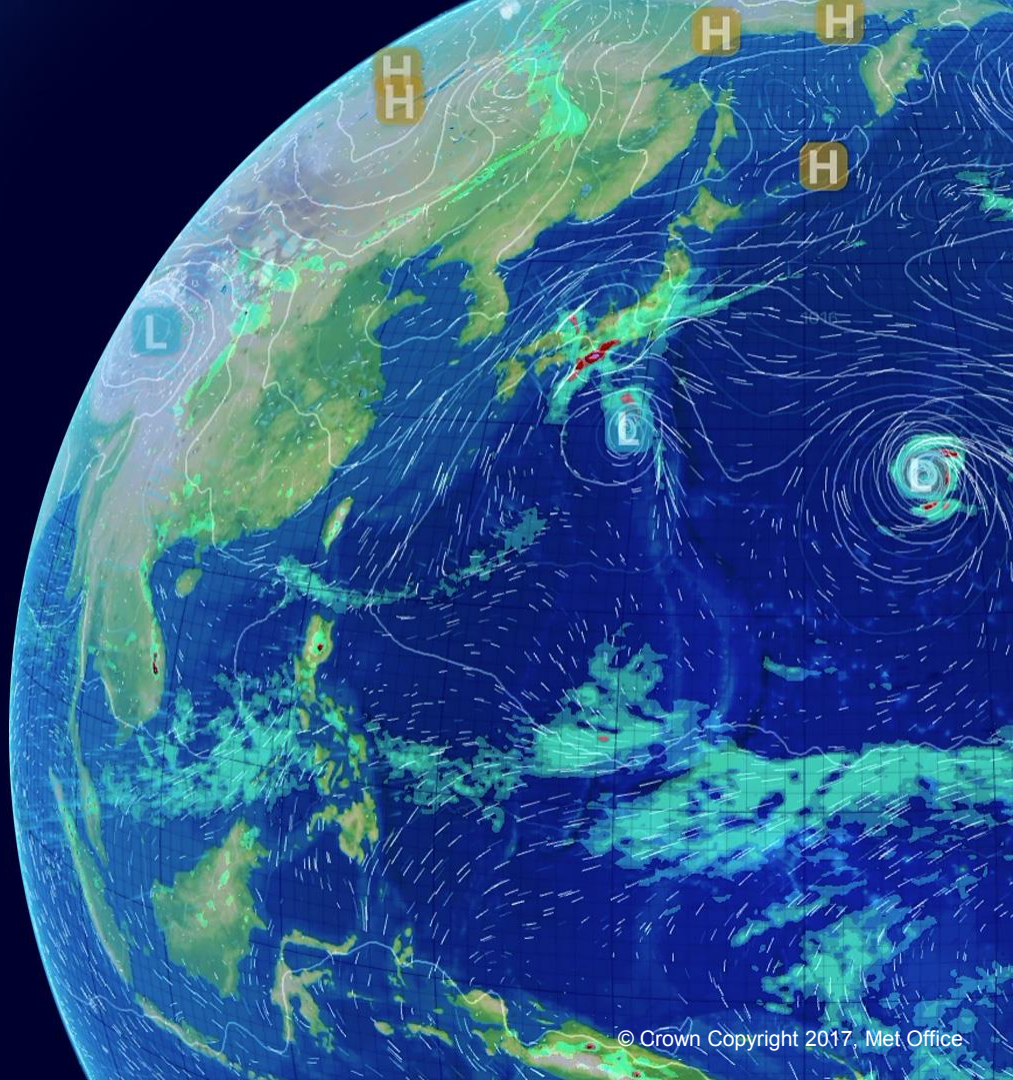
Met Office Hadley Centre



[www.c4mip.net](http://www.c4mip.net)

[www.metoffice.gov.uk](http://www.metoffice.gov.uk)

31 Mar. 2020



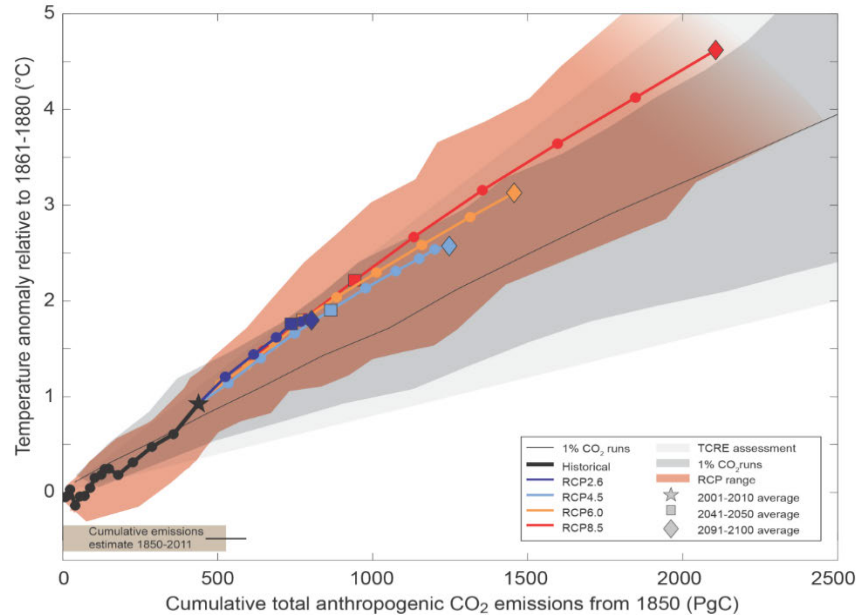
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# Contents

- Carbon cycle background
  - Timeline of carbon cycle intercomparison
  - Framework for carbon budgets
  - Concept of feedback terms and uncertainty
- CMIP6 results
  - C4MIP and ZECMIP
  - Uncertainty – sources and potential for reduction?
- Concluding thoughts
  - CMIP6 successes and failures?
  - Future focus areas

## Total CO<sub>2</sub> emissions are strongly linked to total warming

- A key message from last IPCC report (AR5: 2013/14)
- Long-term warming is linearly related to total emissions of CO<sub>2</sub>.
- For a given warming target, higher emissions now imply lower emissions later.



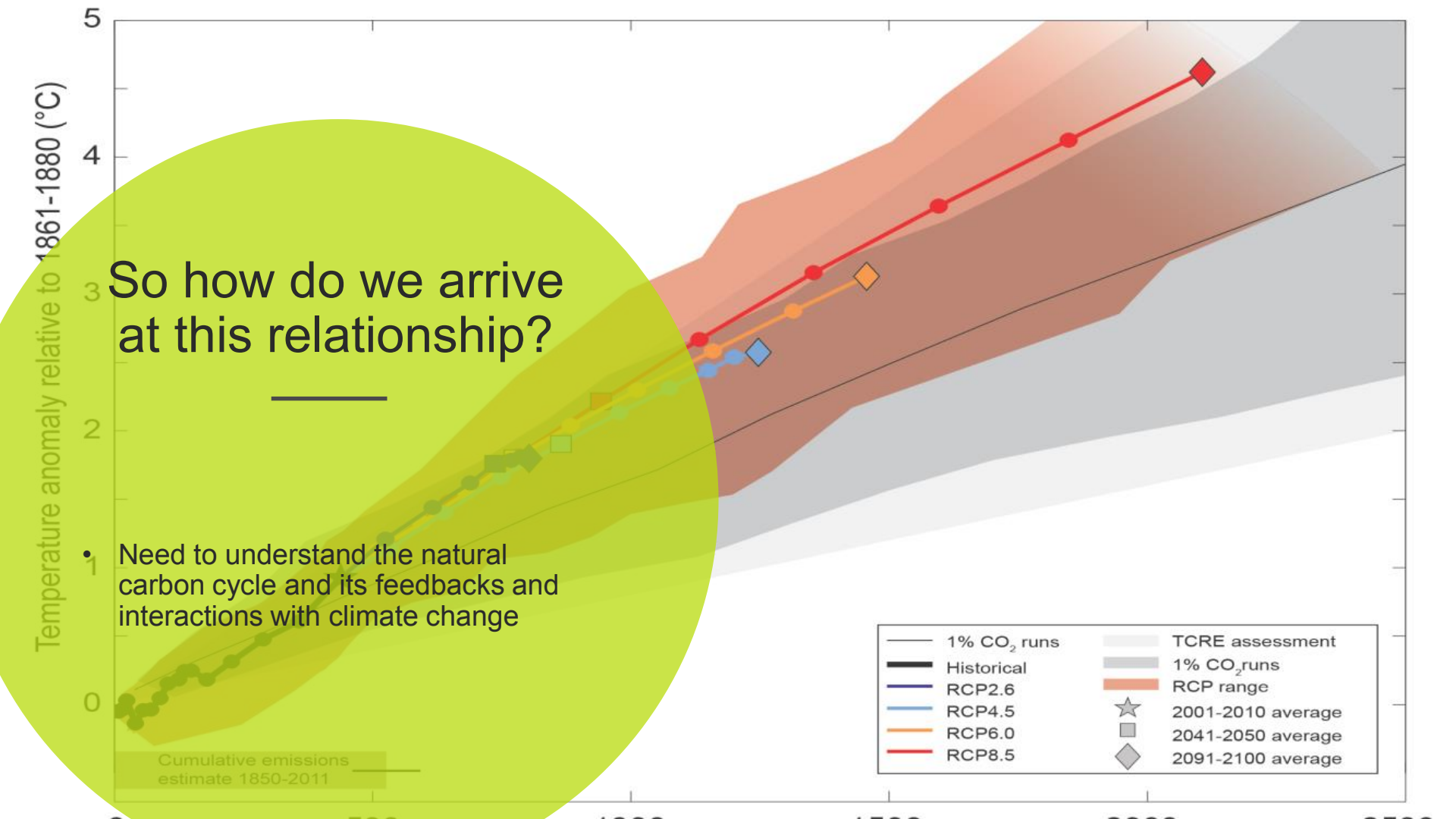
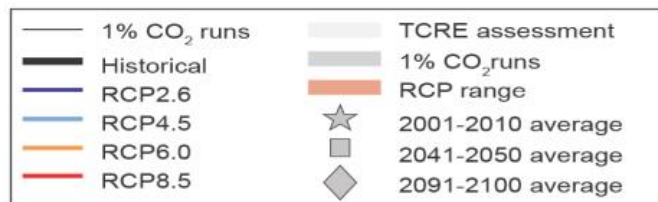
- Allows us to quantify exactly what we must do to meet targets
- Carbon “budget” we can spend
- Quantifying this drew together **ALL** of climate science into a single straight line!

Temperature anomaly relative to 1861-1880 (°C)

So how do we arrive at this relationship?

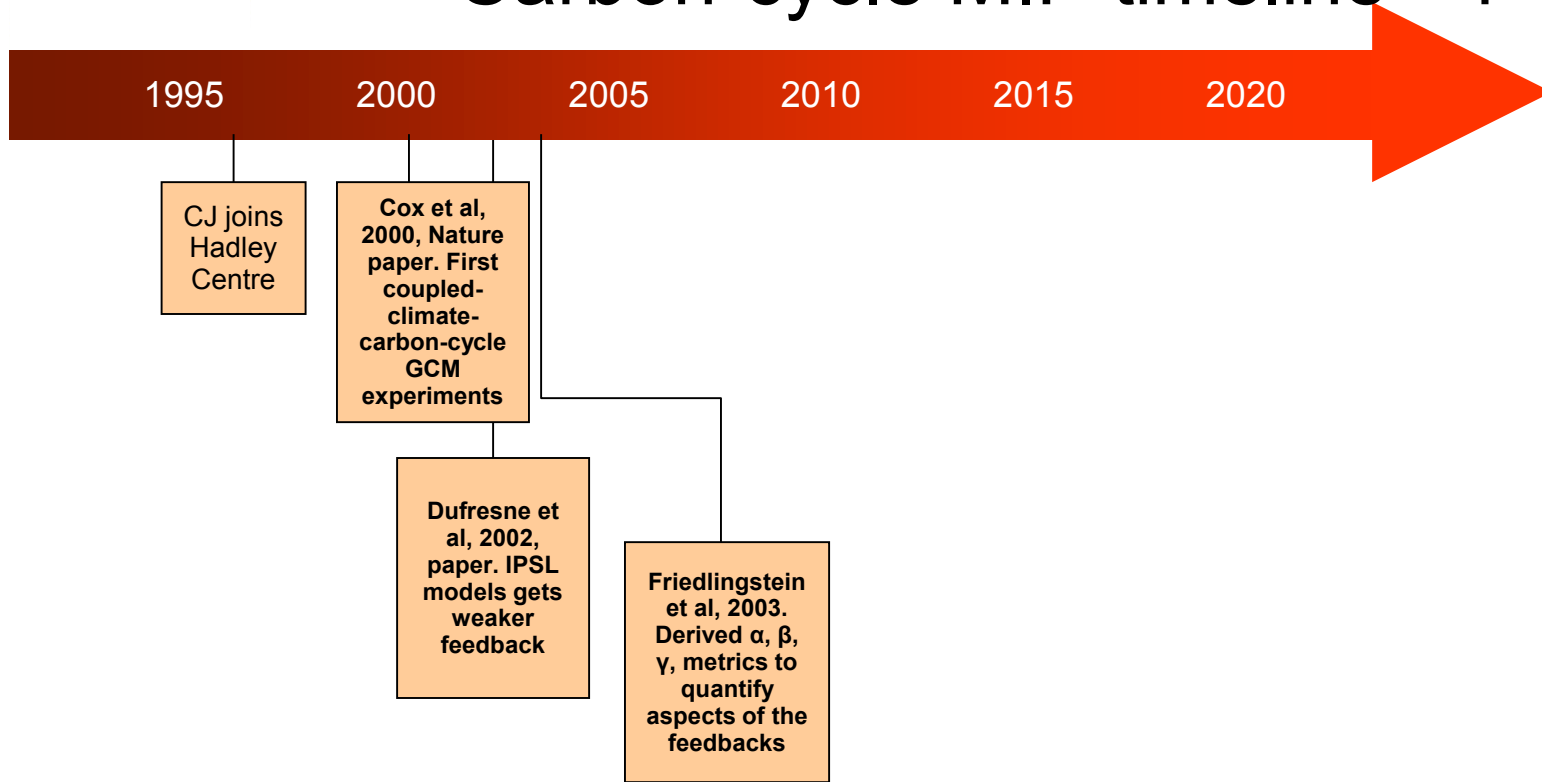
- Need to understand the natural carbon cycle and its feedbacks and interactions with climate change

Cumulative emissions estimate 1850-2011

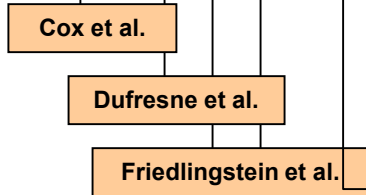


# C4MIP history

# Carbon-cycle MIP timeline - 1



# Carbon-cycle MIP timeline - 1



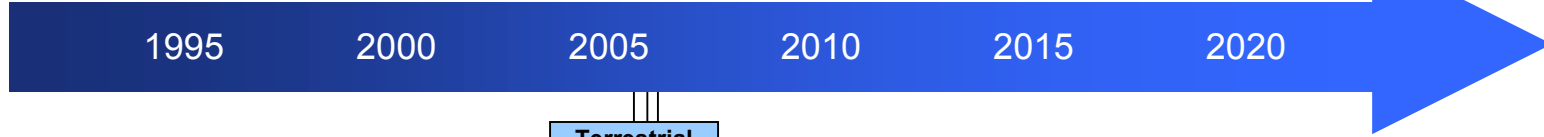
A box containing the cover of the C4MIP project report. The cover features a green and blue circular graphic. Text on the cover includes: "A joint project between IGBP-GAIM and WCRP-WGCM", "Contact People Meetings Discussion Forum", "Pierre Friedlingstein (France)", "Peter Cox (UK)", "Rayner (Australie)", "King (USA)", "Assessment of Model Components", "Experimental Protocol", "Diagnostics", "Coupled Carbon Cycle Climate Model Intercomparison Project", "(The Flying Leap Experiment)", and "Protocol Discussion - Berkeley California - December 12 2000".

C4MIP project initiated

Friedlingstein et al, 2006.  
C4MIP paper.  
First coupled-climate-carbon-cycle MIP paper.

- Stage 1
  - Run lots of models, get lots of (very different) results

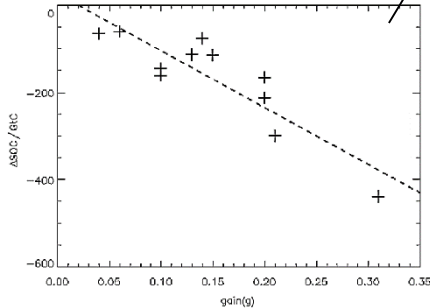
# Carbon-cycle MIP timeline - 2



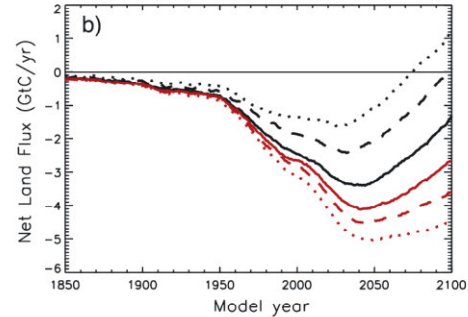
Terrestrial uncertainty

Soil carbon "q10"

Matthews et al., 2005, GRL.  
NPP control on climate-carbon feedback

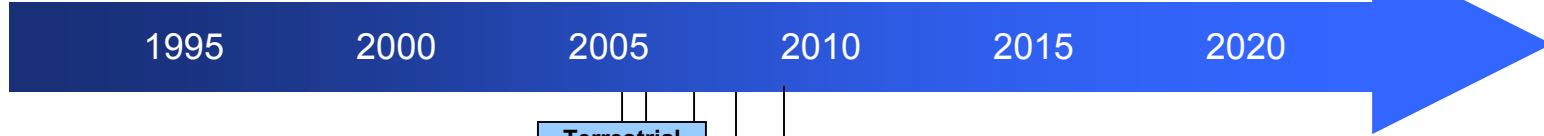


e.g. Jones and Falloon, 2009





# Carbon-cycle MIP timeline - 2



Terrestrial uncertainty

Soil carbon "q10"

Matthews et al.

"climate-carbon" feedback dominated thoughts

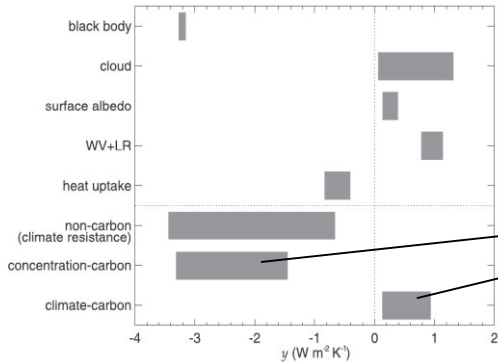
Gregory et al., 2009, J. Clim.

Split into 2 competing feedbacks

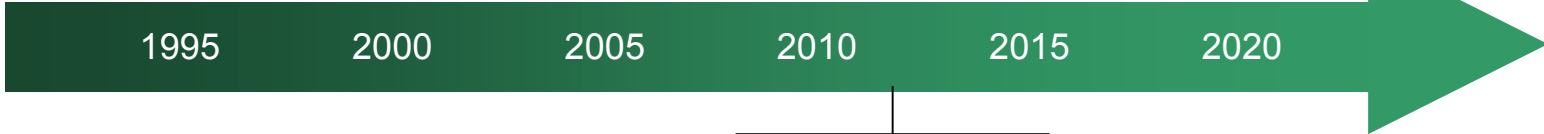
- Response to CO<sub>2</sub>
- Response to climate

Climate-carbon feedback (+ve) is comparable to cloud feedbacks

Concentration-carbon feedback is bigger (but -ve) and more uncertain

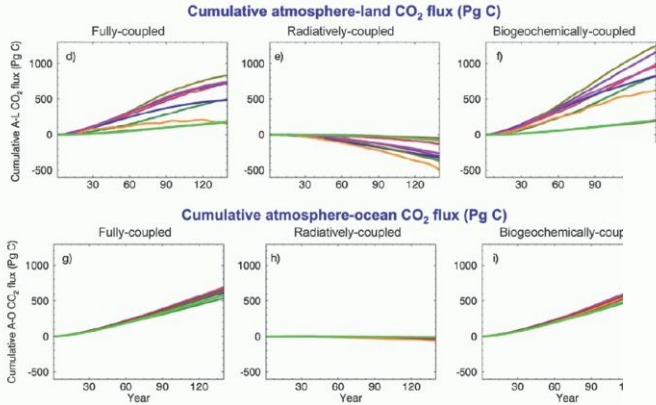


# Carbon-cycle MIP timeline - 3

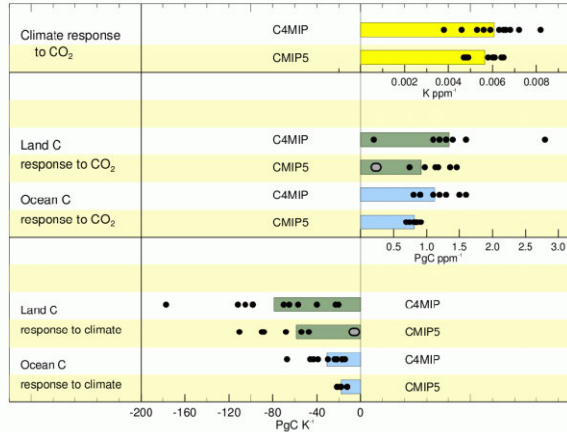


CMIP5 results

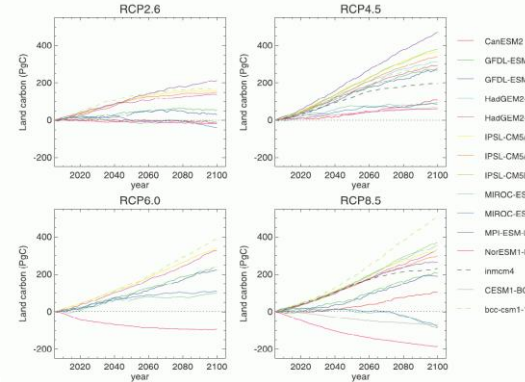
IPCC AR5, Ch.6



Arora et al., 2013

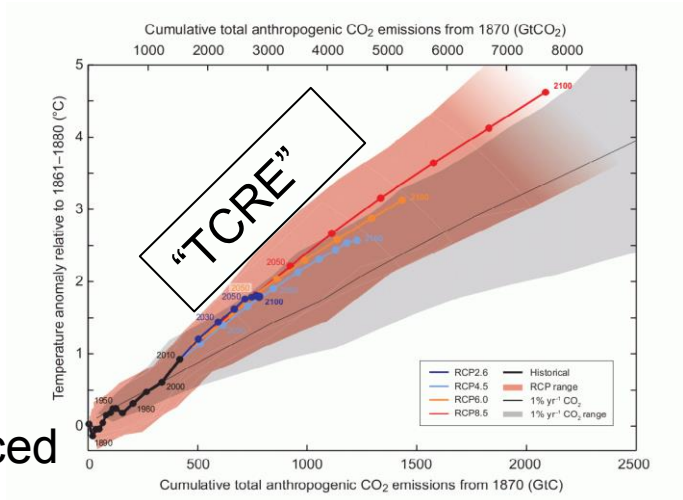
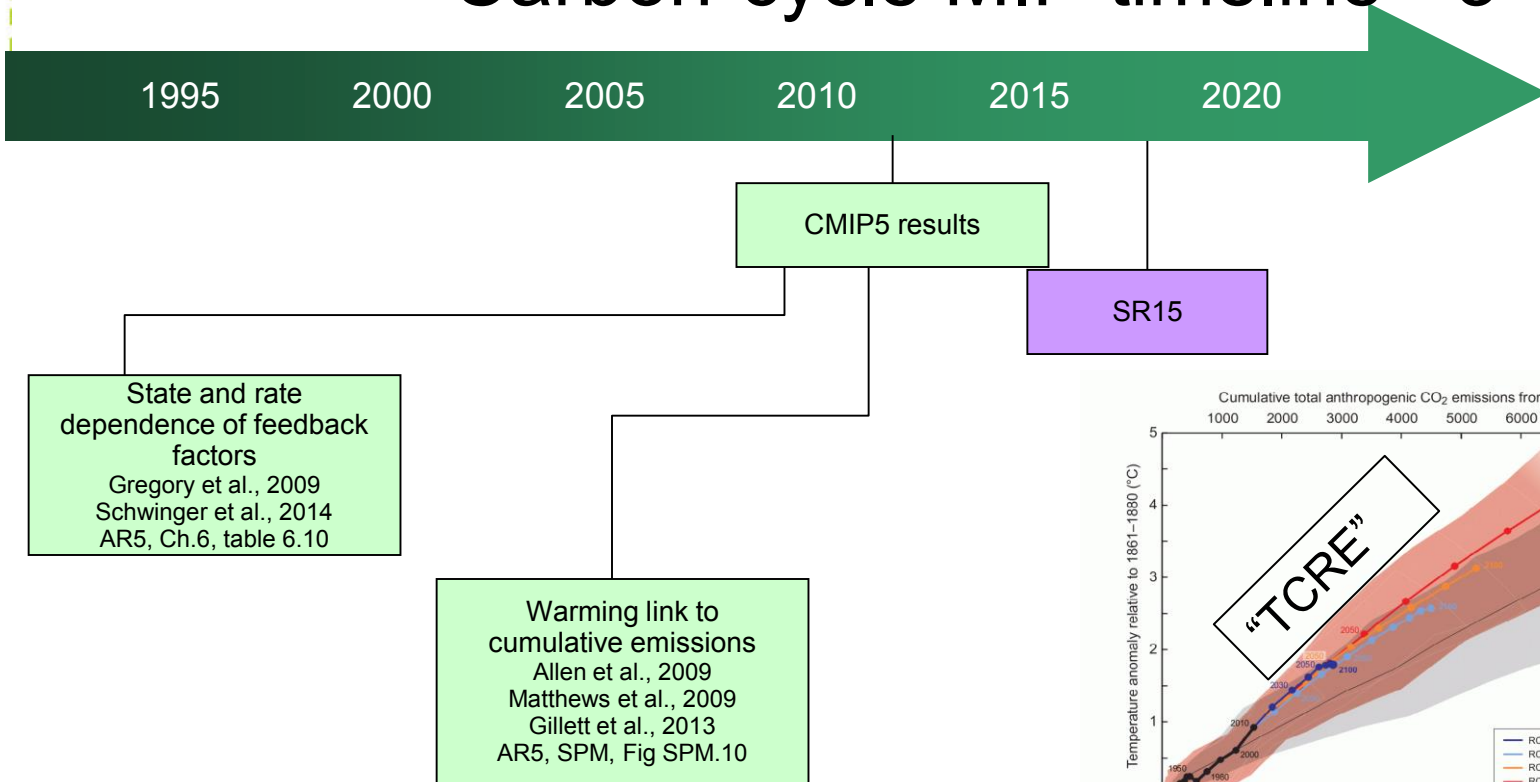


Jones et al., 2013



- Large uncertainty remained – CMIP5 spread no better than C4MIP

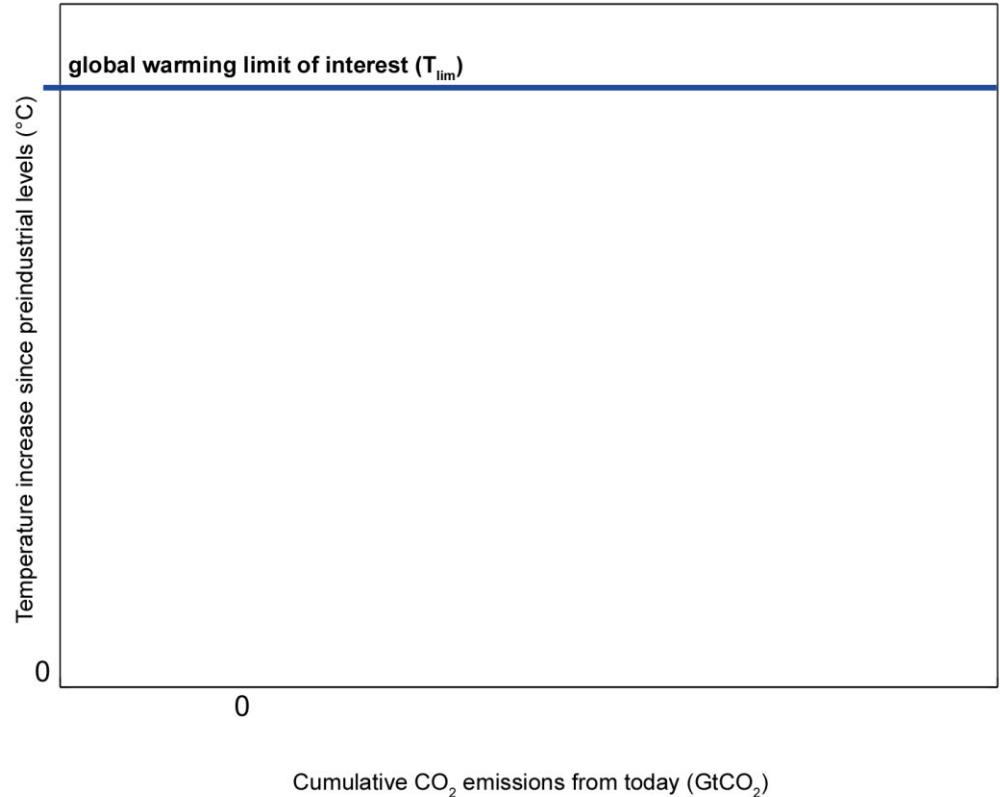
# Carbon-cycle MIP timeline - 3



- BUT – even though model spread not reduced
  - We’ve learned to use the results better

# The Remaining Carbon Budget Framework of the IPCC Special Report on Global Warming of 1.5°C

Five components:



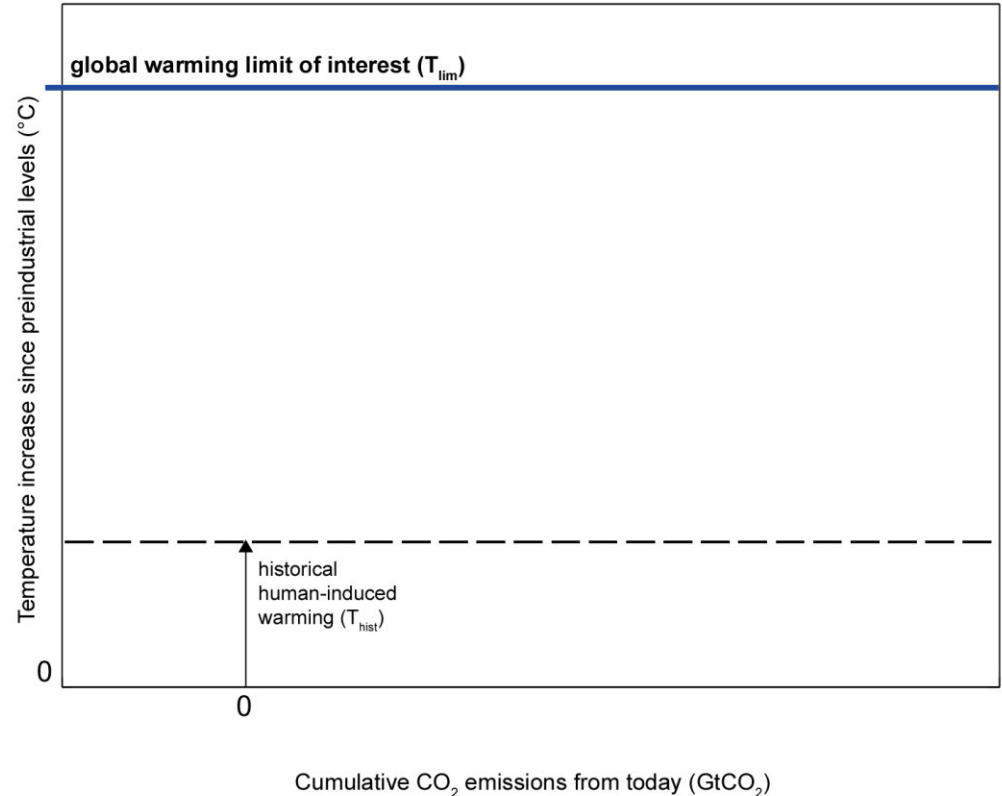
# The Remaining Carbon Budget Framework of the IPCC Special Report on Global Warming of 1.5°C

Five components:

- Historical warming to date

SR15 assessment:

- Human-induced warming since 1850-1900
- Global Surface Air Temperature (GSAT)
- 0.97°C (+- 0.12°C *likely* range)



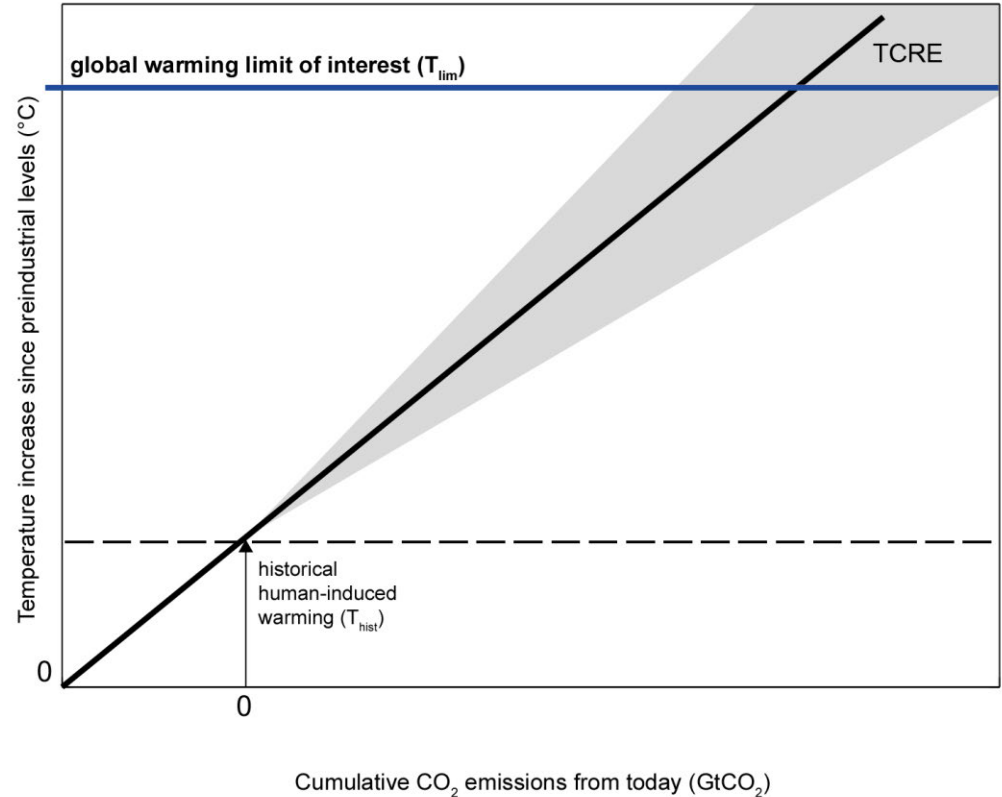
# The Remaining Carbon Budget Framework of the IPCC Special Report on Global Warming of 1.5°C

Five components:

- Historical warming to date
- Transient climate response to cumulative emissions of carbon dioxide (TCRE)

SR15 assessment:

- Same as AR5 assessment
- 0.8-2.5°C / 1000 PgC
- Normally distributed uncertainty



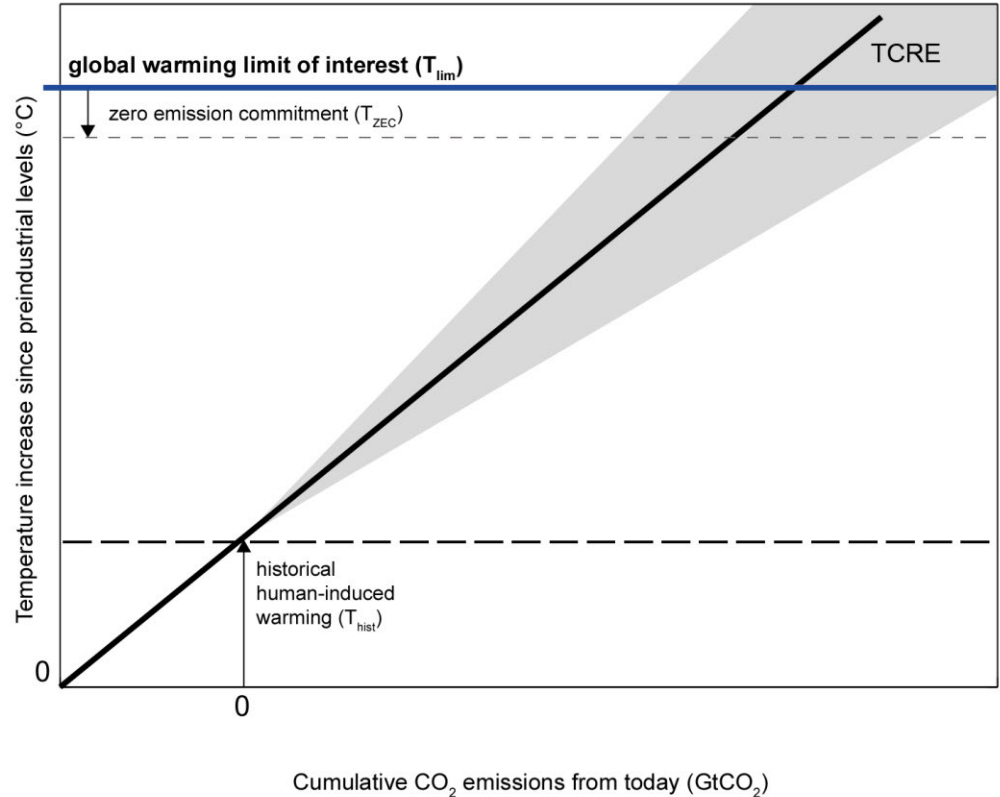
# The Remaining Carbon Budget Framework of the IPCC Special Report on Global Warming of 1.5°C

Five components:

- Historical warming to date
- Transient climate response to cumulative emissions of carbon dioxide (TCRE)
- Zero emission commitment (ZEC)

SR15 assessment:

- Same as AR5 assessment
- Zero or negative



# The Remaining Carbon Budget Framework of the IPCC Special Report on Global Warming of 1.5°C

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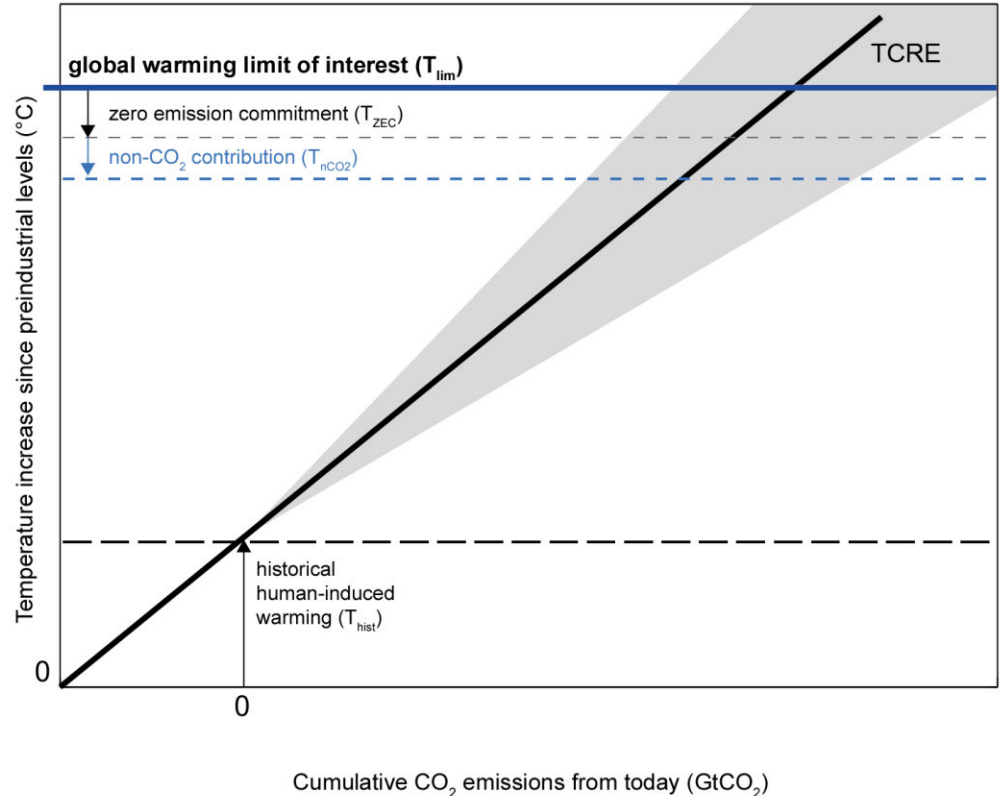
- Historical warming to date
- Transient climate response to cumulative emissions of carbon dioxide (TCRE)
- Zero emission commitment (ZEC)
- Projected future non-CO<sub>2</sub> temperature contribution

SR15 assessment:

- Based on SR15 scenario database
- Future non-CO<sub>2</sub> warming at time global CO<sub>2</sub> emission become net zero
- Estimated with simple climate models

MAGICC & FAIR

Rogelj et al., 2019





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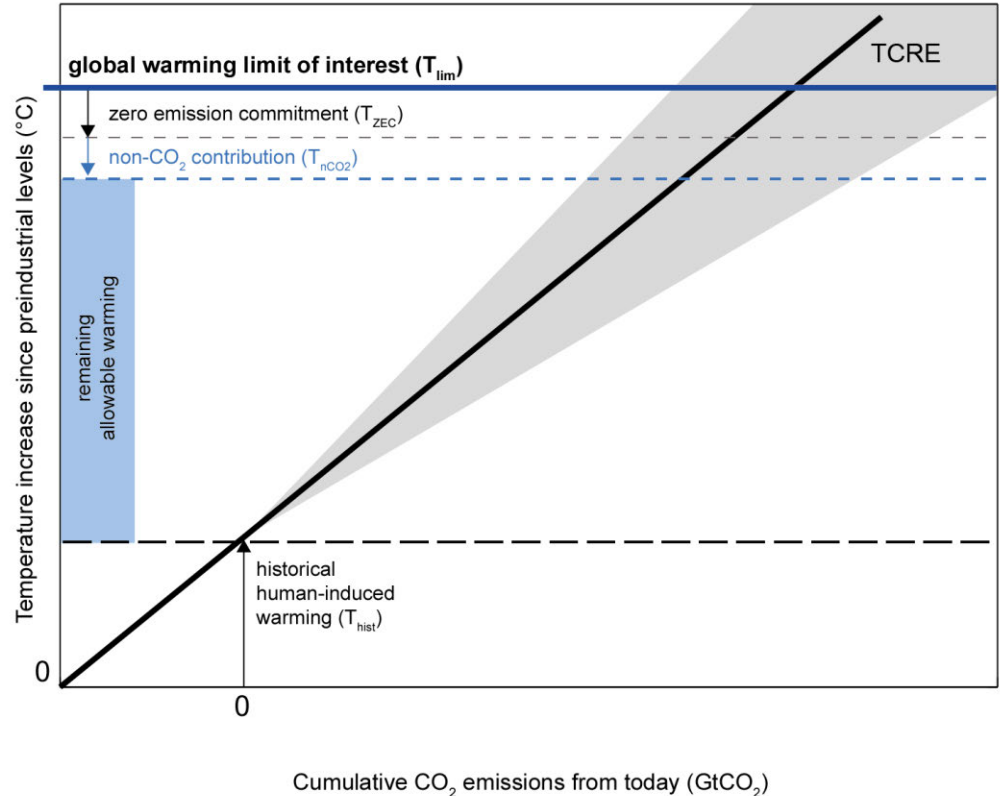
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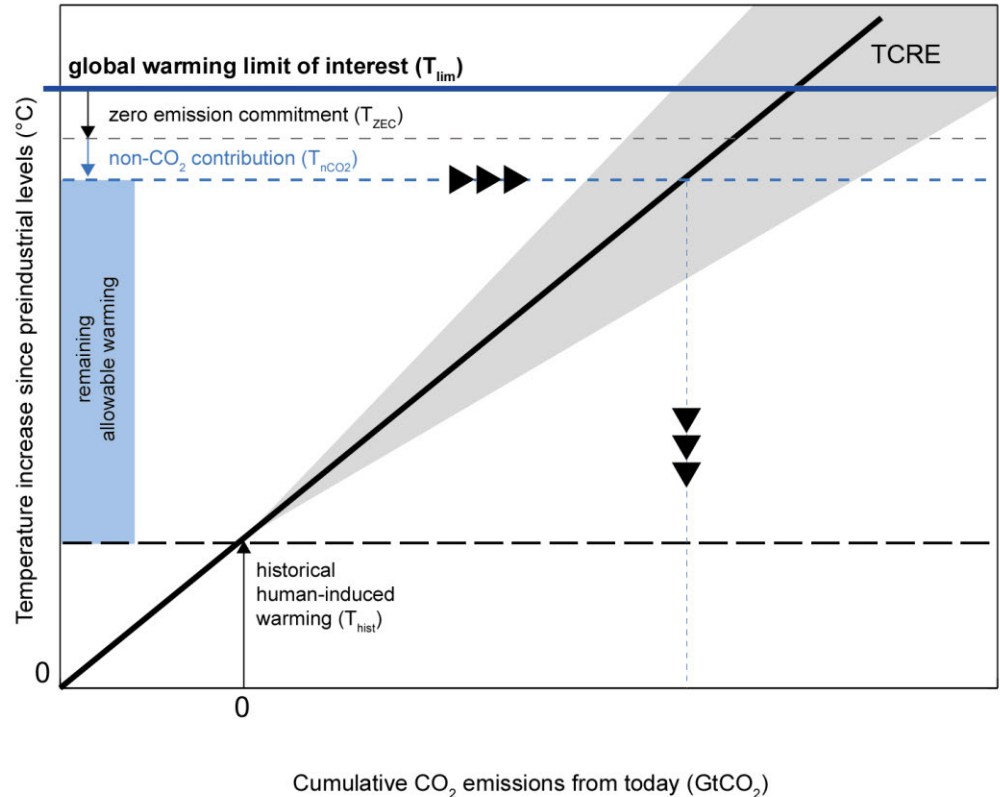
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MAGICC & FAIR

Rogelj et al., 2019



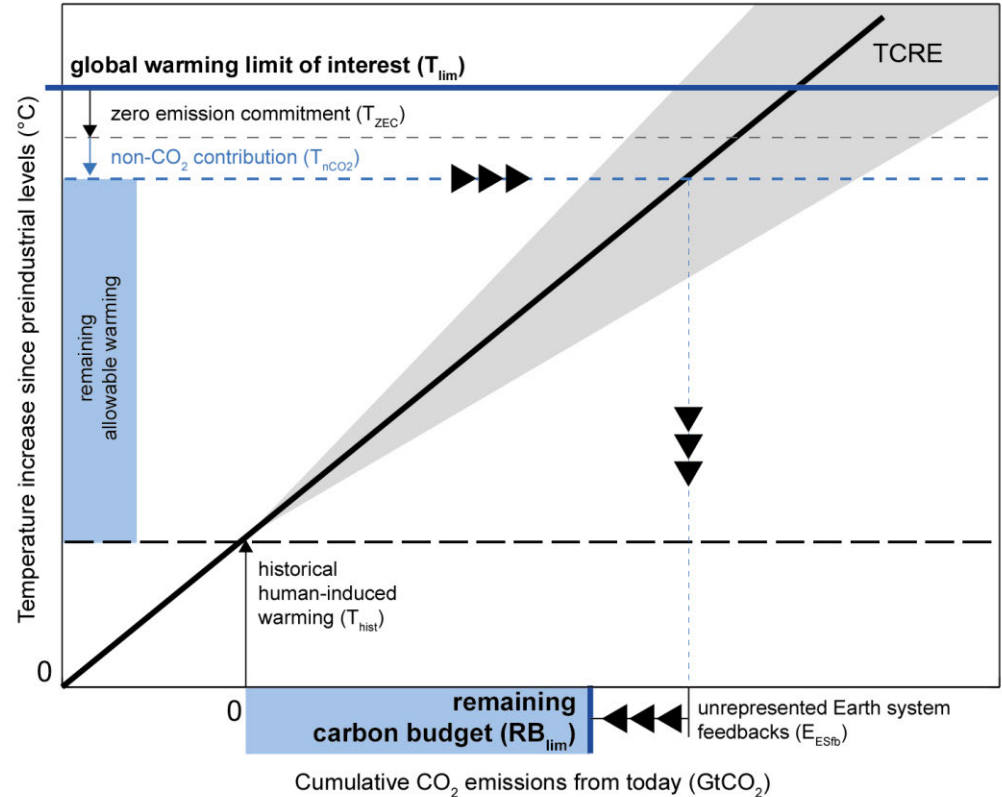
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Five components:

- Historical warming to date
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- Projected future non-CO<sub>2</sub> temperature contribution
- Unrepresented Earth system feedbacks

SR15 assessment:

- Permafrost thawing and other unrepresented Earth system feedbacks can contribute to up to 100 GtCO<sub>2</sub> until 2100



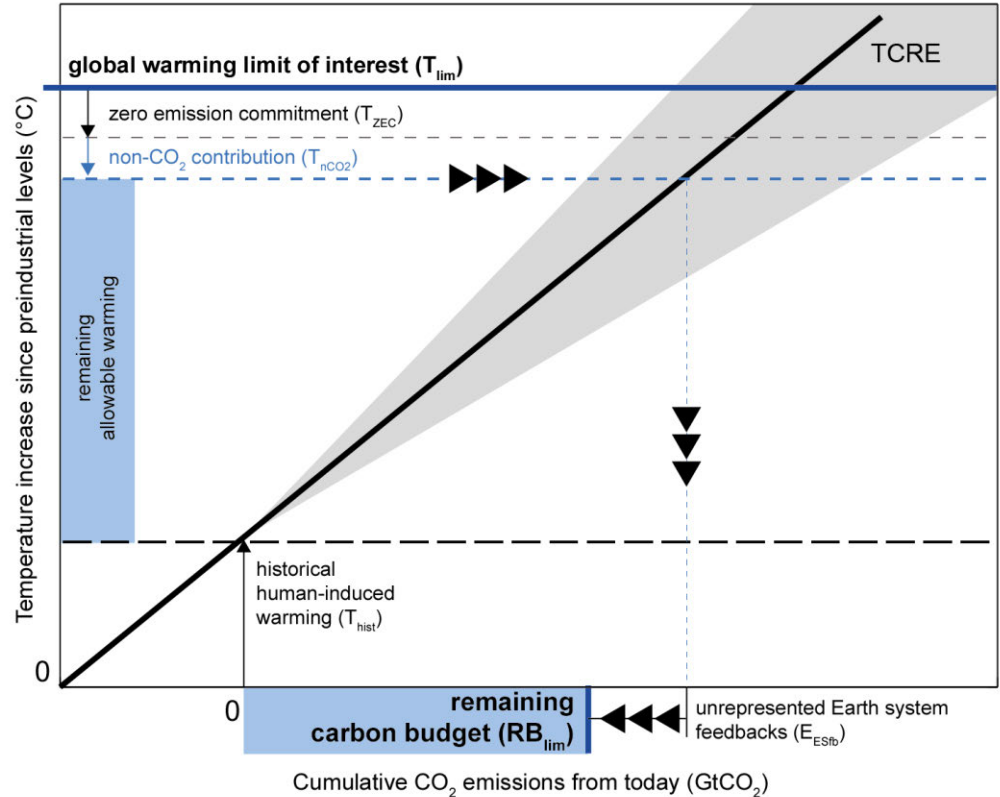
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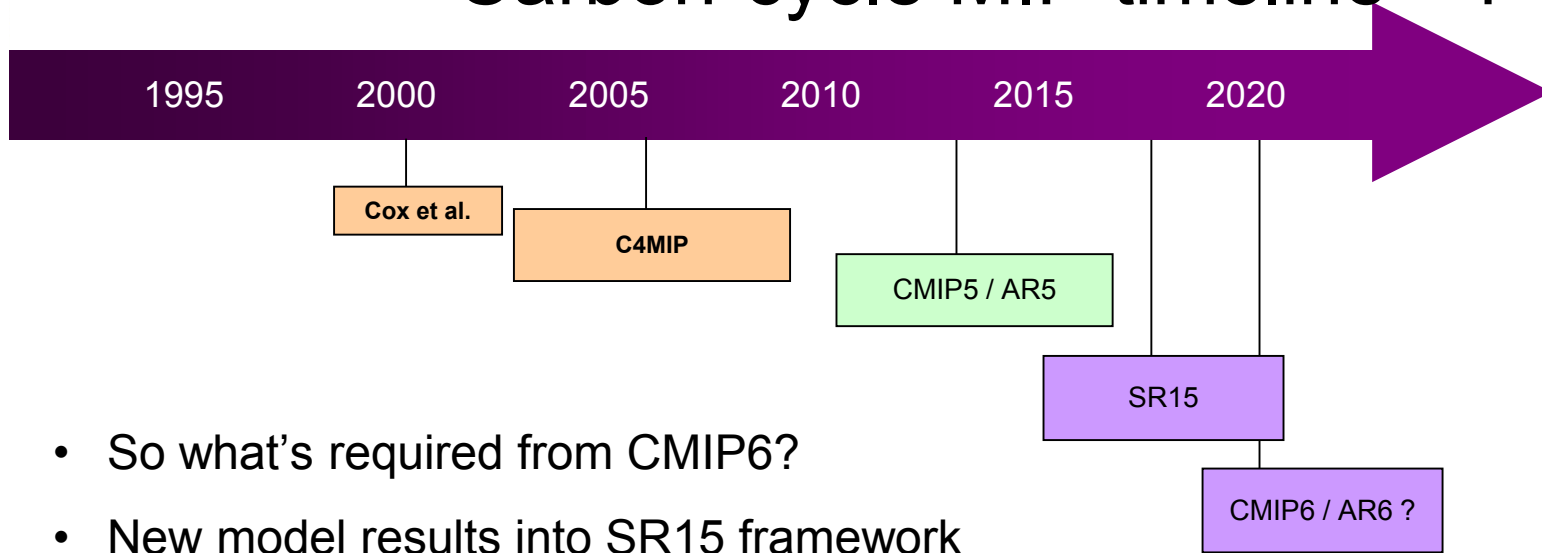
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SR15 assessment:

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# Carbon-cycle MIP timeline - 4



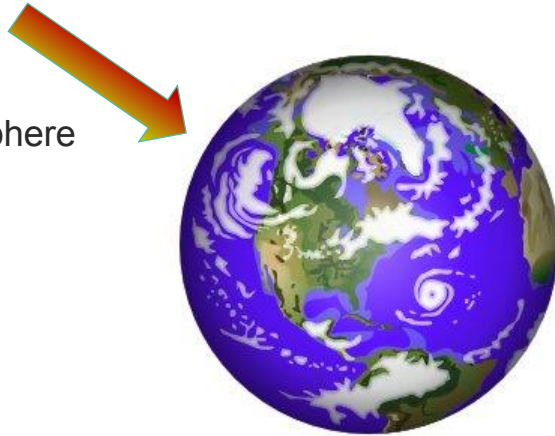
- So what's required from CMIP6?
- New model results into SR15 framework
  - Reduced uncertainty?
  - Improved knowledge on carbon budgets
  - Improved policy advice how to meet targets / avoid impacts

# Primer on feedbacks...

# The climate system: Earth's energy budget

Altered top-of-atmosphere  
energy balance:

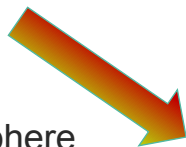
- more energy in



# The climate system: Earth's energy budget

Altered top-of-atmosphere  
energy balance:

- more energy in



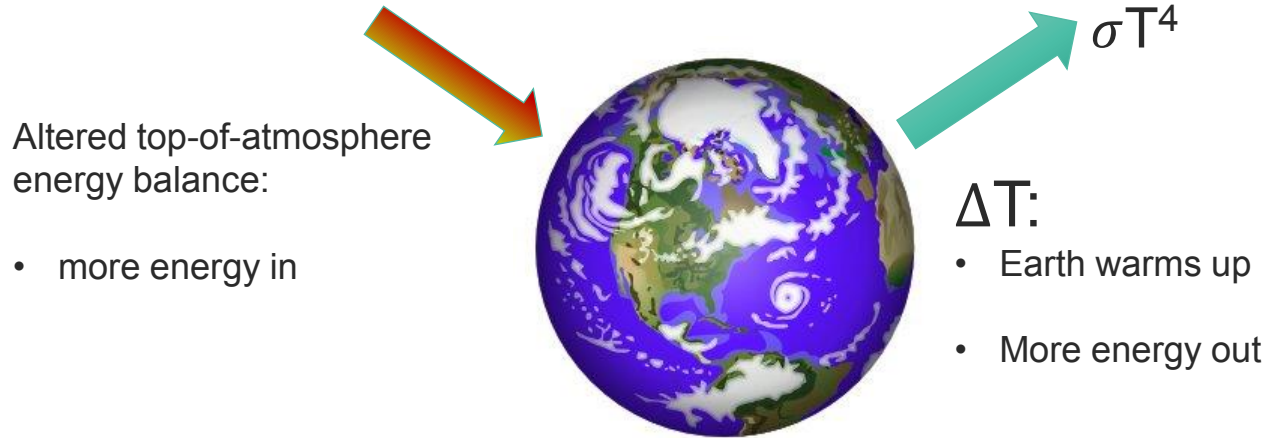
$$\sigma T^4$$

$\Delta T$ :

- Earth warms up
- More energy out



# The climate system: Earth's energy budget

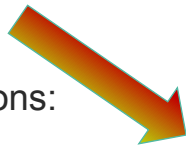


- Strong negative (stabilising) response opposes the initial perturbation
- On top of this get other feedbacks:
  - Clouds, water vapour, ice-albedo, ocean heat...
  - Sum of these is positive/amplifying (from models), but some terms can be globally or locally of either sign

# The carbon cycle: Earth's carbon budget

Anthropogenic emissions:

- more carbon in



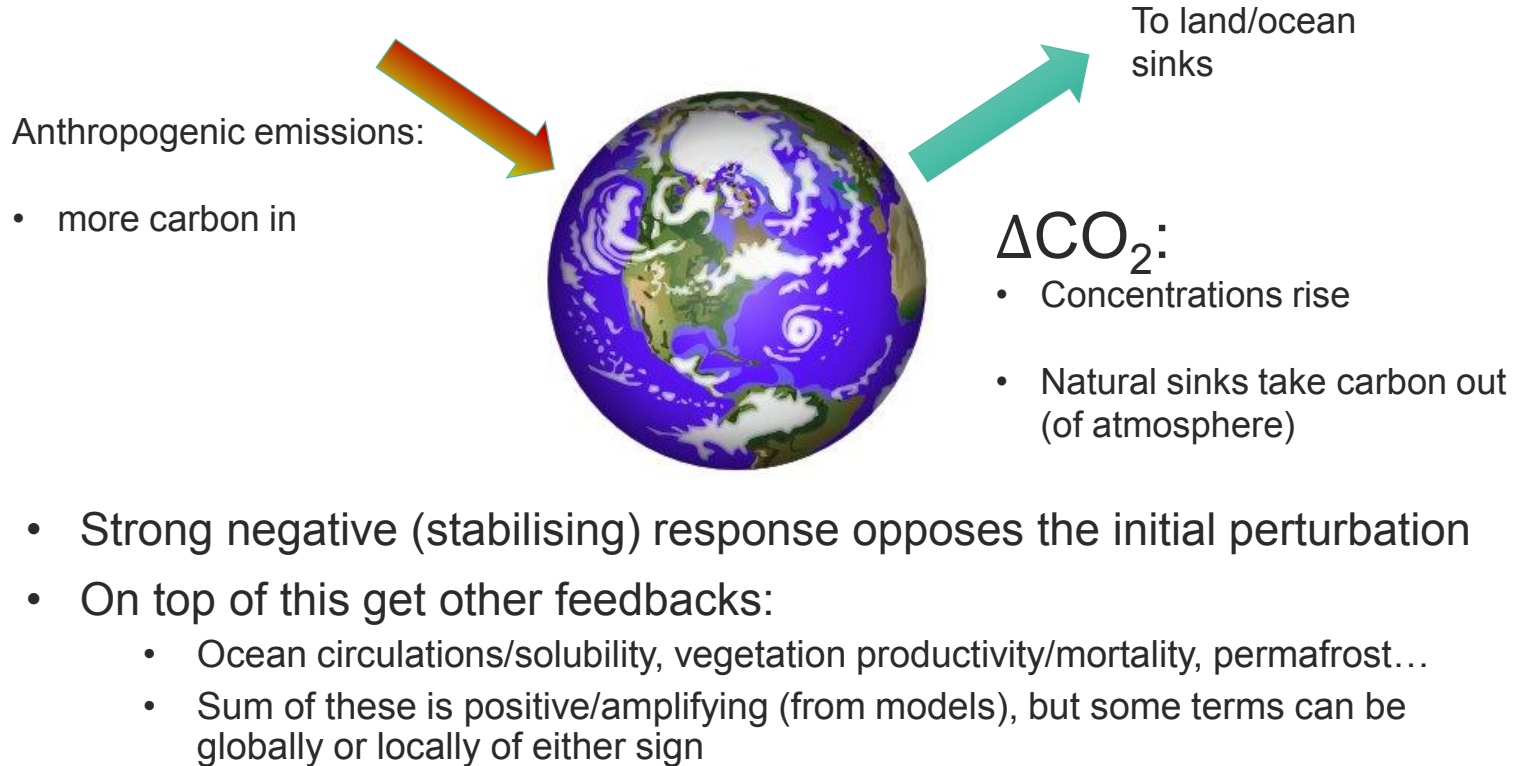
To land/ocean  
sinks



$\Delta\text{CO}_2$ :

- Concentrations rise
- Natural sinks take carbon out (of atmosphere)

# The carbon cycle: Earth's carbon budget



# The similarities are clear...

Strong negative response, stabilises the system against the initial perturbation

- Various feedbacks operate to modulate this

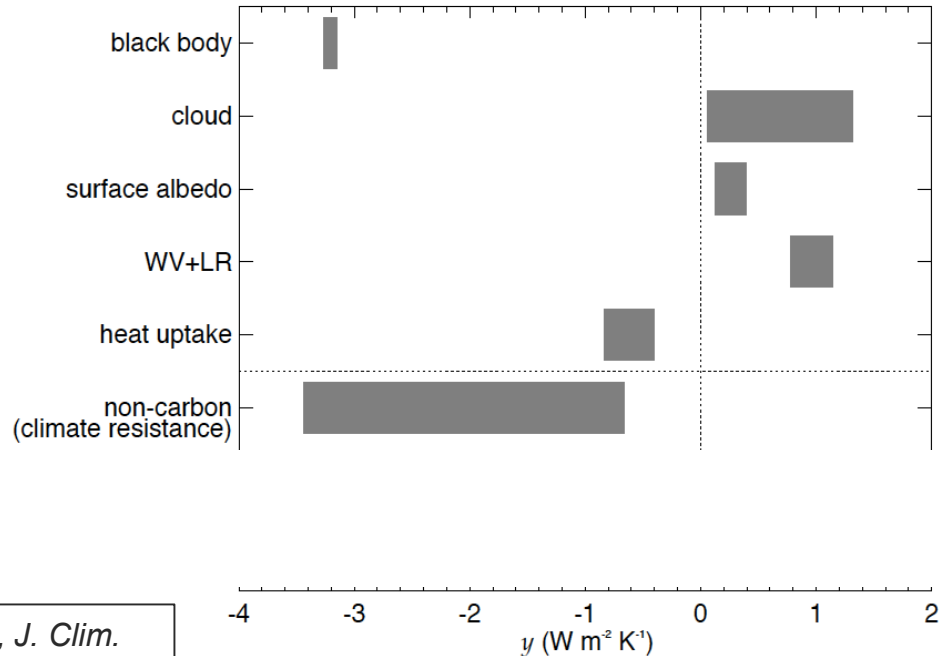
BUT: ...

# The similarities are clear...

Strong negative response, stabilises the system against the initial perturbation

- Various feedbacks operate to modulate this

BUT: Fundamental difference in where the uncertainties lie

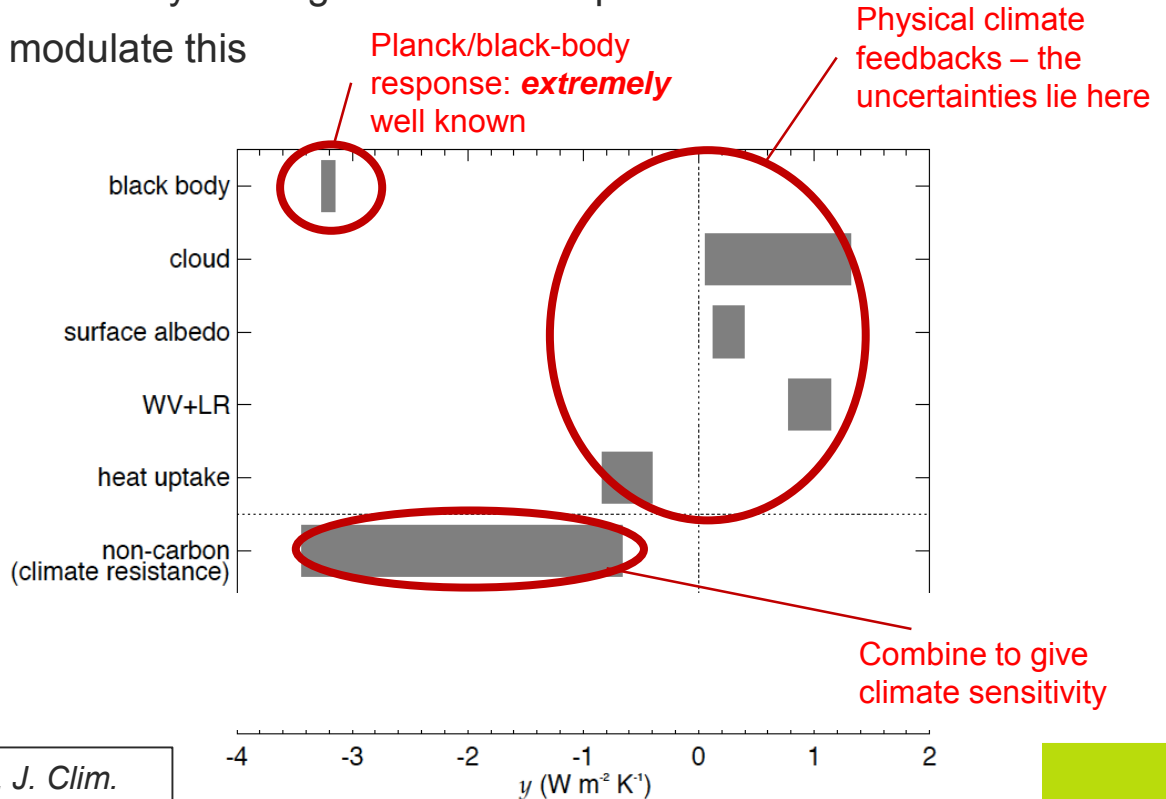


# The similarities are clear...

Strong negative response, stabilises the system against the initial perturbation

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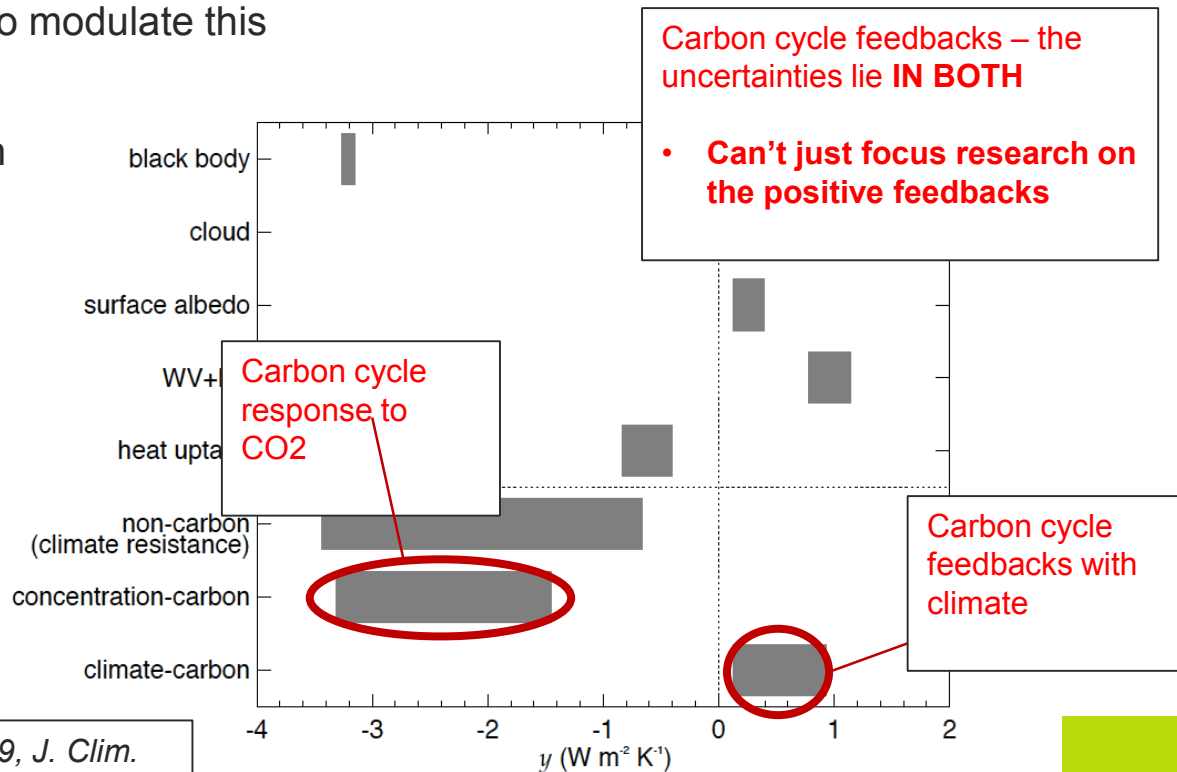


# The similarities are clear...

Strong negative response, stabilises the system against the initial perturbation

- Various feedbacks operate to modulate this

BUT: Fundamental difference in where the uncertainties lie



## Recap

- C4MIP multi-model analysis dates back to 2006
- large model spread
- need to consider carbon response to CO<sub>2</sub> as well as to climate



# Results 1.

## C4MIP

# C4MIP feedback metrics

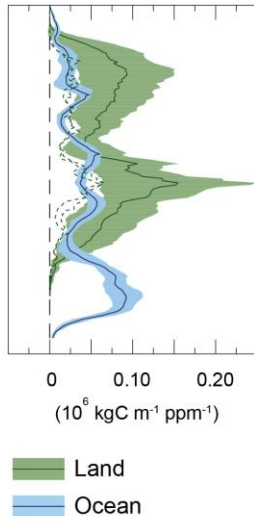
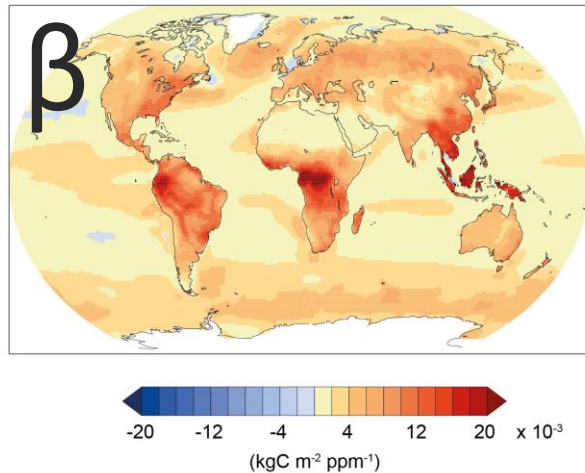
- CO<sub>2</sub> affects climate:

$$\Delta T = \alpha \Delta C_a$$

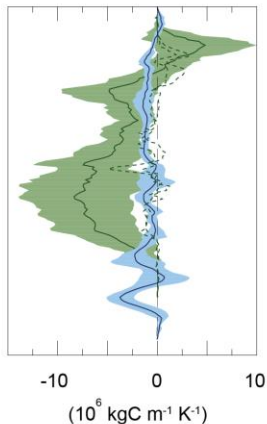
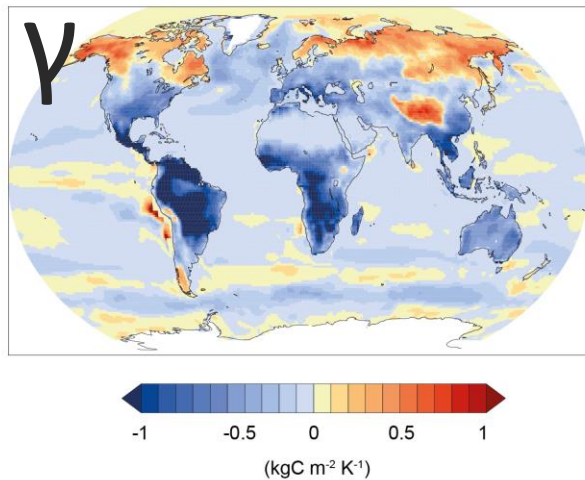
$$\Delta C = \beta \Delta C_a + \gamma \Delta T$$

- Carbon affected by CO<sub>2</sub> and Climate
- “COU” coupled runs vary both
- “BGC” biogeochemical runs – only vary CO<sub>2</sub>, to diagnose beta

a. Regional carbon-concentration feedback



b. Regional carbon-climate feedback

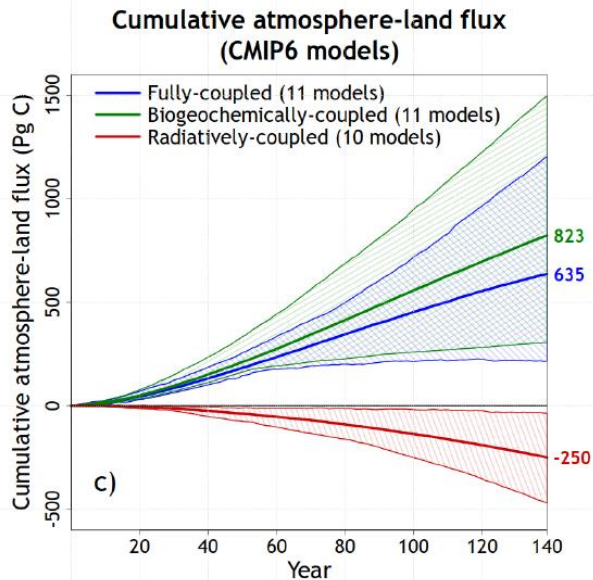


# C4MIP feedback metrics

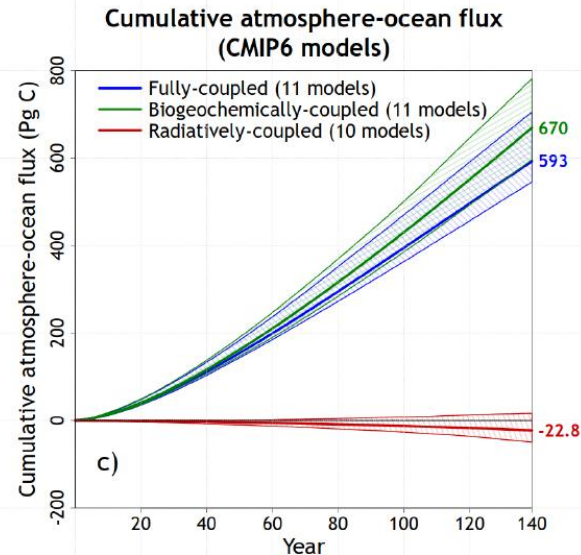
- $\text{CO}_2$  drives natural sinks everywhere
- Climate, globally, reduces sinks
  - Some regional variations

Fig 6.22, IPCC AR5, Ciais et al., 2013

# C4MIP feedback metrics

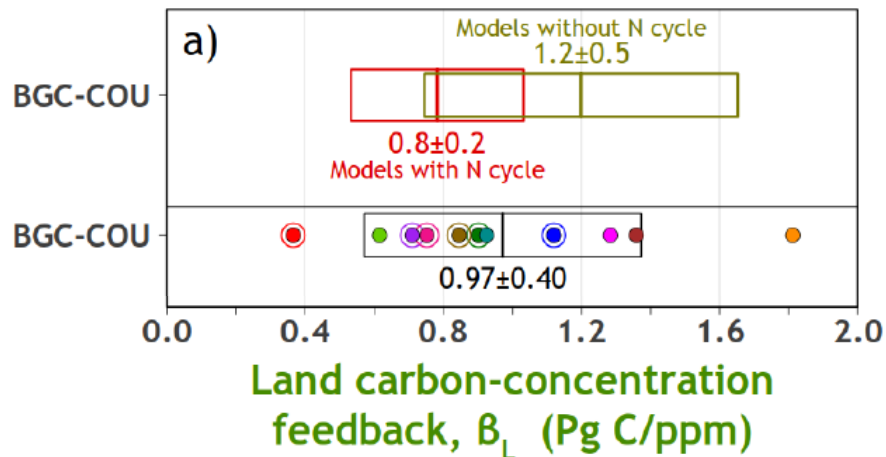


- Land and ocean uptake under 1% CO<sub>2</sub> rise
- Similar overall sinks
- Land stronger dependence on both CO<sub>2</sub> and climate
- Land models much greater spread



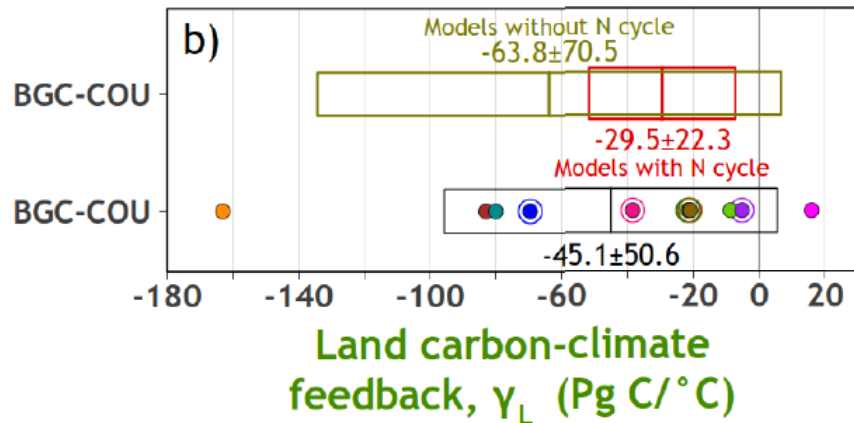
## CMIP6 models at 4xCO<sub>2</sub>

- 6 of 11 models include terrestrial N-cycle



Stronger response to climate

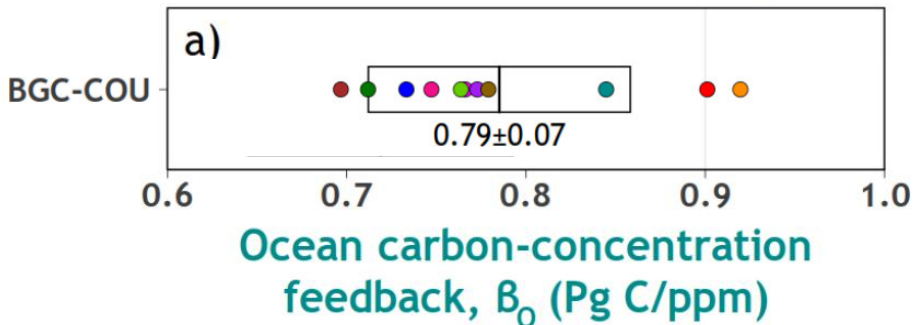
Stronger response to CO<sub>2</sub>



- Land beta similar to CMIP5, reduced spread
- Land gamma weaker
- N-cycle models less spread than non-N

## CMIP6 models at 4xCO<sub>2</sub>

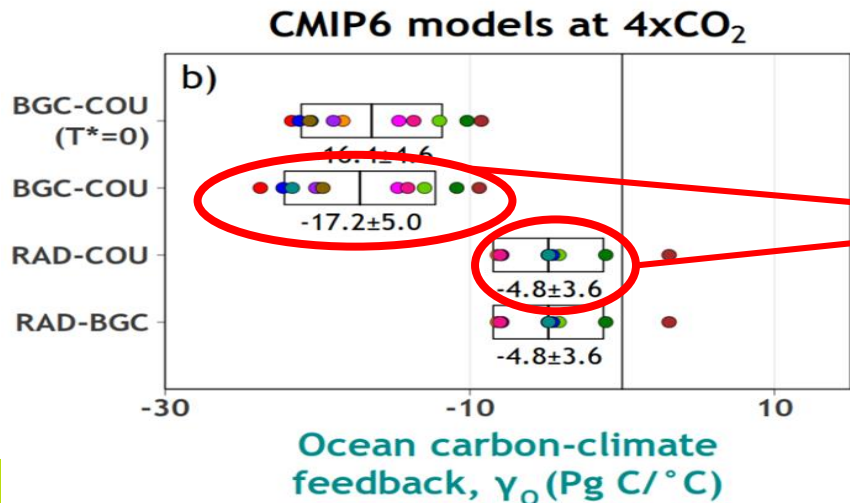
- Ocean models very similar results to CMIP5



Stronger response to climate

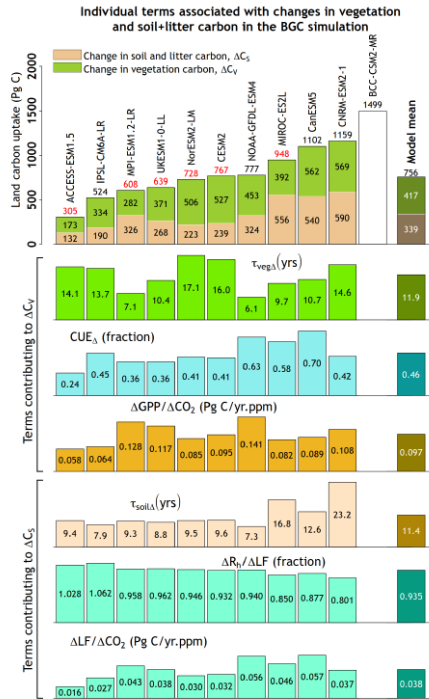


Stronger response to CO<sub>2</sub>

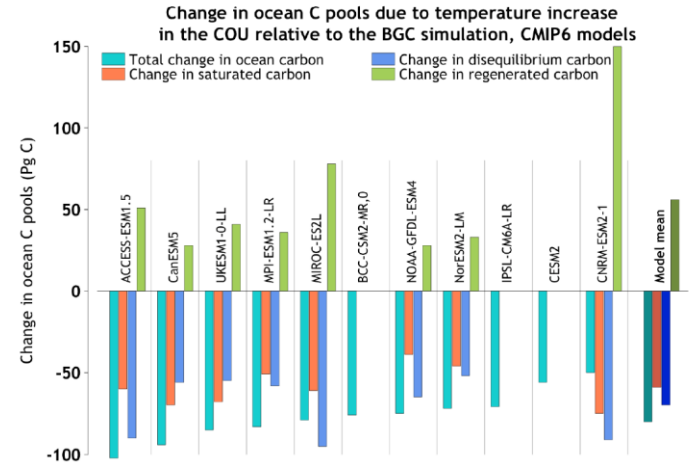


- Explored the sensitivity to methods of calculation
- As recommended by Schwinger 2014, Jones 2016, use COU-BGC

# C4MIP feedback analysis



- Component level breakdown
- Land by veg/soil
  - Then drivers of GPP, allocation, residence time
- Ocean by saturation vs disequilibrium terms
  - And response to warming



• For full details, see: Arora et al. 2020 – in discussion:

• <https://www.biogeosciences-discuss.net/bg-2019-473/>

# C4MIP historical runs

- Analysis and evaluation just beginning
- Similar to CMIP5: fluxes better than stores?
- Treatment of land-use inconsistent
  
- Beware of changes in carbon stores
  - Hide big differences in baseline state!
  
- *<no analysis here – just some results to get you thinking...>*

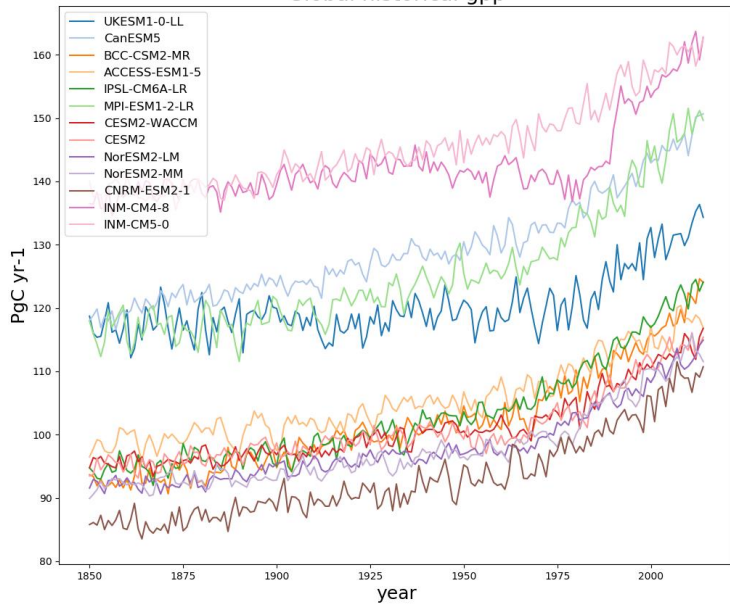


# C4MIP historical runs

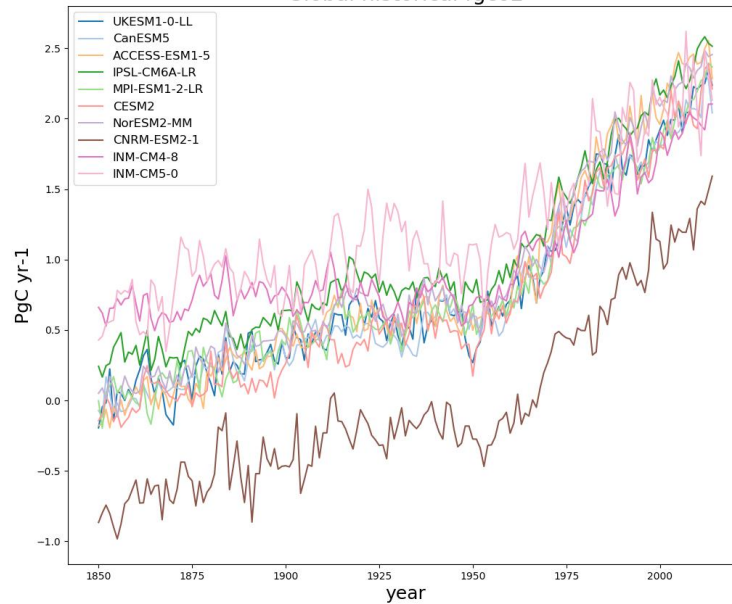
## • GPP and ocean uptake

- Generally consistent
- Models beginning to include lateral flows...

Global historical gpp



Global historical fgco2

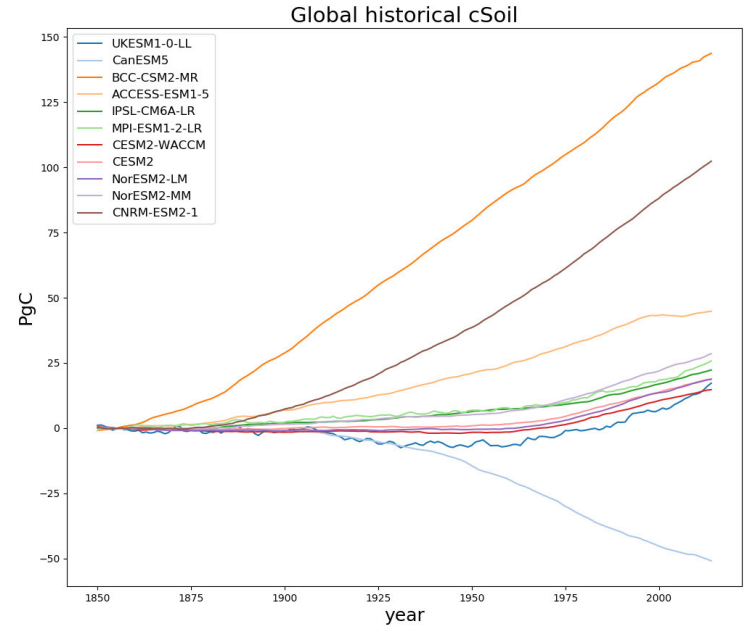
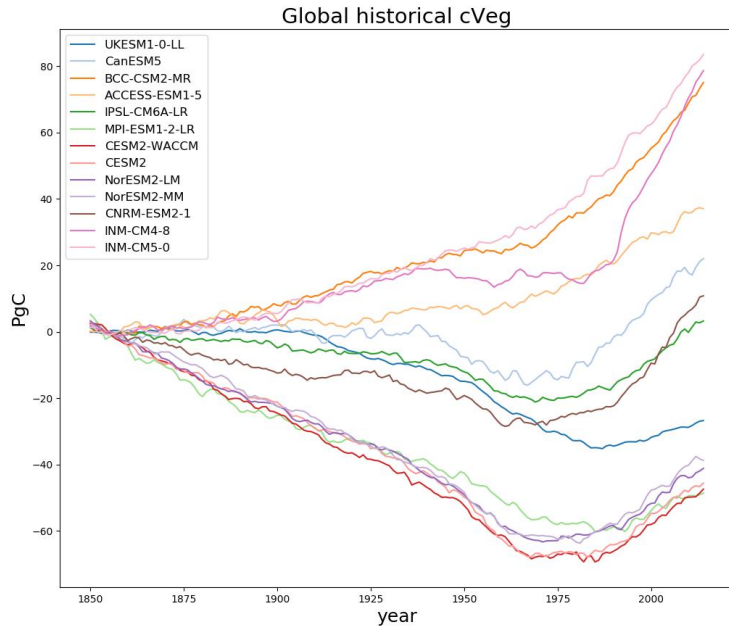


- Within approx. 20% of 120 PgC/yr globally

# C4MIP historical runs

- Veg/Soil stores: changes

- 20-30 PgC increase?

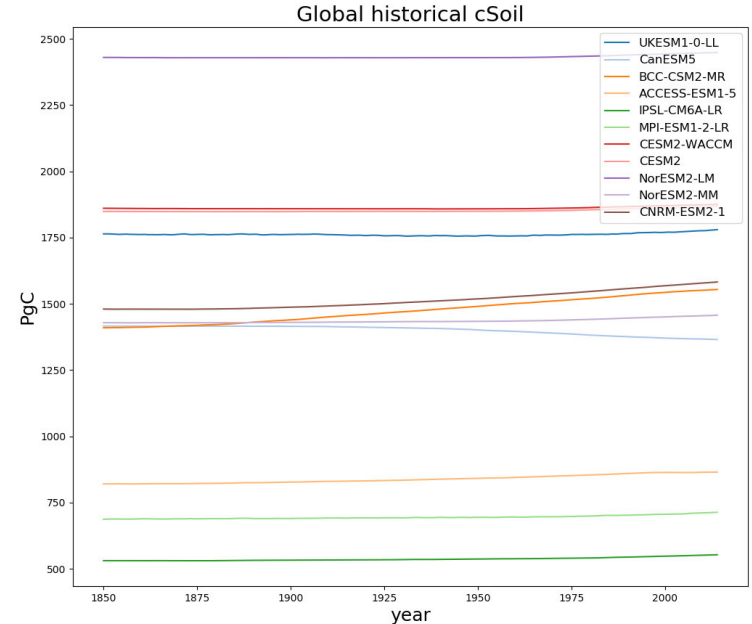
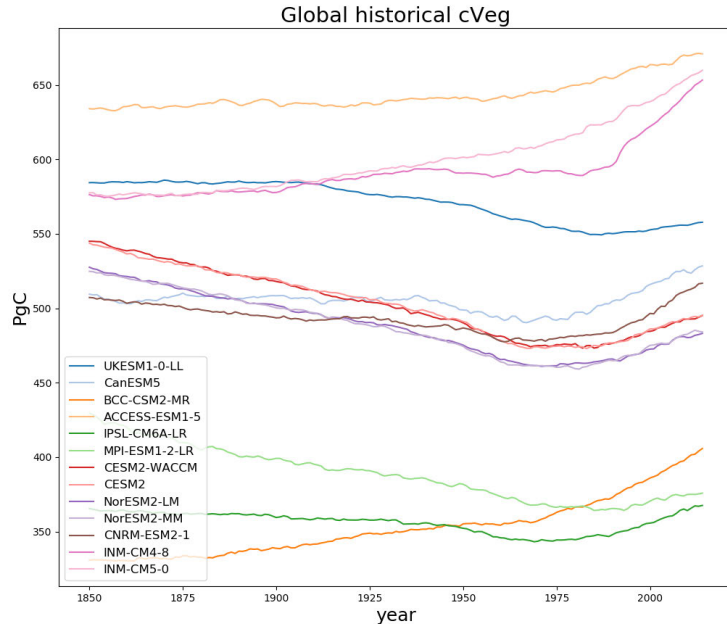


- Cluster into strong/moderate/no effect of land-use?

# C4MIP historical runs

- Veg/Soil stores: **absolutes**

- No correlation between store size and magnitude of change



- Factor 2/5 between veg/soil carbon stores...

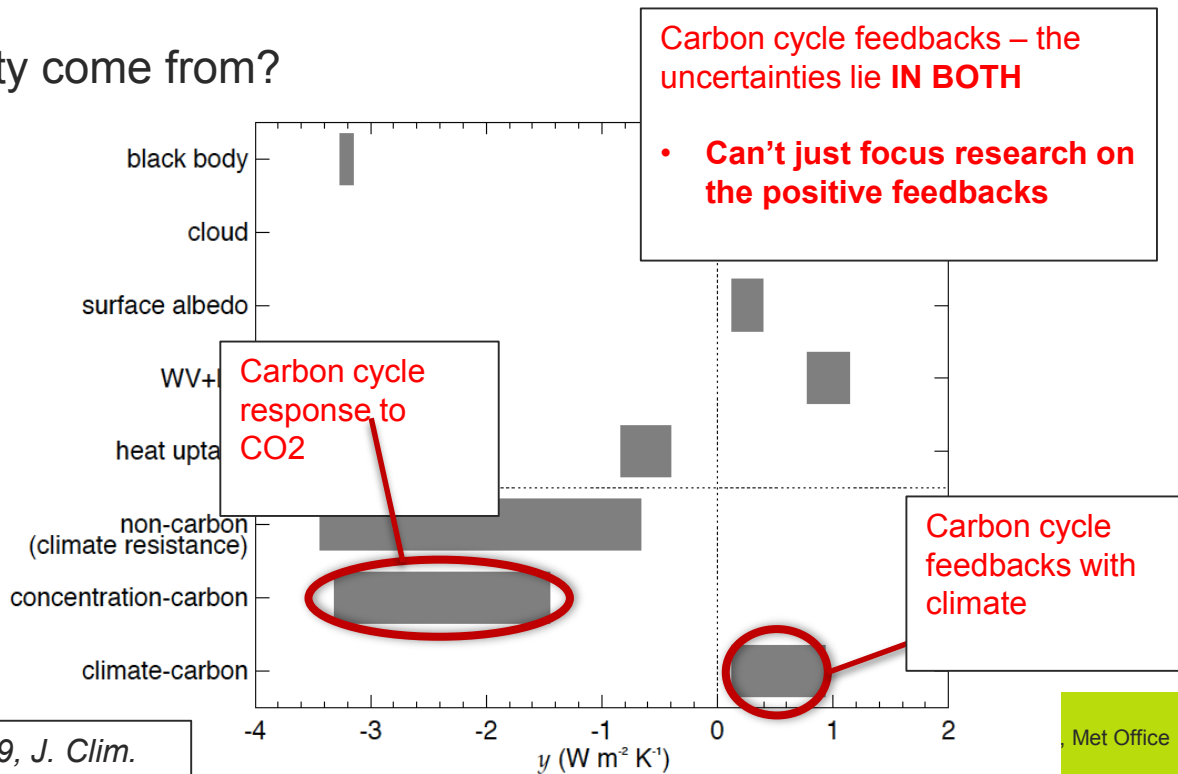
## Results 2.

Sources of uncertainty  
- changes over MIP generations

# C4MIP: uncertainty

- Initial focus on climate feedback gain, “g”
- Over-emphasis on gamma as source of model spread

• So where does the uncertainty come from?  
and how has this changed  
over the generations of  
C4MIP models?



# C4MIP: uncertainty

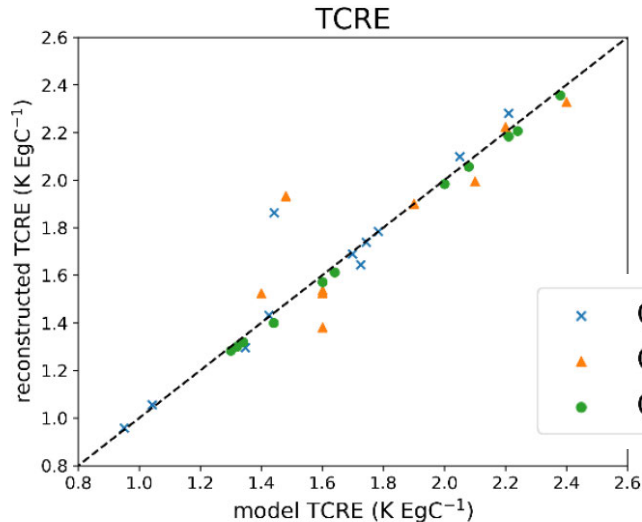
- Gain,  $g$ , can be expressed in terms of alpha, beta, gamma metrics:  
( $k$  = unit conversion, 2.12 PgC/ppm)

$$g = -\frac{\alpha\gamma}{k+\beta}$$

- But so can air-borne fraction and TCRE:

$$AF = \frac{k}{k+\beta+\alpha\gamma}$$

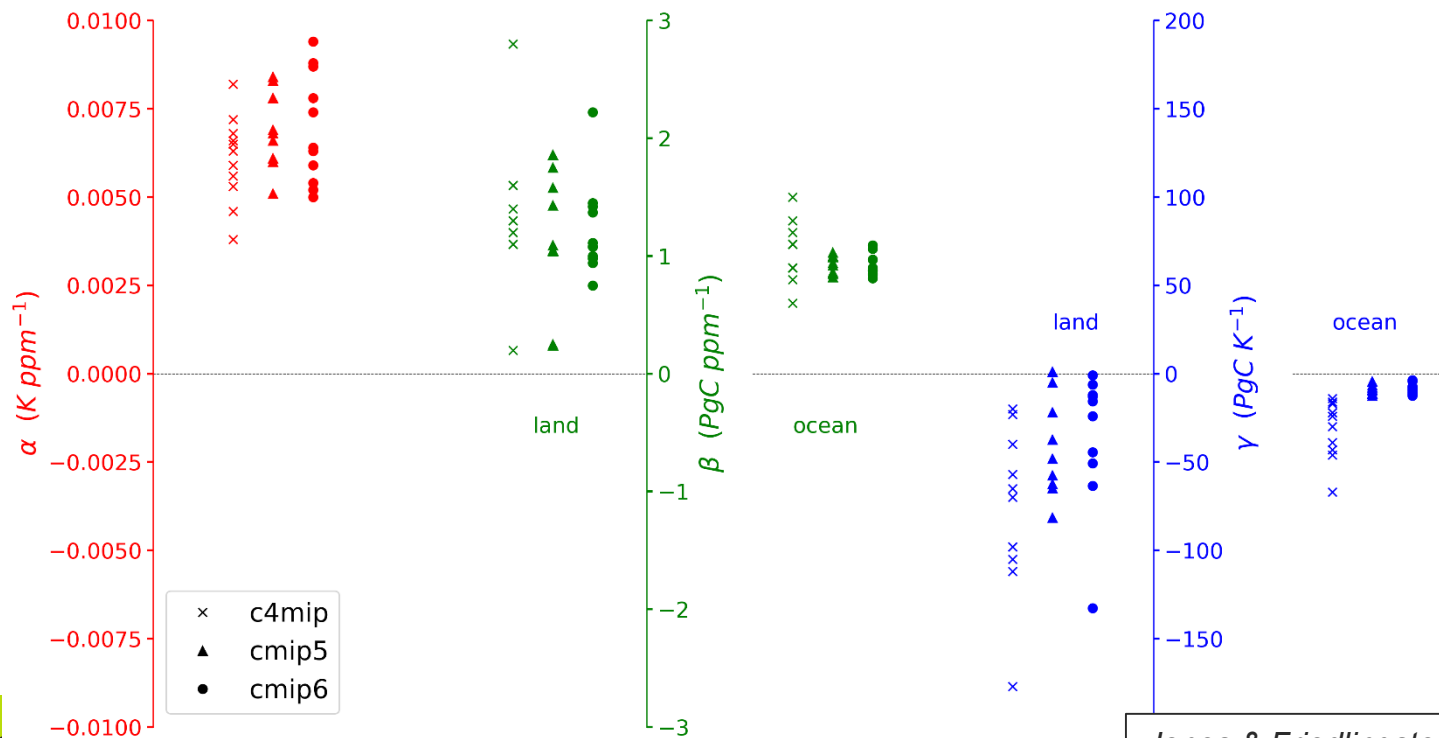
$$TCRE = \frac{\alpha}{k+\beta+\alpha\gamma}$$



- Reconstructed quantities fit well
- Jones & Friedlingstein, 2020, ERL

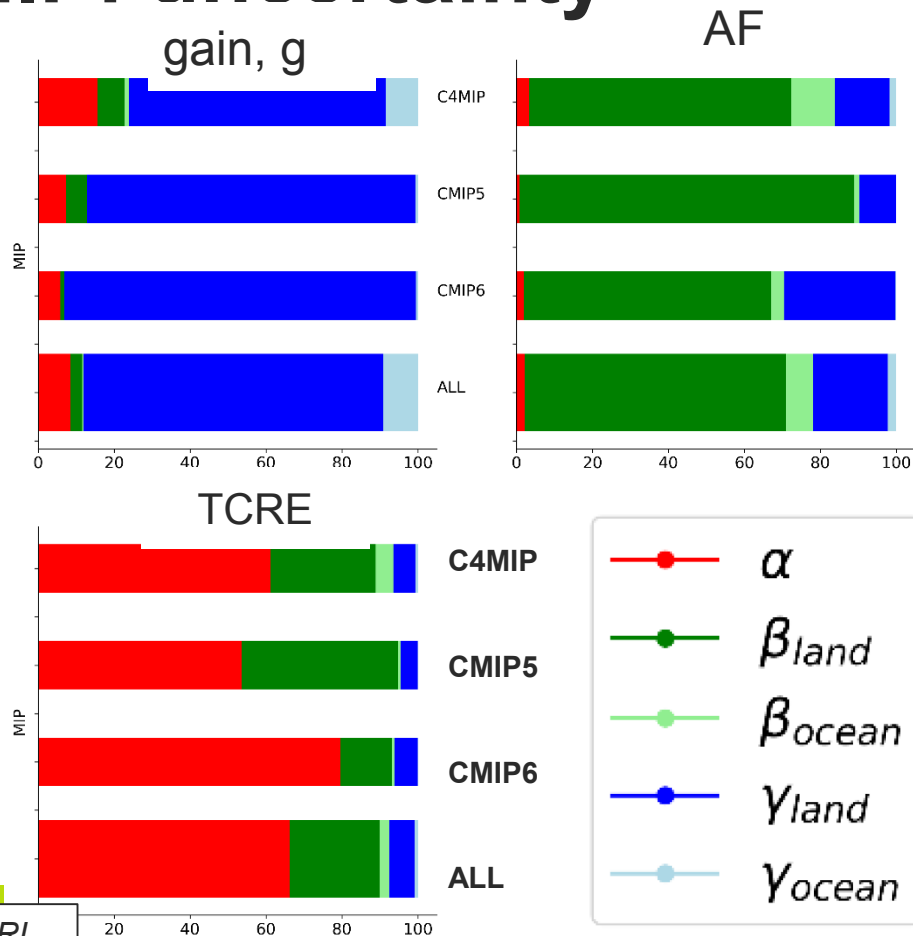
# C4MIP: uncertainty

- This allows propagation of uncertainty in each term to the quantity of interest



# C4MIP: uncertainty

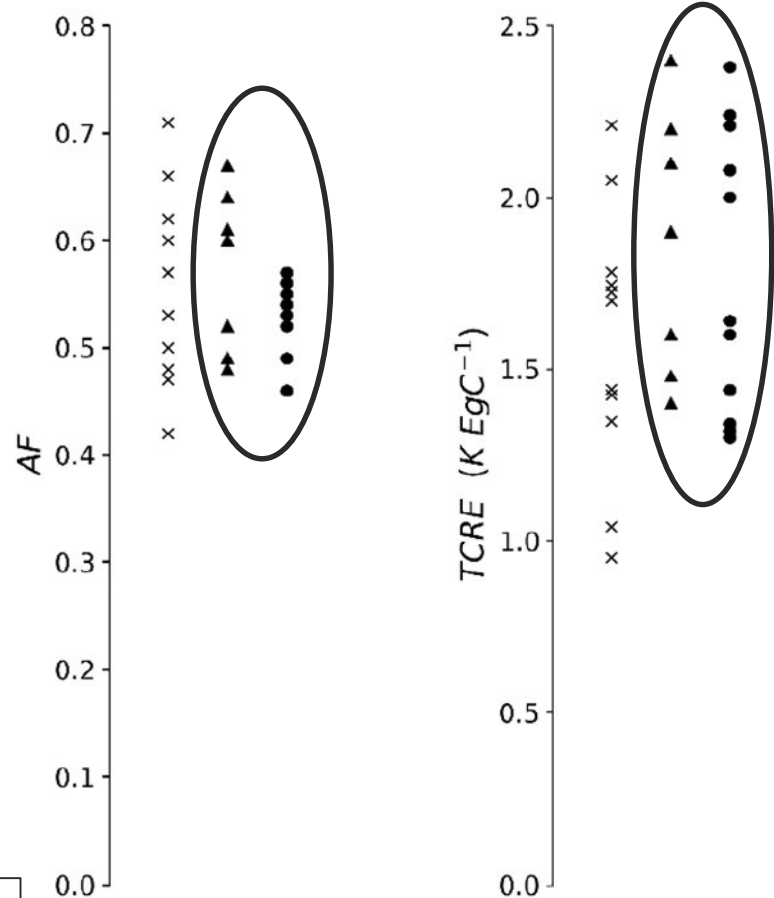
- This allows propagation of uncertainty in each term to the quantity of interest
- Gain**, as we knew – dominated by gamma
- AF** – dominated by beta
- TCRE** – jointly controlled by beta/alpha
  - CMIP5: approx. 50:50 climate vs carbon cycle
  - CMIP6: move towards control by climate uncertainty





# C4MIP: uncertainty

- **AF** – dominated by beta
  - CMIP6 spread < half of CMIP5
- **TCRE** – jointly controlled by beta/alpha
  - CMIP6 and CMIP5 very similar
    - mean and spread



## Results 3.

# ZECMIP

# ZECMIP: “a MIP in a year”



January 2019 – Vancouver  
carbon budgets workshop

- Hugely successful new MIP – targeted to fill a science gap
- From idea to delivery in less than 12 months.

# ZECMIP: “a MIP in a year”



ESGF Portal at CEDA

## Geoscientific Model Development

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CEDA ESGF Search Portal

Geosci. Model Dev., 12, 4375–4385, 2019  
<https://doi.org/10.5194/gmd-12-4375-2019>  
© Author(s) 2019. This work is distributed under  
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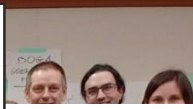
Model experiment description paper

The Zero Emissions Commitment Model Intercomparison  
Project (ZECMIP) contribution to C4MIP: quantifying  
committed climate changes following zero carbon  
emissions

Chris D. Jones<sup>1</sup>, Thomas L. Frölicher<sup>2,3</sup>, Charles Koven<sup>4</sup>, Andrew H. MacDougall<sup>5</sup>,

May/October 2019 – protocol  
paper submitted/published

- December 2019 – analysis paper
- submitted
- 18 models took part



Model	A1	A2	A3	B1	B2	B3
ACCESS	X	X	X	-	-	-
CanESM5	X	-	X	-	-	-
CESM2	X	-	-	-	-	-
CNRM	X	-	-	-	-	-
GFDL	X	X	X	X	X	X
MIROC-ES2L	X	X	X	-	-	-
MPI-ESM	X	-	-	-	-	-
NorESM2	X	-	-	-	-	-
UKESM	X	X	X	-	-	-
Bern	X	X	X	X	X	X
CLIMBER	X	-	-	-	-	-
DCESS	X	X	X	X	X	X
IAPRAS	X	X	X	X	X	X
LOVECLIM	X	X	-	X	-	-
MESM	X	X	X	X	X	X
MIROC-lite	X	X	X	X	X	X
P. GENIE	X	X	X	X	X	X
UVic	X	X	X	X	X	X

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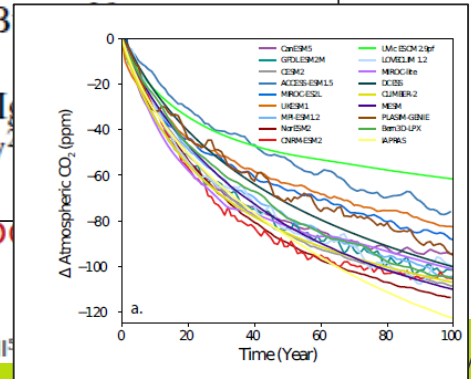
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## Is there warming in the pipeline? A multi-model analysis of committed climate changes following zero carbon emission commitment from CO<sub>2</sub>

Andrew H. MacDougall<sup>1</sup>, Thomas L. Frölicher<sup>2,3</sup>, Chris D. Jones<sup>4</sup>, Joeri Rogelj<sup>5,6</sup>, H. Damon Matthews<sup>6</sup>, Kirsten Zickfeld<sup>7</sup>, Vivek K. Arora<sup>8</sup>, Noah J. Barrett<sup>1</sup>, Victor Brovkin<sup>9</sup>, Friedrich A. B. Micheal Eby<sup>10</sup>, Alexey V. Eliseev<sup>11,12</sup>, Tomohiro Hajima<sup>13</sup>, Philip B. Holden<sup>14</sup>, Aurich Jeltsch-Thömmes<sup>2,3</sup>, Charles Koven<sup>15</sup>, Laurie Menviel<sup>16</sup>, Martine Michou<sup>17</sup>, I. Akira Oka<sup>18</sup>, Jörg Schwinger<sup>19</sup>, Roland Séférian<sup>17</sup>, Gary Shaffer<sup>20,21</sup>, Andrei Sokolov<sup>22</sup>, Jerry Tjiputra<sup>19</sup>, Andrew Wiltshire<sup>4</sup>, and Tilo Ziehn<sup>23</sup>

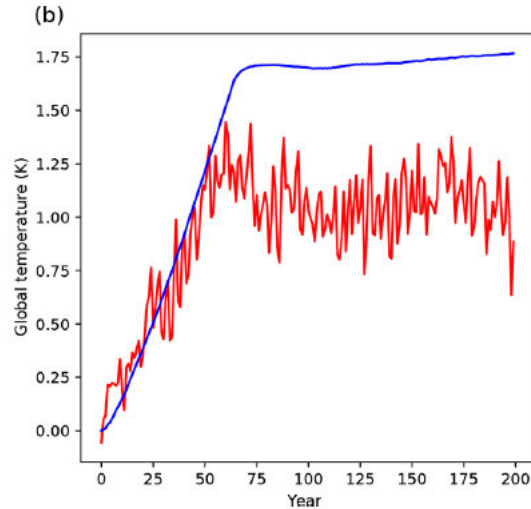
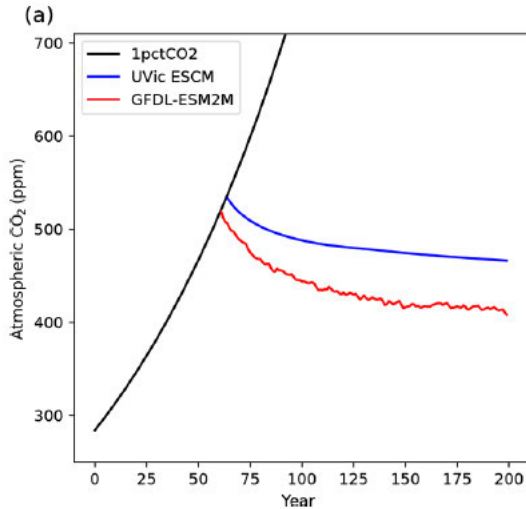
committed climate changes following zero carbon emissions

Chris D. Jones<sup>ID</sup><sup>1</sup>, Thomas L. Frölicher<sup>ID</sup><sup>2,3</sup>, Charles Koven<sup>ID</sup><sup>4</sup>, Andrew H. MacDougall<sup>1</sup>

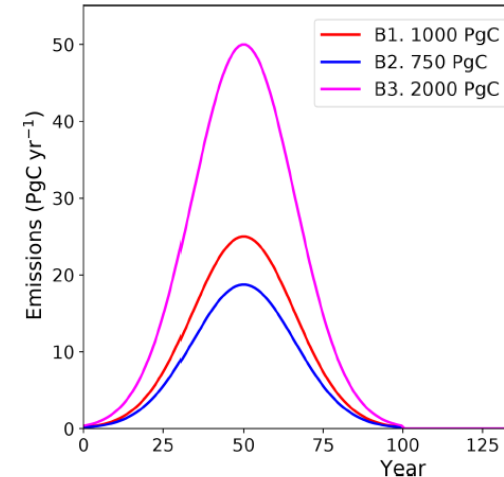


# ZECMIP: experiments

- How does climate continue to respond following complete cessation of emissions
- (myth: some warming is “locked in”, or “in the pipeline”)



*Jones et al., 2019*

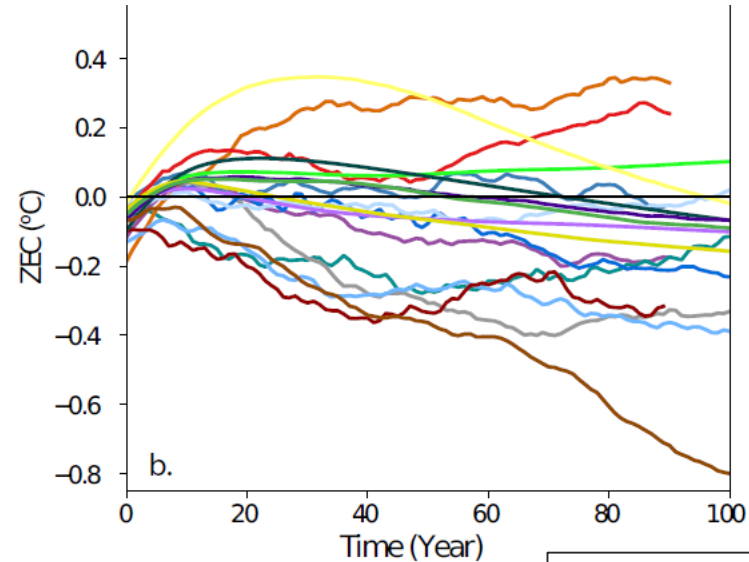
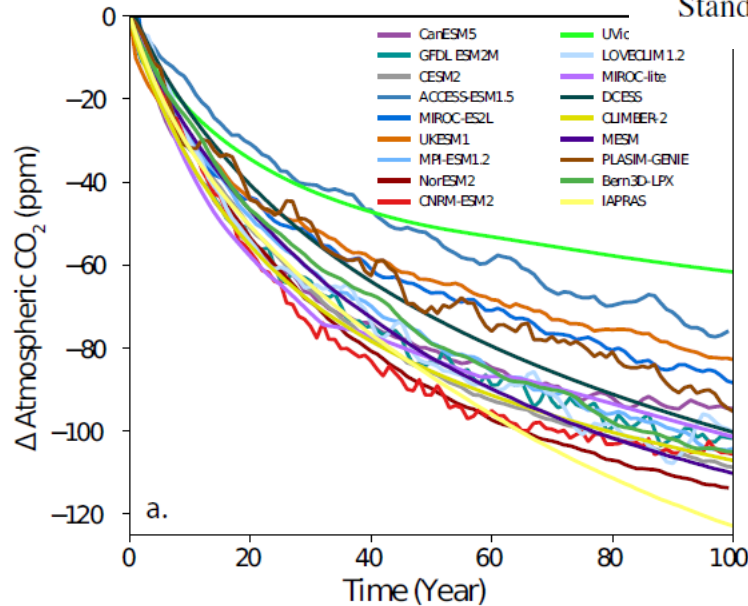


- “A” experiments: sudden stop from 1% trajectory
  - “B” experiments: gradual rise and reduce of emissions

# ZECMIP: results

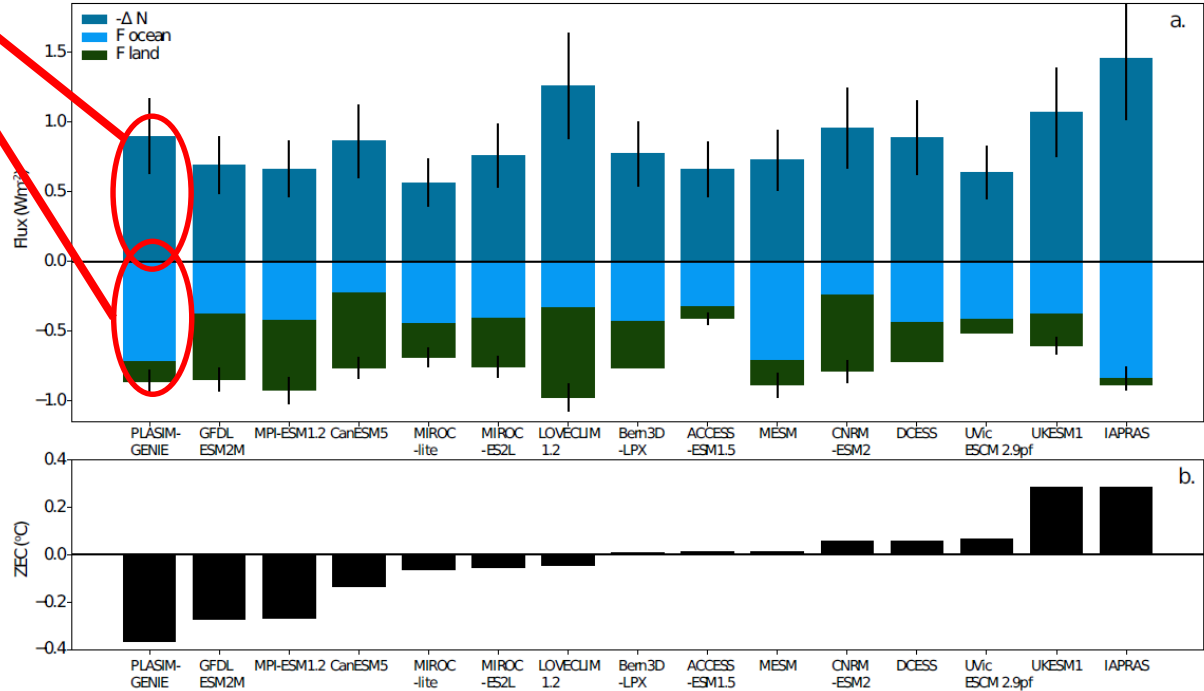
- All 18 models show rapid initial reduction in CO<sub>2</sub> – sinks persist but begin to slow
- Range of warming/cooling spans zero

Model	ZEC <sub>25</sub> (°C)	ZEC <sub>50</sub> (°C)	ZEC <sub>90</sub> (°C)
Mean	-0.01	-0.06	-0.11
Median	-0.01	-0.05	-0.08
Standard Deviation	0.15	0.19	0.23



# ZECMIP: results

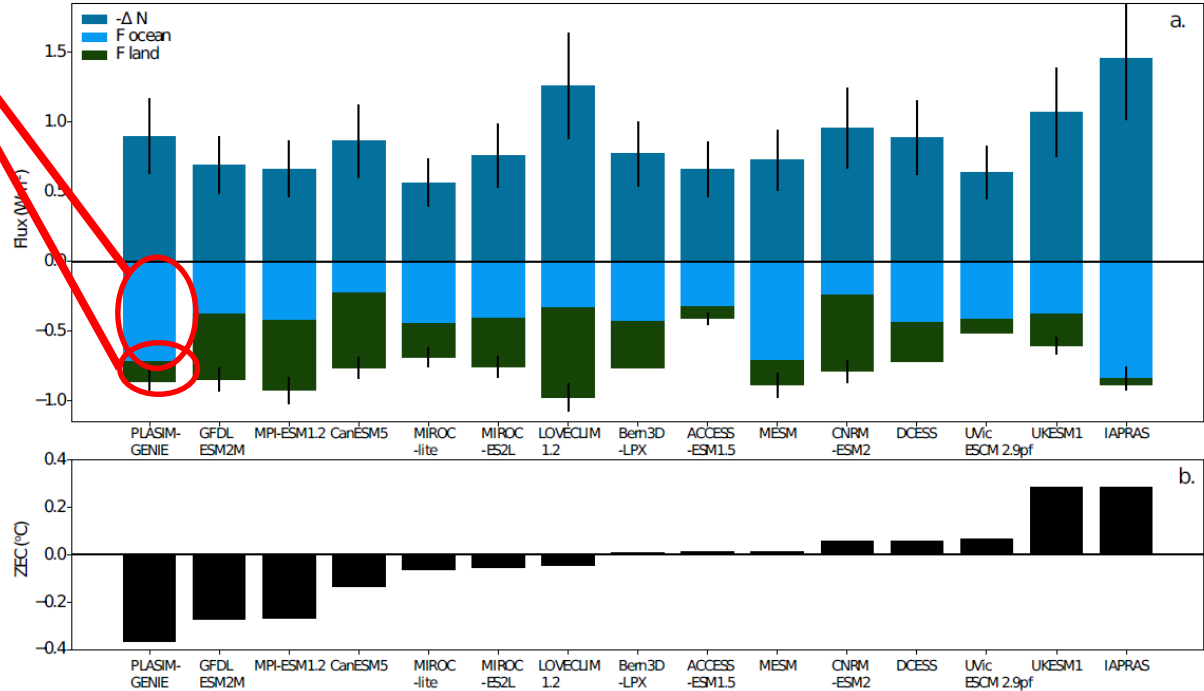
- Heat vs carbon...
- We can diagnose response in terms of balance between CO<sub>2</sub> reduction and ocean heat uptake
- No clear signal why some models have +ve or -ve ZEC
- No correlation with climate sensitivity





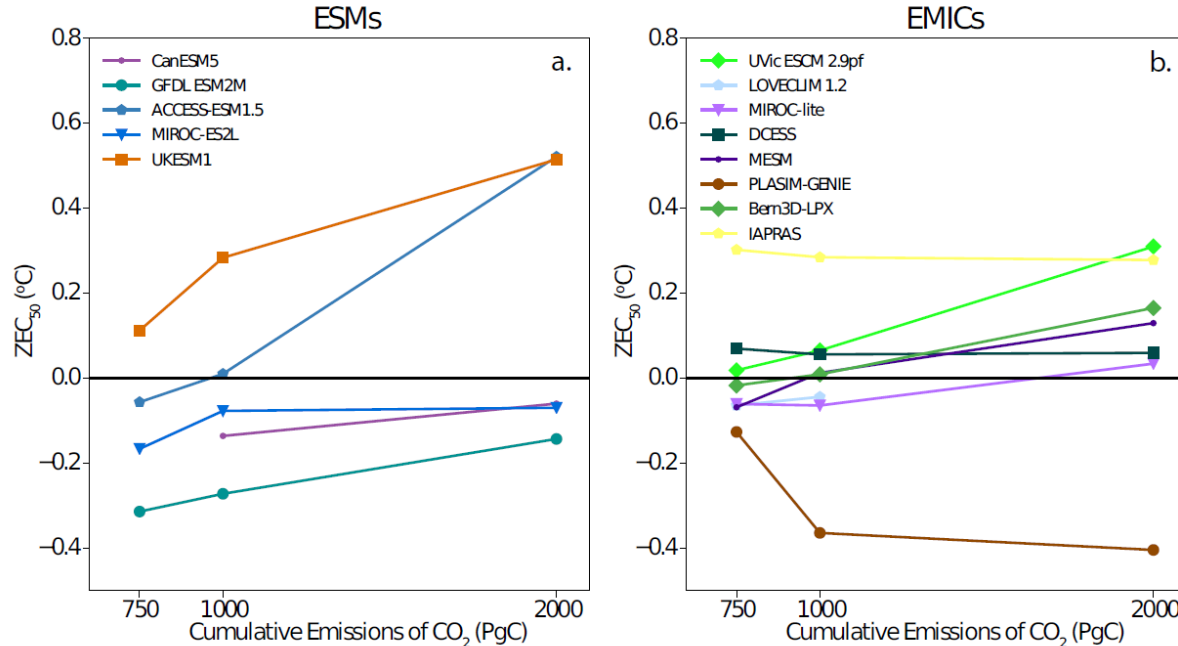
# ZECMIP: results

- Land vs ocean...
- We can diagnose response in terms of balance land and ocean carbon sink
- Both just as important (magnitude)
- No clear signal which determines +ve or -ve ZEC



# ZECMIP: results

- State-dependence: long-term warming greater after greater emissions



- For full details, see: MacDougall et al. 2020 – in discussion:
  - <https://www.biogeosciences-discuss.net/bg-2019-492/>

# C4MIP / ZECMIP synthesis

- So what does all this mean for carbon budgets?
- Three of the five components of SR15 carbon budgets:

# C4MIP / ZECMIP synthesis

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# C4MIP / ZECMIP synthesis

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  - TCRE
    - No change in TCRE magnitude or spread since CMIP5
    - BUT: change in **source** of uncertainty
      - N-cycle has reduced spread in land-carbon, leaving greater role for climate response uncertainty

# C4MIP / ZECMIP synthesis

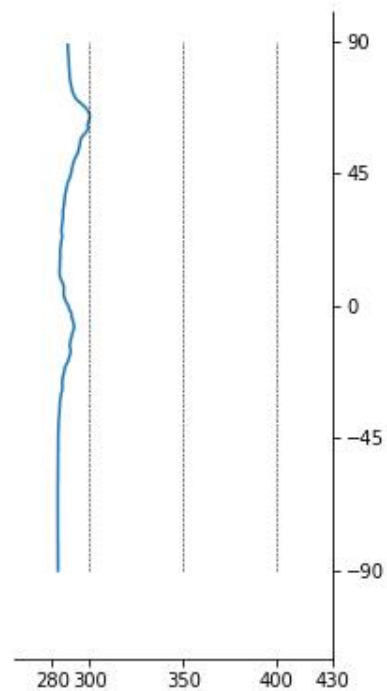
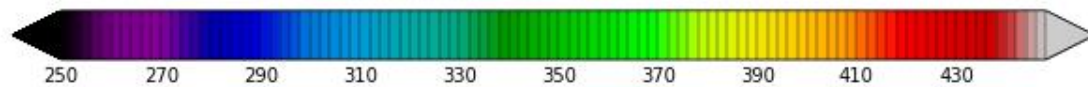
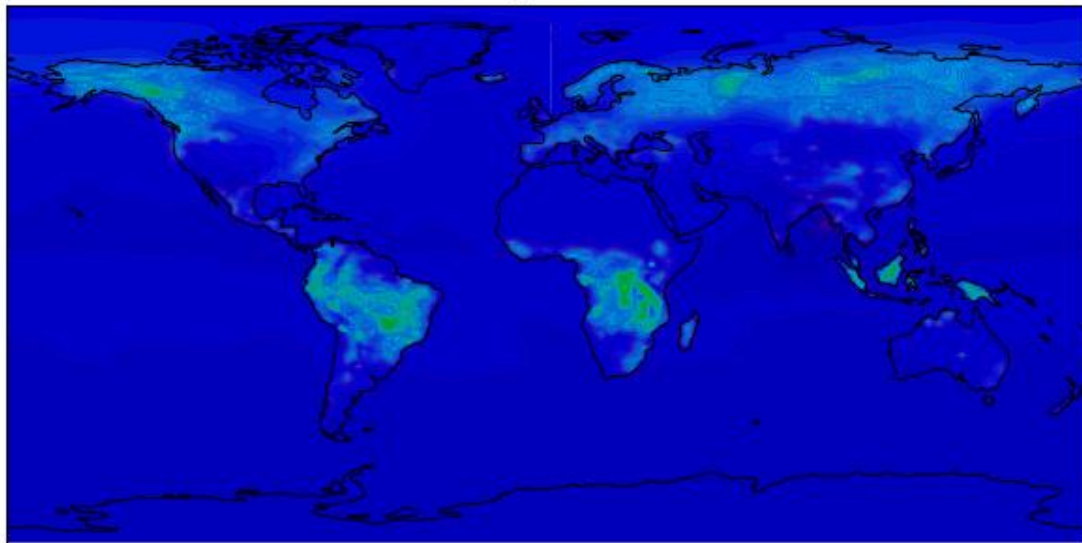
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    - BUT: change in **source** of uncertainty
      - N-cycle has reduced spread in land-carbon, leaving greater role for climate response uncertainty
- Missing processes / ES feedbacks
  - Permafrost – still not accounted for in ESMs
  - N-cycle: partially accounted for
    - SR15 framework doesn't allow for this! a work in progress how to account for it

# CMIP6 successes and failures?

- CMIP6 has been hugely challenging
  - More complex models, more MIPs, much bigger data request
  - Shorter timelines?
- Carbon stocks?
  - Still rubbish! Community must do more to improve this aspect
- Reduced uncertainty?
  - Maybe not quantitatively, but better understanding of processes
- Terrestrial N-cycle in 6/11 models
  - Appears to have reduced model spread
  - Needs fuller process-evaluation
- A reminder of complexity...



Surface CO<sub>2</sub>, 1850 : 1 : 16 : 0





# Concluding comments

- CMIP6 marks 3<sup>rd</sup> generation of coupled climate-carbon cycle ESMs
- Headline numbers not hugely different from CMIP5...
- BUT – there has been progress
  - Confirmation of ZEC=0, and understanding of mechanisms
  - Increased complexity (N-cycle) in land models has led to reduced spread of response
  - TCRE uncertainty now more controlled by climate sensitivity than carbon cycle feedbacks
- Next steps
  - Improved consideration of carbon stocks and residence times
  - Emergent constraints, perhaps regionally, on responses
  - Treatment of mixed-complexity (“partially included processes”) in carbon budgets framework

# References

## Key references for this talk

### C4MIP protocol and results

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### ZECMIP protocol and results

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