

# **Constraining LGM Ocean Carbonate Chemistry and Circulation using Data Assimilation**

Michelle Frazer (Rice University)

Lee Kump (Penn State University)

Andy Ridgwell (University of California Riverside)

2024 Paleoclimate Working Group Meeting

This work was supported by the Heising-Simons Foundation

## **Goal:**

explore the role of the ocean carbon cycle and circulation changes in deglaciation using data assimilation and an intermediate complexity earth-system model cGENIE

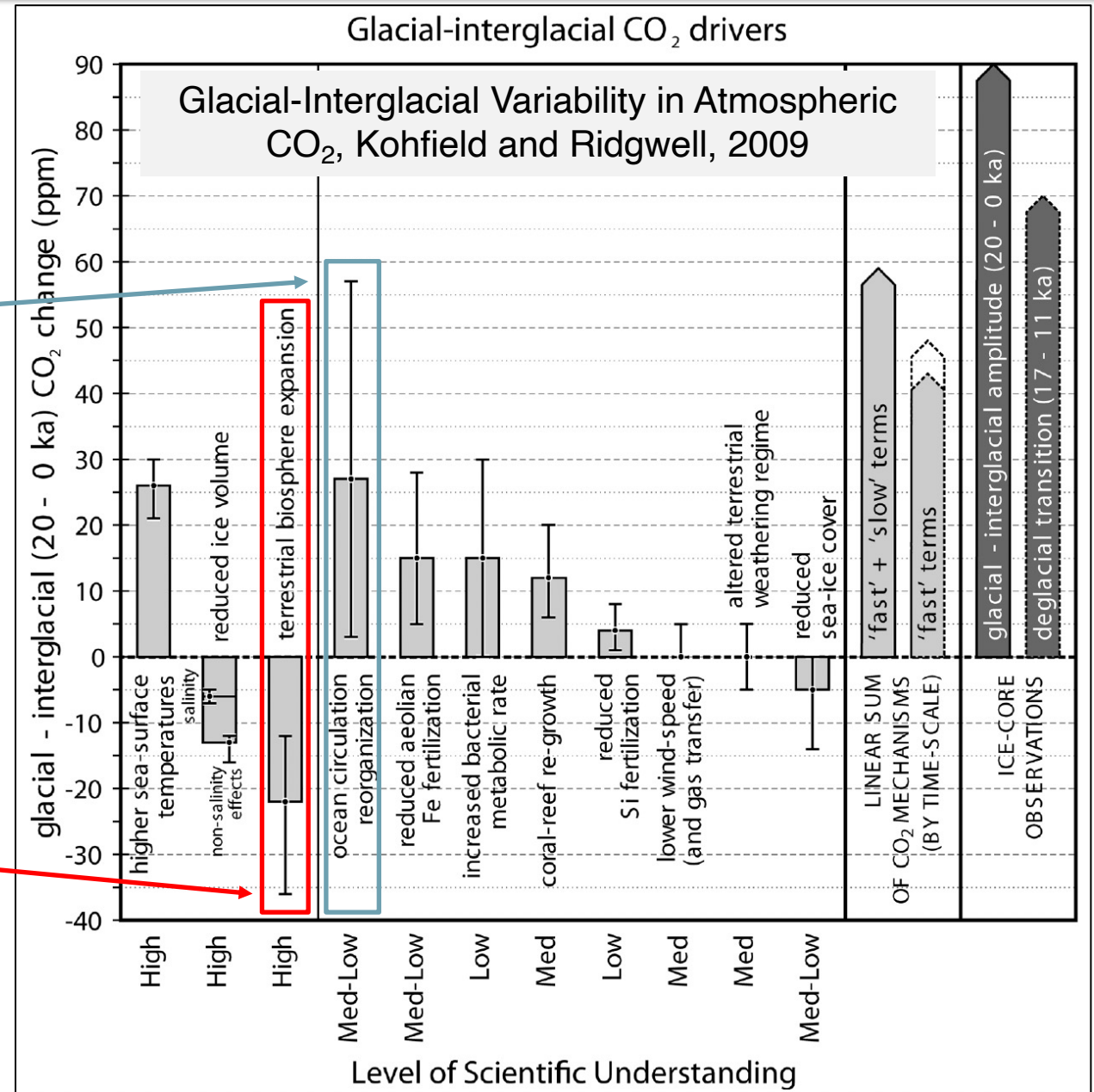
1. Background
2. Tools
  - cGENIE
  - data assimilation
3. Reconstruction
4. Key Finding
5. Takeaways

## Why increase in CO<sub>2</sub> from the Last Glacial Maximum (LGM) to the late Holocene (HOL)?

- Multiple proposed components
- Example, changes in ocean circulation

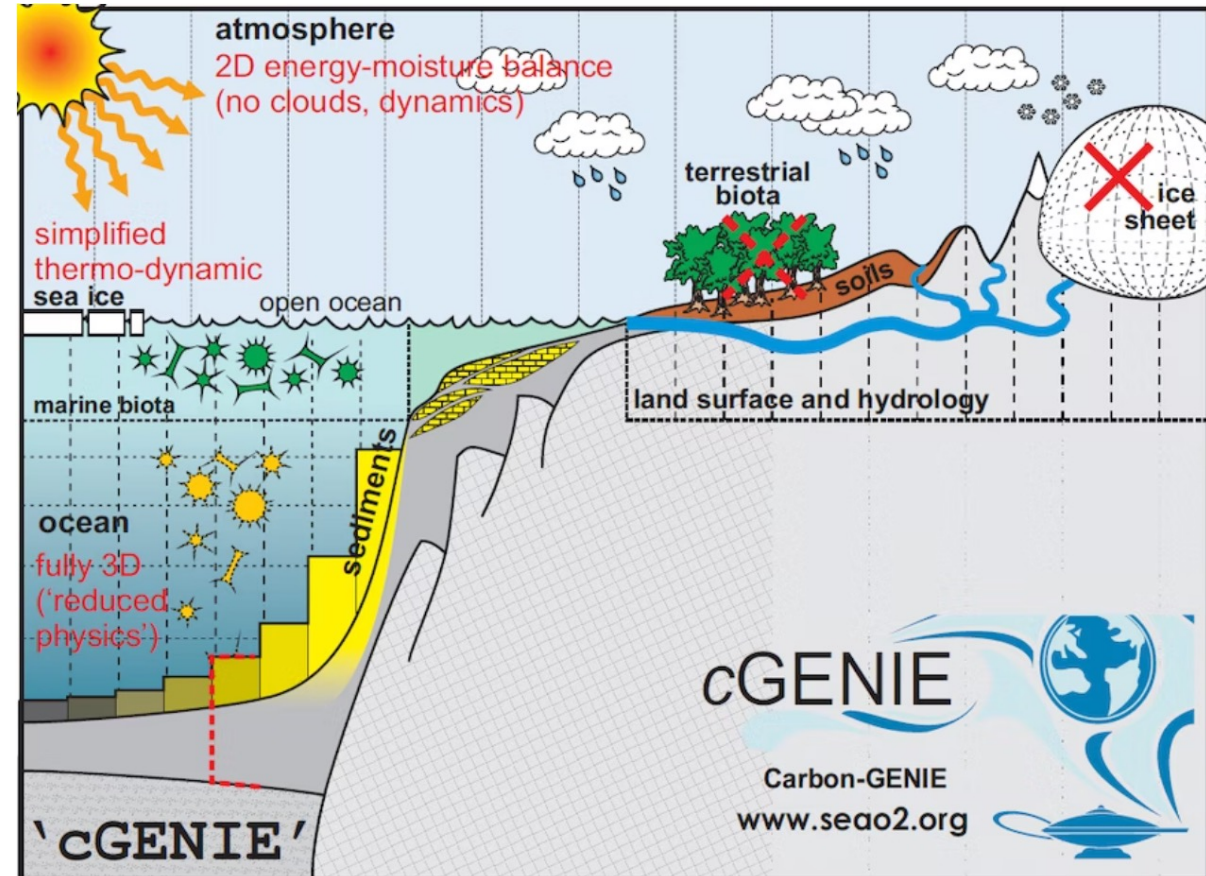
## Benthic foraminiferal proxy data:

- An increase in  $\delta^{13}\text{C}$  is inferred from benthic foraminiferal data
- Peterson et al, 2014:
  - whole-ocean  $\delta^{13}\text{C}$  increase of  $0.34 \pm 0.19\text{‰}$  estimated from 480 benthic foraminiferal records
  - implies an uptake in carbon by terrestrial biosphere consistent with recent vegetation model estimates of 330–694 Pg C



## cGENIE: a chemistry enabled earth system model of intermediate complexity (EMIC)

- Components include:
  - biogeochemical cycling
  - ocean circulation
  - ocean–atmosphere exchange
  - ocean–sediment exchange
  - geological cycle of carbon
- Prior: 60-member, 20k-year ensemble
- LGM and HOL scenarios with volume correction
- Latin hypercube sampling of 3 tuning parameters:
  - wind stress scaling → general circulation
  - freshwater flux → NADW formation
  - brine water rejection → S Ocean source



## Data assimilation combines model and proxy data to create an ensemble reconstruction

$$X_a = X_b + K(Y - \hat{Y})$$

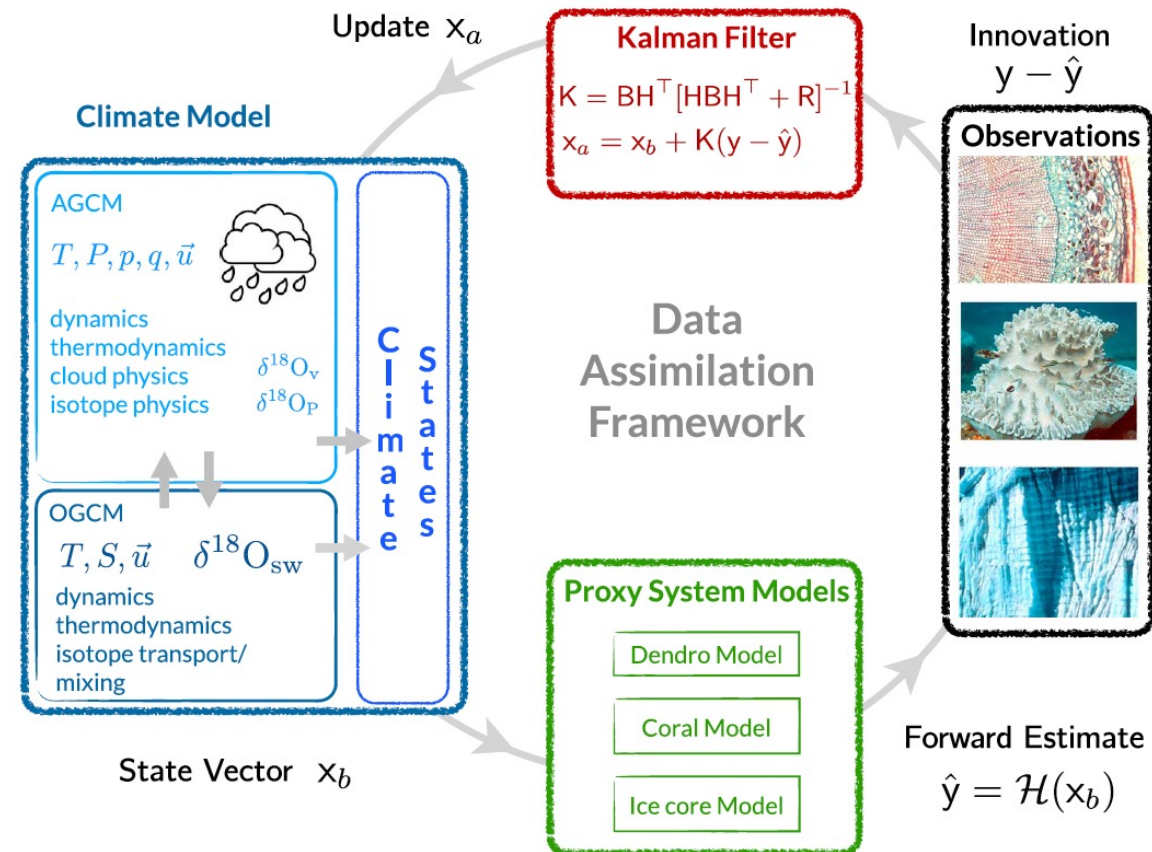
- $X_a$ : “analysis” posterior = update
- $X_b$ : “background” prior = climate model output
- $Y - \hat{Y}$ : innovation
  - $Y$ : proxy records
  - $\hat{Y}$ : estimate from proxy system models
- $K$ : Kalman gain matrix for weighting

### Innovation:

- $\delta^{13}\text{C}$  from *Peterson et al, 2014*, >200 sites
- cGENIE outputs  $\delta^{13}\text{C}$

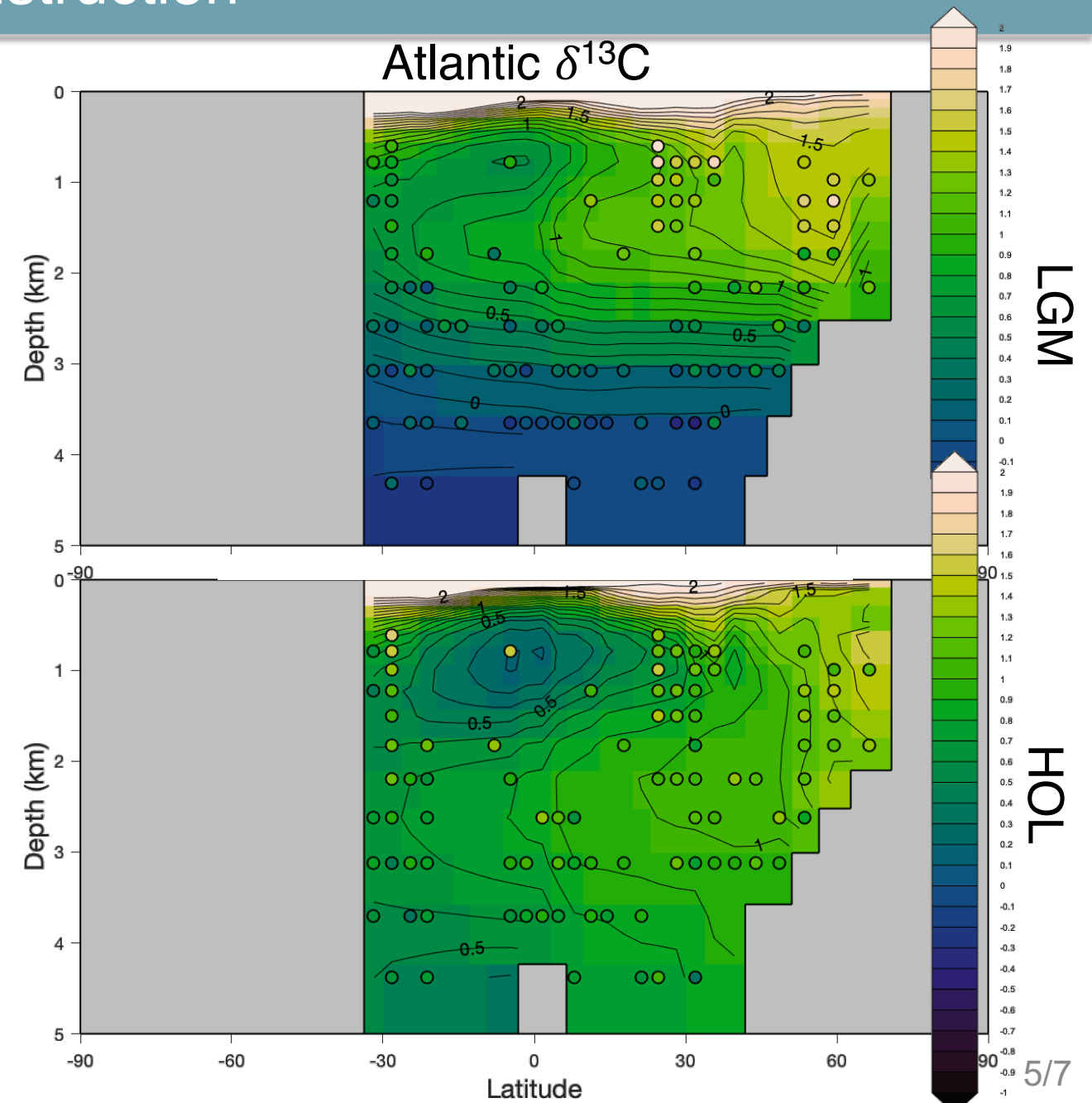
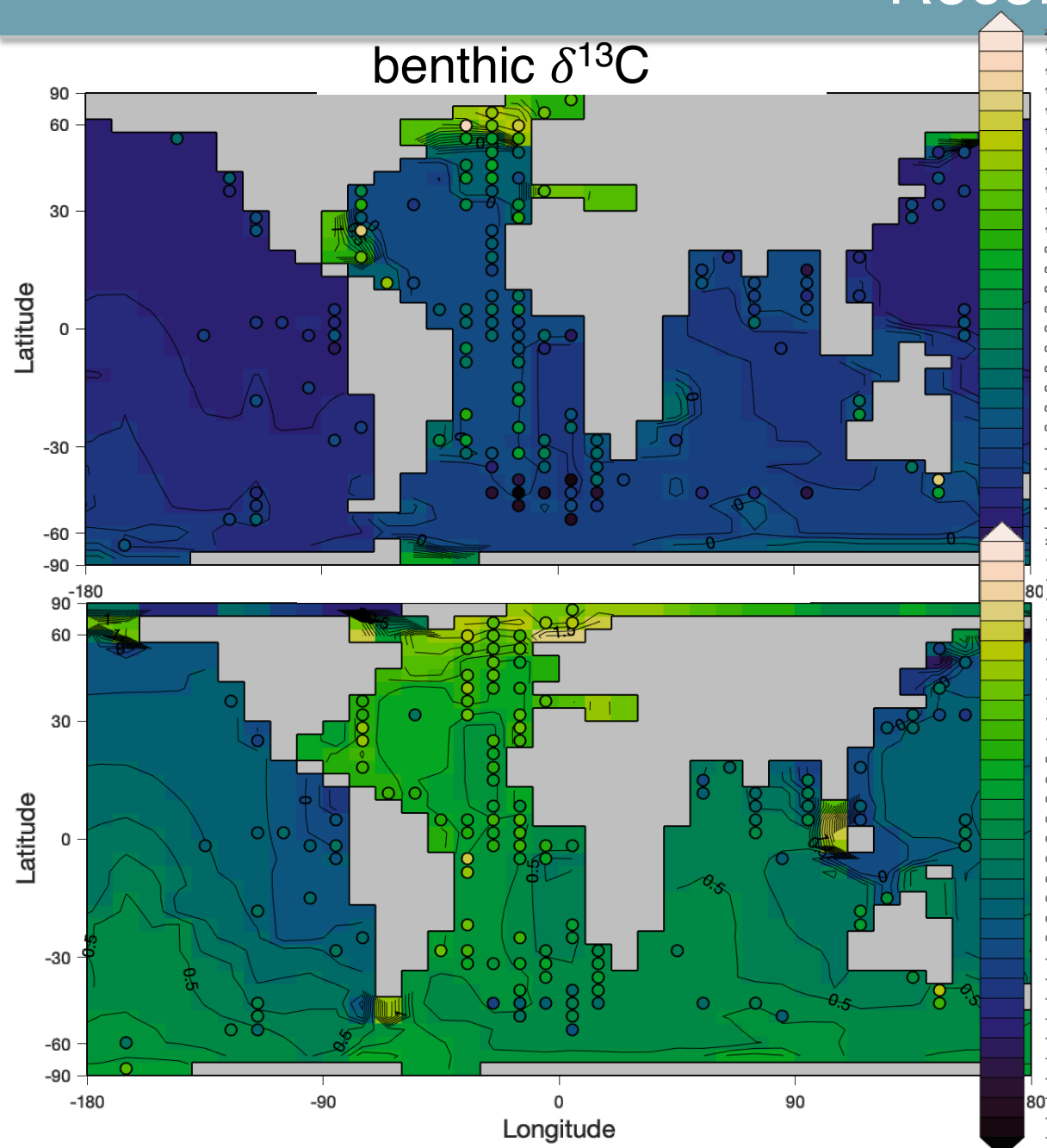
### Posterior:

- mean and 60-member ensemble
- varied uncertainty/error, localization, re-gridding
- using DASH (Jonathan King, available on GitHub)



*Hakim et al, 2016*

# Reconstruction



# Key Finding

## Carbon inventories:

- Whole-ocean  $\delta^{13}\text{C}$  increase of  $0.22 \pm 0.1\text{‰}$
- DIC increase of  $-33 \pm 50 \text{ Pg}$  (aka, a decrease)

	LGM_DA		HOL_DA	
	C (Pg)	$\delta^{13}\text{C}$ (‰)	C (Pg)	$\delta^{13}\text{C}$ (‰)
Atmos CO <sub>2</sub>	410	-6.46	584	-6.35
Ocean DIC	36462	0.23	36429	0.45
Total	36872	0.15	37014	0.34
	(sum)	(weighted)	(sum)	(weighted)

## Theory:

- Expected change in  $\delta^{13}\text{C}$  accompanied by insignificant DIC change: what does that mean?
- From LGM  $\rightarrow$  HOL, we see an increase in isotopically heavy carbon
- One way is to accumulate isotopically neutral carbon and bury organic matter
- Another possibility is terrestrial carbon growth pulling out light carbon, but also a large increase in neutral carbon
- If  $\delta^{13}\text{C}$  change was only by terrestrial carbon change, would be significantly less DIC in HOL

**Conclusion: unable with these results to interpret the ocean  $\delta^{13}\text{C}$  change in terms of terrestrial biosphere growth**

## Constraining LGM Ocean Carbonate Chemistry and Circulation using Data Assimilation

### Ongoing Work:

- $\text{CaCO}_3$  co-assimilation with sediments module: add ALK as parameter → can we recover modern ALK? Same carbon storage results?
- Where are the  $\delta^{13}\text{C}$  changes coming from (if not from terrestrial carbon storage)? → add tracers to explore carbon cycle

**With a range of data assimilation solutions, our results are contrary to the conventional interpretation of an increase in  $\delta^{13}\text{C}$  in the Holocene corresponding to uptake by terrestrial biosphere.**

**We also demonstrate the power of combining models with proxy data through rigorous data assimilation methods.**

*To discuss further: [michelle.frazer@rice.edu](mailto:michelle.frazer@rice.edu)*