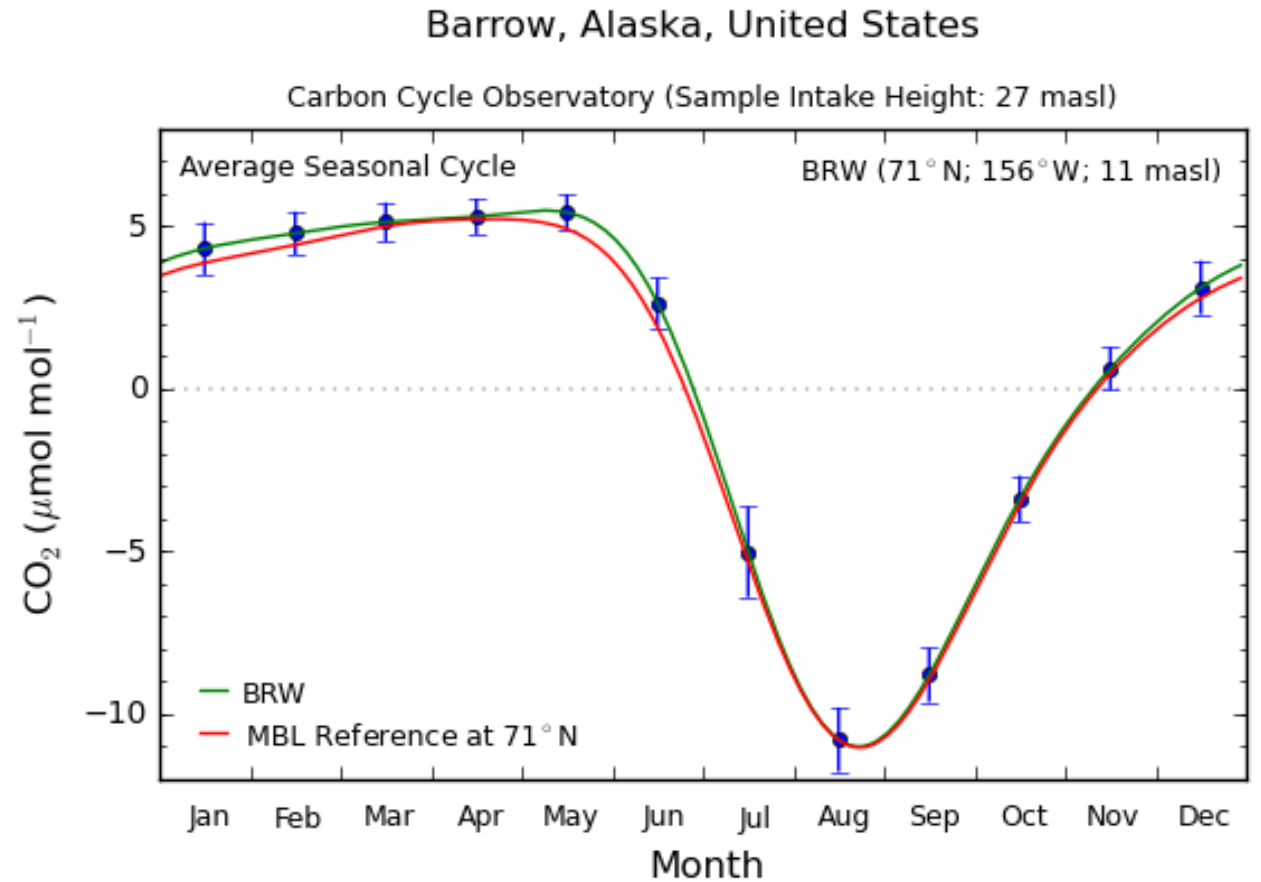
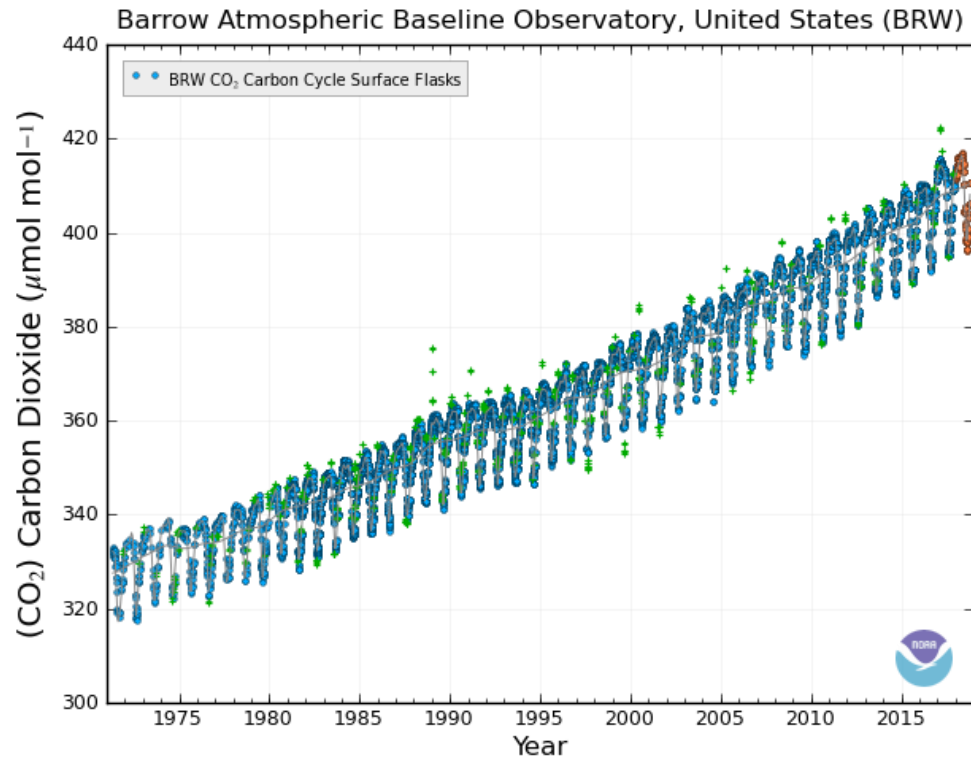
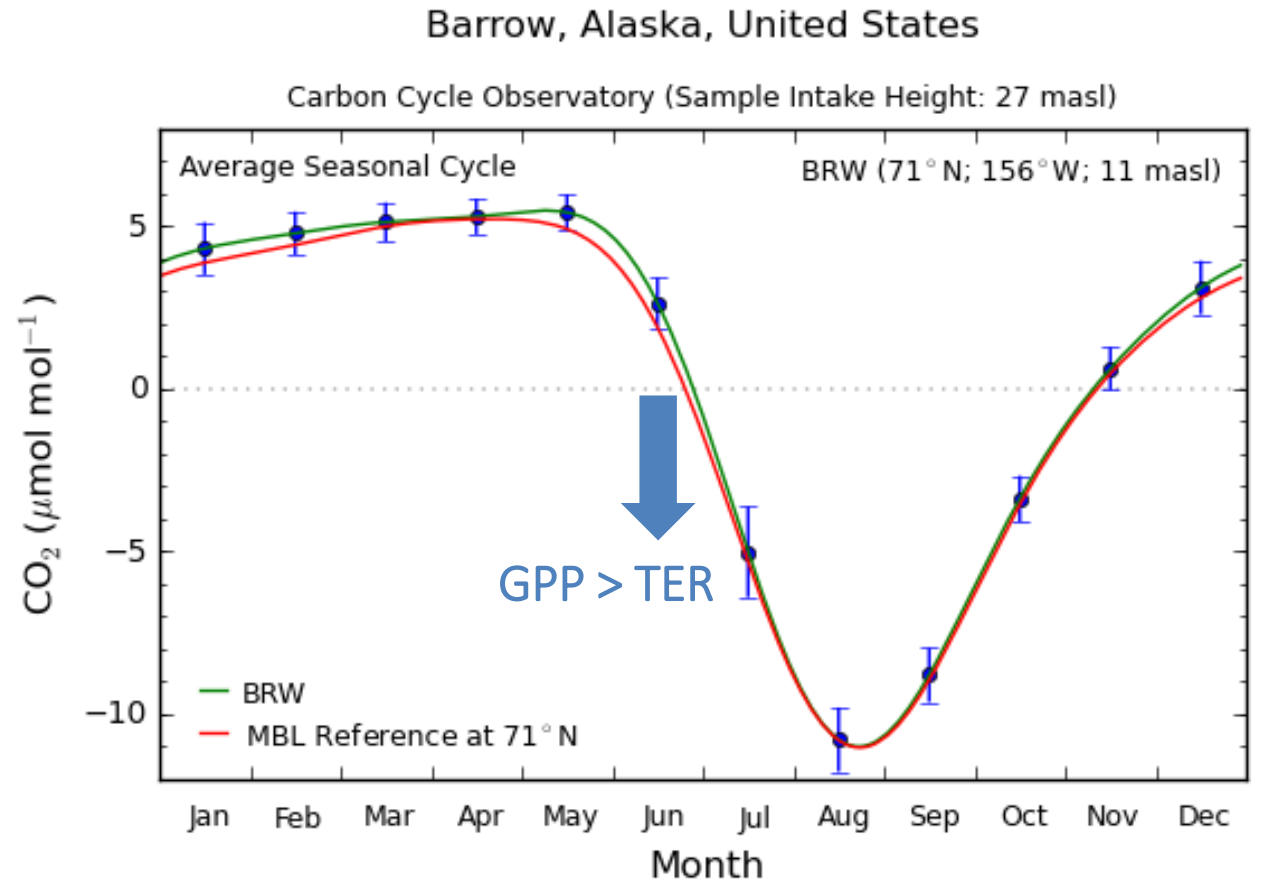
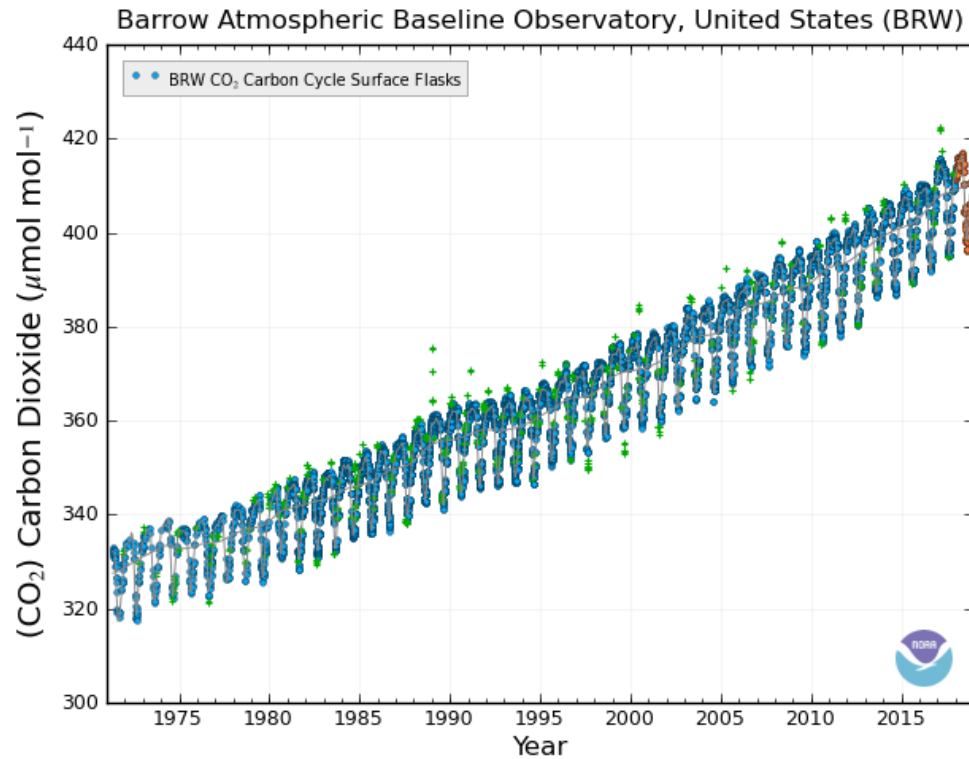


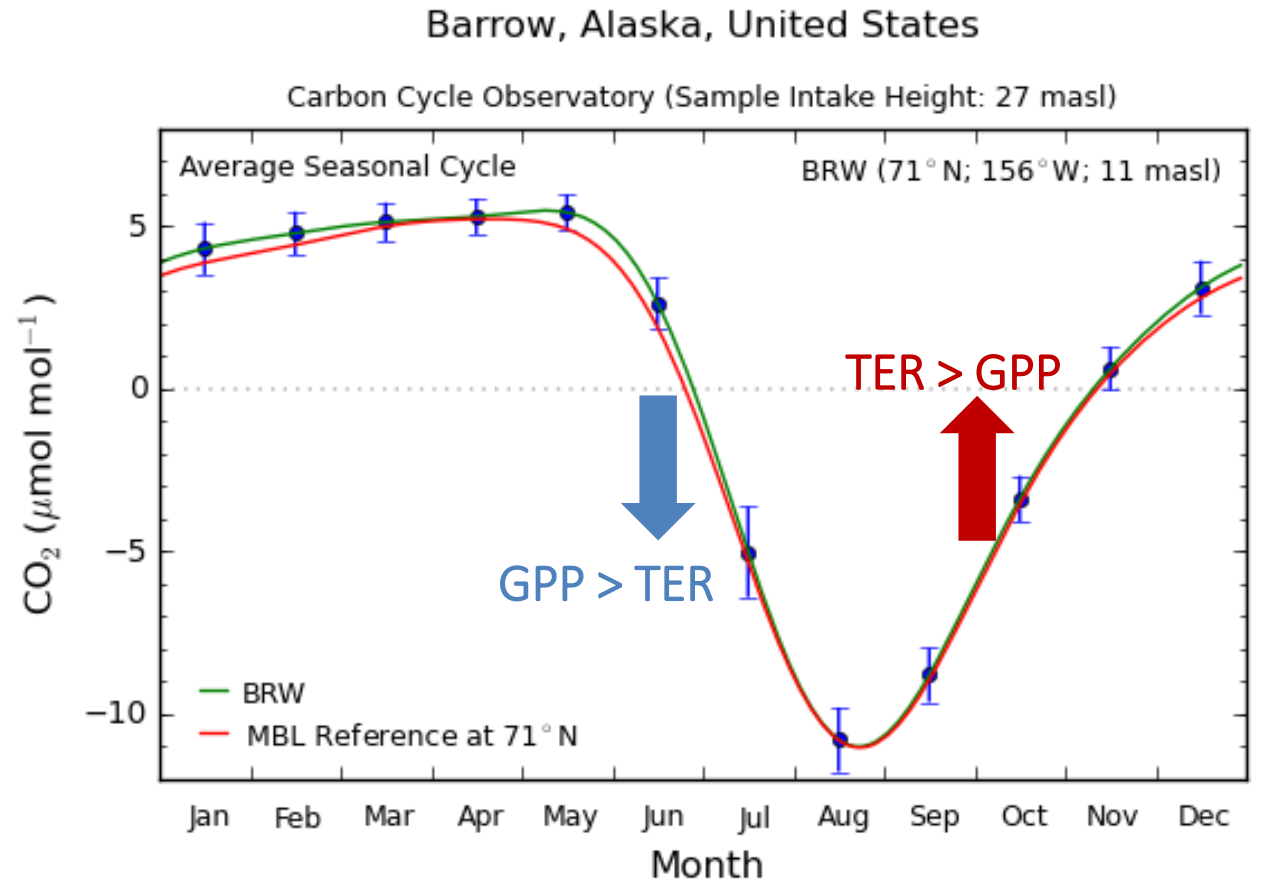
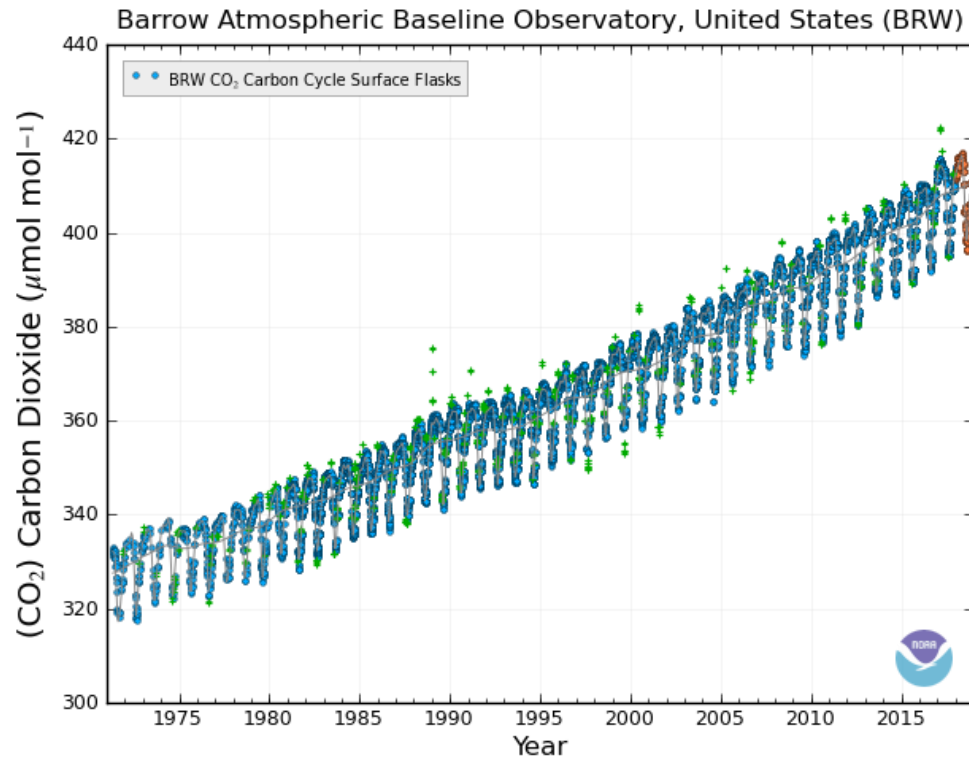
# Attribution of CO<sub>2</sub> seasonal cycle amplification in Northern Hemisphere: Analyses based on a tagged CO<sub>2</sub> transport model

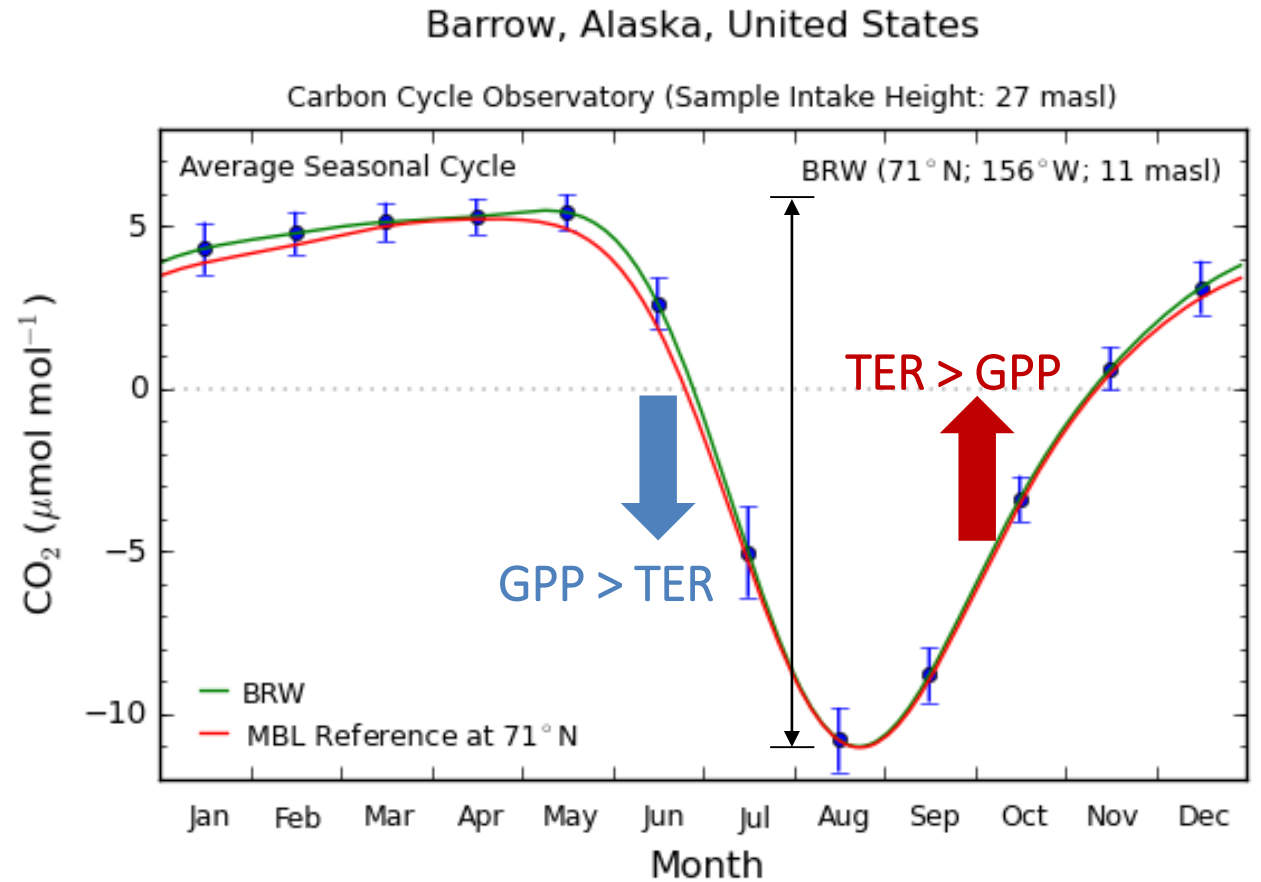
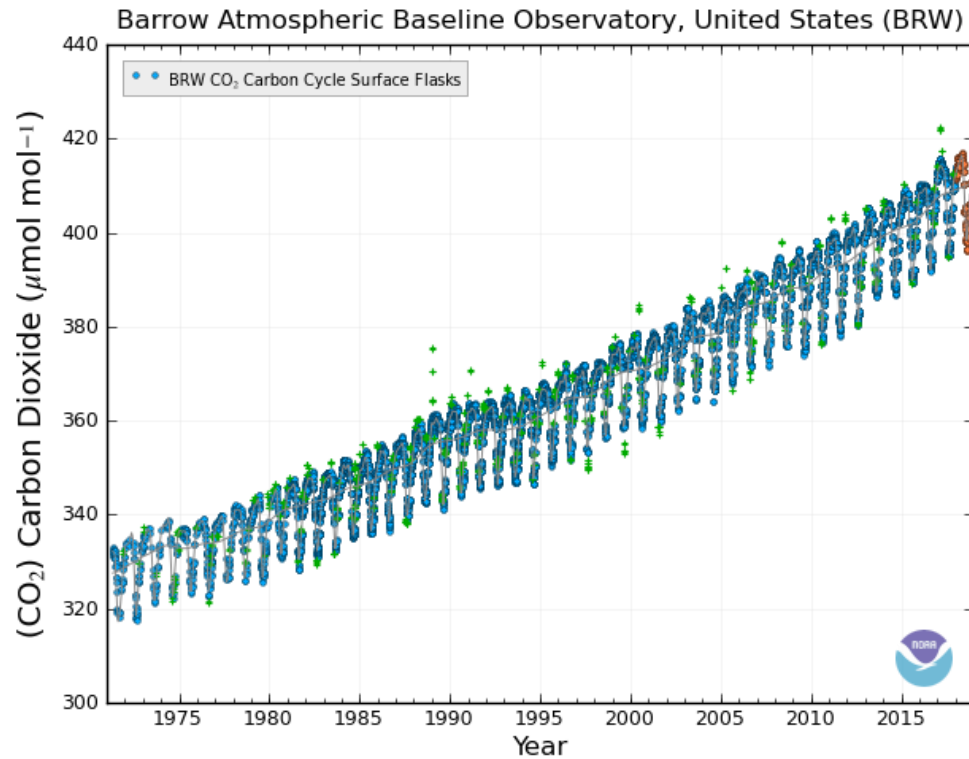
Xin Lin, Gretchen Keppel-Aleks  
University of Michigan

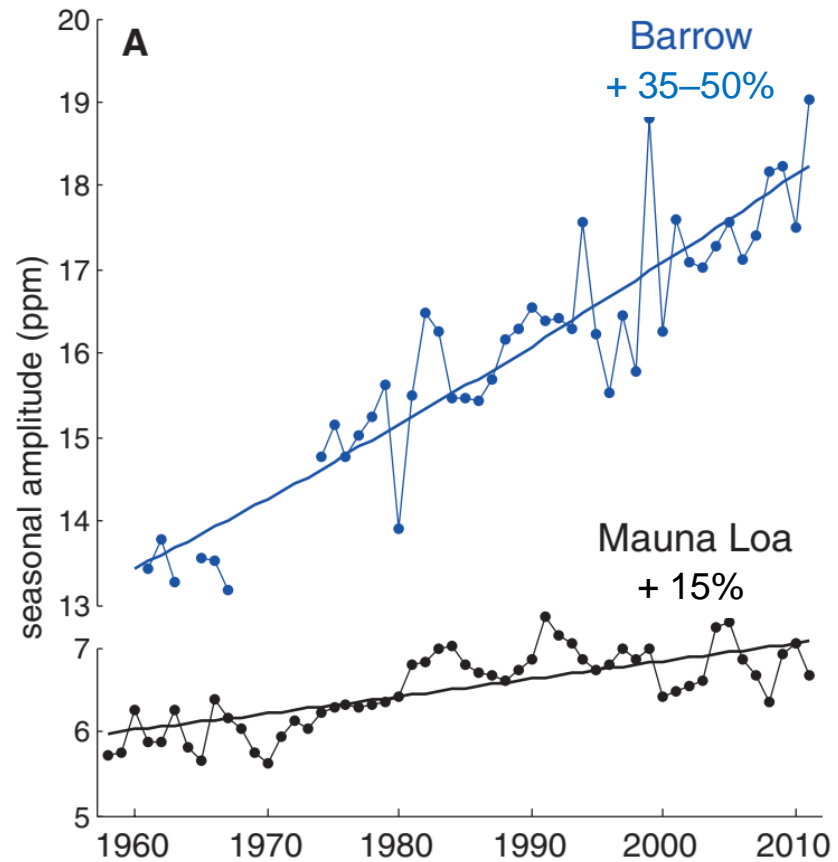
CESM Workshop, Boulder  
Feb. 13, 2019

CO<sub>2</sub> seasonal cycle as one of key indicators of carbon balance

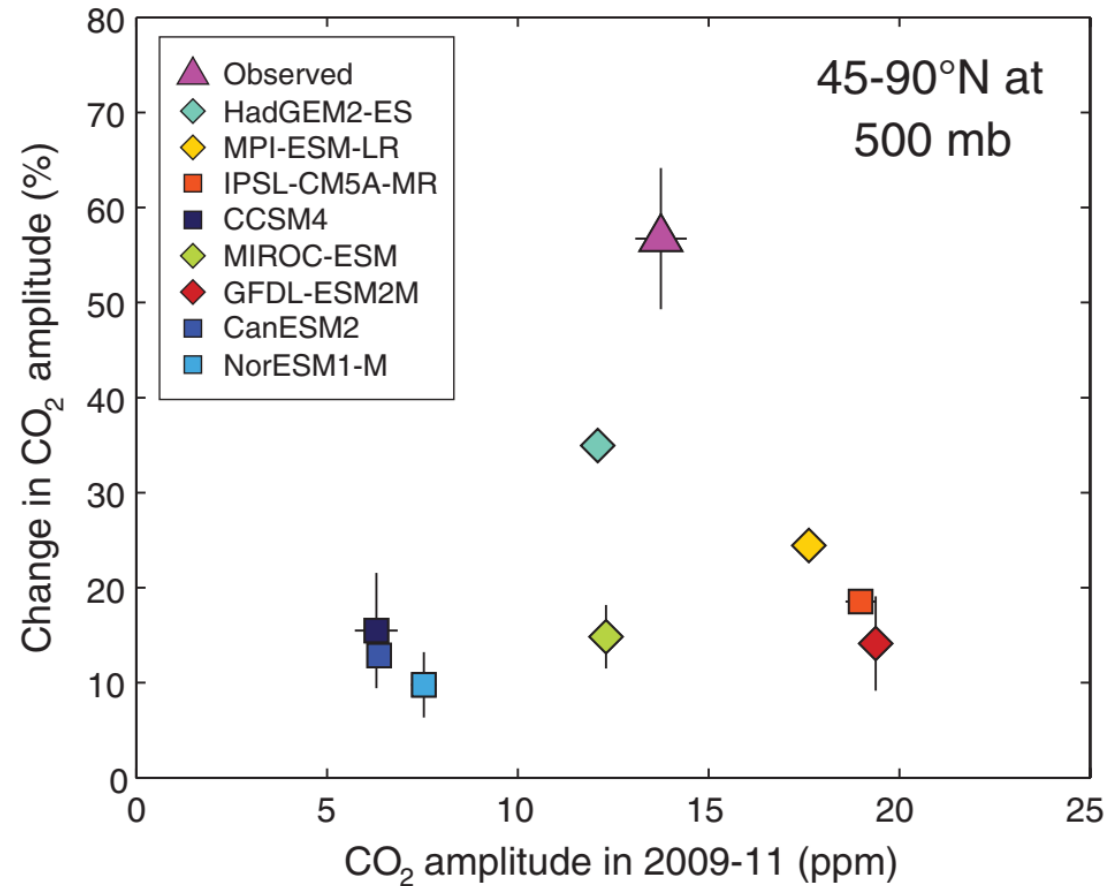
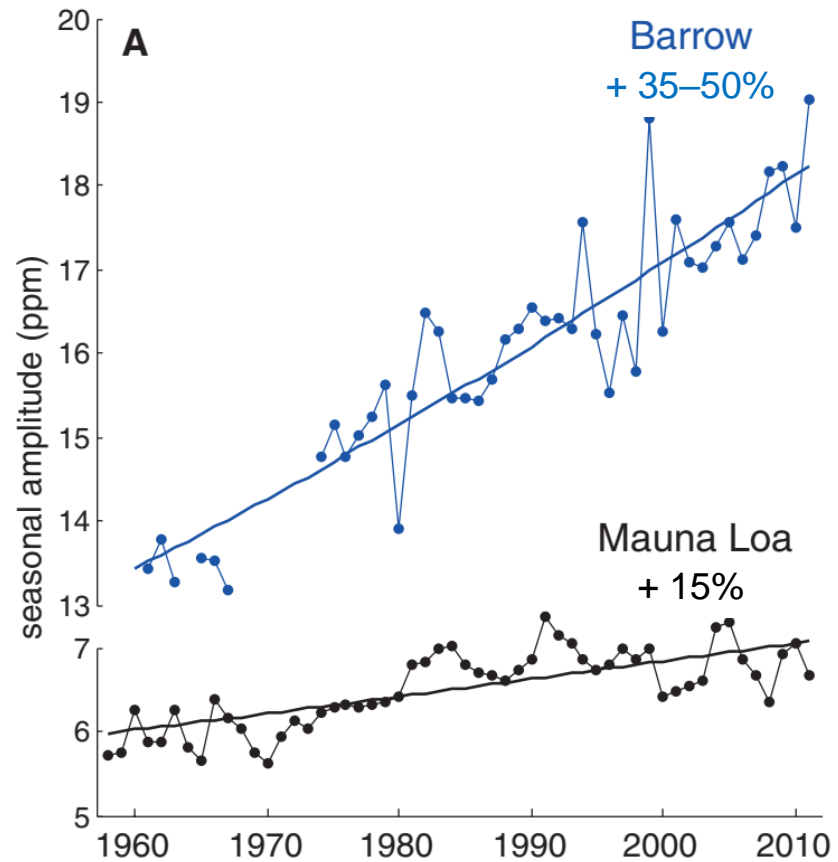
CO<sub>2</sub> seasonal cycle as one of key indicators of carbon balance

CO<sub>2</sub> seasonal cycle as one of key indicators of carbon balance

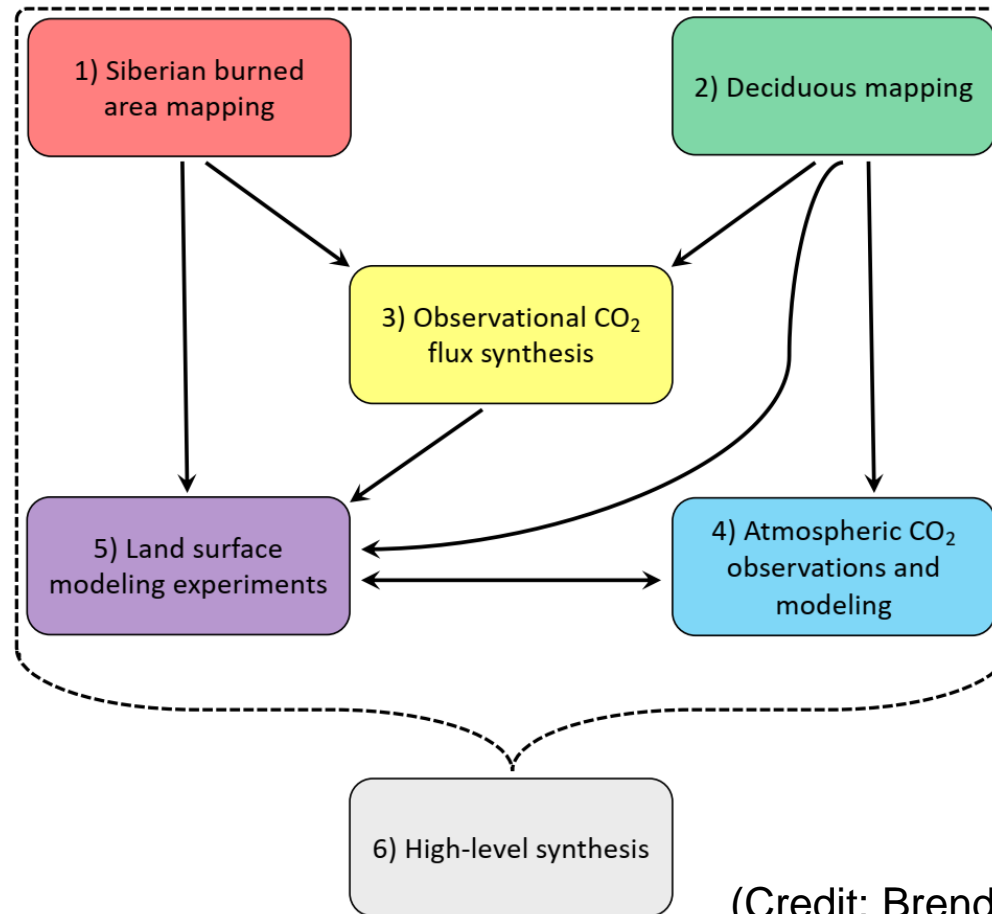
CO<sub>2</sub> seasonal cycle as one of key indicators of carbon balanceCO<sub>2</sub> seasonal cycle amplitude (SCA)

Amplification of CO<sub>2</sub> seasonal cycle in Northern Hemisphere over the past decades

(Graven et al. 2013 Science)

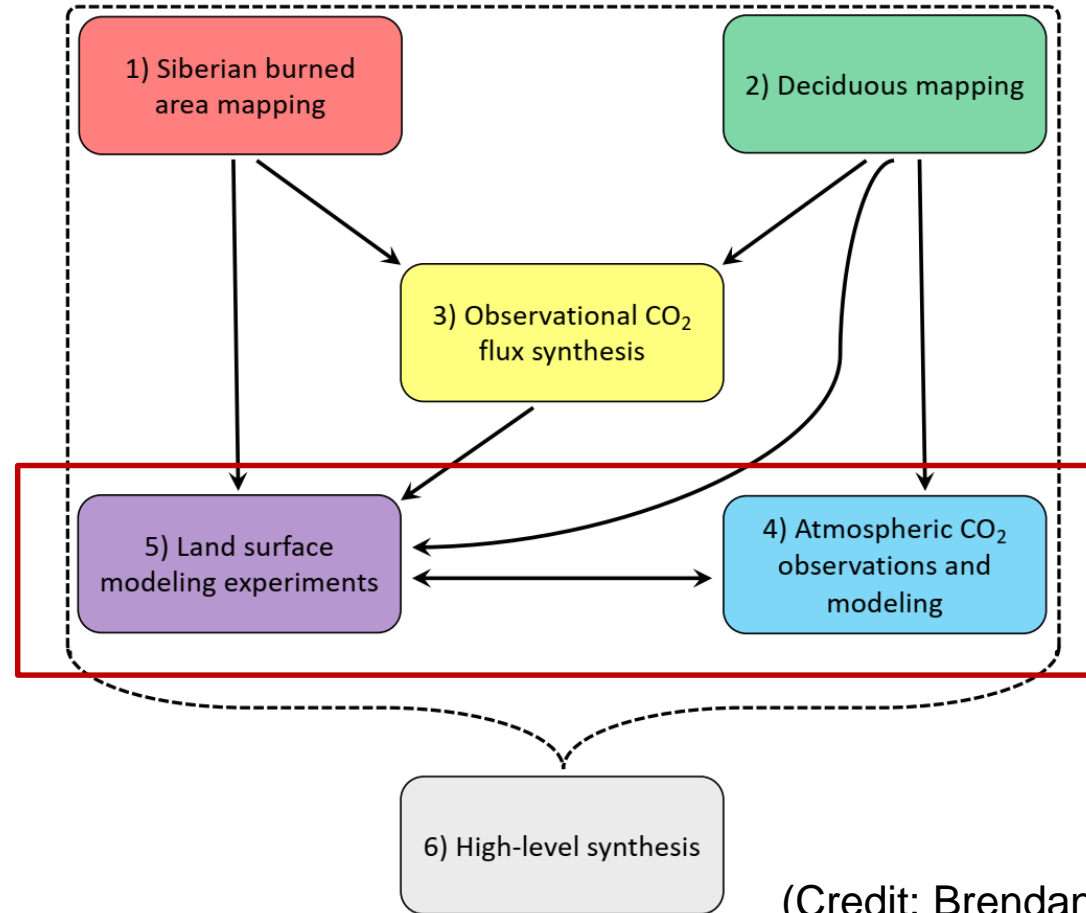
Amplification of CO<sub>2</sub> seasonal cycle in Northern Hemisphere over the past decades

(Graven et al. 2013 Science)

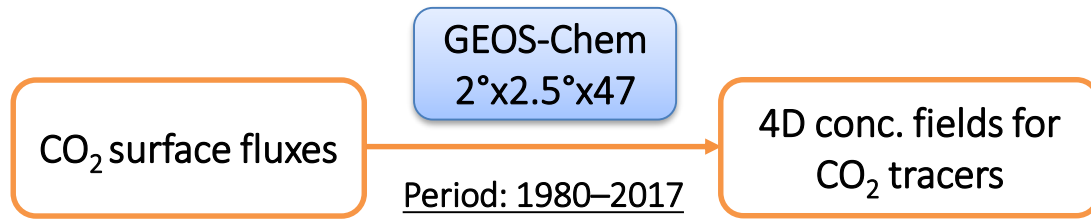


(Credit: Brendan Rogers)

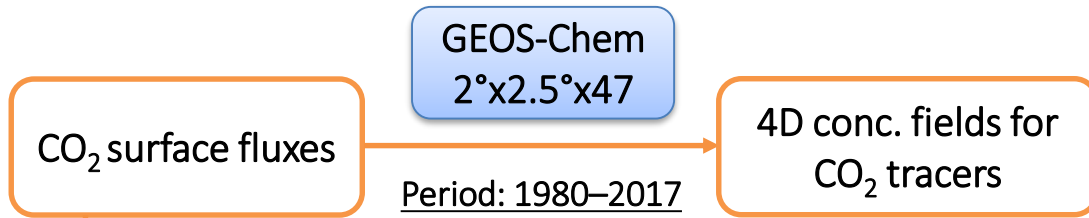




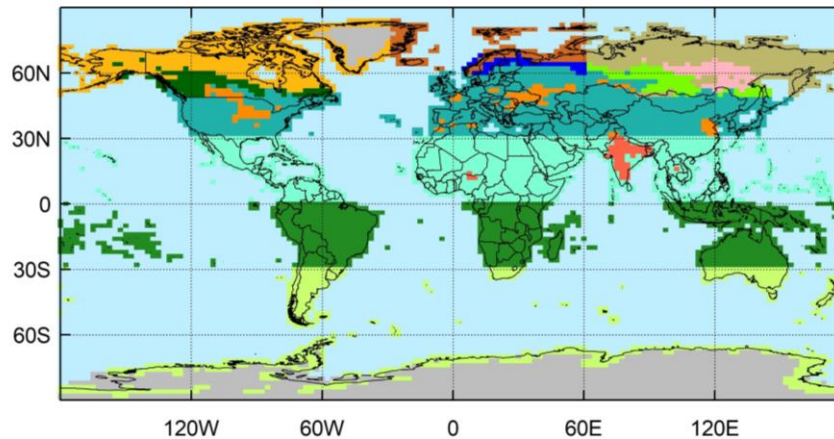
(Credit: Brendan Rogers)

The tagged CO<sub>2</sub> transport model framework

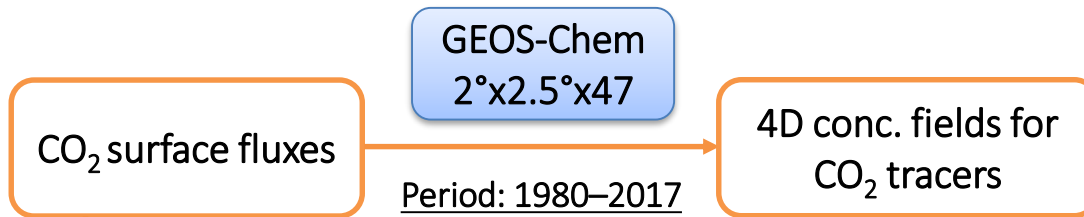
# The tagged CO<sub>2</sub> transport model framework



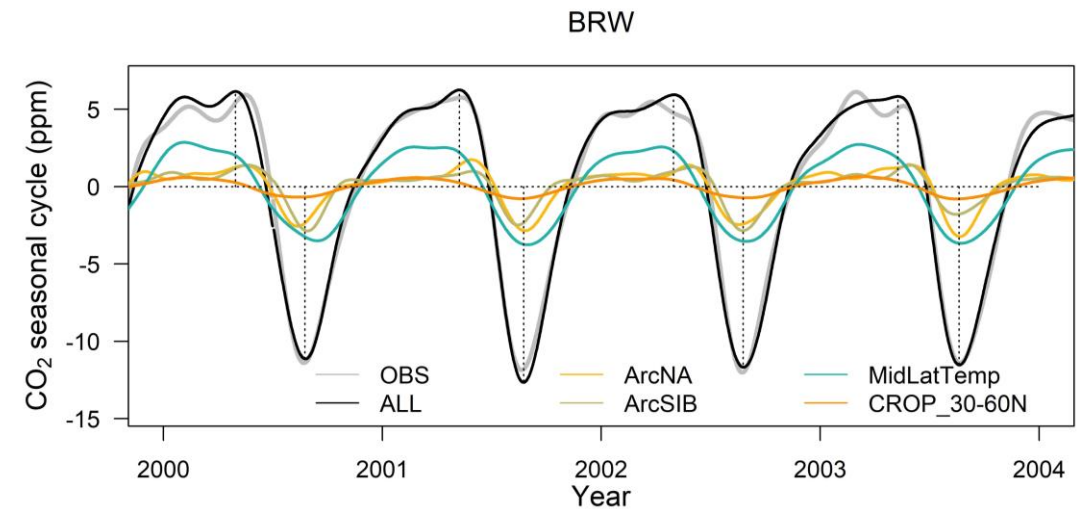
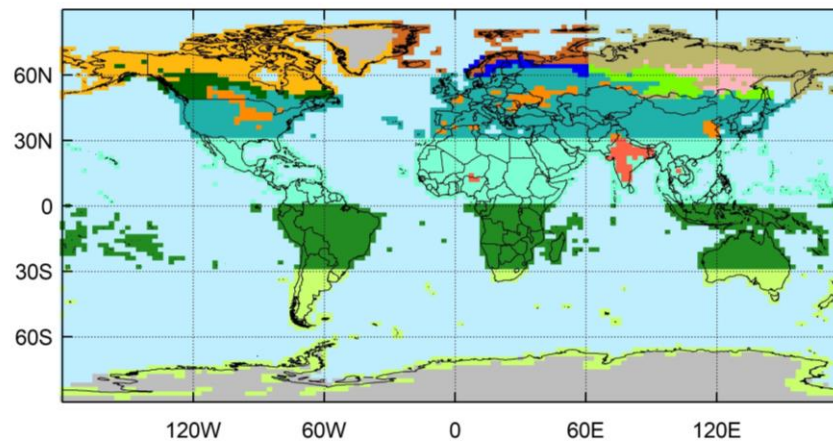
	TRACER
Total vegetated area	CO2TR1
ArcNA	CO2TR2
ArcEU	CO2TR3
ArcSIB	CO2TR4
BorEnNA	CO2TR5
BorEnEU	CO2TR6
BorEnSIB	CO2TR7
BorDnSIB	CO2TR8
MidLatTemp	CO2TR9
NatPFTs_0_30N	CO2TR10
PFTs_0_30S	CO2TR11
PFTs_30_90S	CO2TR12
CROP_0_30N	CO2TR13
CROP_30_60N	CO2TR14
Non-vegetated	
Ocean	



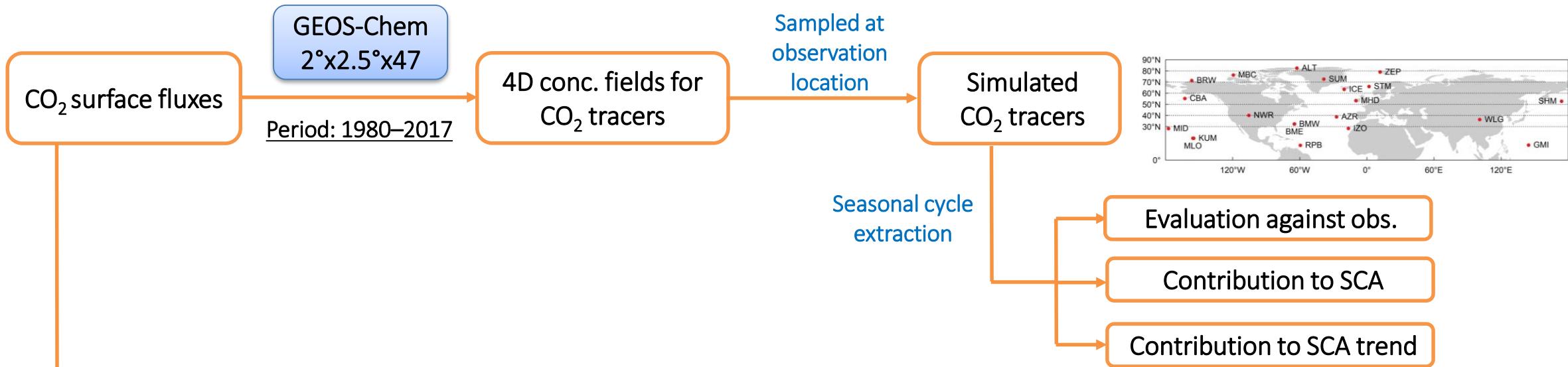
# The tagged CO<sub>2</sub> transport model framework



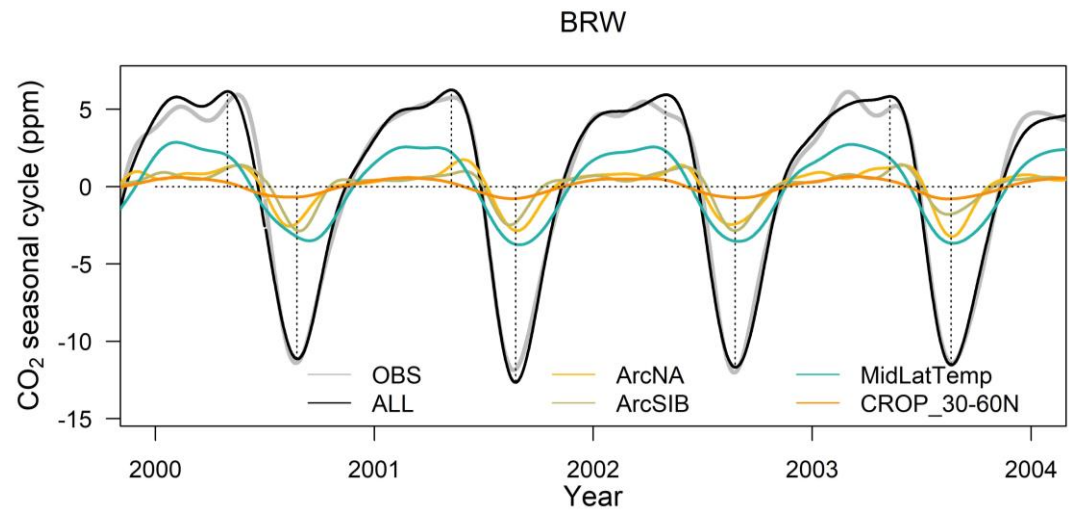
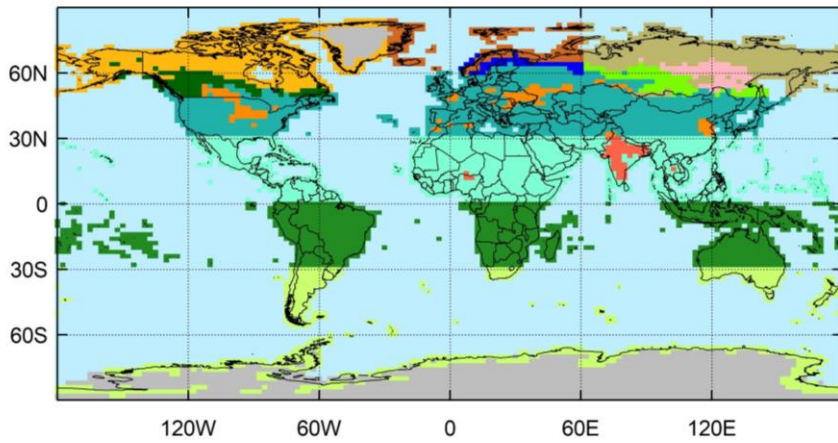
	TRACER
Total vegetated area	CO2TR1
ArcNA	CO2TR2
ArcEU	CO2TR3
ArcSIB	CO2TR4
BorEnNA	CO2TR5
BorEnEU	CO2TR6
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BorDnSIB	CO2TR8
MidLatTemp	CO2TR9
NatPFTs_0_30N	CO2TR10
PFTs_0_30S	CO2TR11
PFTs_30_90S	CO2TR12
CROP_0_30N	CO2TR13
CROP_30_60N	CO2TR14
Non-vegetated	
Ocean	



# The tagged CO<sub>2</sub> transport model framework



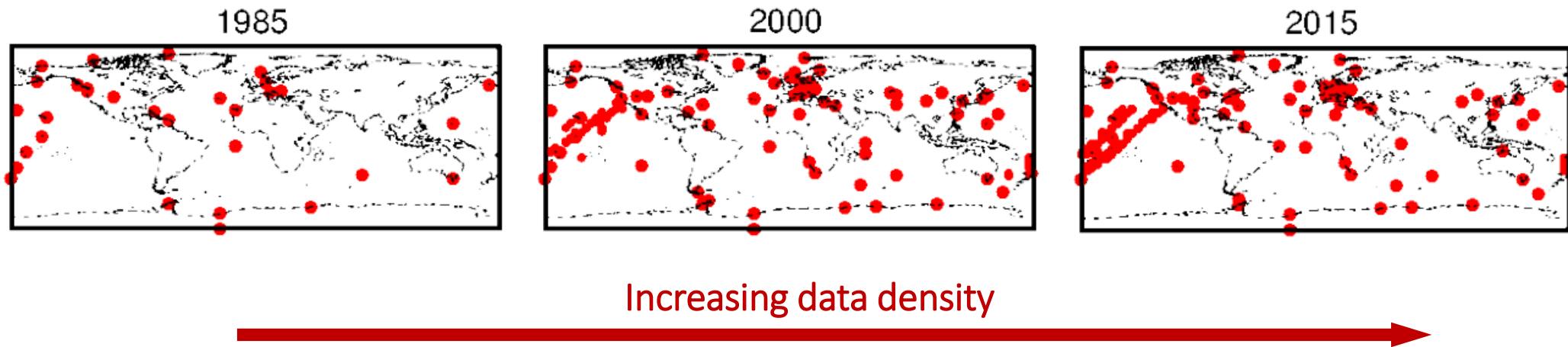
	TRACER
Total vegetated area	CO2TR1
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CROP_0_30N	CO2TR13
CROP_30_60N	CO2TR14
Non-vegetated	
Ocean	



## The inverted CO<sub>2</sub> surface fluxes used to drive the transport model

- Monthly NEE from CAMS (Copernicus Atmosphere Monitoring Service) CO<sub>2</sub> inversion v17r1 (2018)
- Flux uncertainty associated to transport errors and data density

### Location of the assimilated observations over the globe

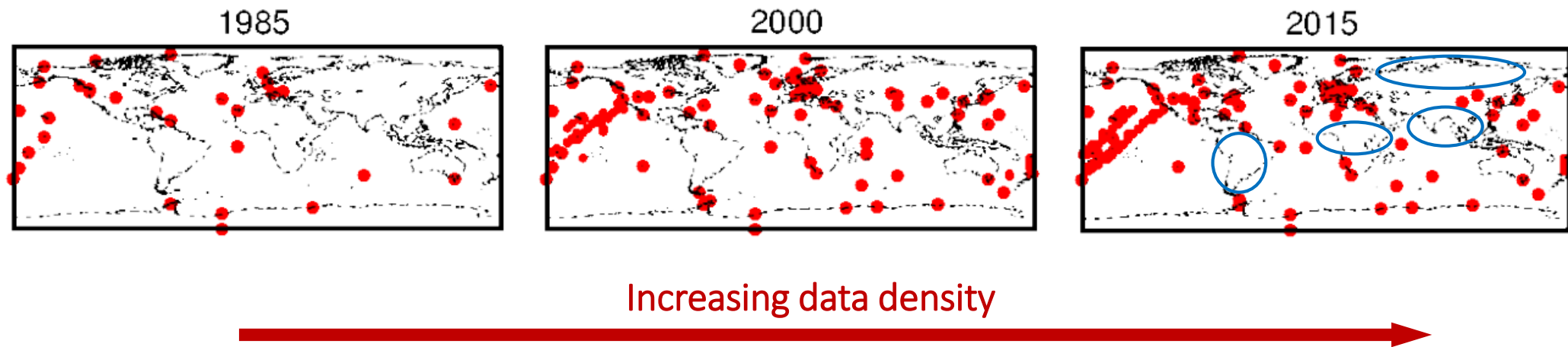


(Adapted from Chevallier et al. 2018)

## The inverted CO<sub>2</sub> surface fluxes used to drive the transport model

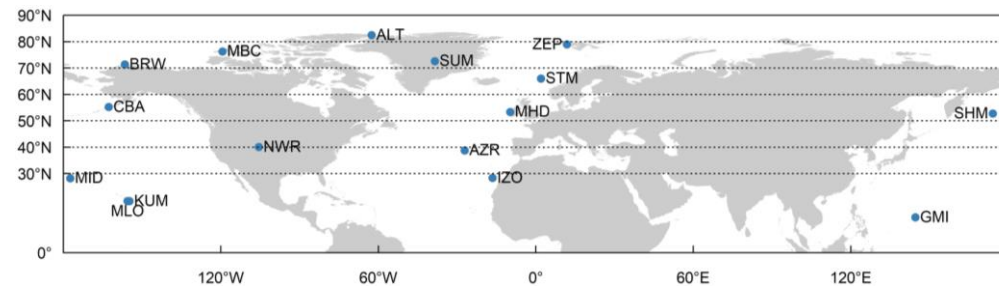
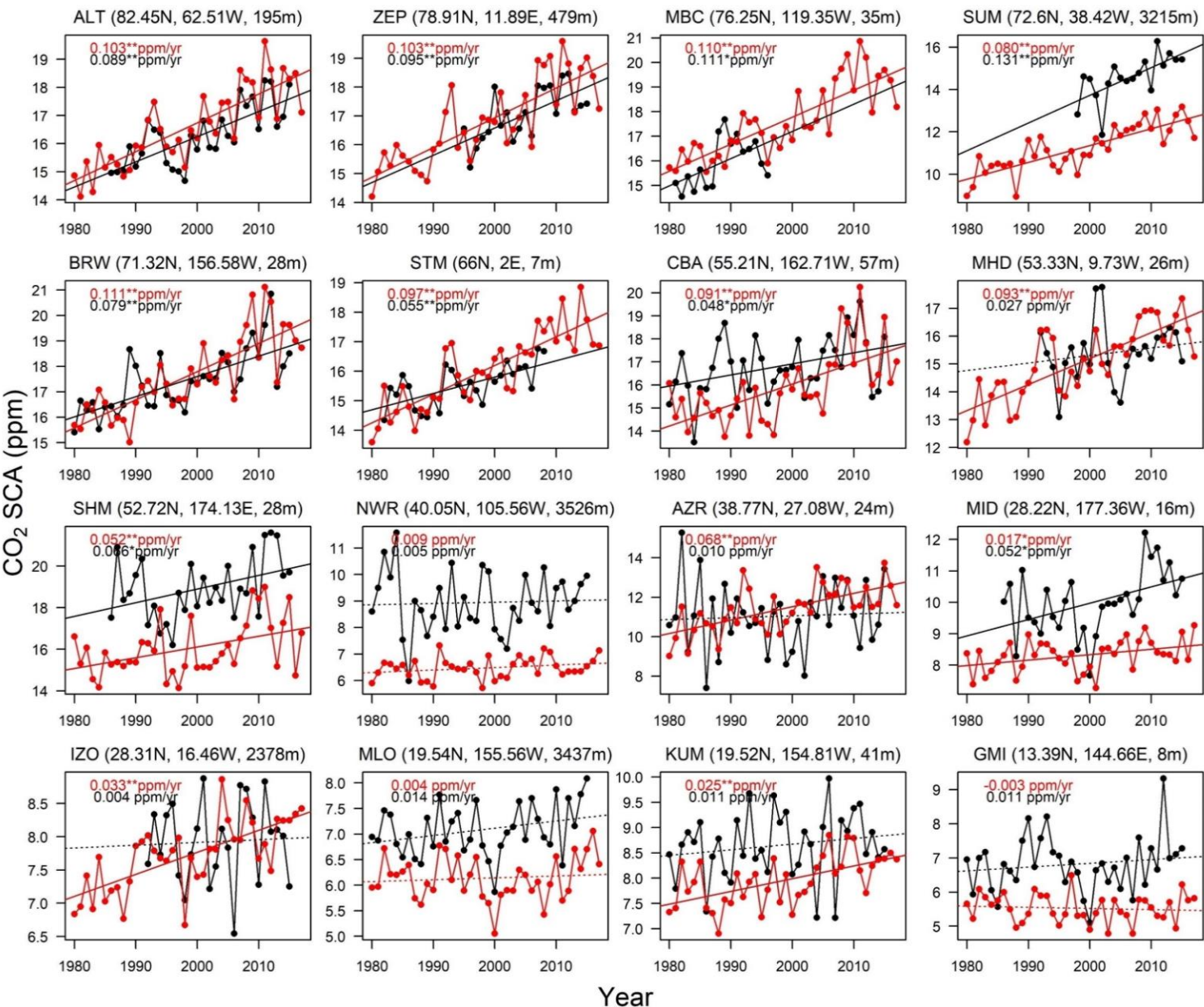
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### Location of the assimilated observations over the globe



(Adapted from Chevallier et al. 2018)

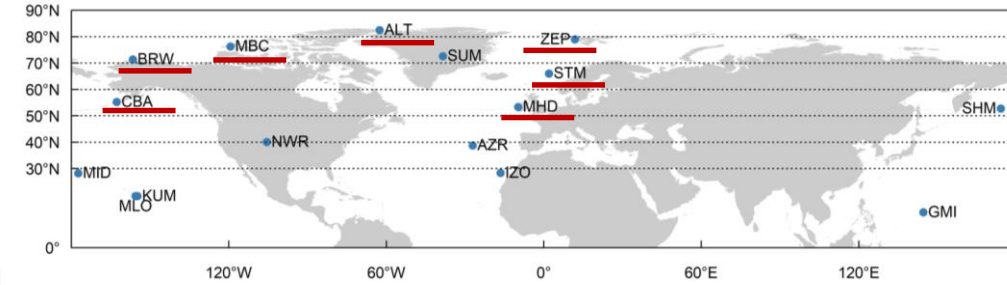
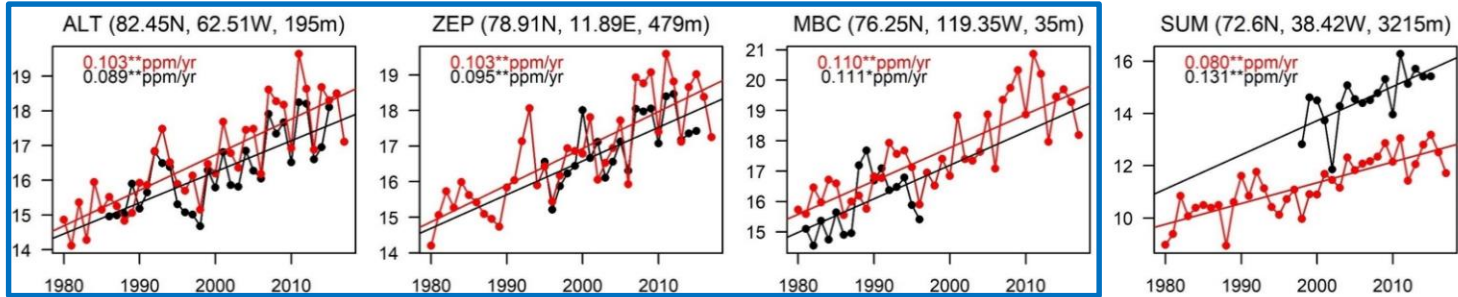
# Modelled vs. Observed CO<sub>2</sub> seasonal cycle amplitude – NOAA stations



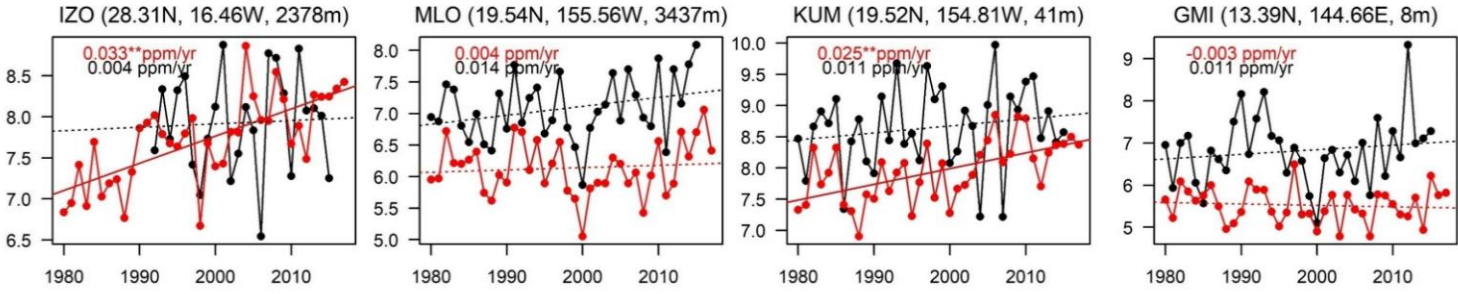
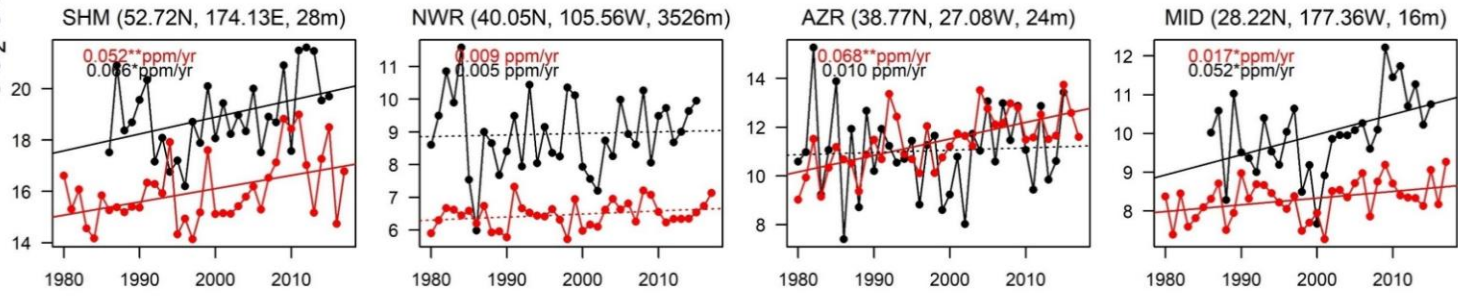
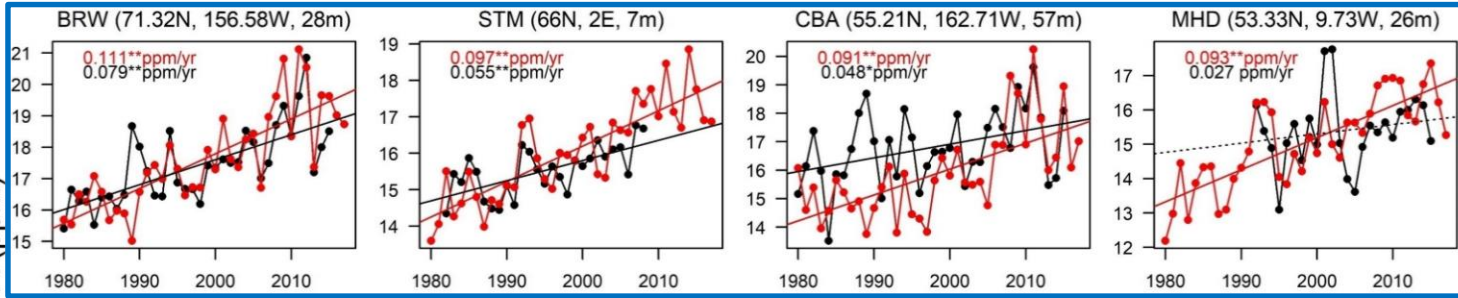
MOD  
OBS



# Modelled vs. Observed CO<sub>2</sub> seasonal cycle amplitude – NOAA stations



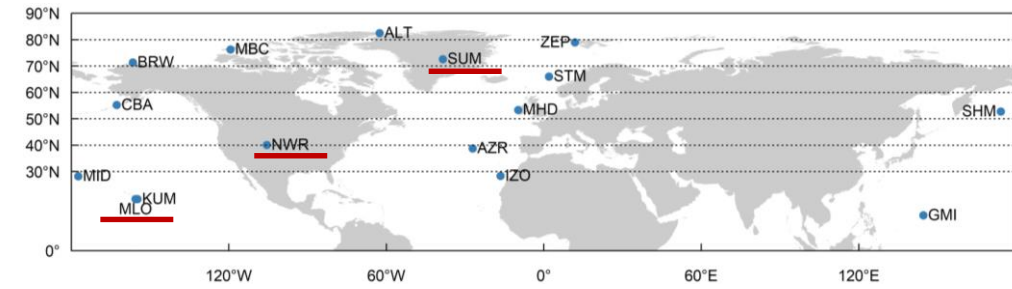
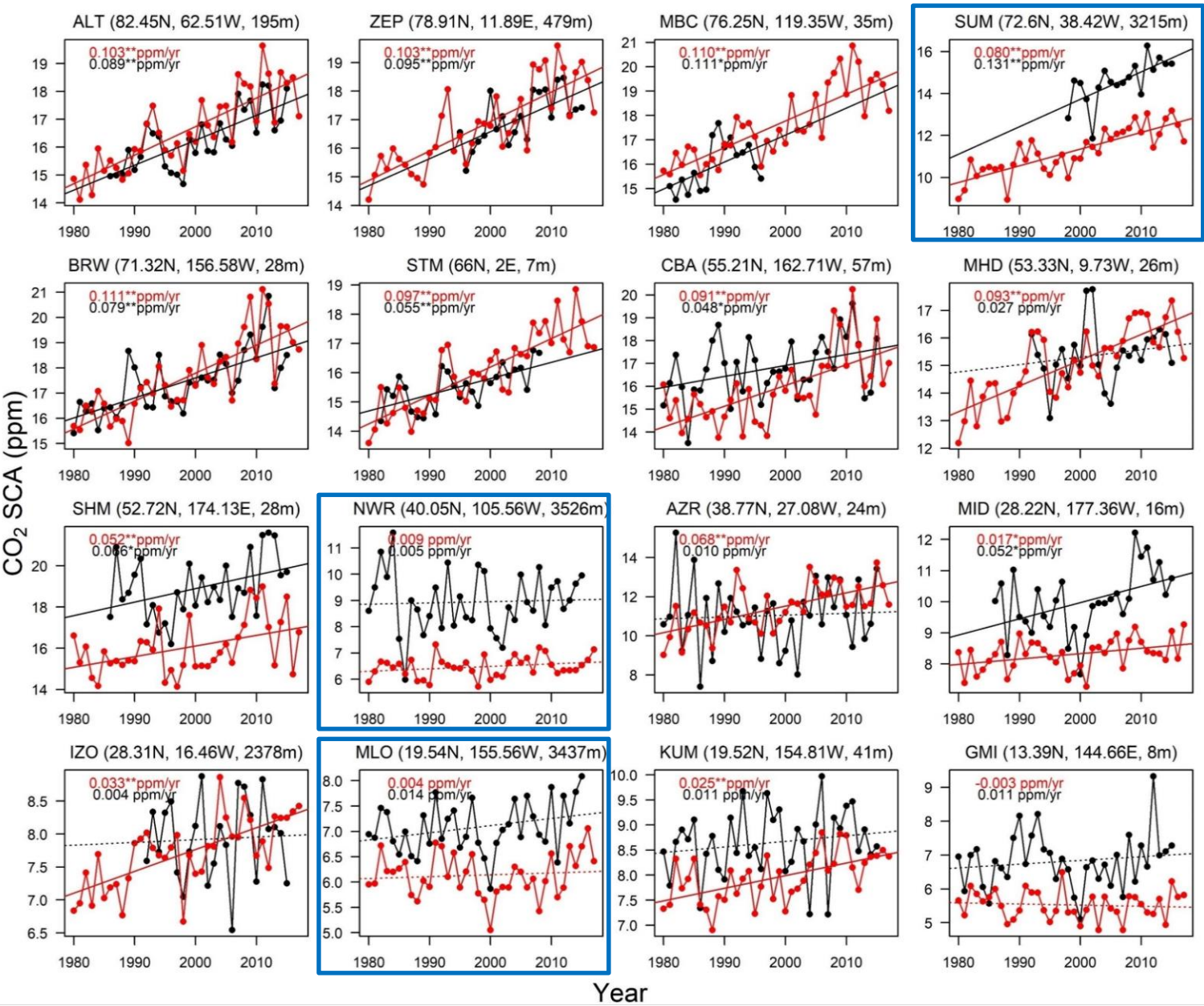
- Good at most northern high latitude stations



MOD  
OBS

Year

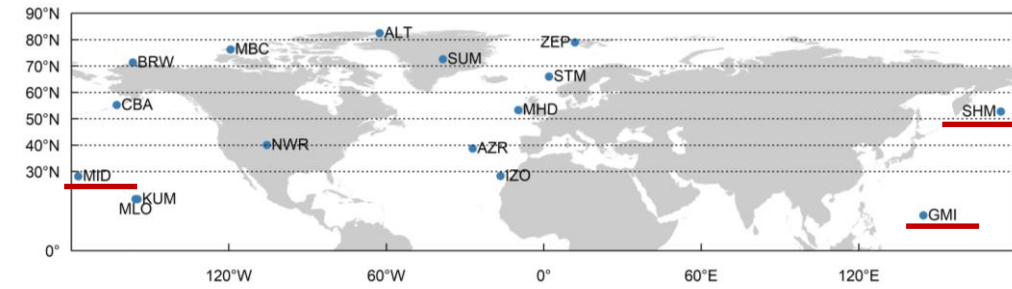
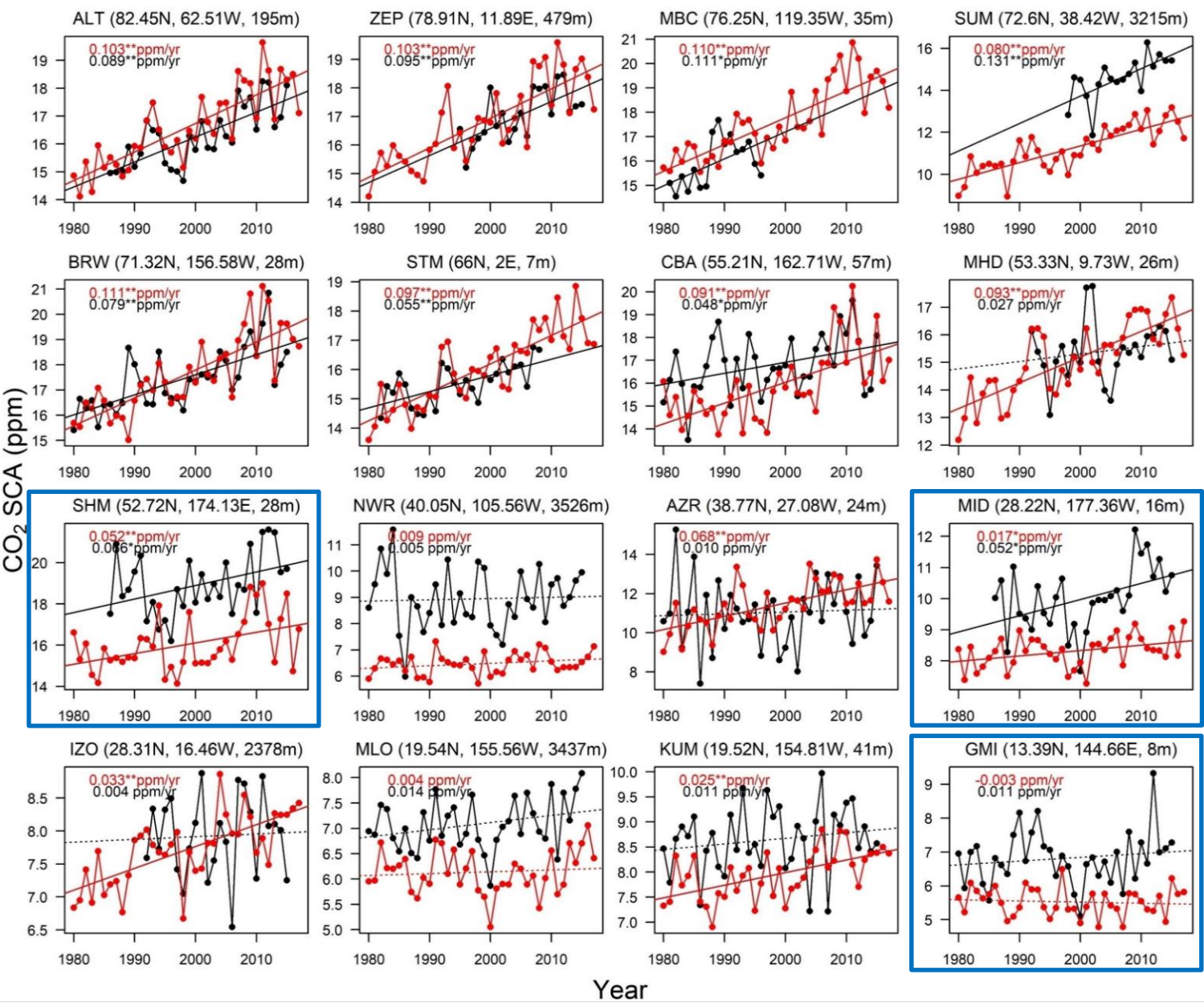
# Modelled vs. Observed CO<sub>2</sub> seasonal cycle amplitude – NOAA stations



- Good at most northern high latitude stations
- Underestimation of SCA at mountain stations (SUM, NWR, MLO)

MOD  
OBS

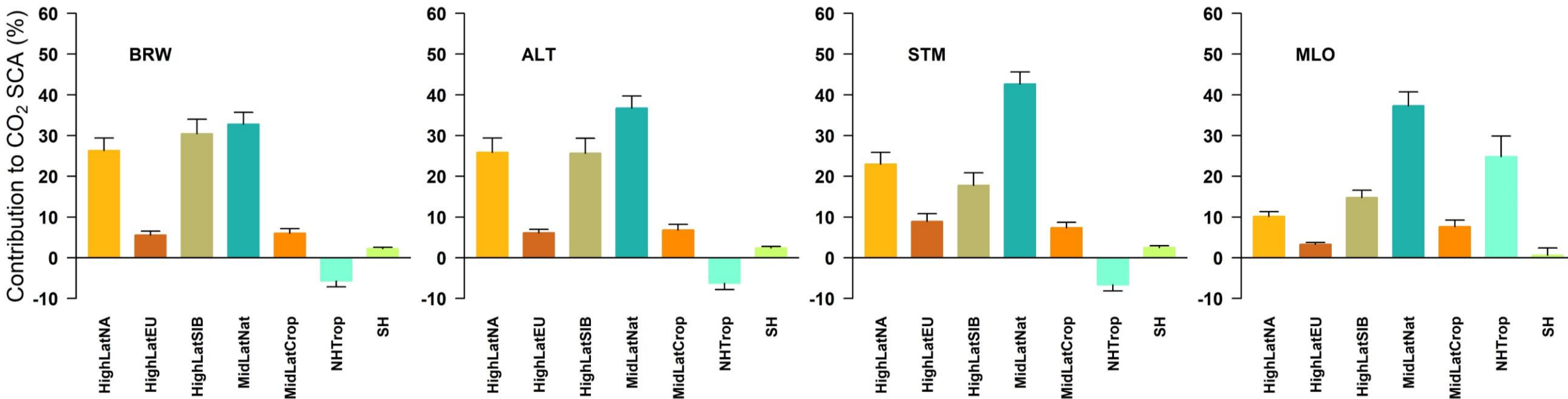
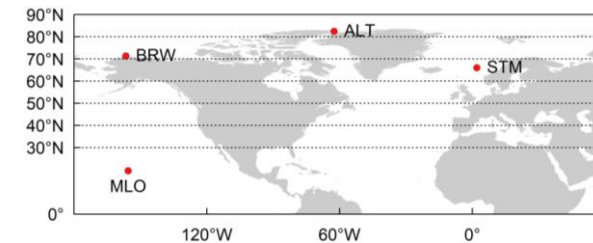
# Modelled vs. Observed CO<sub>2</sub> seasonal cycle amplitude – NOAA stations



- Good at most northern high latitude stations
- Underestimation of SCA at mountain stations (SUM, NWR, MLO)
- Underestimation of SCA at Pacific stations (SHM, MID, GMI)

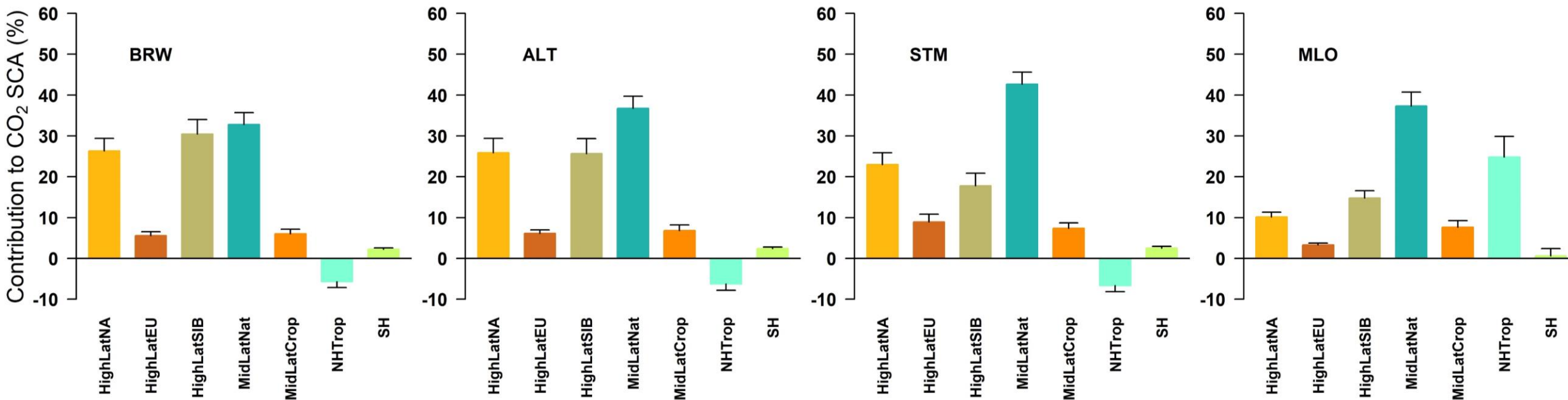
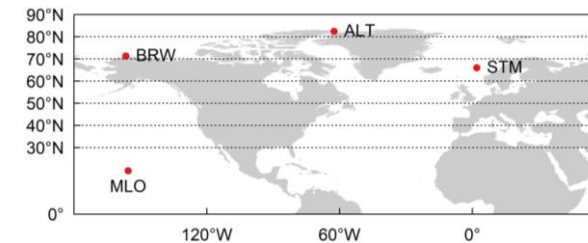
MOD  
OBS

# Contribution to SCA from different regions



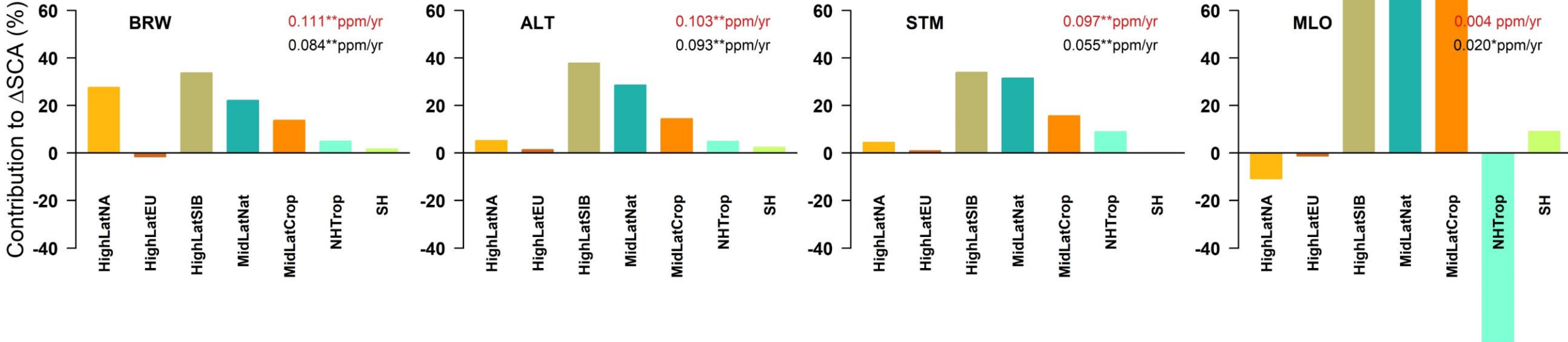
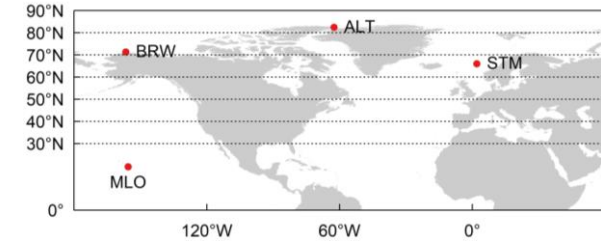
	HighLatNA	HighLatSIB	MidLatNat	MidLatCrop
Northern high stations	~20–30%	~20–30%	~30–40%	<10%

# Contribution to SCA from different regions

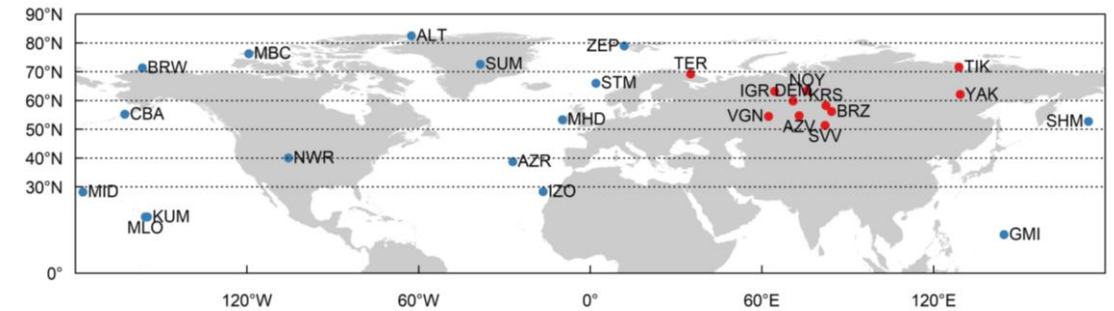
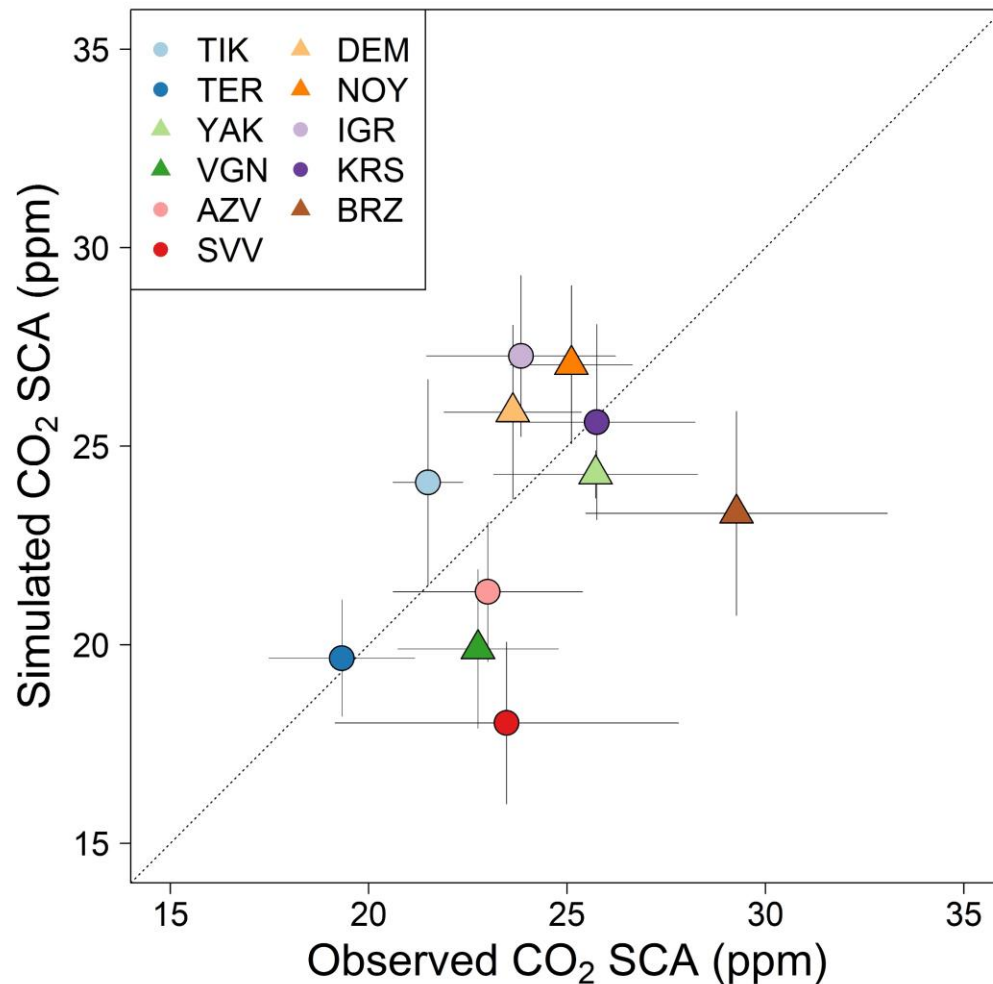


	HighLatNA	HighLatSIB	MidLatNat	MidLatCrop
Northern high stations	~20–30%	~20–30%	~30–40%	<10%
MLO	10%	15%	37%	<10%

# Contribution to SCA changes in Northern high latitudes from different regions



	HighLatNA	HighLatSIB	MidLatNat	MidLatCrop
Northern high stations	28% for BRW	~30–40%	~20–30%	~10%

Modelled vs. Observed CO<sub>2</sub> seasonal cycle amplitude – Siberia stations

- Model results are reasonable at Siberia stations even though they are not assimilated in the CO<sub>2</sub> inversion

- 1 Dominant regional contributor to CO<sub>2</sub> SCA and changes in Northern high latitude:

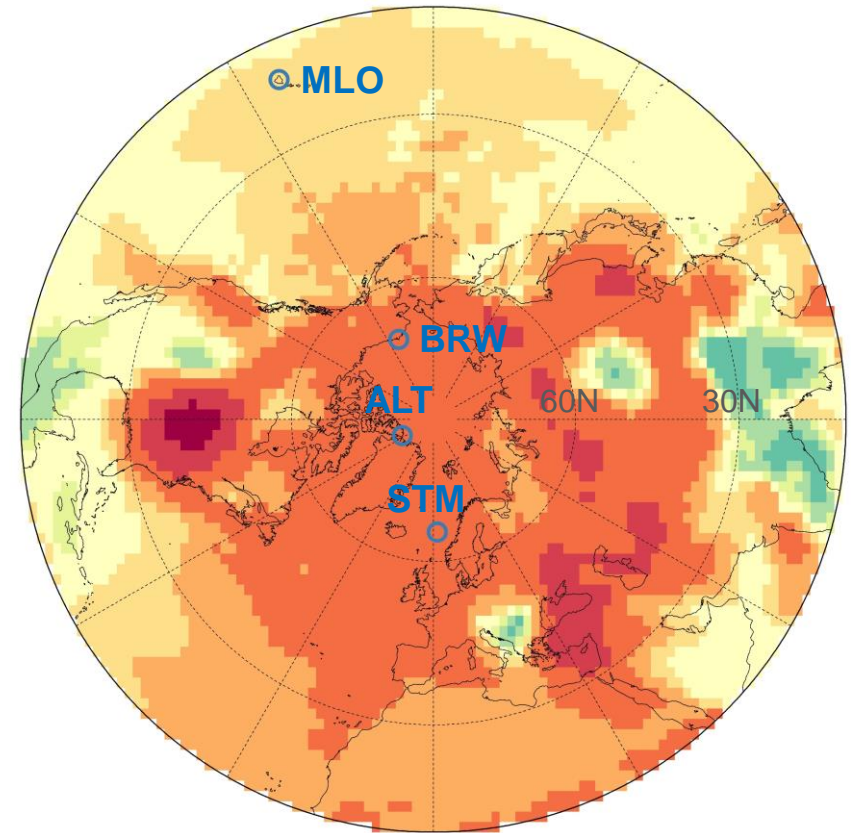
	HighLatNA	HighLatSIB	MidLatNat
Contrib. to CO <sub>2</sub> SCA	~20–30%	~20–30%	~30–40%
Contrib. to SCA change	depends	~30–40%	~20–30%



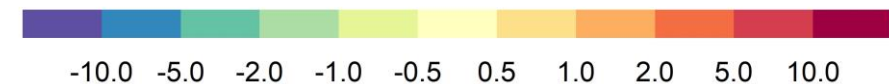
- 1 Dominant regional contributor to CO<sub>2</sub> SCA and changes in Northern high latitude:

	HighLatNA	HighLatSIB	MidLatNat
Contrib. to CO <sub>2</sub> SCA	~20–30%	~20–30%	~30–40%
Contrib. to SCA change	depends	~30–40%	~20–30%

- 2 An “extrapolation” of site-based analyses to pixel-based analyses



$\Delta$ SCA (ppm)

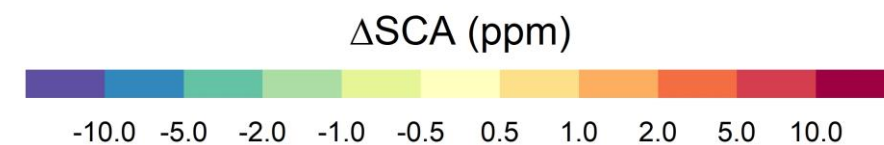
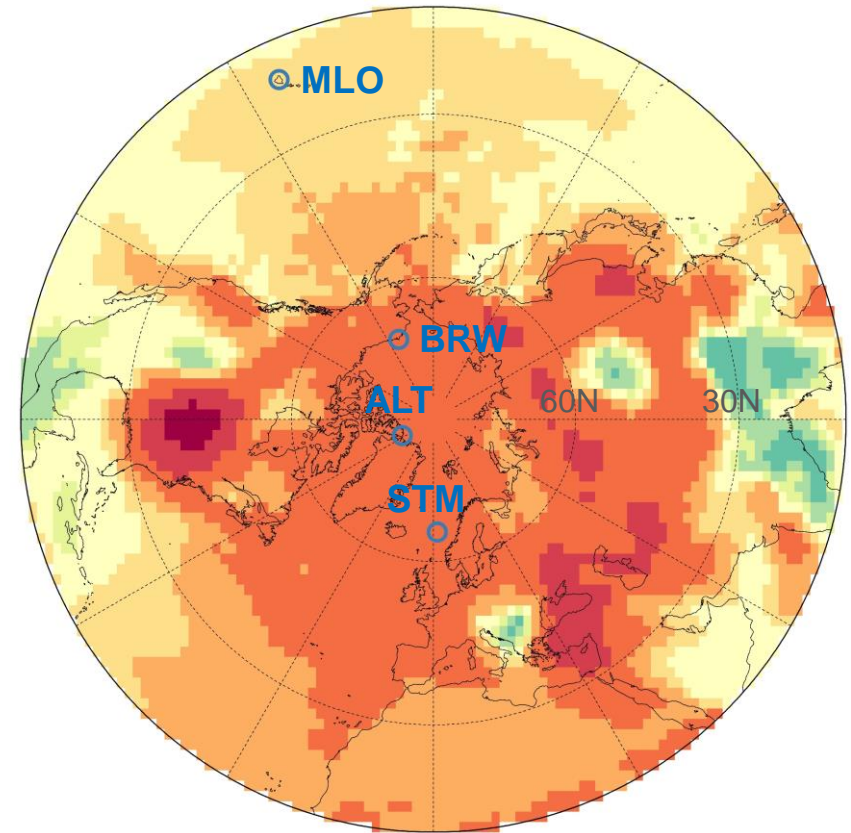


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	HighLatNA	HighLatSIB	MidLatNat
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- 2 An “extrapolation” of site-based analyses to pixel-based analyses

- 3 Application of this tag model framework to land surface model for more hypothesis-driven studies on CO<sub>2</sub> seasonal amplification.



# Acknowledgement

- Collaborators

Brendan Rogers (WHRC)

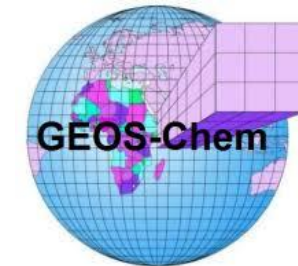
Leah Birch (WHRC)



- Funding resource

NASA Grant NNX17AE13G

- NOAA ESRL for CO<sub>2</sub> flask measurements
- NIES and MGO for CO<sub>2</sub> measurements in Russia
- GEOS-Chem model development group
- CAMS CO<sub>2</sub> inversion group



# Thanks!

Contact: [xinlinn@umich.edu](mailto:xinlinn@umich.edu)