

# CarbonWatch (NZ)

GUIDING CARBON MITIGATION STRATEGIES



## Regional to National Scale Inverse Modelling of New Zealand's Carbon Balance

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Climate, Freshwater & Ocean Science

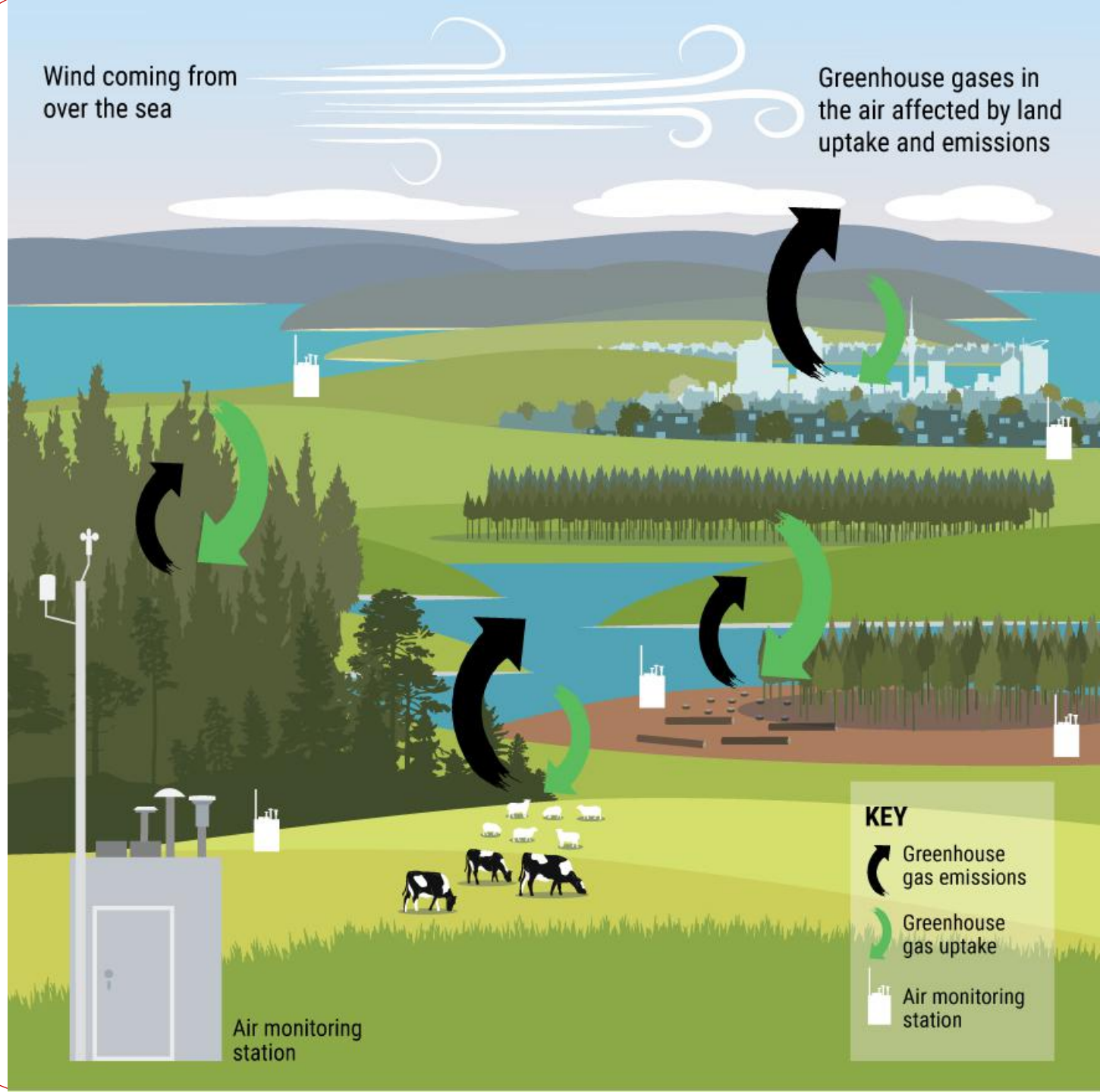


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Taihoro Nukurangi




Wind coming from over the sea

Greenhouse gases in the air affected by land uptake and emissions



### KEY

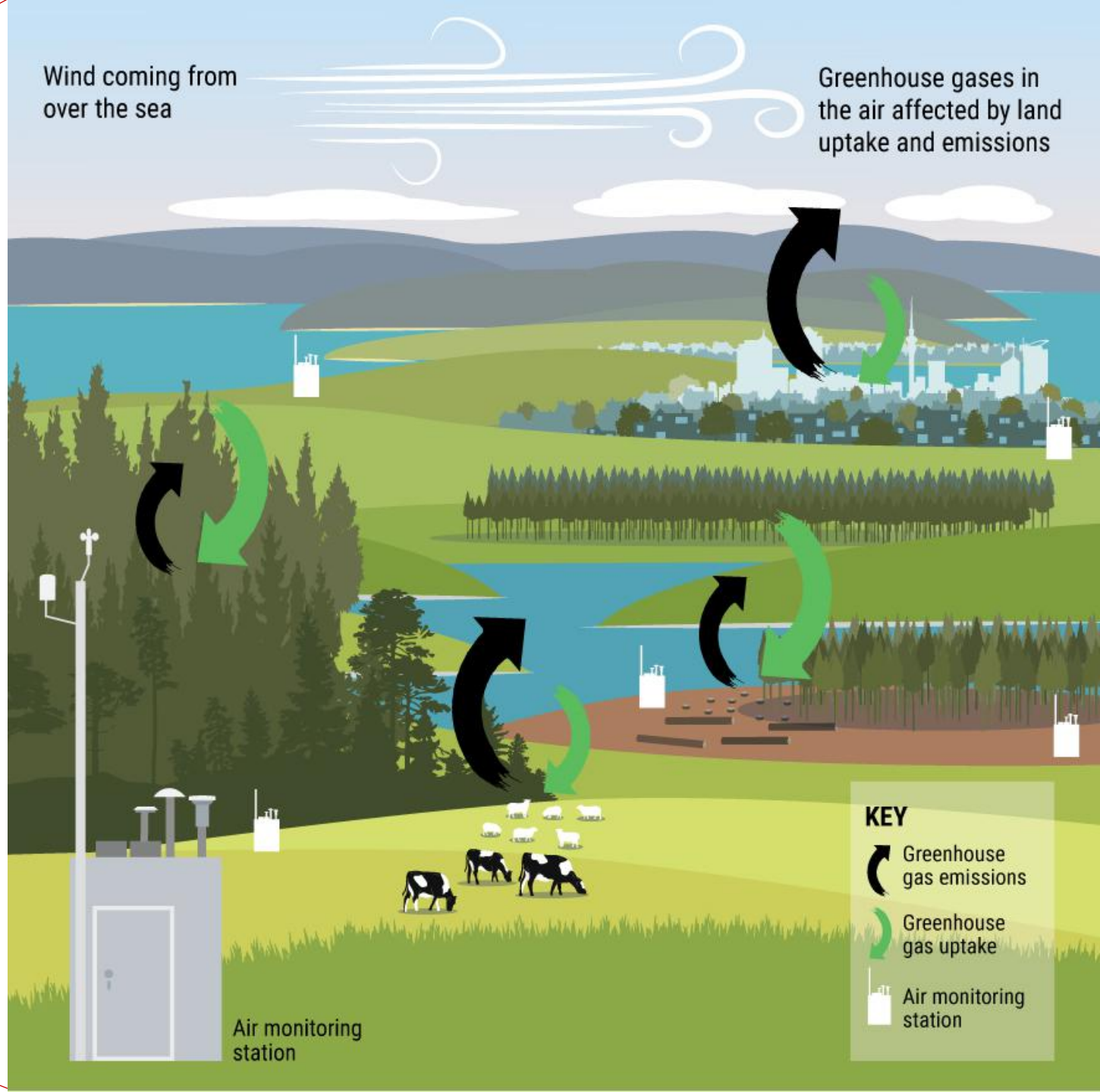
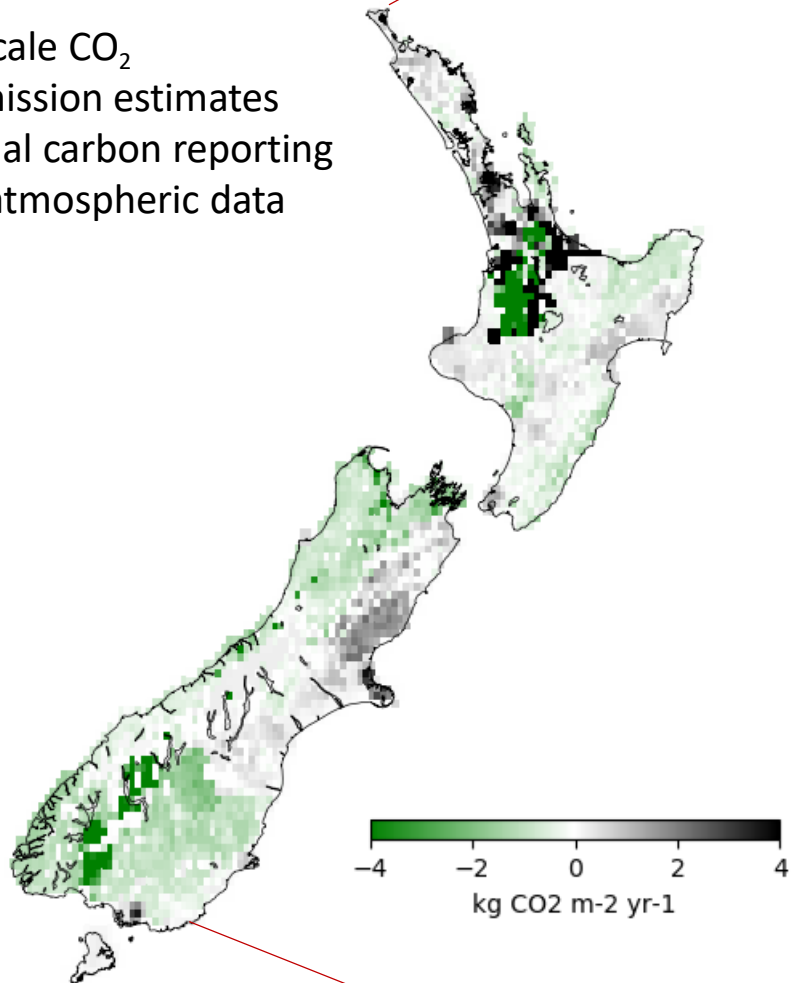
-  Greenhouse gas emissions
-  Greenhouse gas uptake
-  Air monitoring station

Air monitoring station

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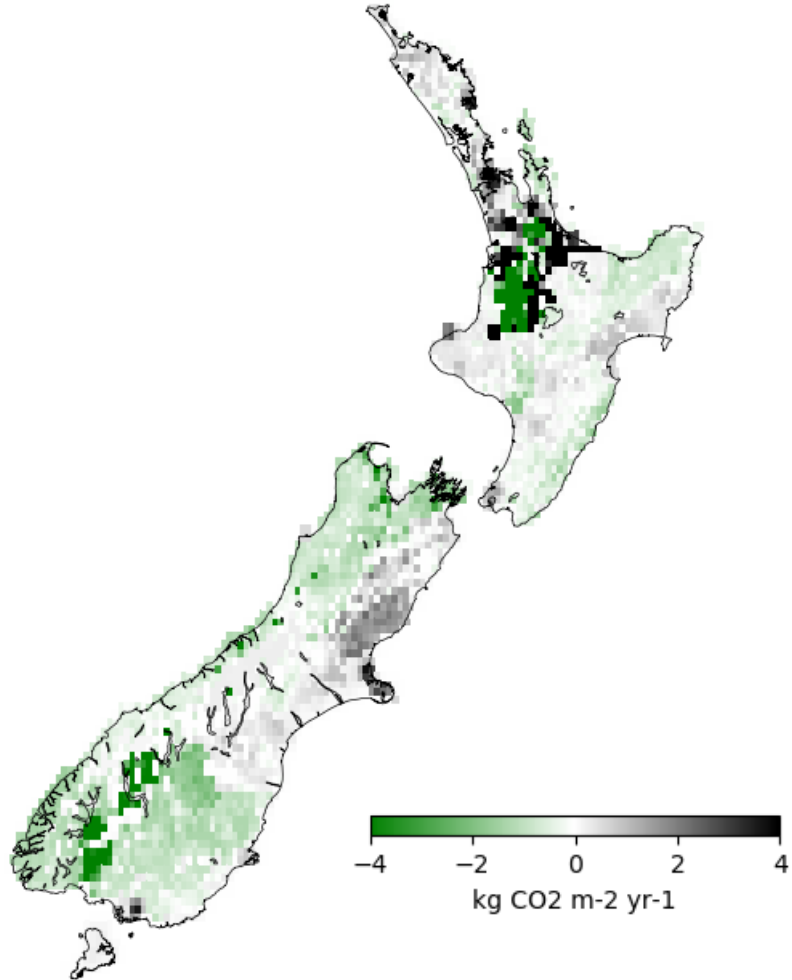
National scale CO<sub>2</sub> uptake/emission estimates and national carbon reporting based on atmospheric data



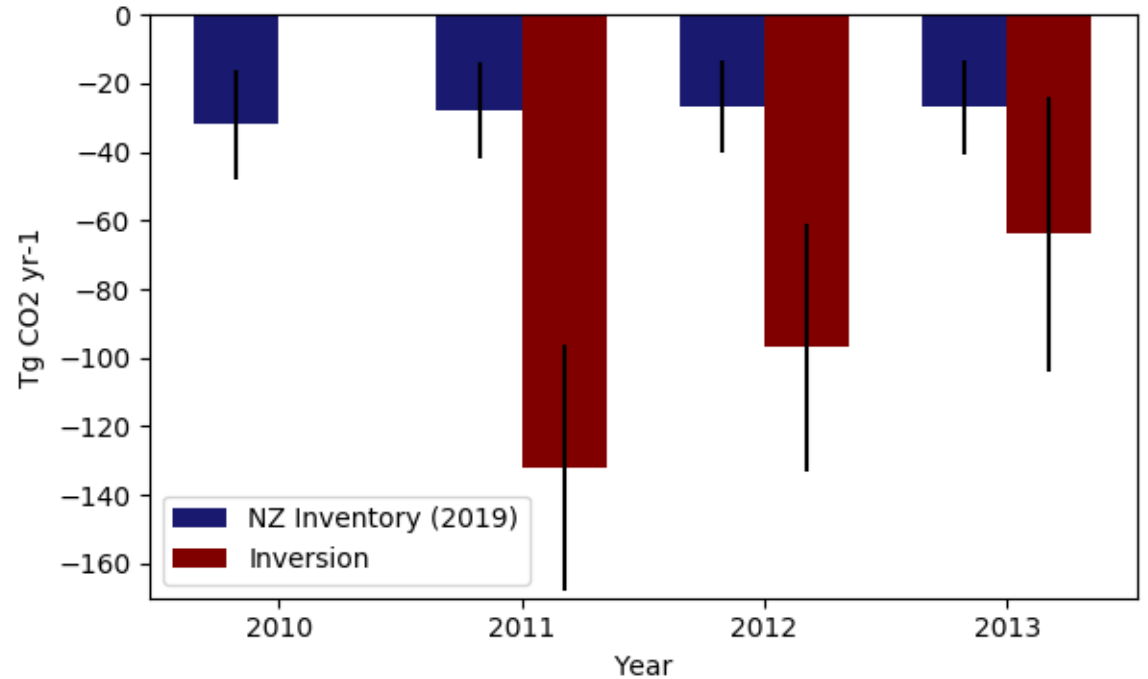


# CarbonWatch (NZ) – Pilot Study

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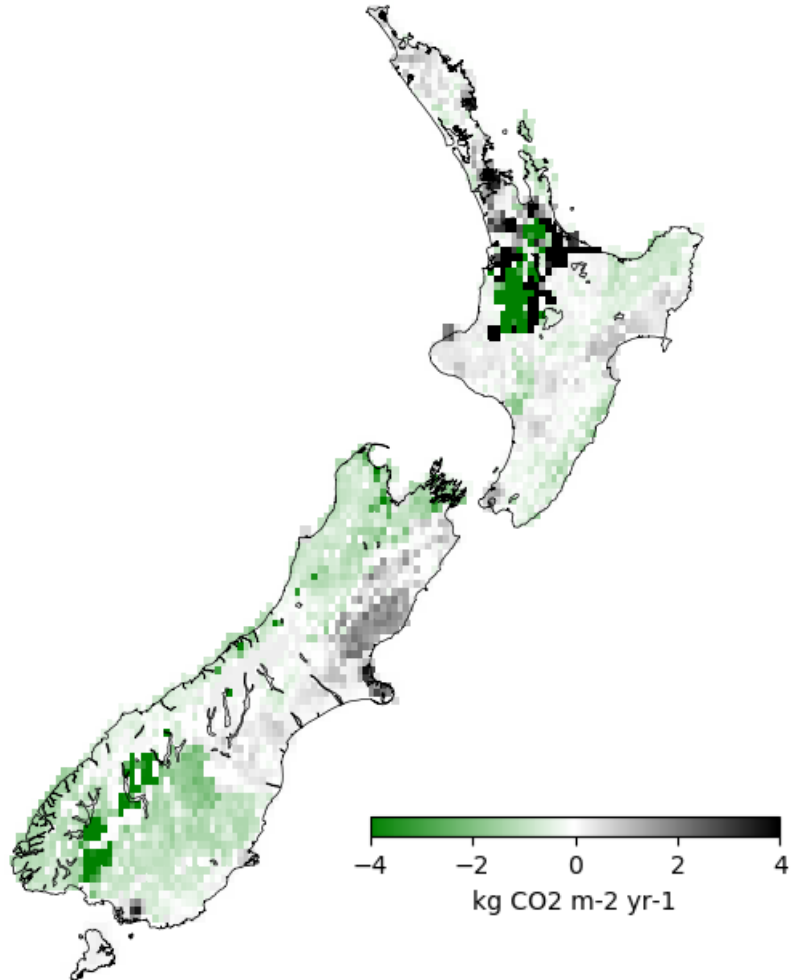
Annual mean CO<sub>2</sub> fluxes, Steinkamp et al. (2017)



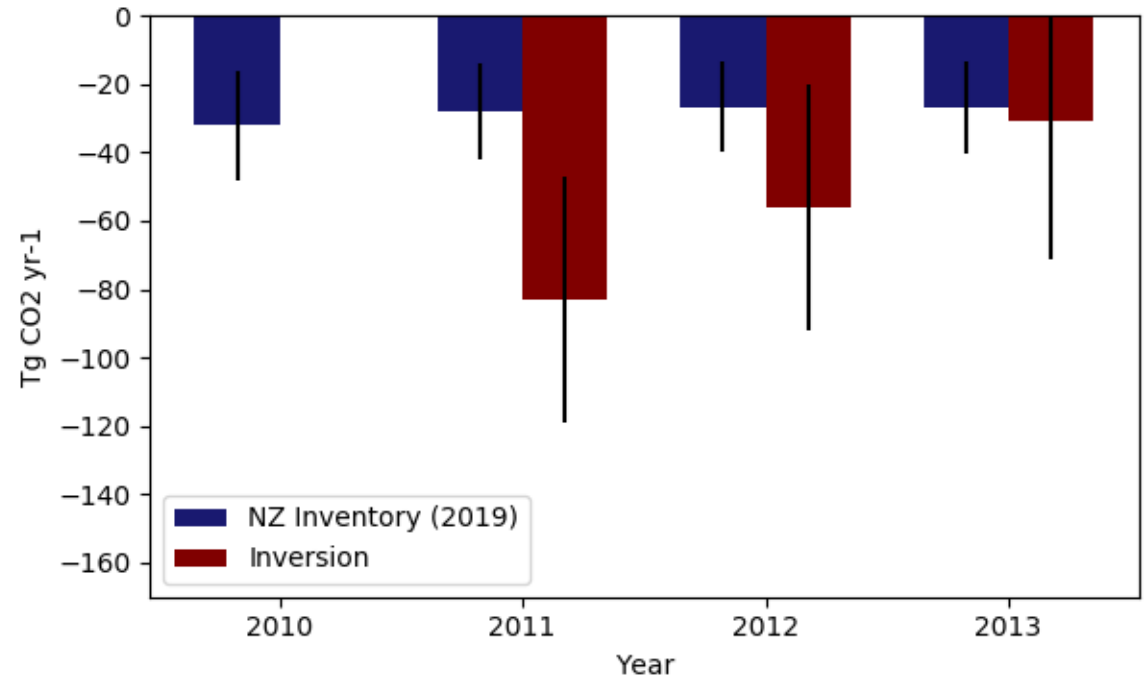
National Inventory vs inversion results  
(bottom up) (top down)

# CarbonWatch (NZ) – Pilot Study

GUIDING CARBON MITIGATION STRATEGIES

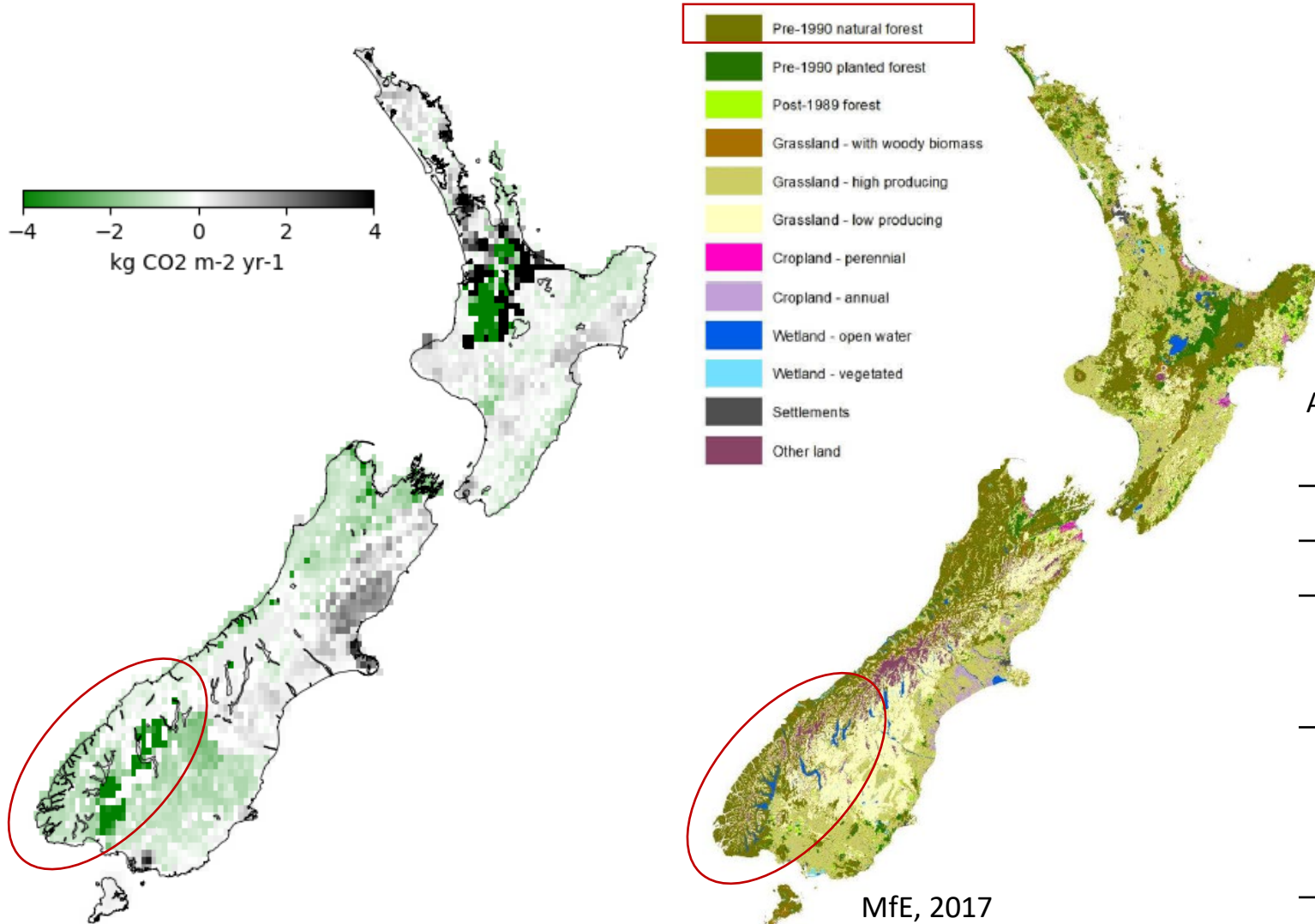


Annual mean CO<sub>2</sub> fluxes, Steinkamp et al. (2017)



Inversion → 30-60% larger CO<sub>2</sub> sink

# Stronger CO<sub>2</sub> sink



Annual mean CO<sub>2</sub> flux with uncertainty (1σ) for NZ regions  
Steinkamp et al. (2017)

Region	2011	2012	2013
NZ Total	-132(36)	-97(36)	-64(40)
North Island	18(28)	-40(28)	-1(30)
North	5(25)	-10(25)	7(25)
South	13(17)	-30(17)	-8(19)
South Island	-149(22)	-56(23)	-63(28)
East	-37(17)	9(18)	-10(23)
West	-113(17)	-65(16)	-52(17)
<b>Fiordland</b>	<b>-68(13)</b>	<b>-22(12)</b>	<b>-31(14)</b>

MfE, 2017

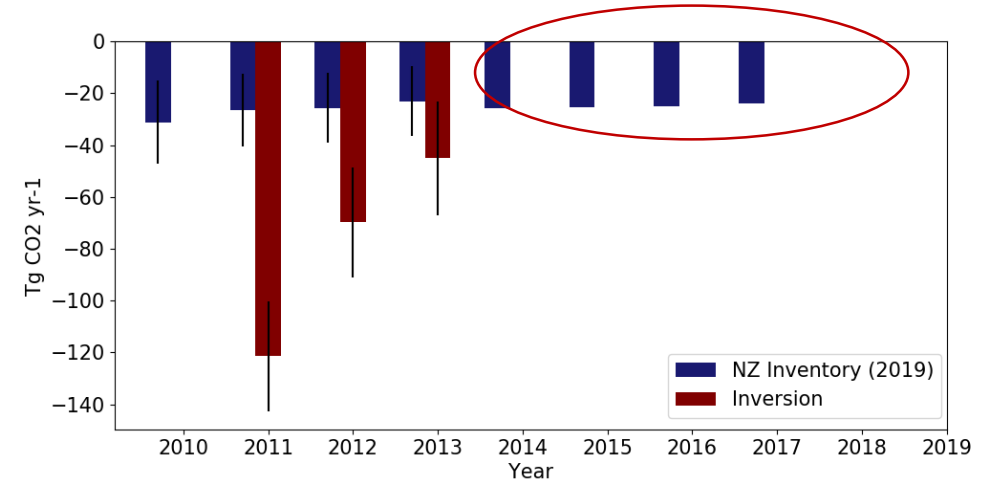
MfE – Ministry for the Environment

# Talk Overview

- Methodology
- Inversion Setup

## • Results

- Carbon exchange for recent years, still a sink?
- Inversion improvements
  - Higher model resolution
  - Impact of measurements from a new site



# How the inversion works

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# Methodology - Bayesian approach

- 25 regions

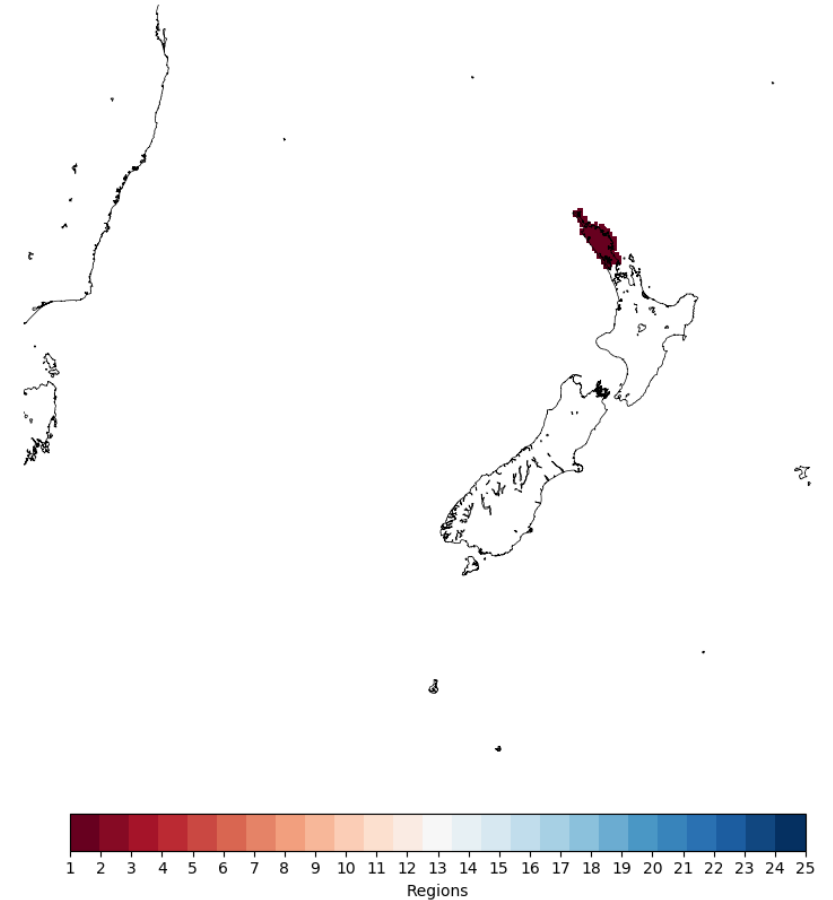


$$J = \frac{1}{2}(Tx - d)^T C_d^{-1}(Tx - d) + \frac{1}{2}(x - x_o)^T C_o^{-1}(x - x_o) + \frac{1}{2}(Sx)^T C_s^{-1}(Sx)$$

minimized  
analytically

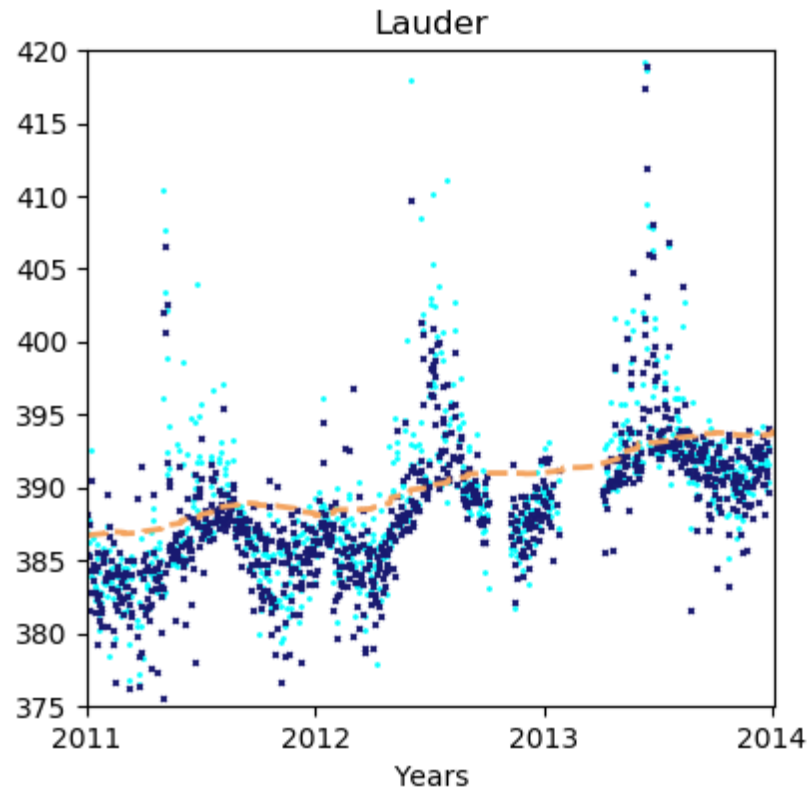
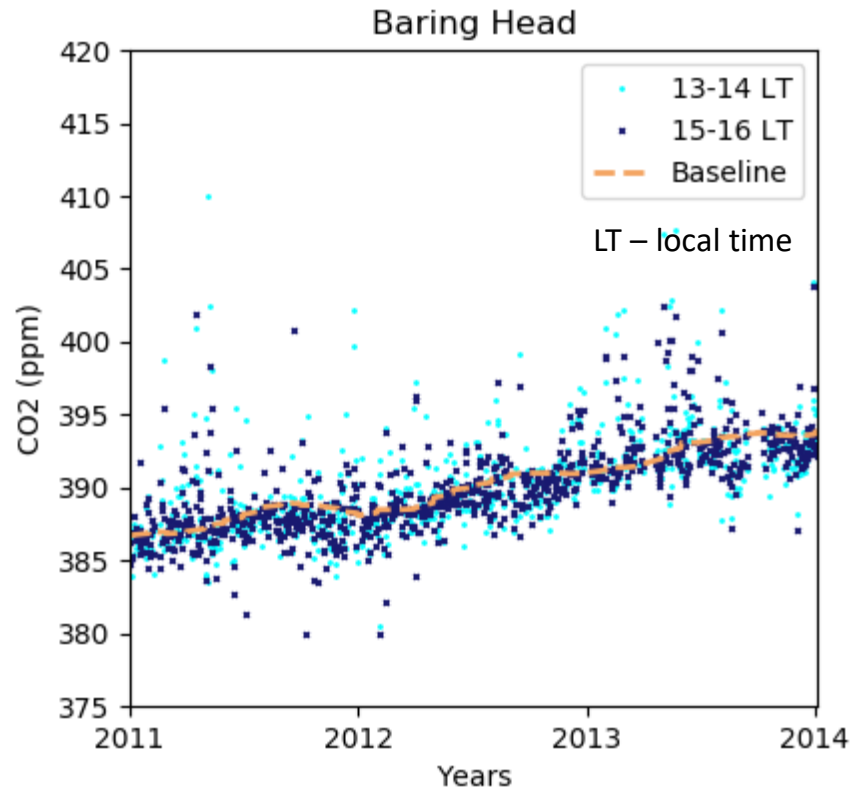
$$x = C(T^T C_d^{-1}d + C_o^{-1}x_o)$$

$$C = (T^T C_d^{-1}T + C_o^{-1})^{-1}$$



The posterior & error covariance matrix

# What do we see from the measurements?



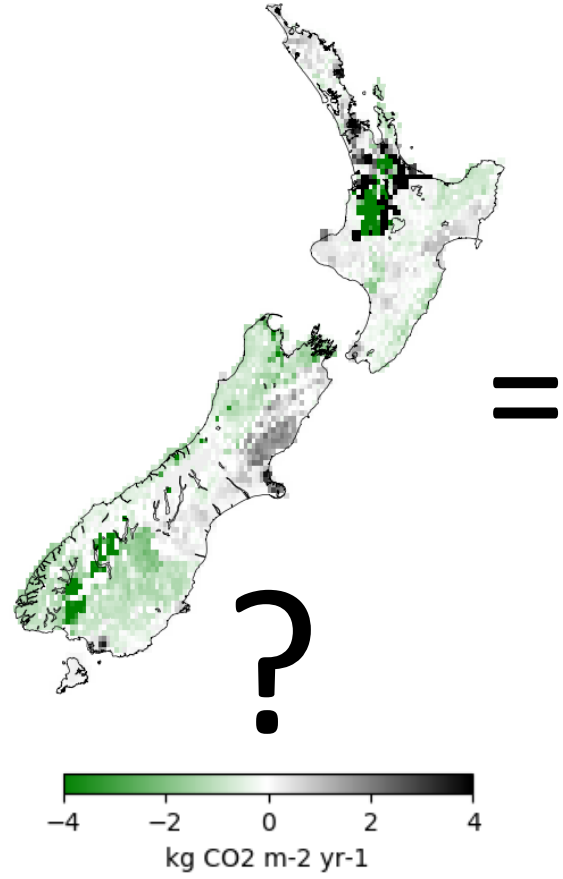
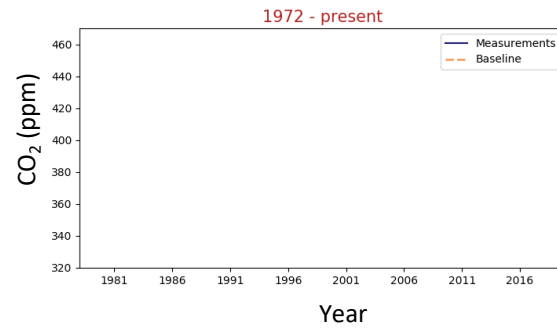
13-14, 15-16 LT – well mixed air

Baseline – predominantly oceanic air

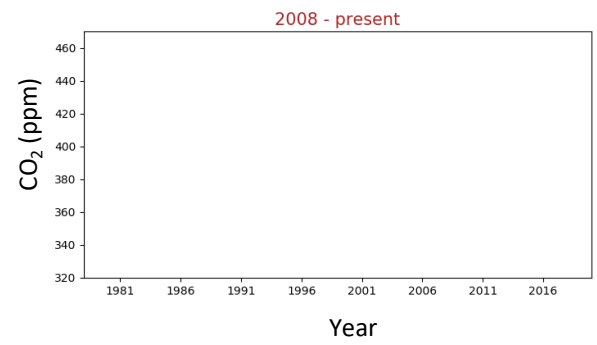
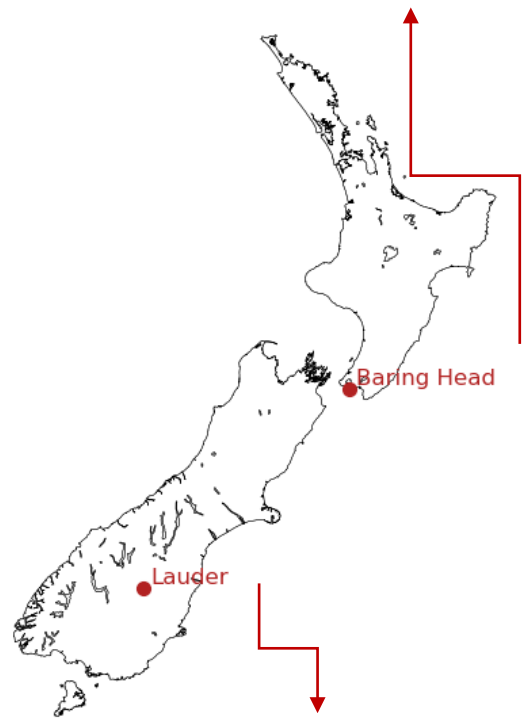
Inversion data = measurements – baseline – anthropogenic signal

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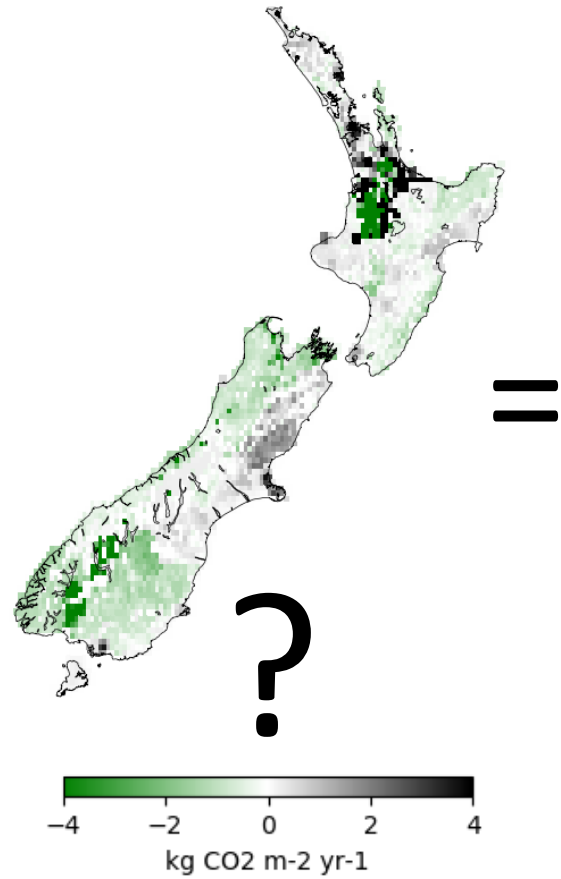
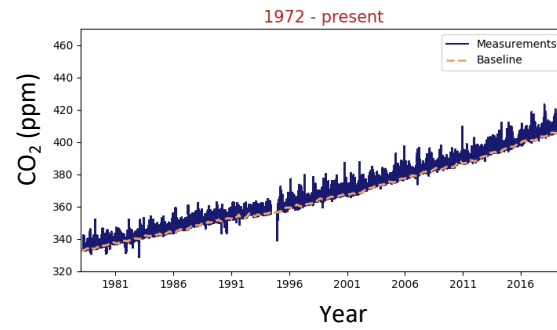
# Methodology



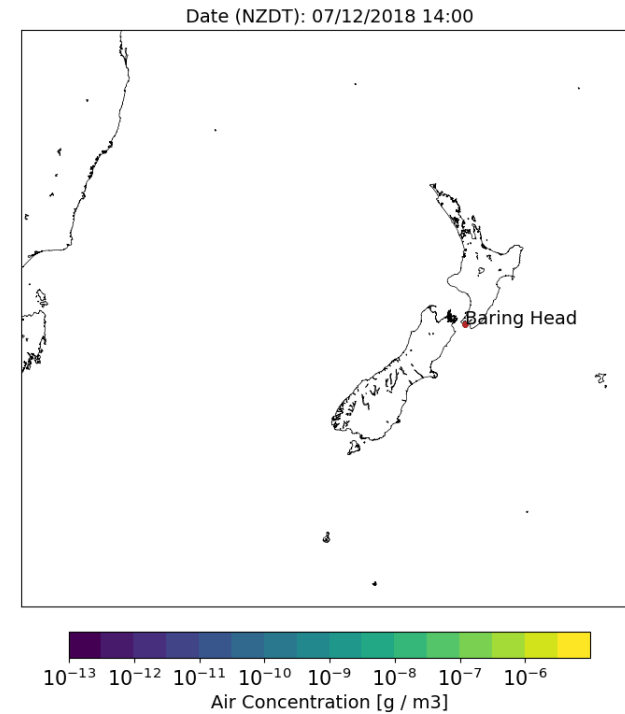
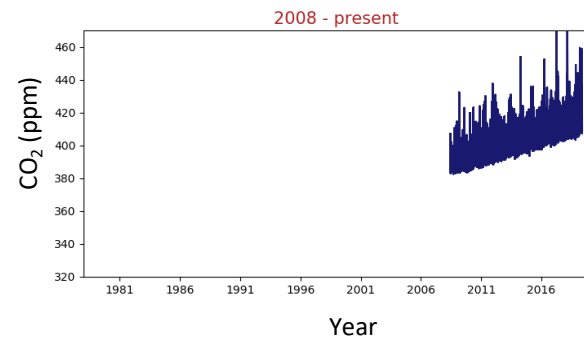
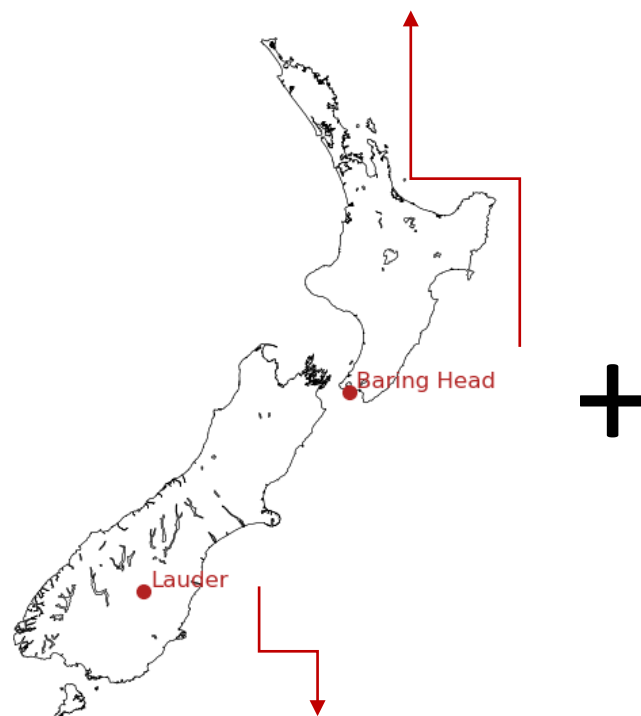
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# Methodology



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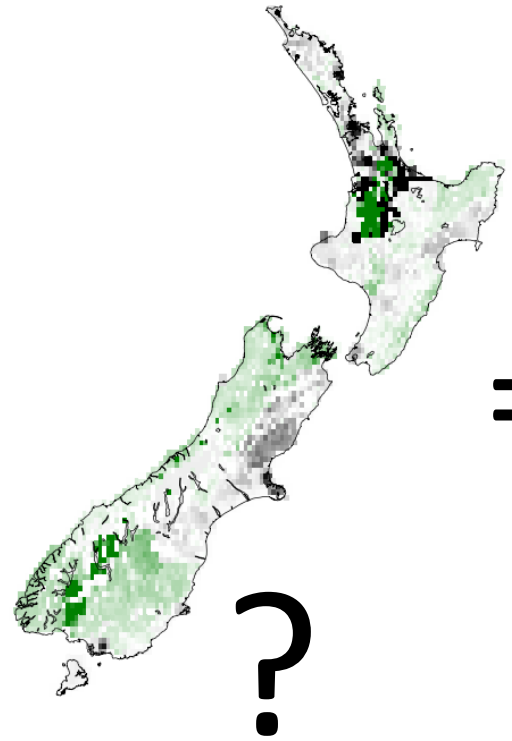
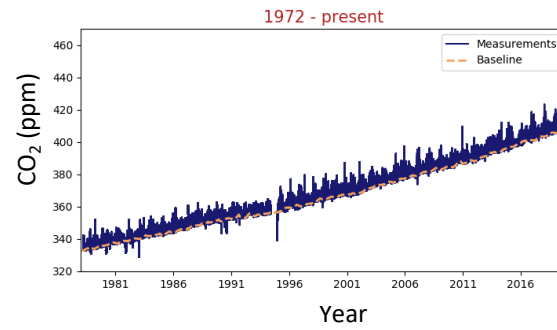
## Transport model

NAME III Lagrangian dispersion model

+  
NZLAM (12 km) / NZCSM (1.5 km) meteorology  
(Local configuration of the UK Met Office Unified Model)



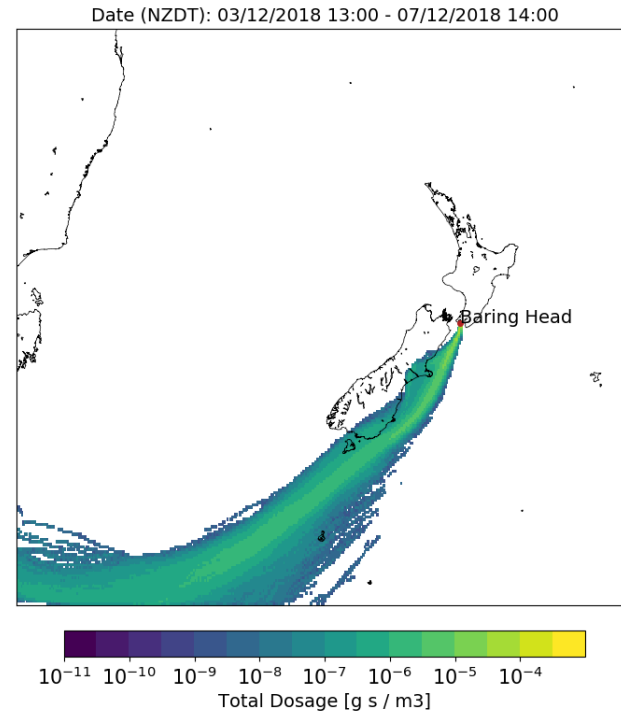
# Methodology



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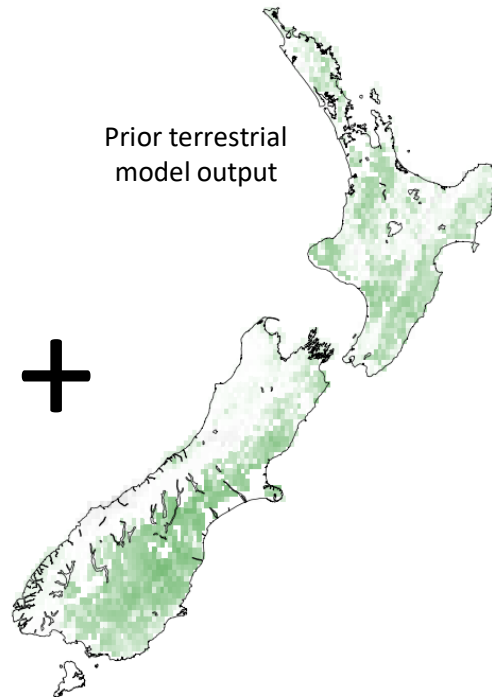


+



## Transport model

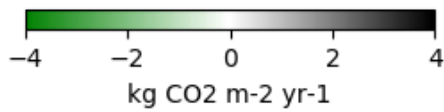
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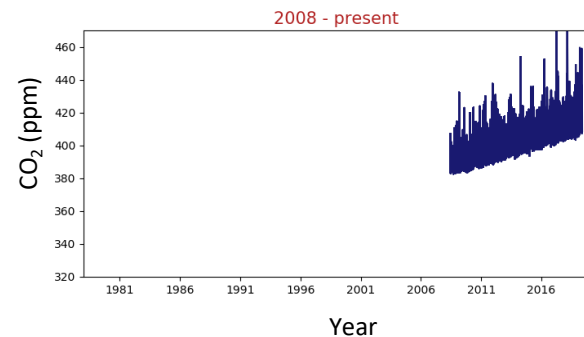
+

## Prior flux

Biosphere – BIOME-BGC v4.2  
 Ocean – Takahashi et al. (2009)  
 Anthropogenic – EDGAR v4.2



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# Results

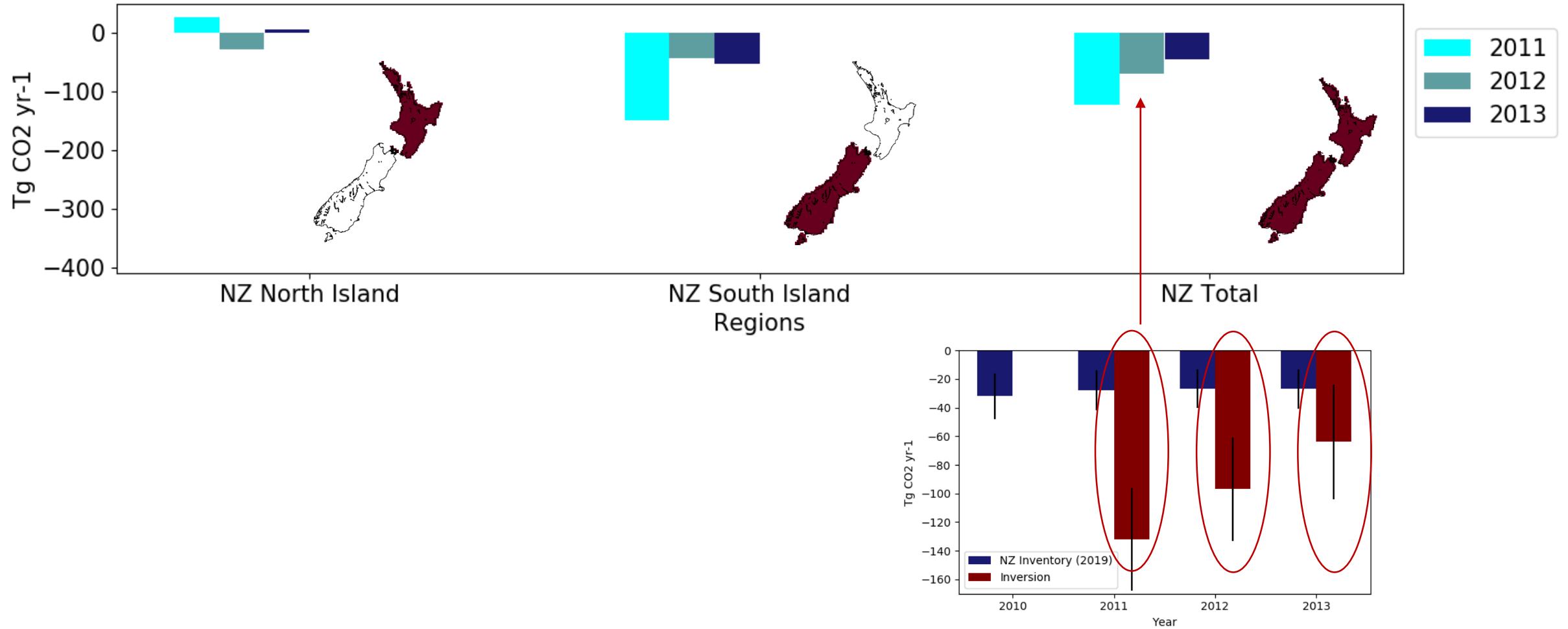
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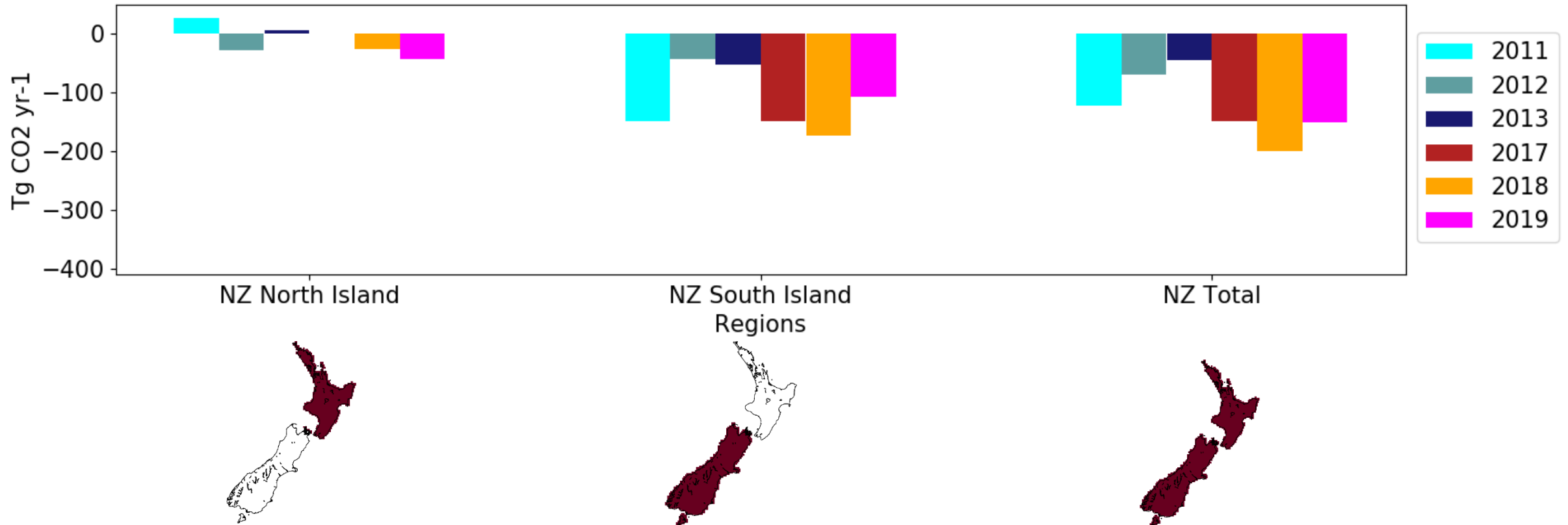
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# Annual fluxes

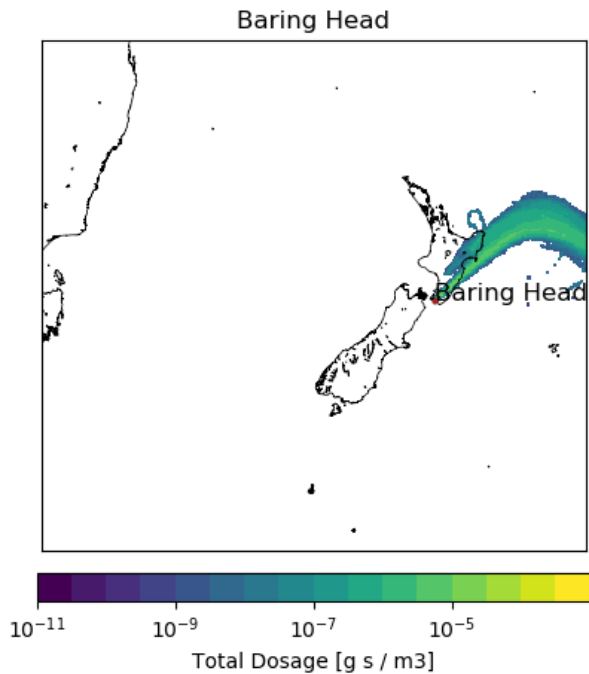
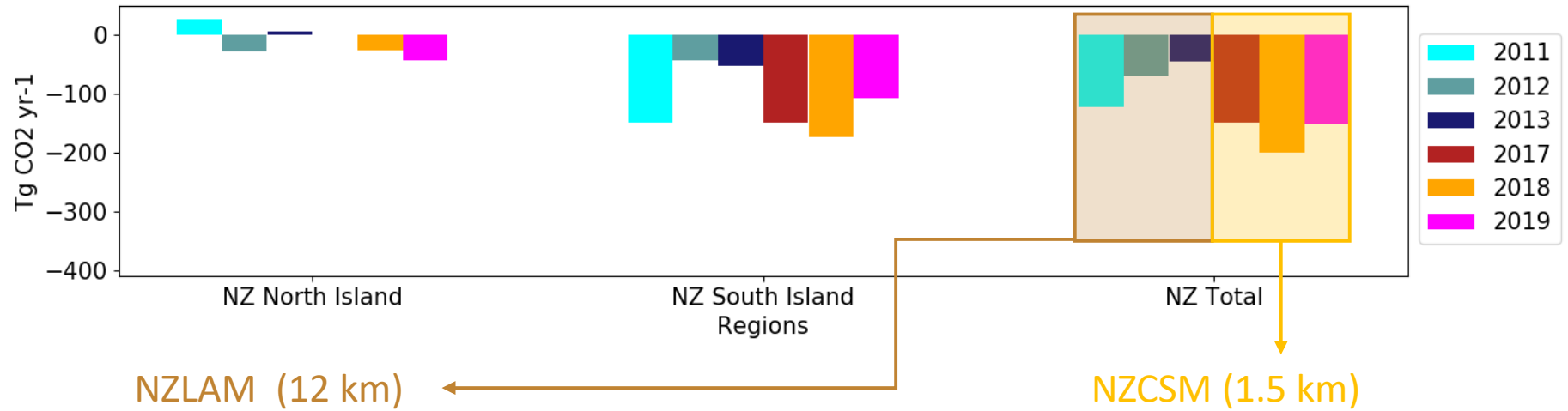


# Annual fluxes

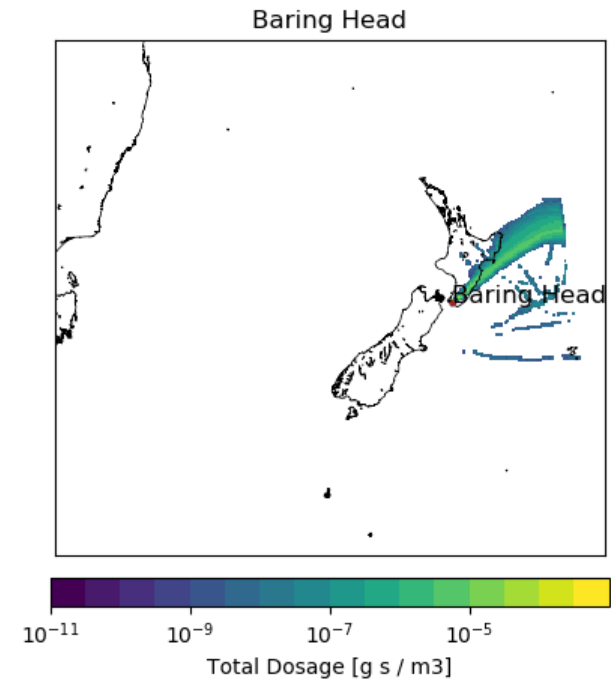


2014, 2015, 2016 work in progress  
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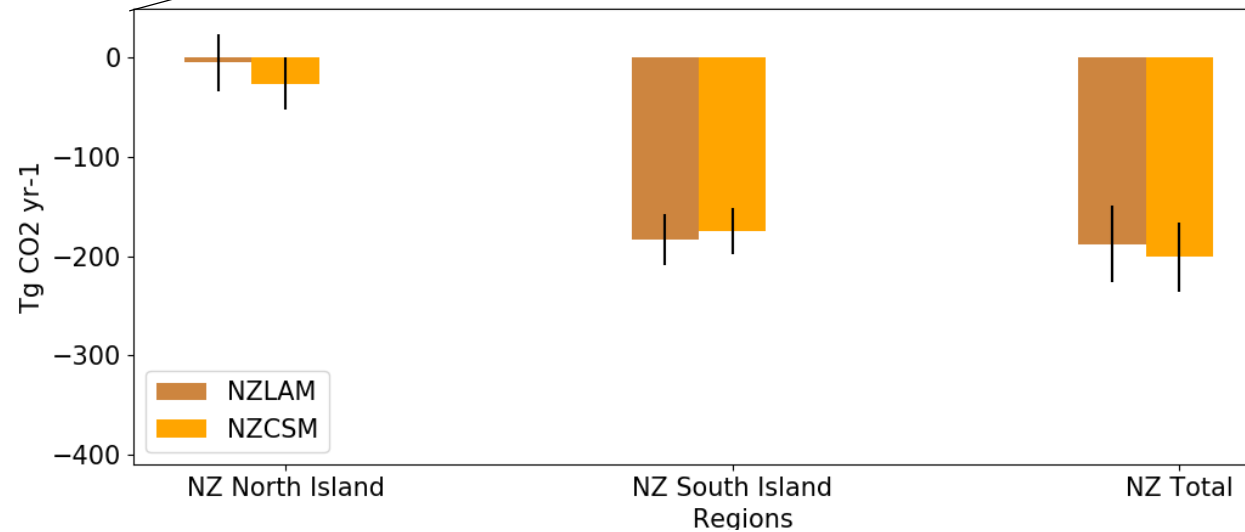
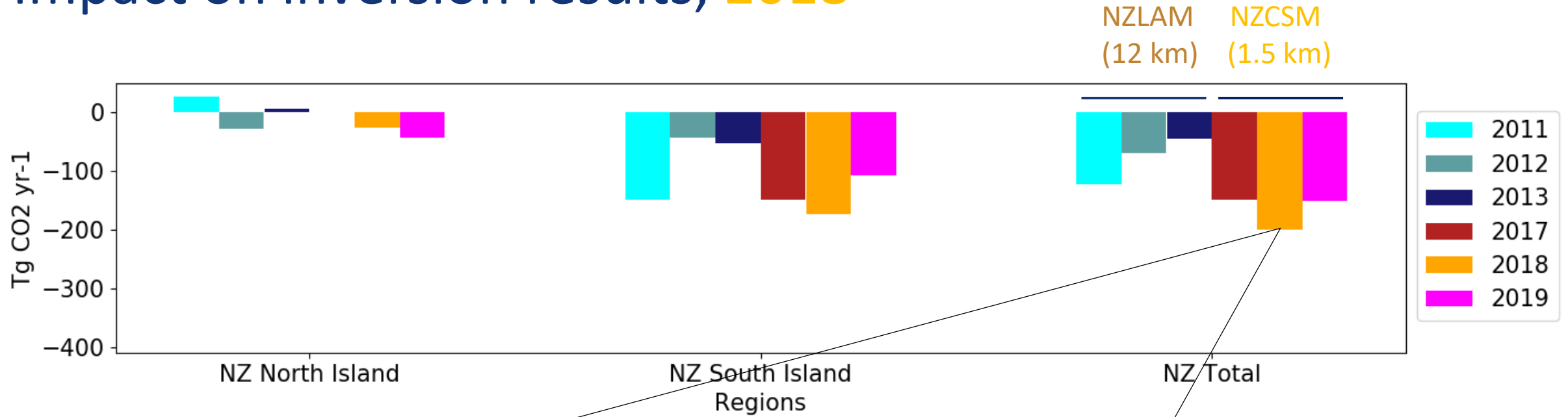
# Important model improvement!



01/12/2018

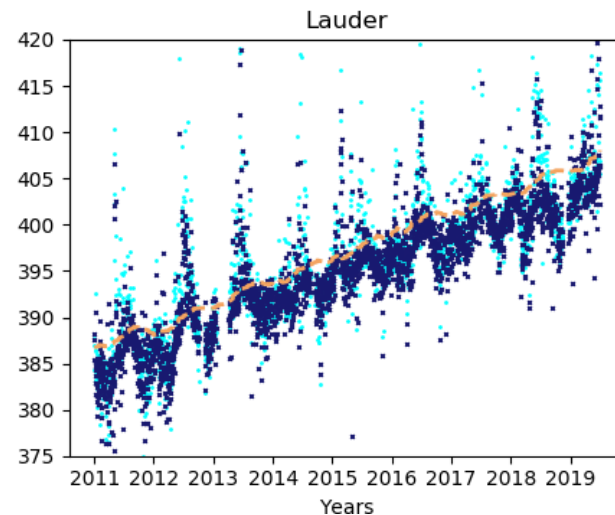
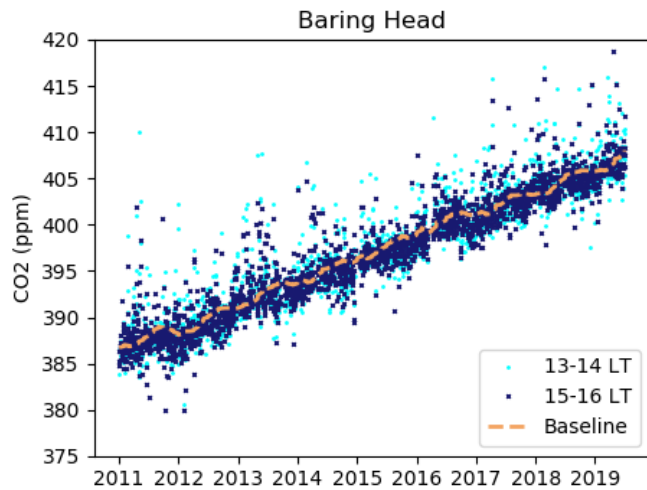
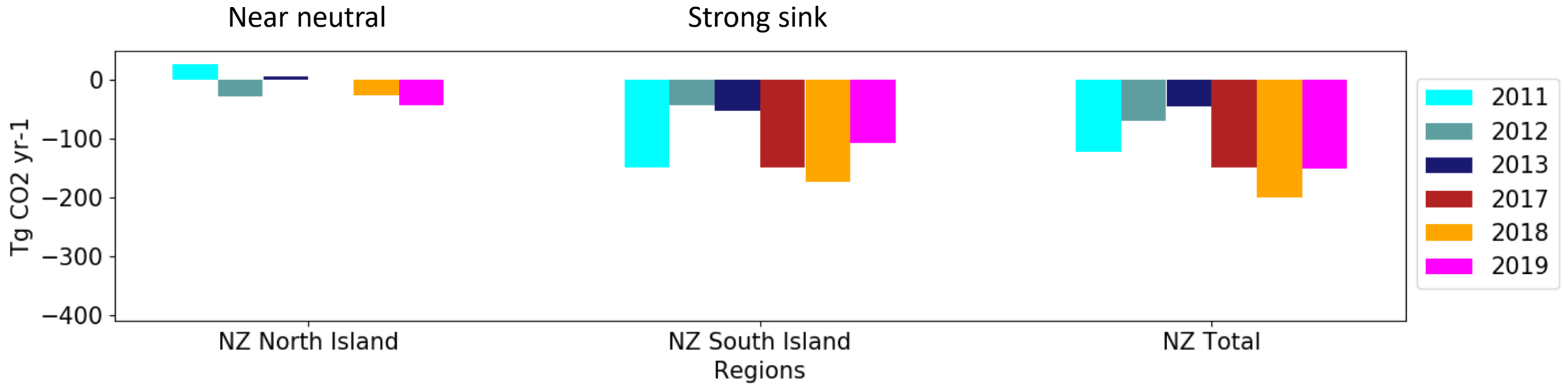


# Impact on inversion results, 2018

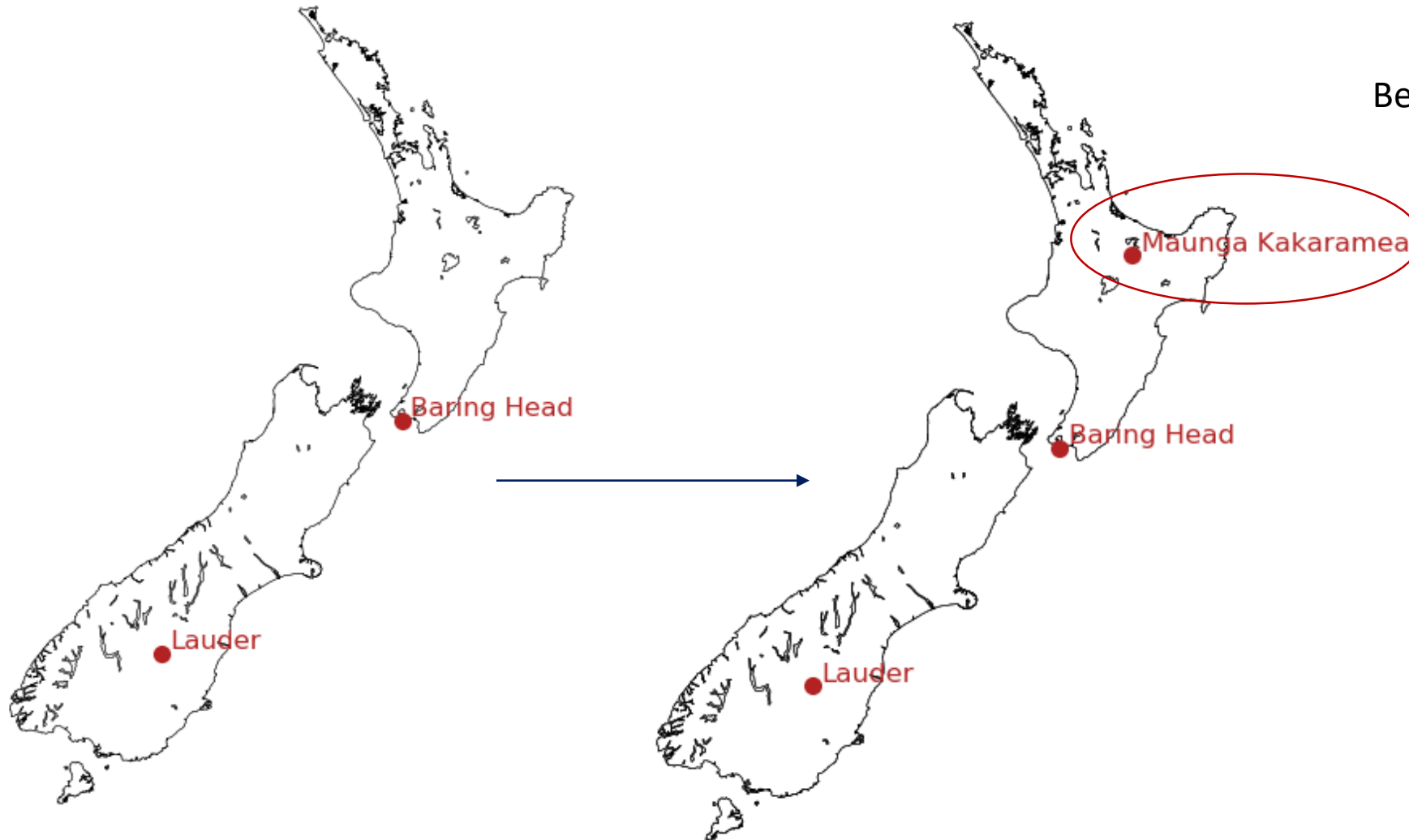




# Annual fluxes – sink location



# New site, Maunga Kākaramea



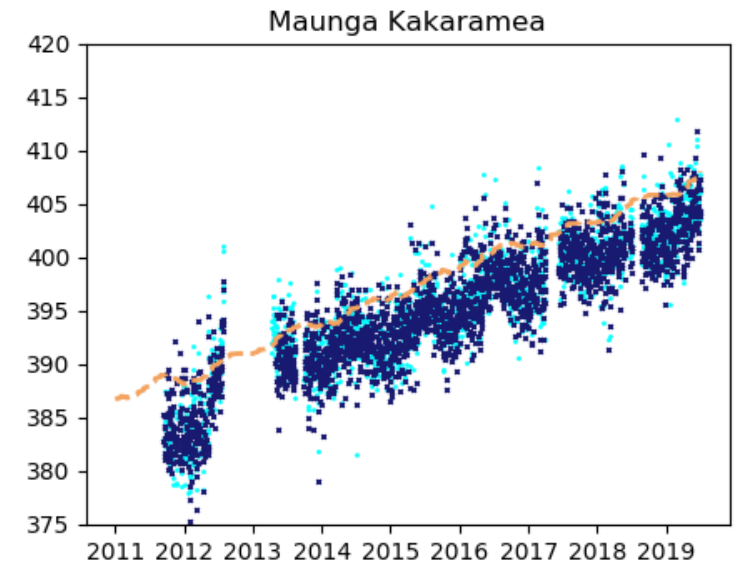
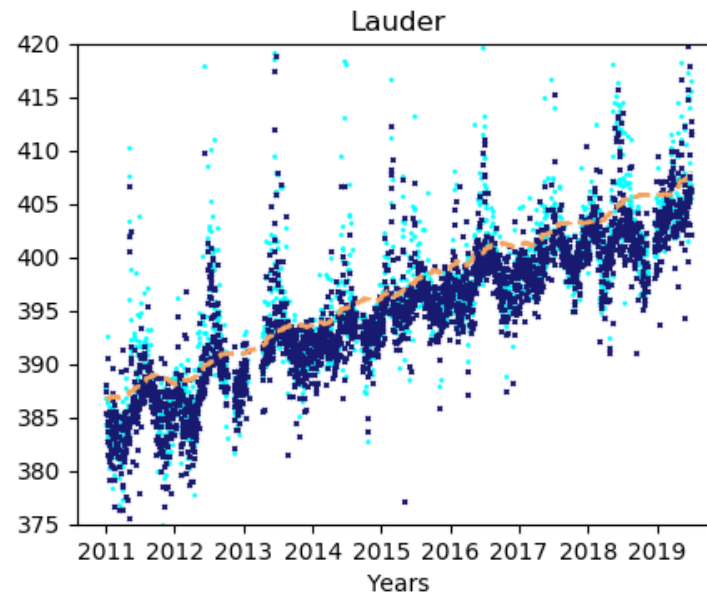
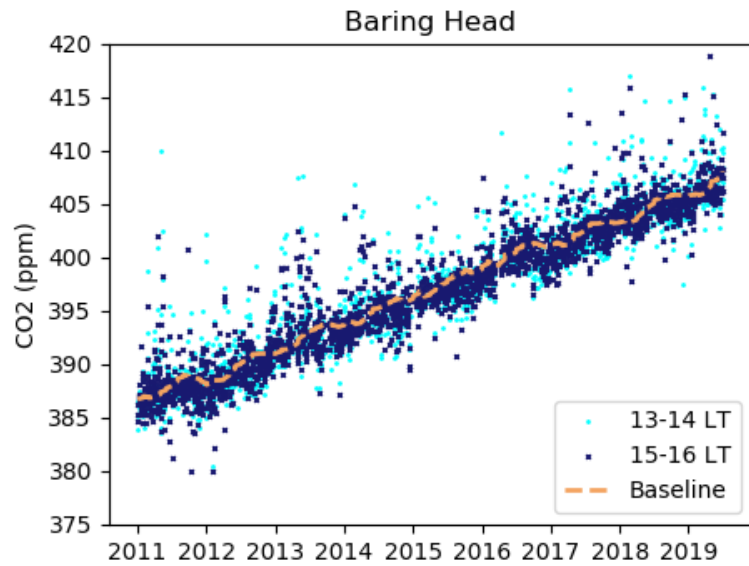
Better CO<sub>2</sub> flux estimates  
&  
Better understanding of the CO<sub>2</sub> exchange  
between different forest types

North Island  
Indigenous & planted, exotic  
forests

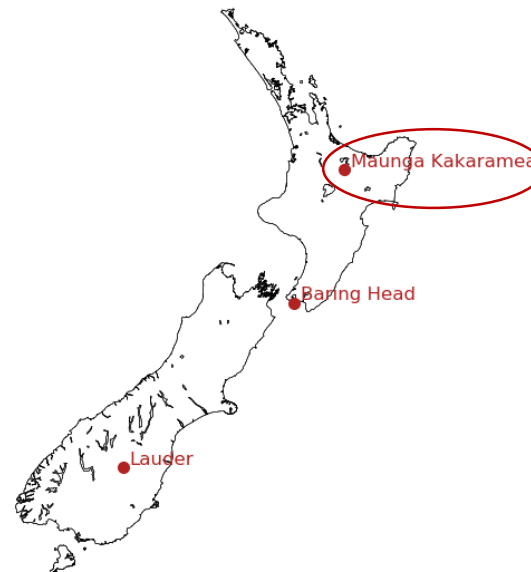
VS

South Island  
Mature, indigenous forests

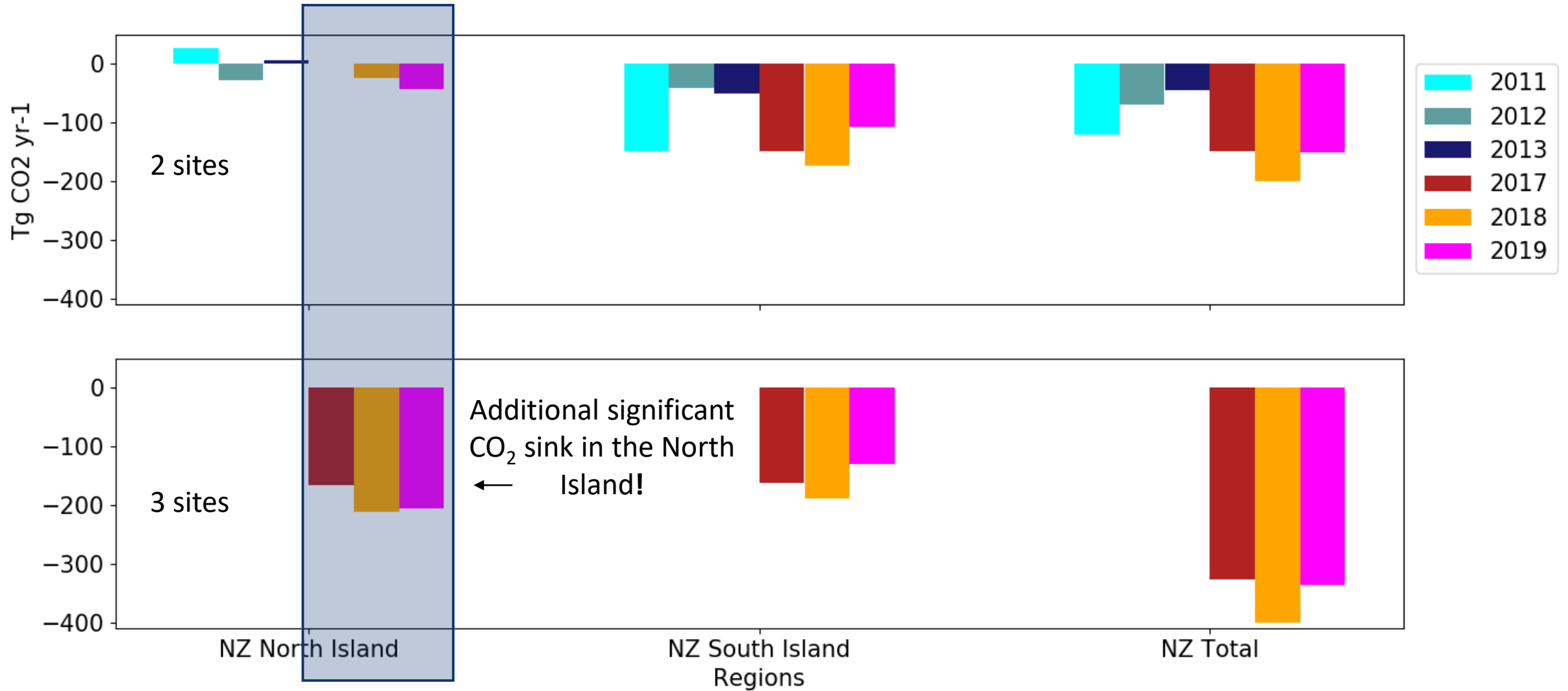
# What do we expect? Even larger sink?



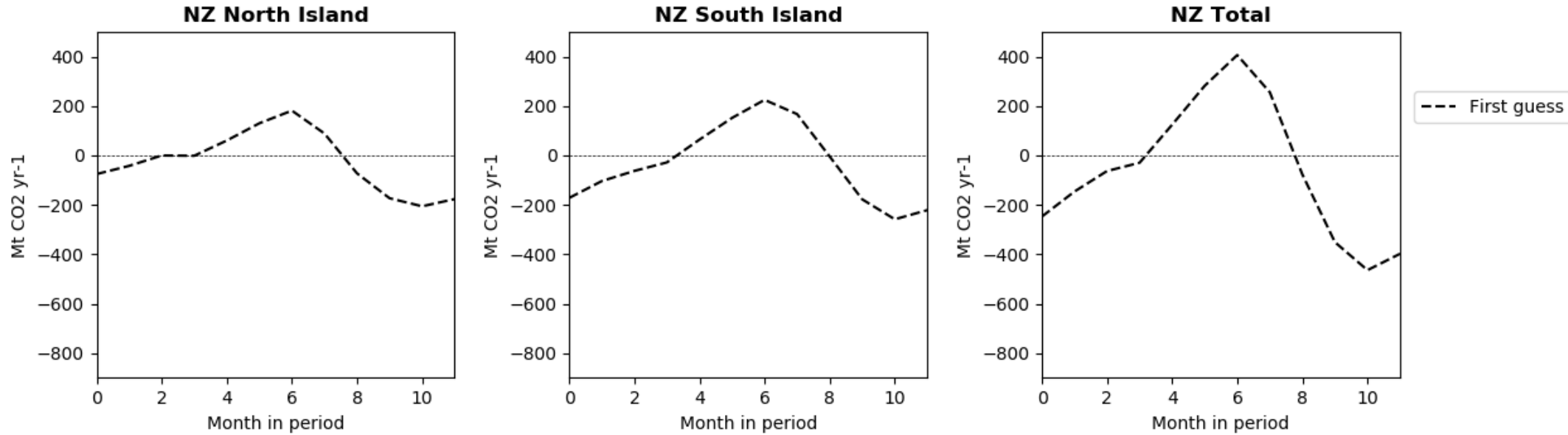
↑  
Additional significant  
CO<sub>2</sub> sink in the North  
Island?



# Annual fluxes with new data



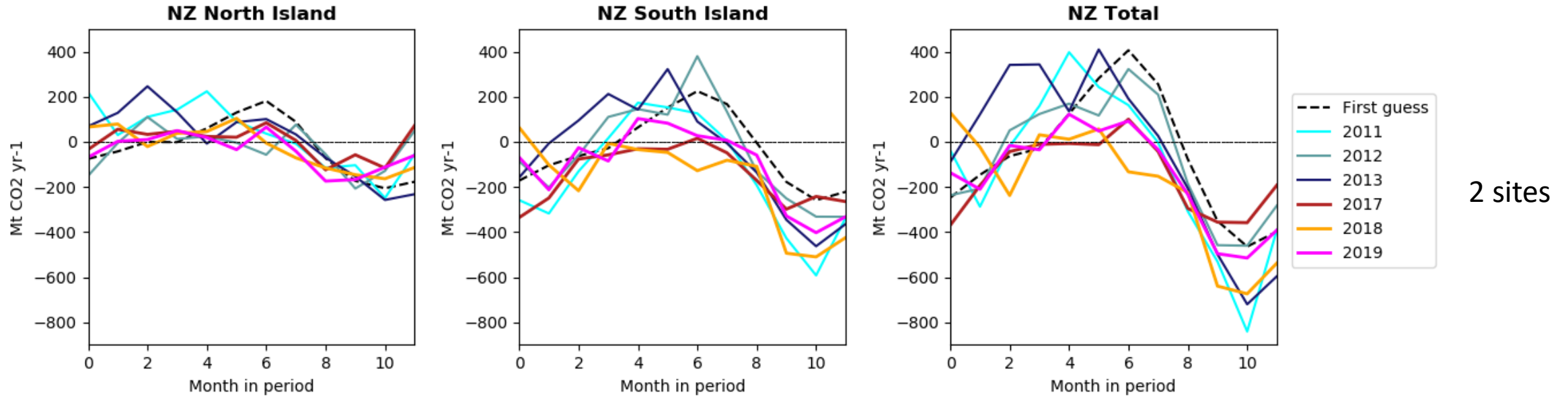
# Monthly fluxes, CO<sub>2</sub> variability



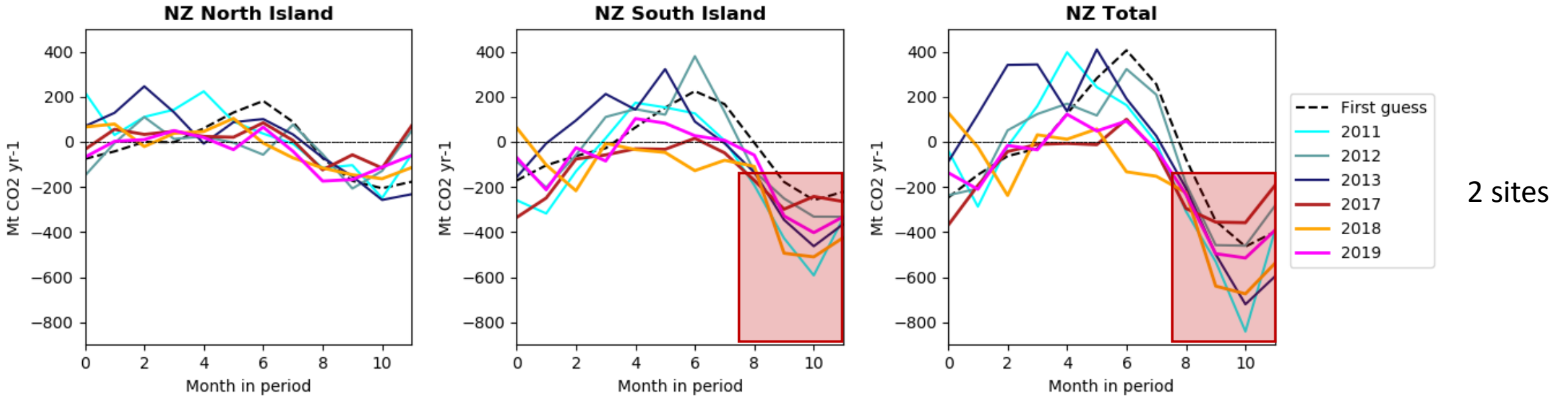
Southern Hemisphere seasons!



# Monthly fluxes, CO<sub>2</sub> variability

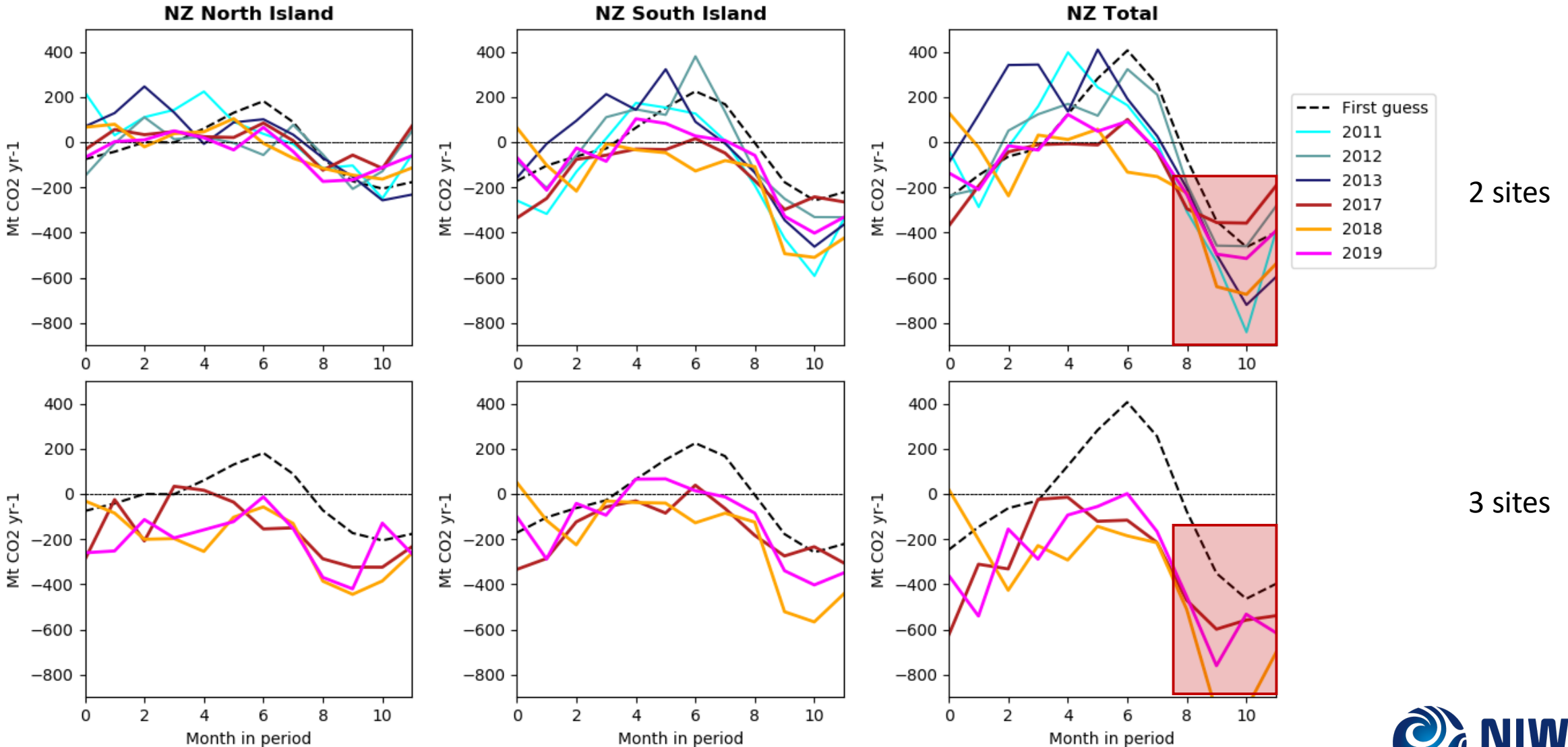


# Monthly fluxes, CO<sub>2</sub> variability

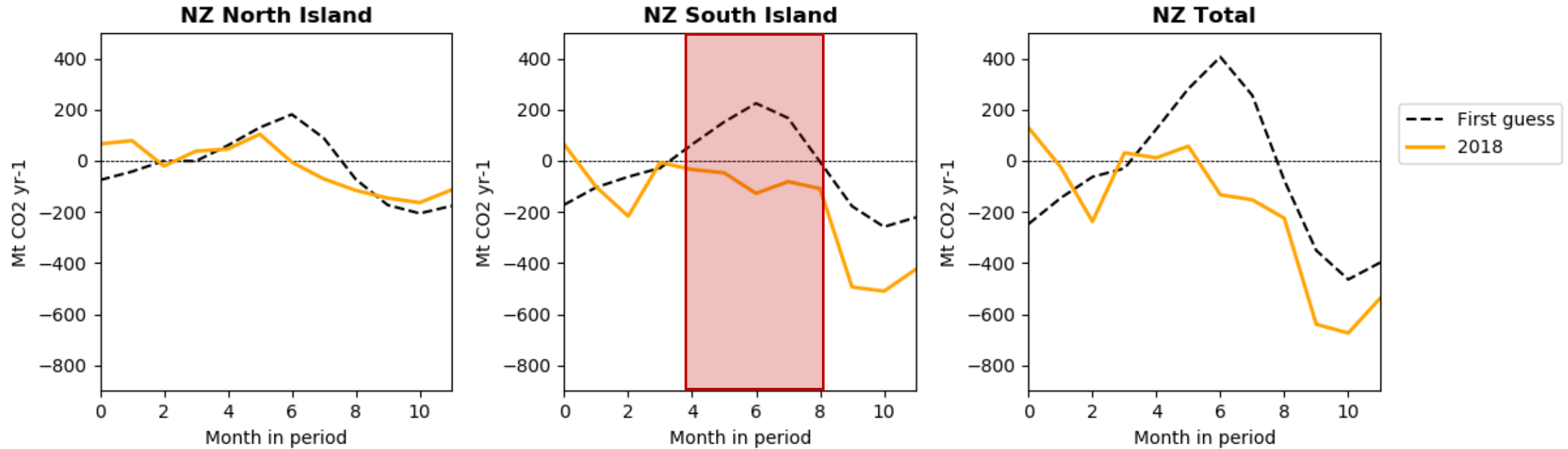


Stronger CO<sub>2</sub> uptake during summer

# Monthly fluxes, CO<sub>2</sub> variability



# Monthly fluxes, CO<sub>2</sub> variability, 2018 – 2 sites

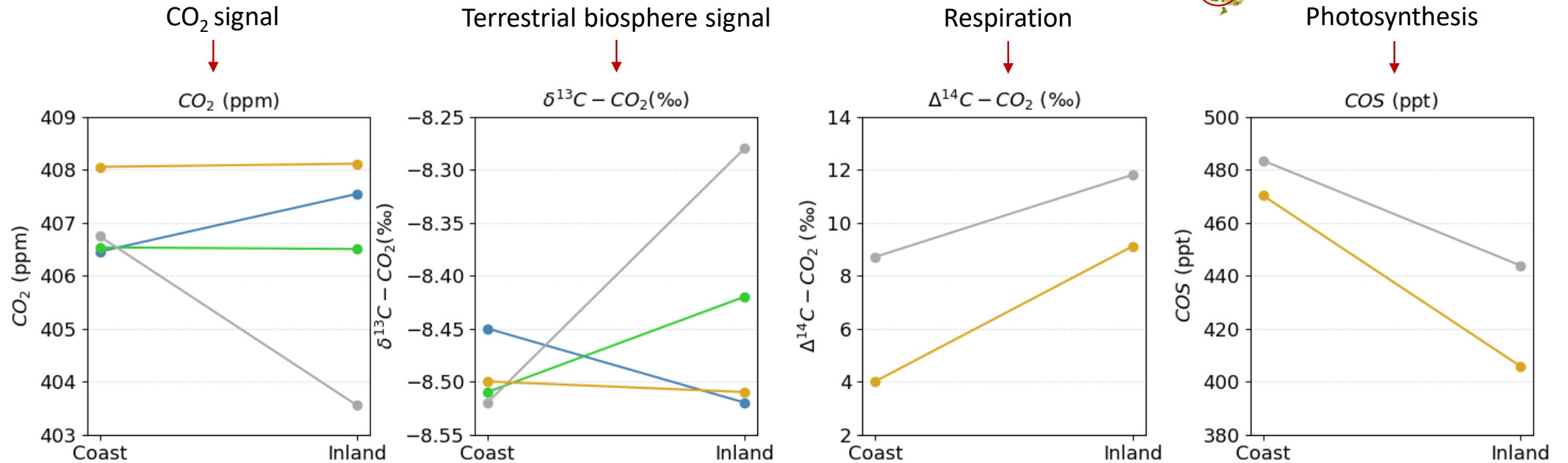


CO<sub>2</sub> uptake present in winter also

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# CO<sub>2</sub> tracer measurements, Fiordland

CO<sub>2</sub> isotopes ( $\delta^{13}\text{C}$  and  $\Delta^{14}\text{C}$ ) and Carbonyl sulphide (COS) flask measurements in Fiordland



CO2 (ppm)	Uptake	Respiration
Autumn	-26.4	23.4
Winter	-42.9	43.0



13 sites in total - GHG measurements + isotopes + COS + flux tower

3 long running sites with continuous measurements

9 new sites with in situ measurements

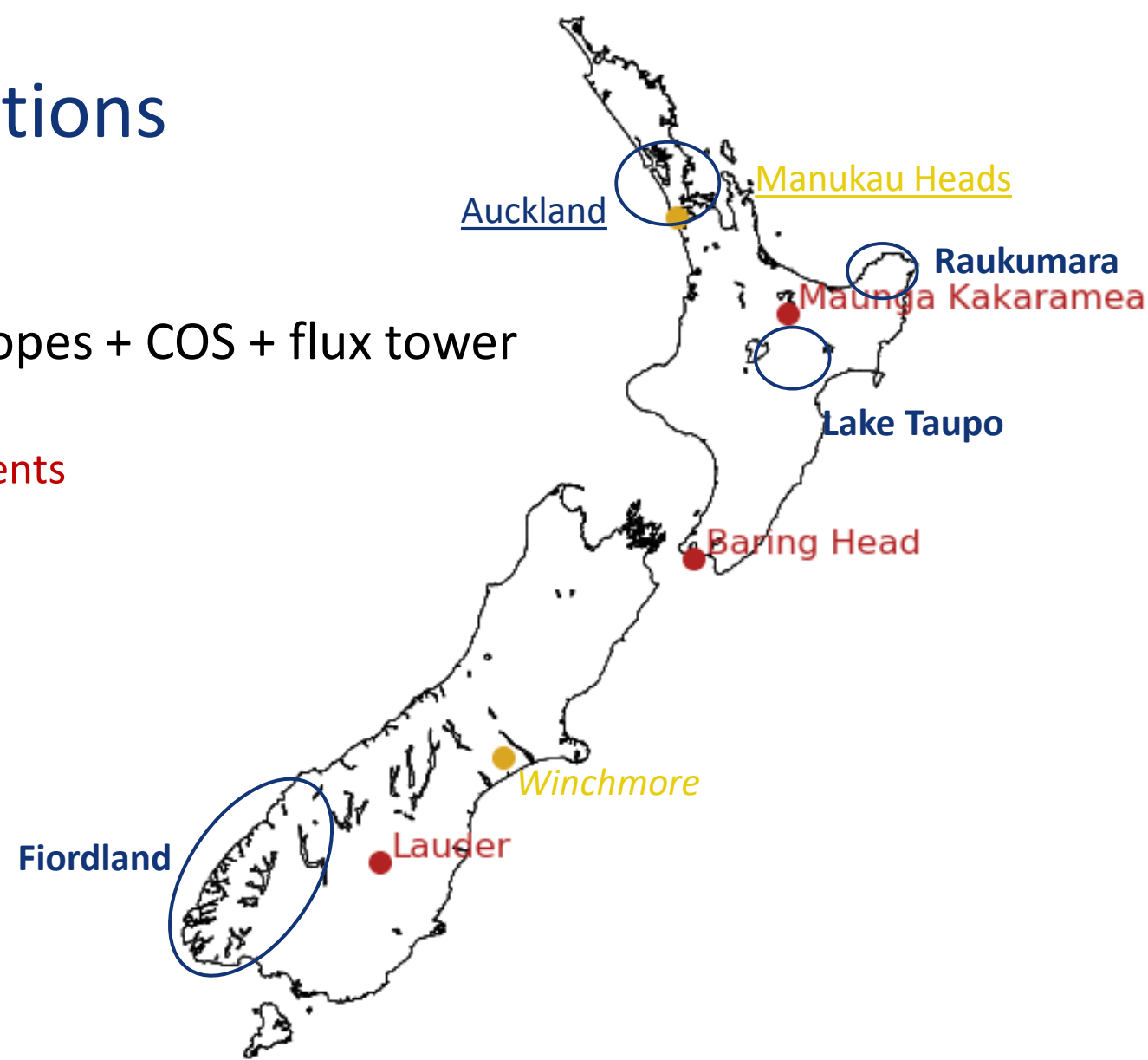
8 new sites with discrete measurements

+ smaller scale studies:

**Forests**

*Grasslands*

Urban areas



# Summary

- Recent flux NZ picture: 2017-2019 CO<sub>2</sub> sink still present
- New measurements suggest even larger sink

→ Work in progress, sensitivity tests, uncertainty quantification



## Acknowledgements

- CarbonWatchNZ Team at NIWA, GNS Science, Manaaki Whenua Landcare Research, and University of Waikato
- UK Met Office and NIWA weather and Lagrangian modelling teams
- New Zealand eScience Infrastructure (NeSI)
- MBIE, Marsden Fund, and NIWA for funding
- NIWA in situ measurements team

## Thank you

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More Info: <https://www.niwa.co.nz/climate/research-projects/carbon-watch-nz>

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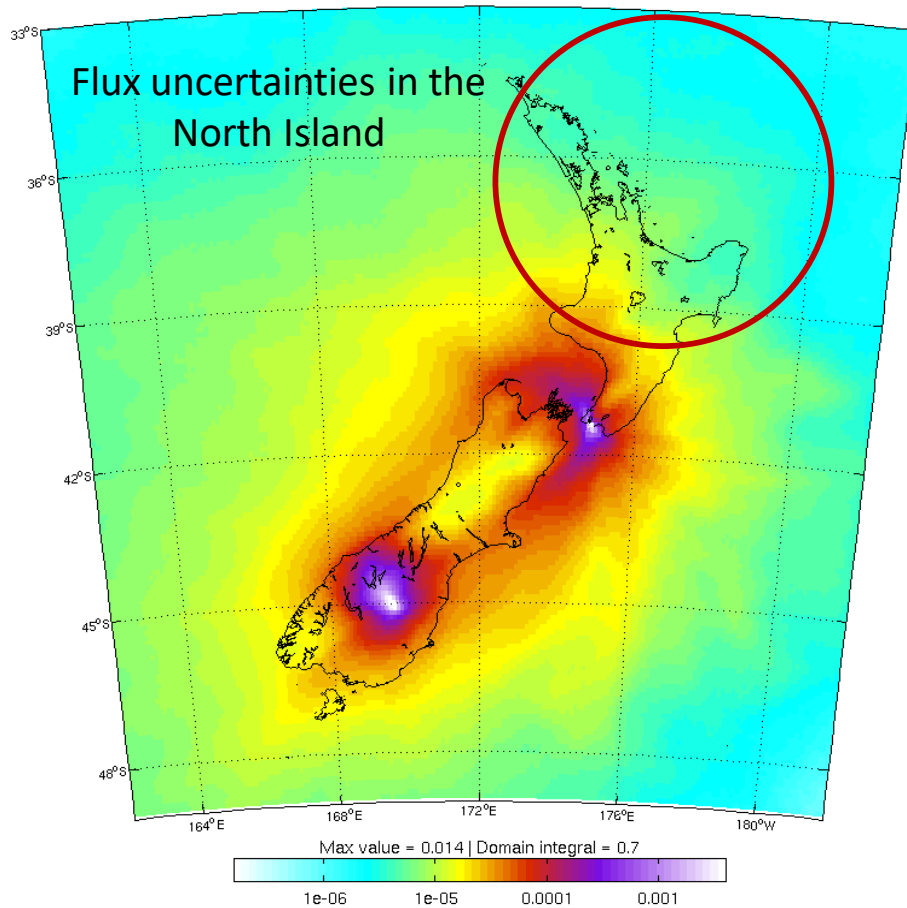
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# Modelled footprints

Baring Head and Lauder



Baring Head, Lauder and Maunga Kakaramea

