

# From ocean to coast: Past and future marine climate changes off southeast Australia

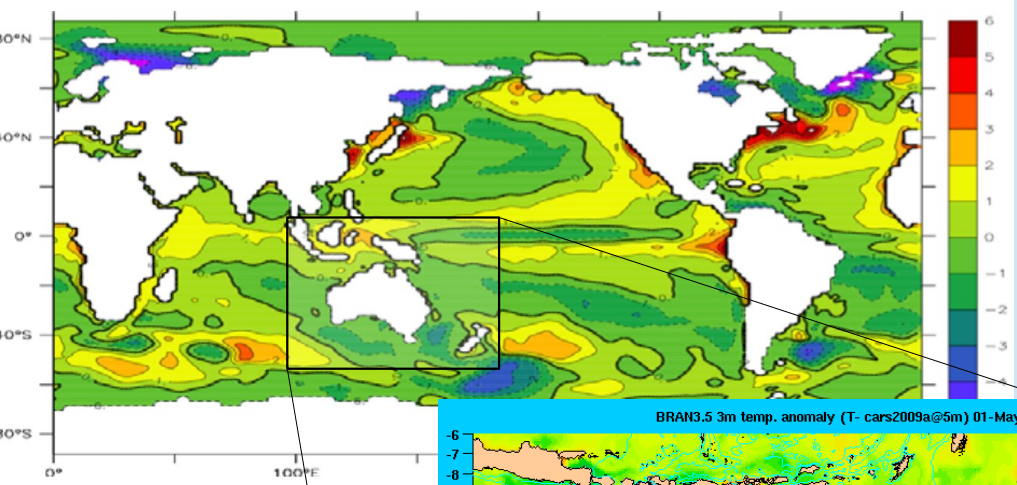
**Eric C. J. Oliver<sup>1,2</sup>**, Simon J. Wotherspoon<sup>1</sup>,  
Matthew A. Chamberlain<sup>3</sup>, and Neil J. Holbrook<sup>1,2</sup>

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<sup>2</sup> Australian Research Council Centre of Excellence for Climate System Science

<sup>2</sup> CSIRO Marine and Atmospheric Research (CMAR), Hobart, AUS

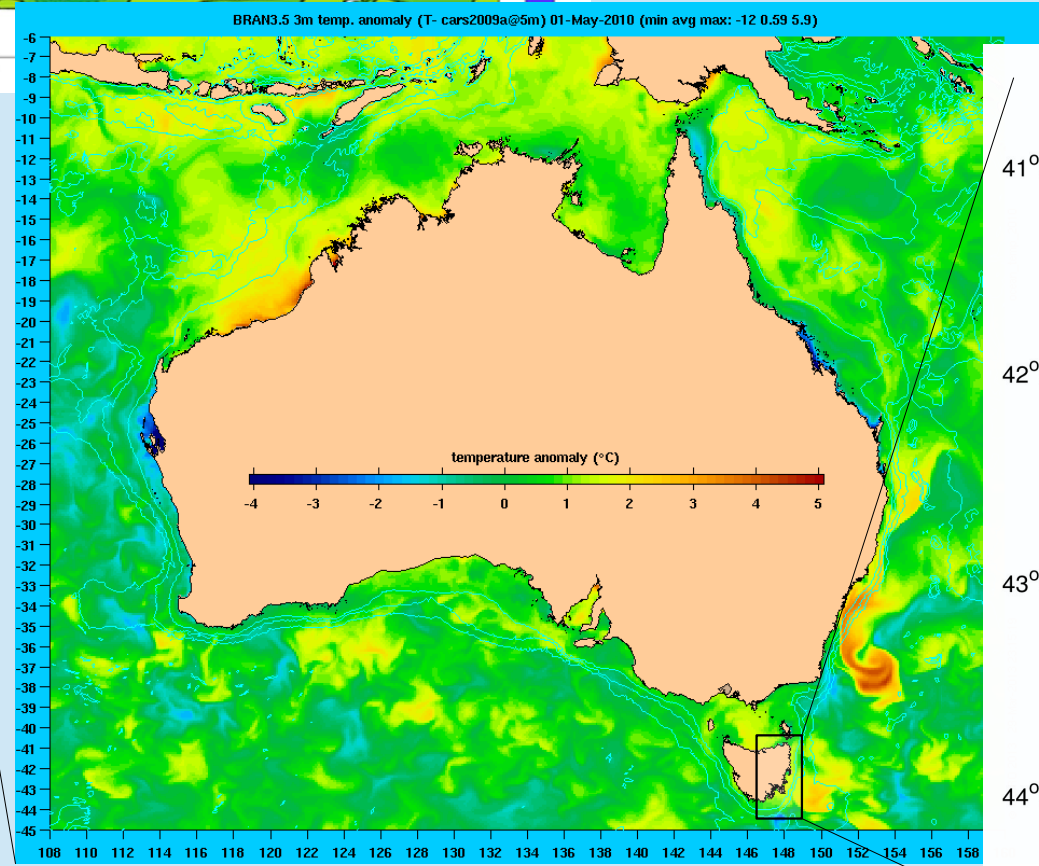
## Global



“From ocean to coast”: Modeling the ocean across a range of scales from **global** through to **regional** and **shelf / coastal**

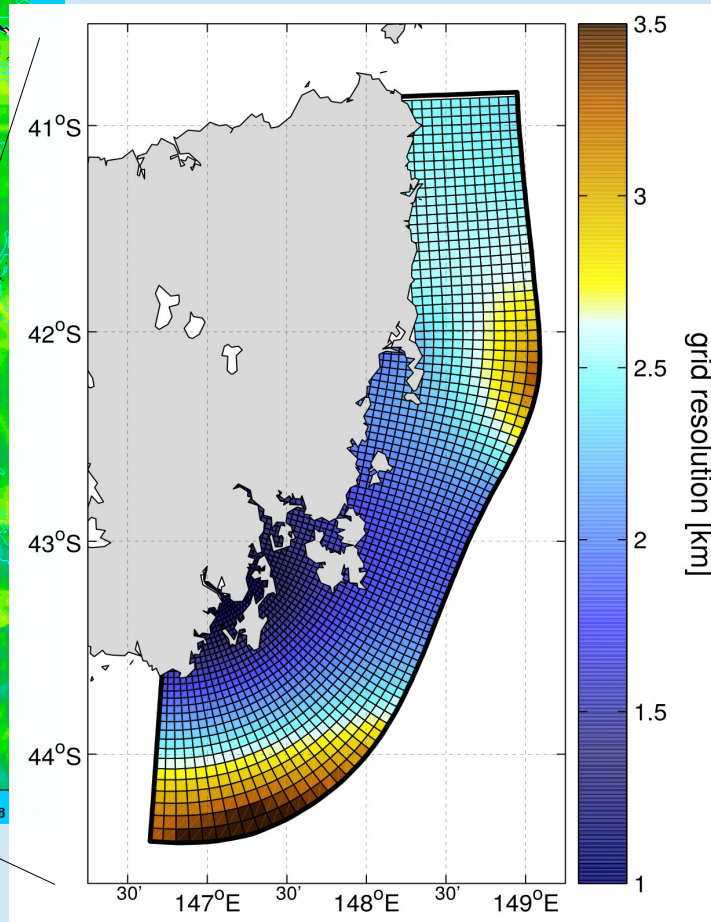
## Regional

[CAWCR]



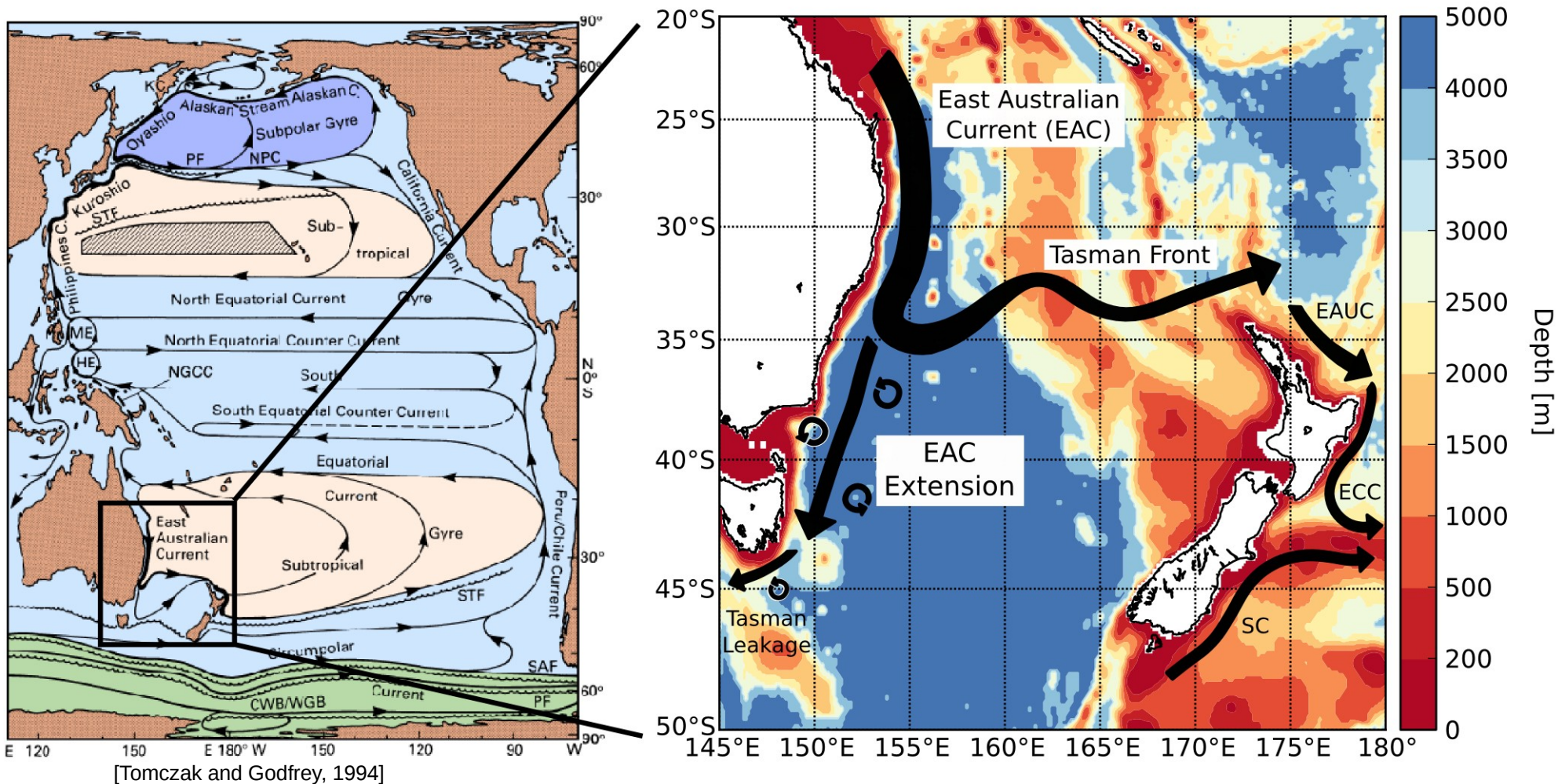
[CSIRO (Peter Oke)]

## Shelf / Coastal

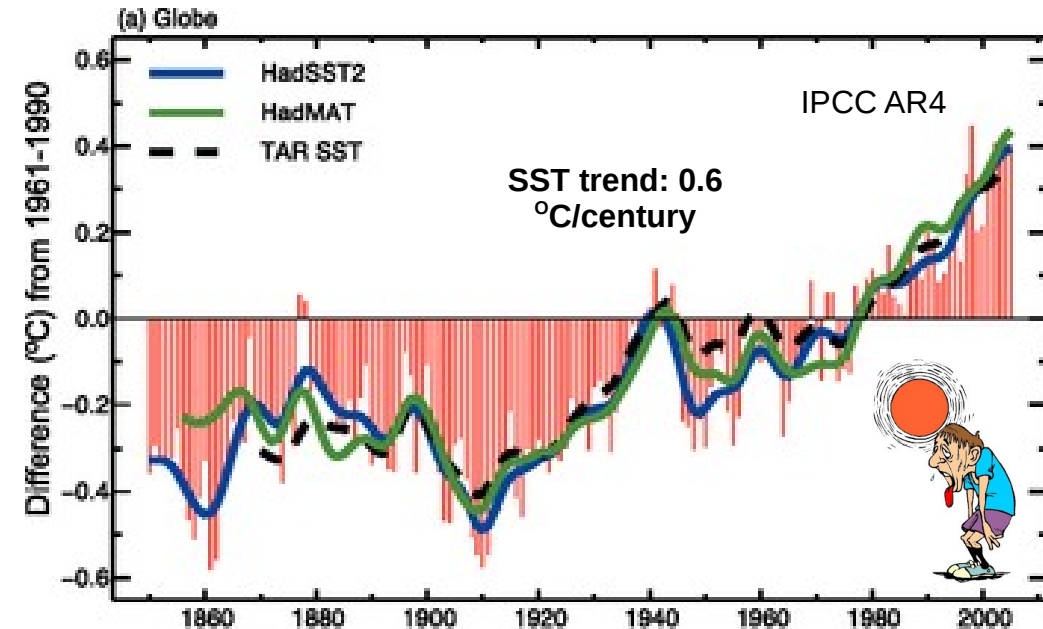




- **Regional oceanography of the Tasman Sea**
- western boundary current, eddy-rich region, complex bathymetry

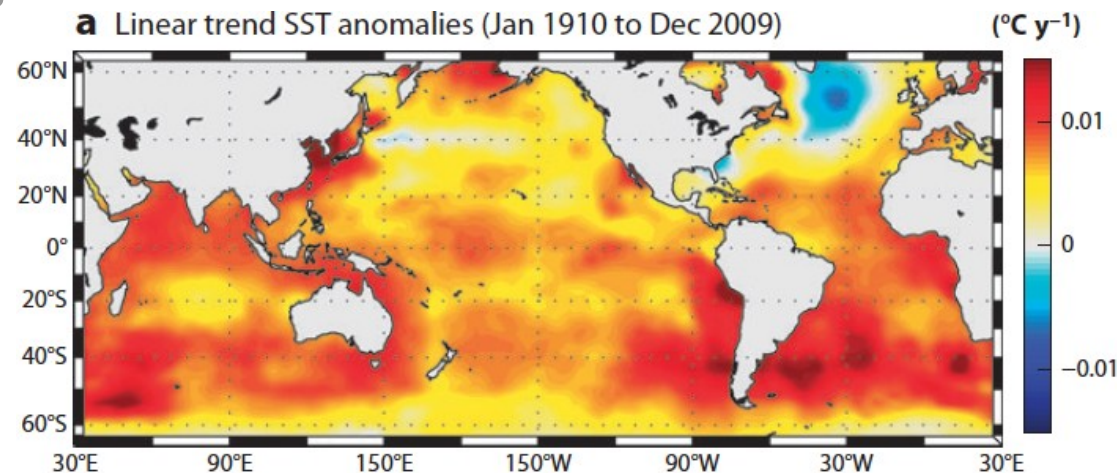
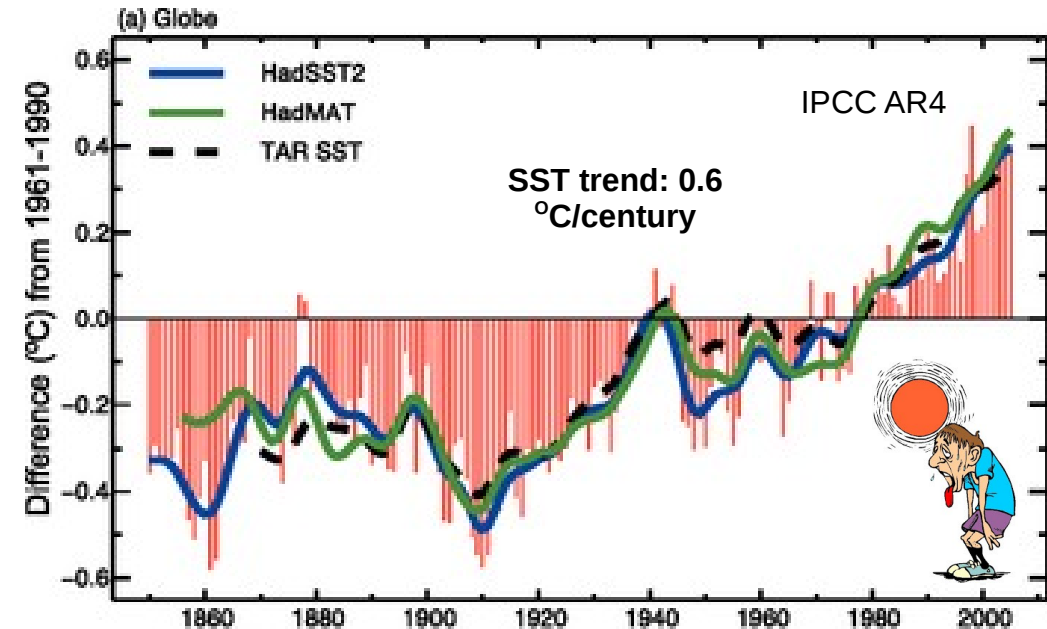


- Global marine climate is **warming**
- The SW Pacific (Tasman Sea) is a **hotspot of change**
- Impacts on **marine ecology** are already being felt
- **Historical marine climate** in Eastern Tasmania is poorly understood
- Large-scale models and reanalysis are not designed for near-shore studies
- Alternatives
  - Statistical downscaling
  - Dynamical downscaling



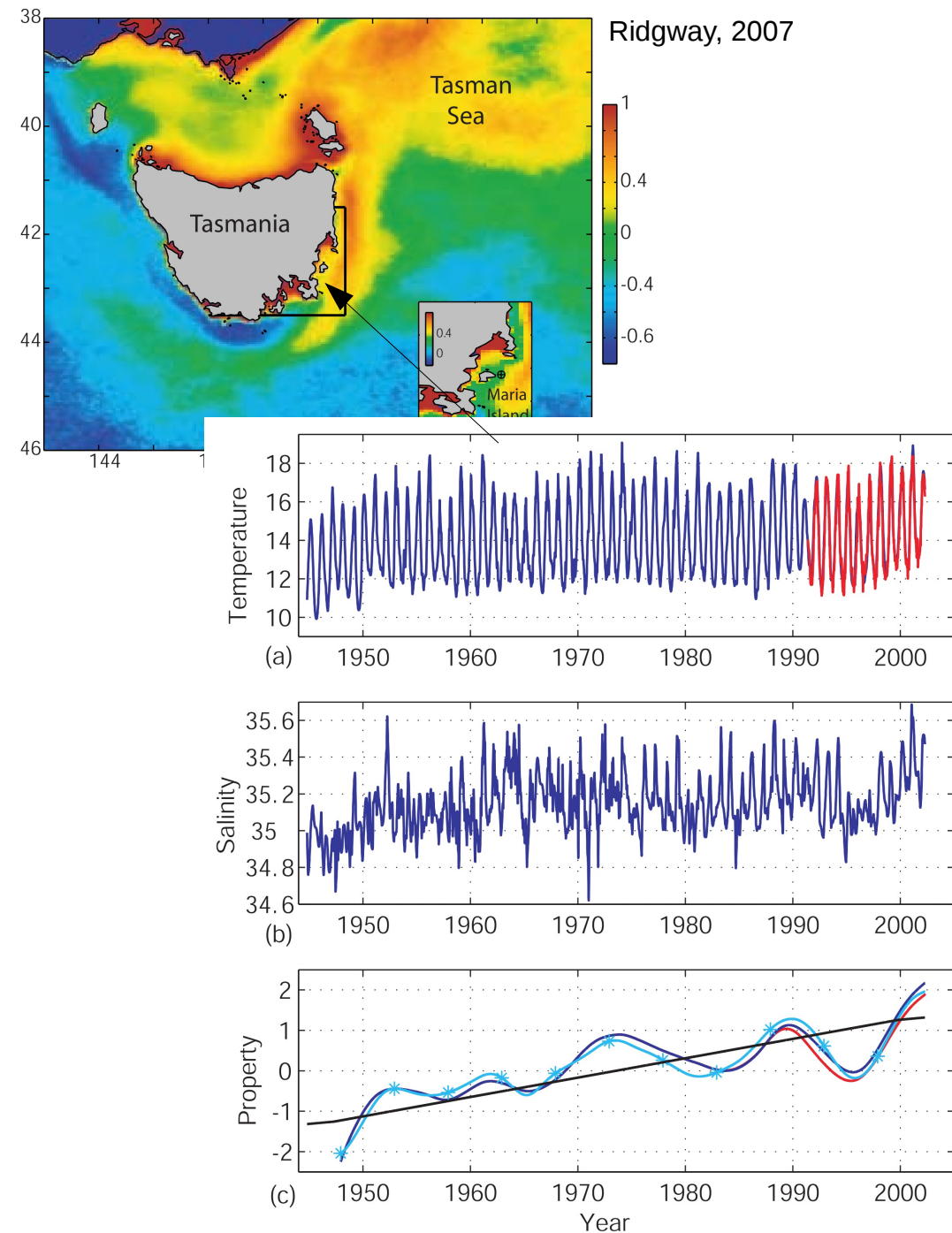


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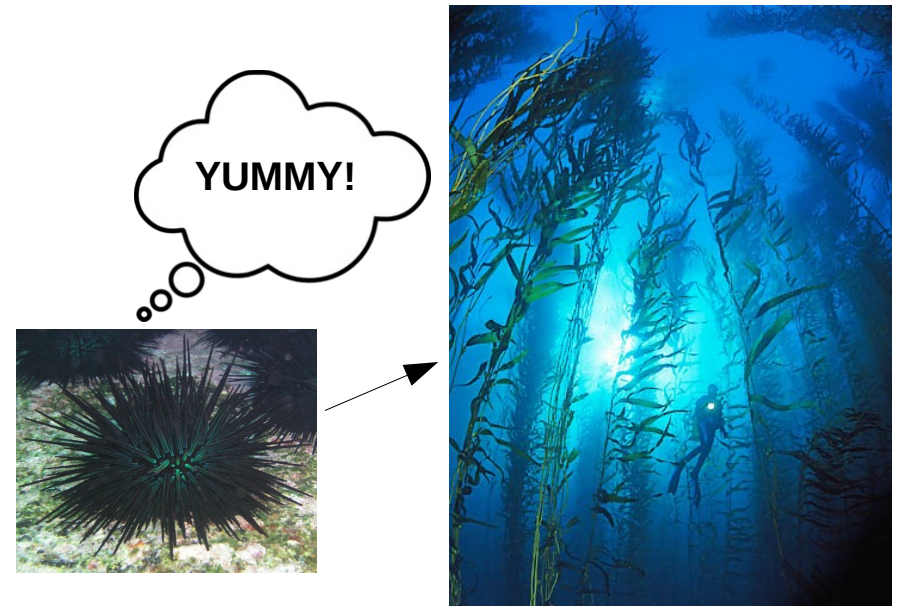
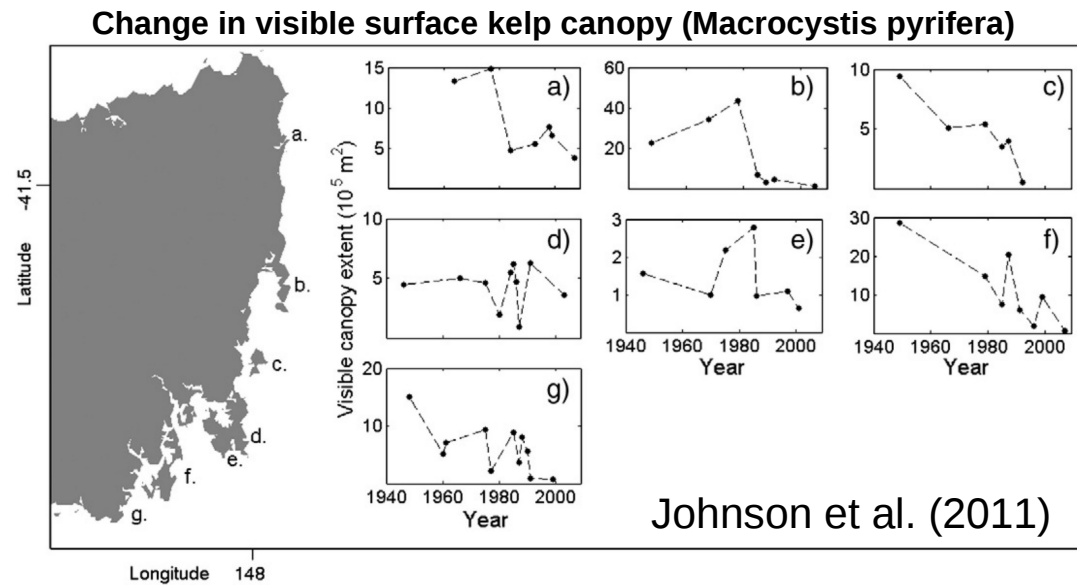
Chavez et al., 2011

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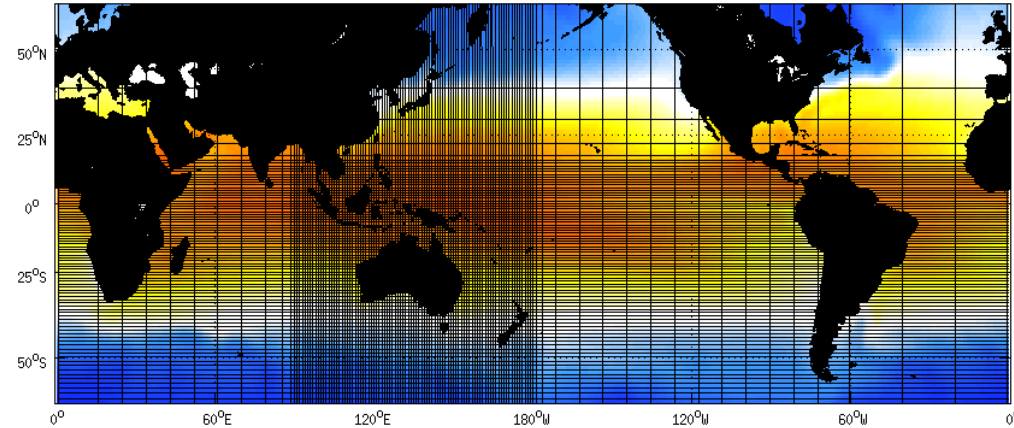


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- Eddy-resolving dynamical downscaling in Australia region performed by [Chamberlain et al. \(2010\)](#):
- Two ocean model runs using Ocean Forecasting Australia Model (**OFAM**; 70°S–70°N domain, 1/10° resolution around Australasia)

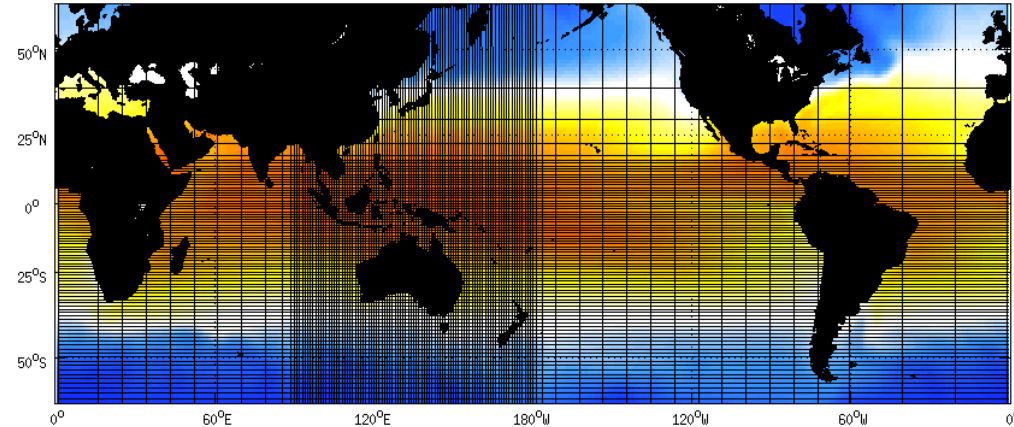
OFAM grid with mean SST



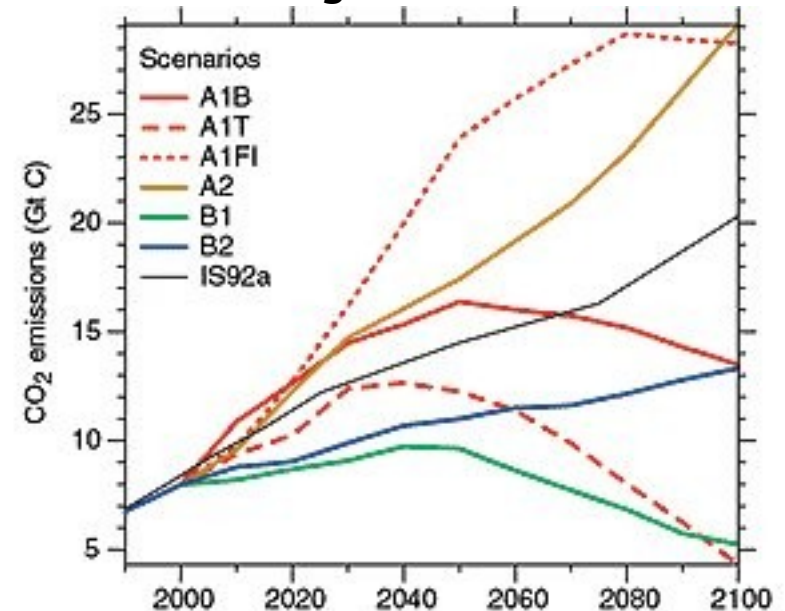


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  - **1990s (CTRL run)**, and
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- Control run forced by **historical reanalysis**
- **Climate change scenario** provided by CSIRO Mk3.5 GCM with an A1B emissions scenario

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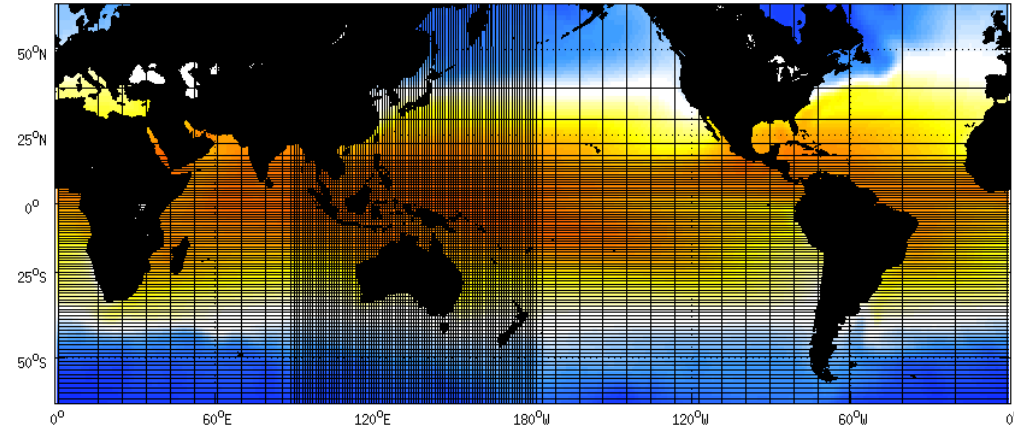


Climate change emissions scenarios

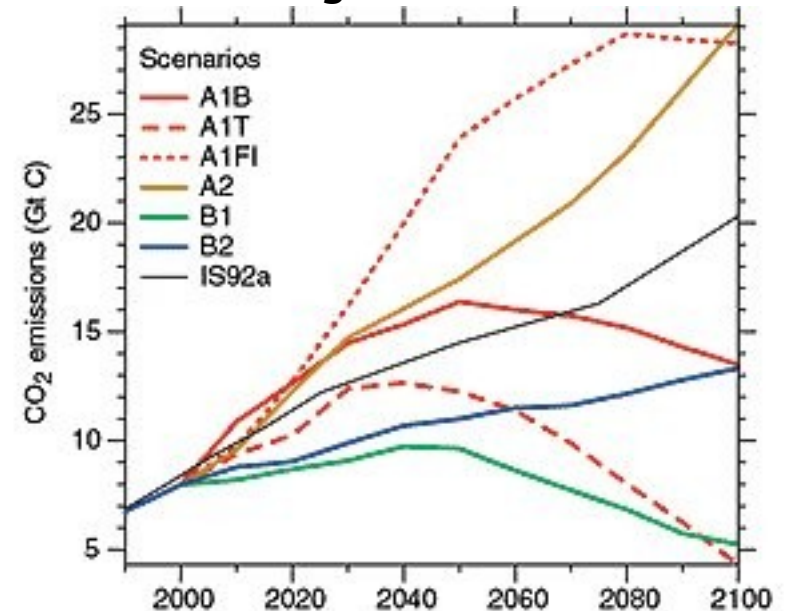


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- Models represent well general circulation and temperature distribution around Australia, including seasonality [Sun et al, 2012; Matear et al., 2013]

OFAM grid with mean SST

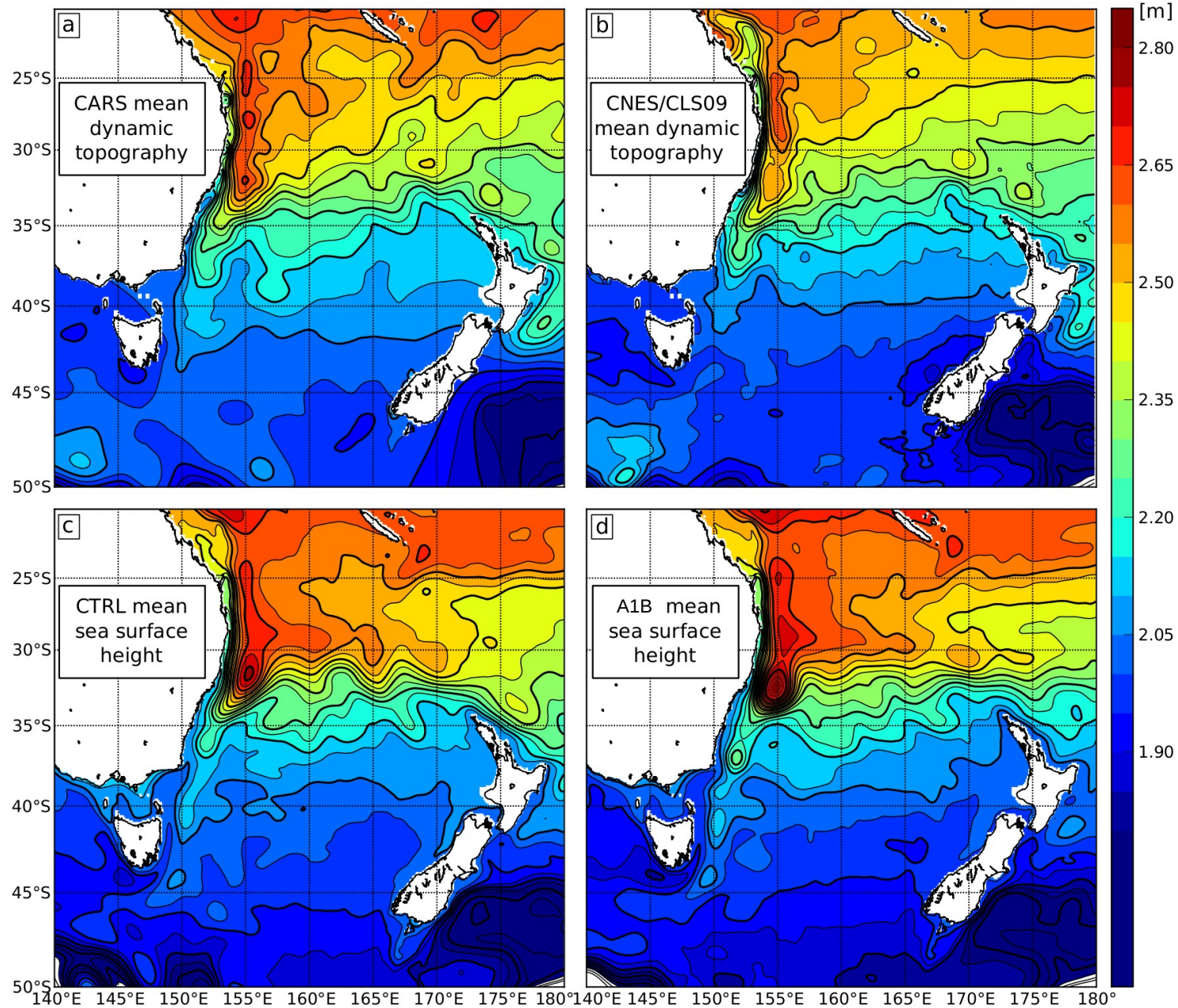


Climate change emissions scenarios



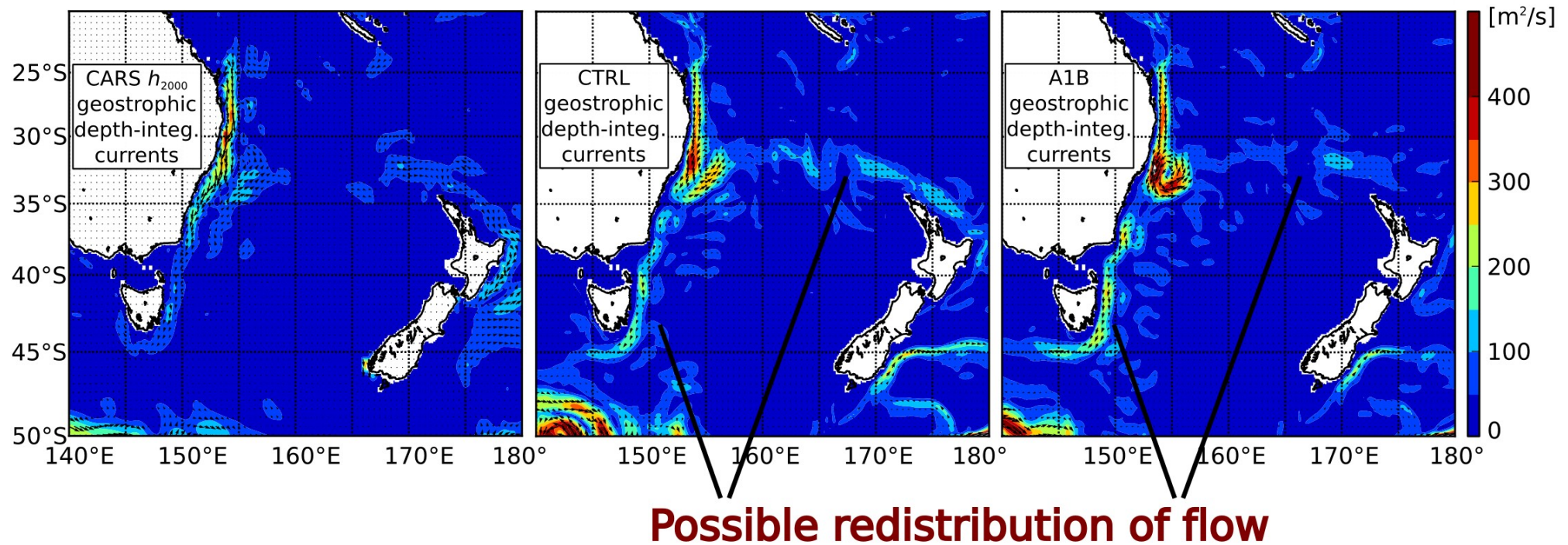


Model simulated  
**surface mean  
dynamic topography**  
(indicative of surface  
geostrophic flow)  
consistent with  
observations

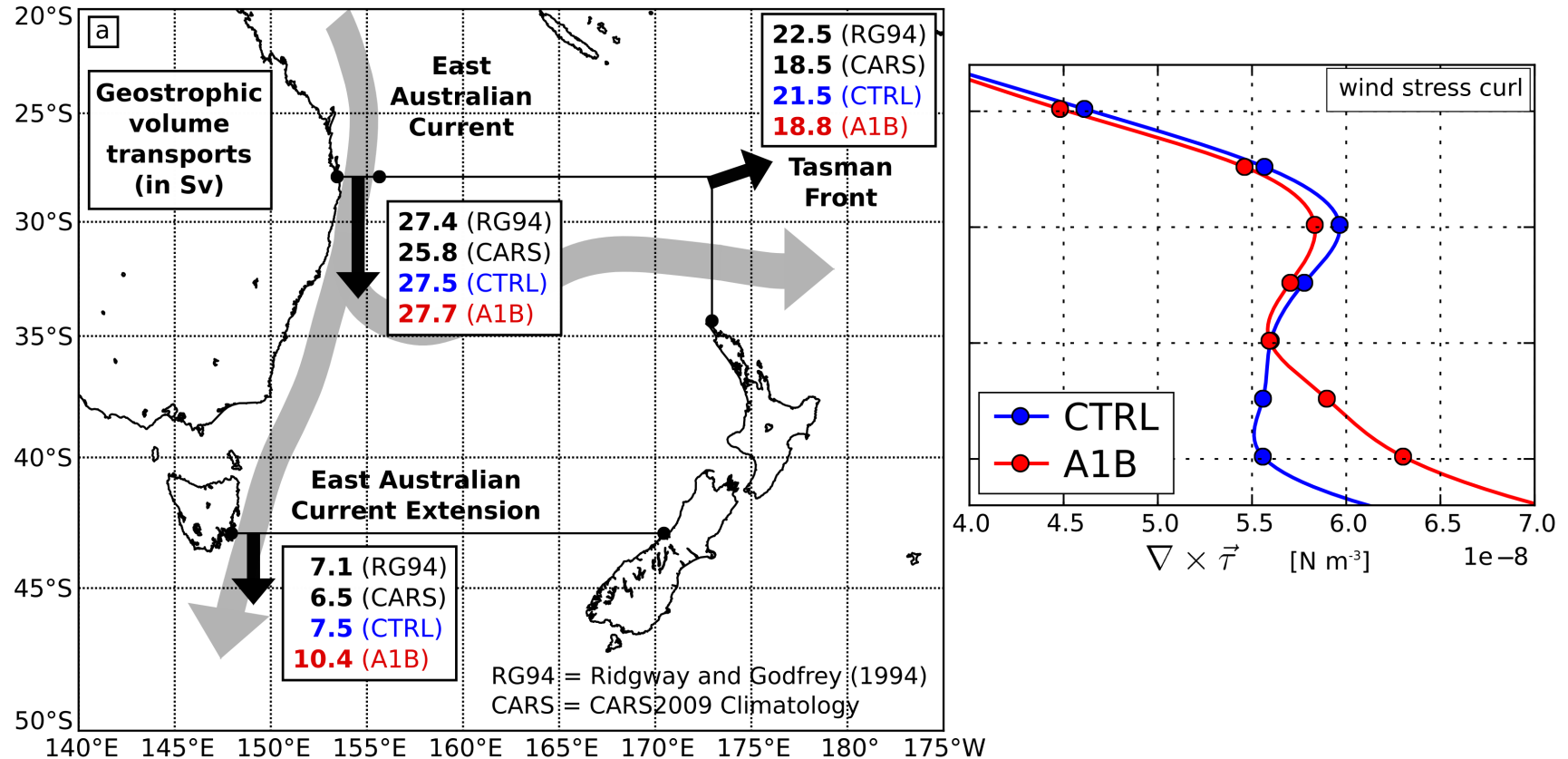




- Model simulated **mean volume transport**



- **Redistribution of flow** through the Tasman Sea



- **Enhanced EAC extension** and **reduced flow along Tasman Front**, consistent with basin-wide changes in wind stress curl



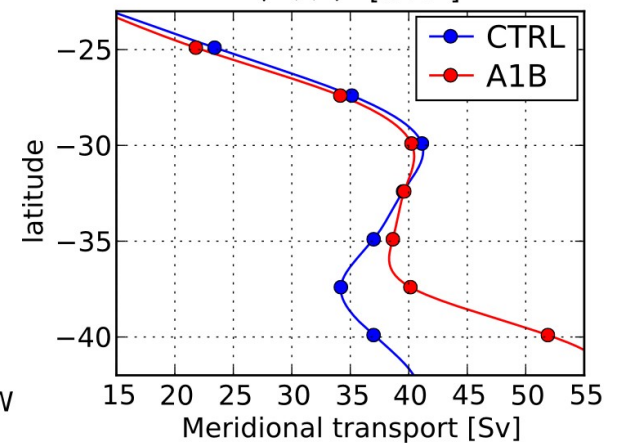
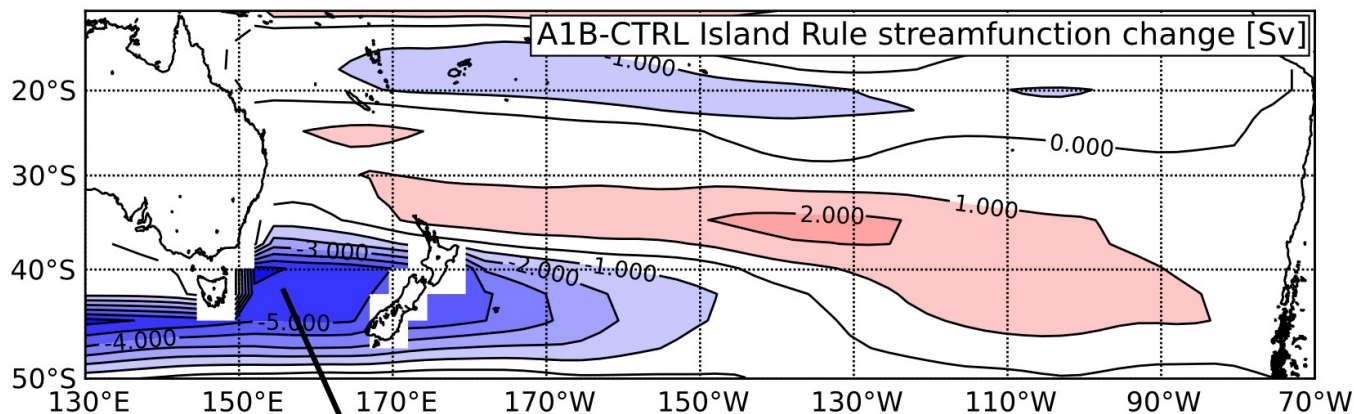
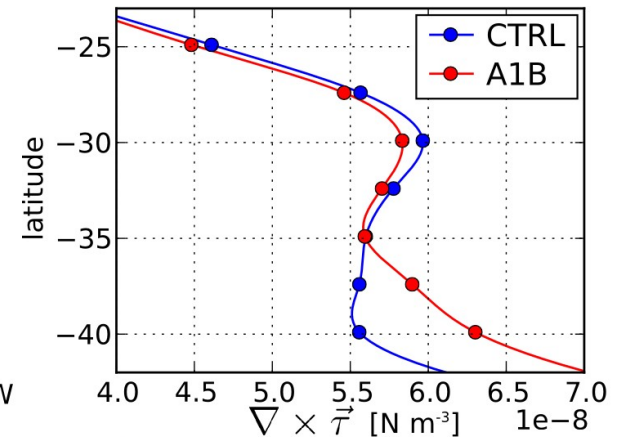
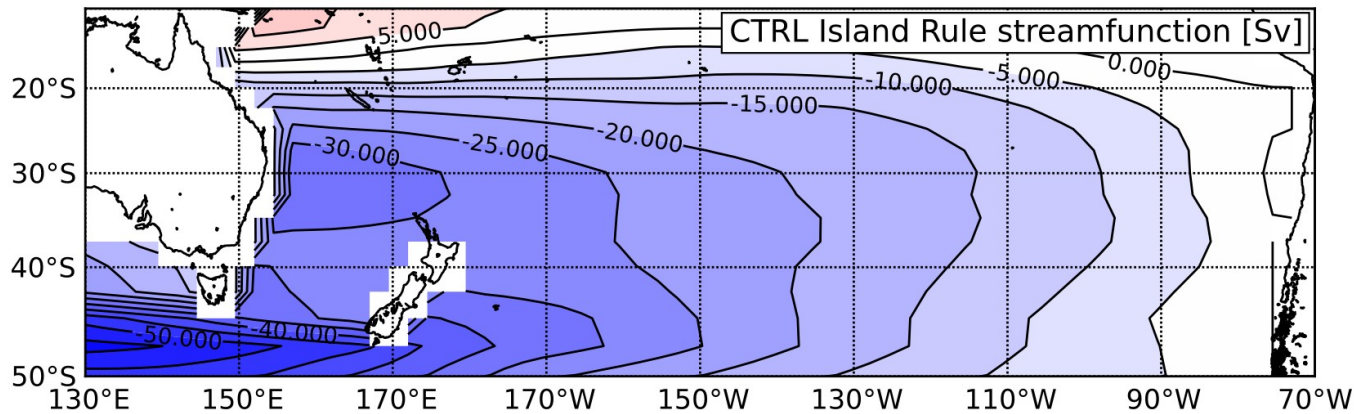
- **Simple linear, wind-driven, barotropic circulation model**

- If the changes in mean circulation are simply due to changes in wind-stress, then we may be able to capture them with such a model
- Sverdrup stream function  $\psi(x,y)$  given by zonally integrating meridional flow according to  $d\psi/dx=V$
- Wind-driven  $V$  in the interior of the ocean given by the Sverdrup balance:

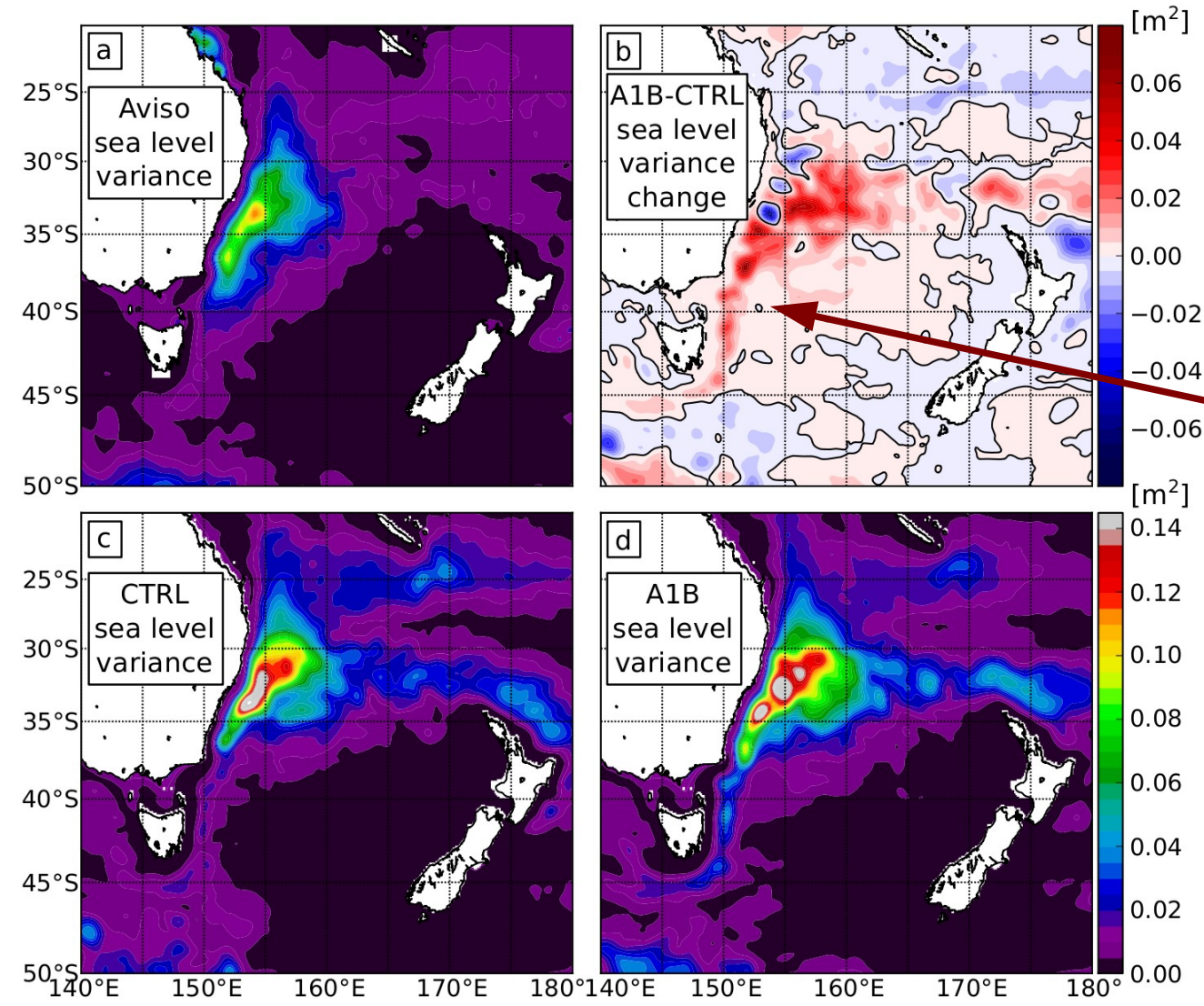
$$\beta V = \frac{1}{\rho H} \nabla \times \vec{\tau}$$

- Value of  $\psi$  along island boundaries (i.e., Aus., NZ) handled by Godfrey (1989) Island Rule

- Island Rule stream function** for CTRL (1990s) winds, and change for A1B (2060s) wind



**circulation changes at high latitudes in the Tasman Sea (EAC extension)**

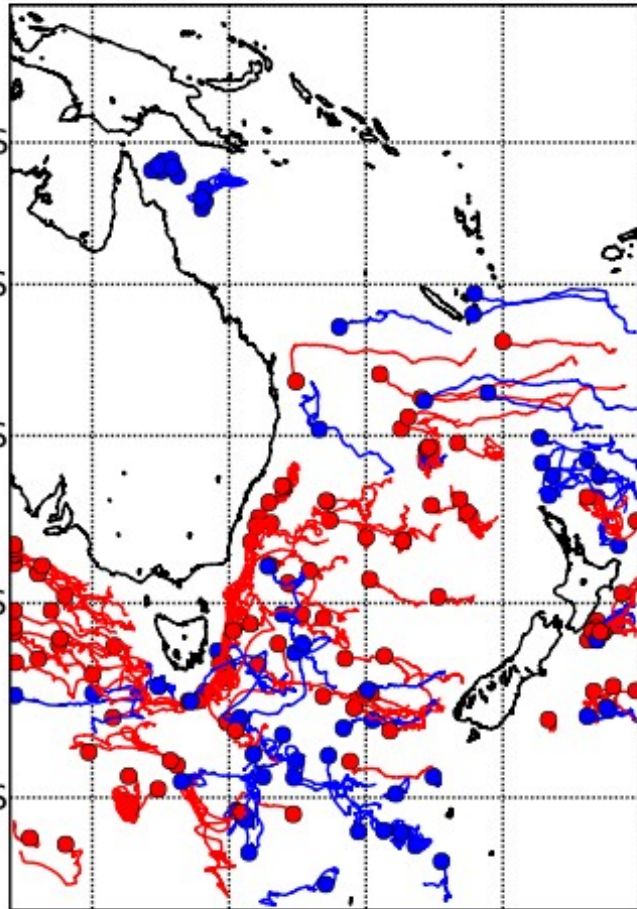


- Sea level variance (~eddy kinetic energy) consistent between model and observations
- Significant **increase in eddy kinetic energy** in EAC Extension region, where flow is not steady but in fact consists of a train of mesoscale eddies...

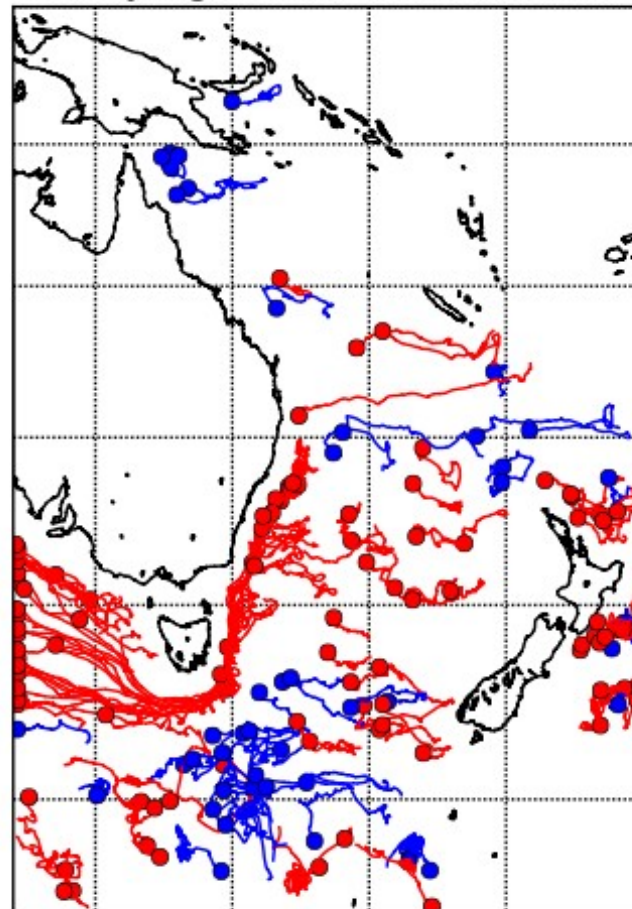


**Cyclonic (blue)** and **anticyclonic (red)** eddies tracked using Chelton et al. (2011) sea level algorithm:

Eddy age > 32 weeks (CTRL)

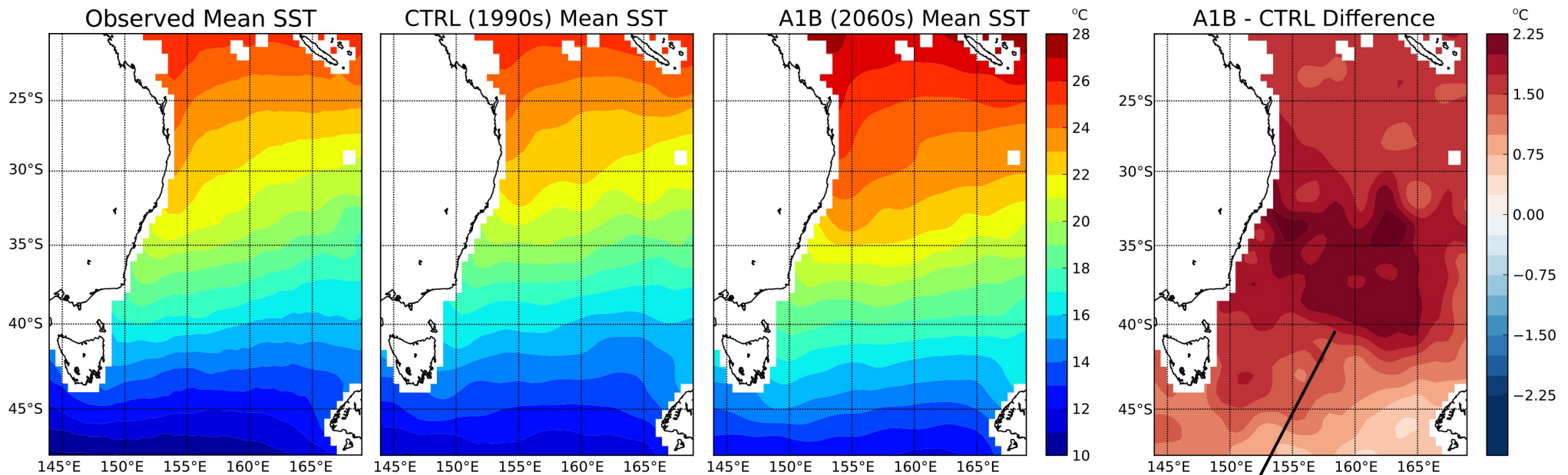


Eddy age > 32 weeks (A1B)



Significant increase in number of long-lived anticyclonic (warm core) eddies in EAC Extension region, and possibly an increase in eddies passing through the Tasman Leakage

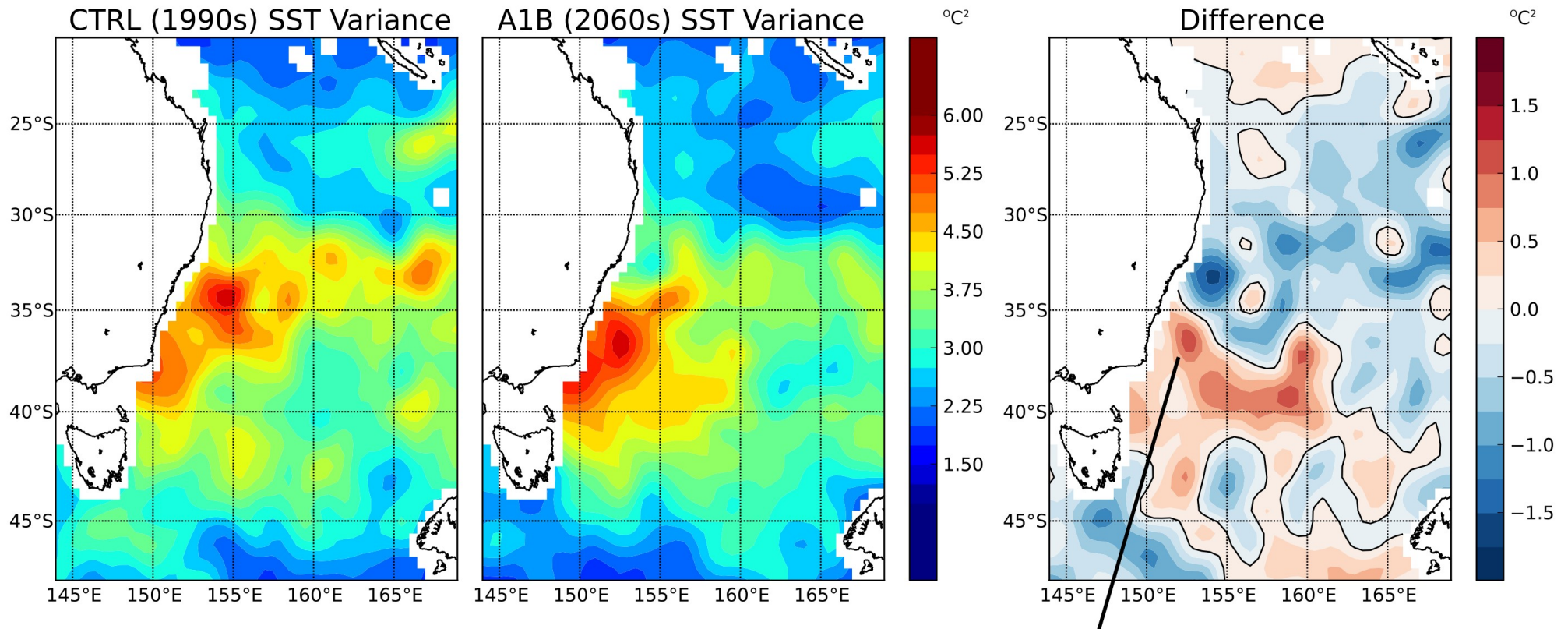
- Model projected change to **mean SST**



Model projected Tasman Sea hotspot



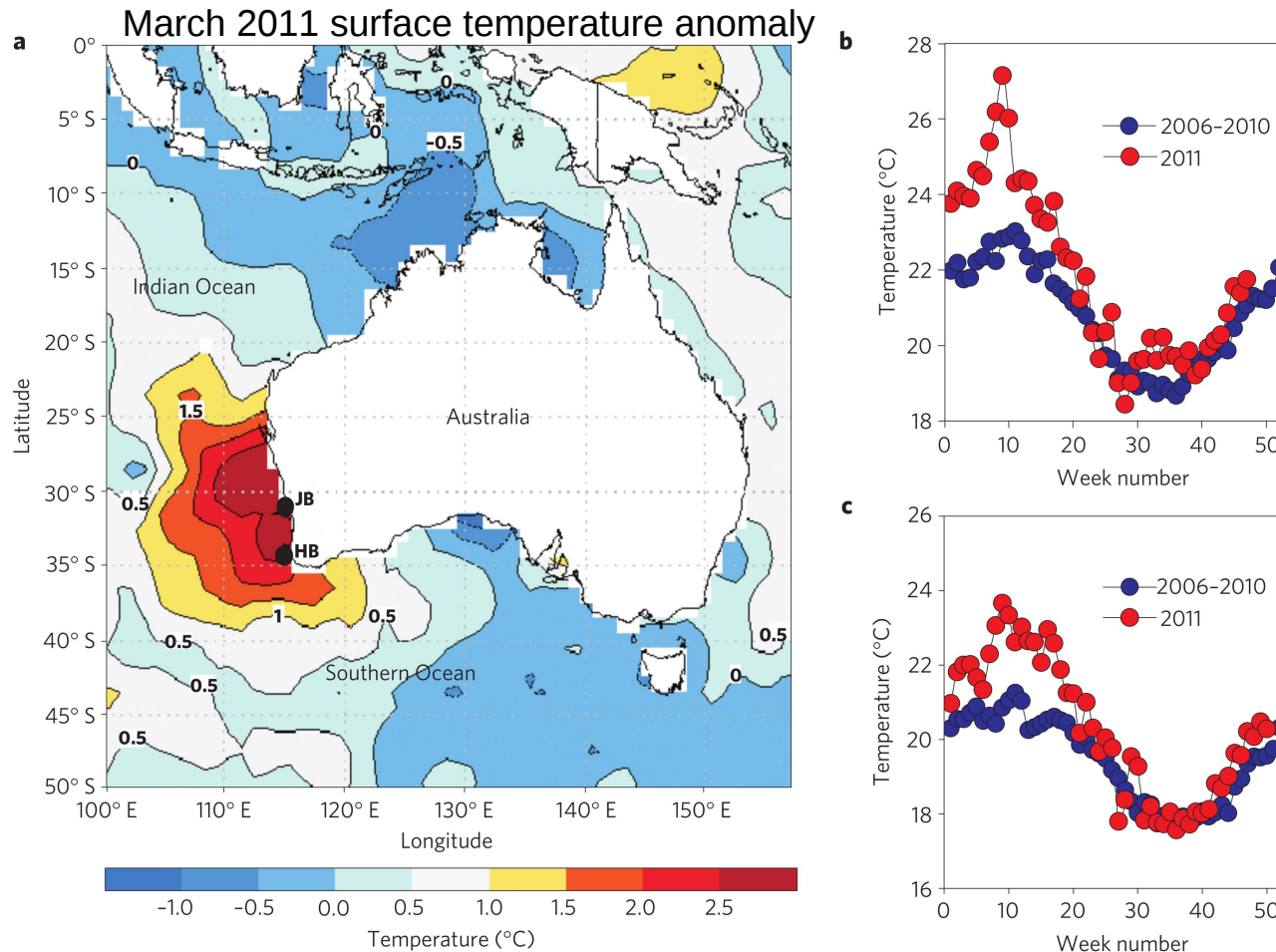
- ...and an associated increase in **SST variance** in same region



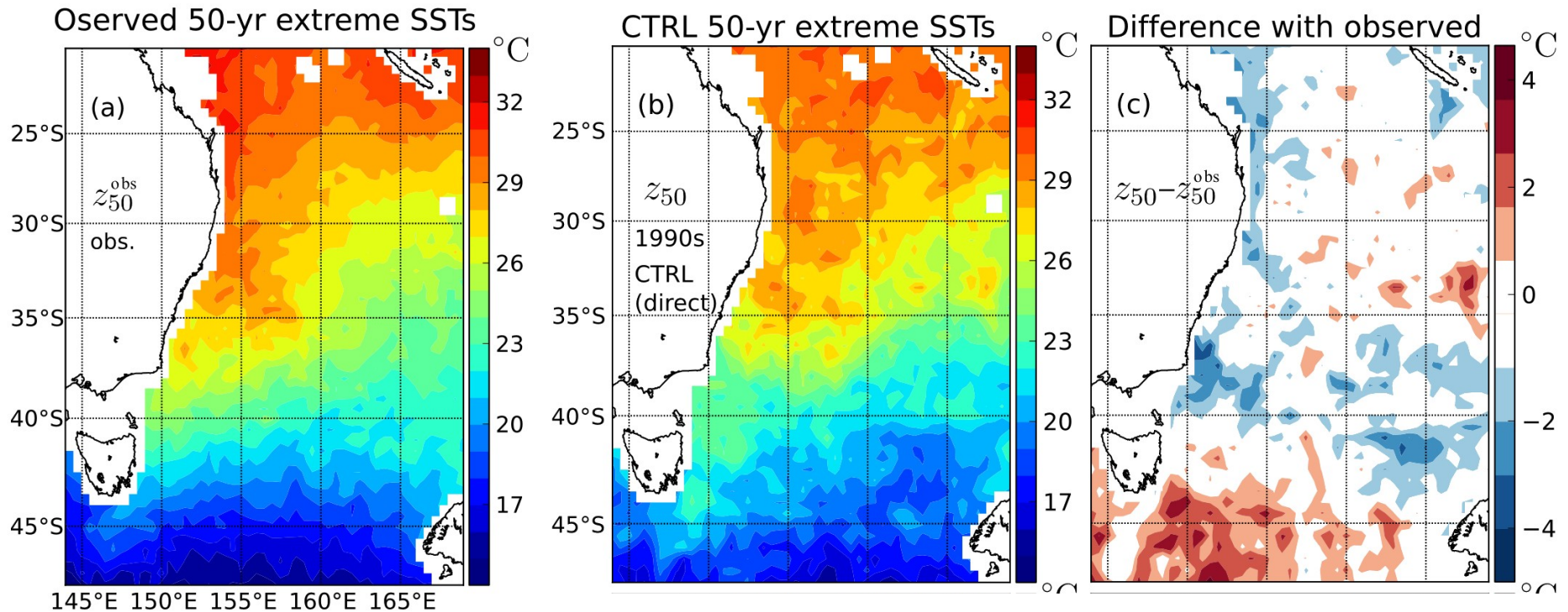
**Increase of SST variability  
in EAC extension region**



- In 2011, a “**marine heat wave**” off of **Western Australia** was documented (Pearce and Feng, 2013; Feng et al., 2013)



- Some species experienced **range extensions** during the marine heat wave which persisted after the heat wave dissipated (Wernberg et al. 2013)



- The ocean model runs **do not** fully represent the extremes
- The ocean model runs **do represent** well the overall climate
- Extremes can be represented using the “climate” alone, e.g.:
  - Griffiths et al. (2005), Ballester et al. (2010), Simolo et al. (2011), de Vries et al. (2012)

- SST Extremes modeled using a **Bayesian hierarchical model**
  
- **For the 1990s climate:**
  - The CTRL run yields good estimates of the large-scale marine climate, e.g., the mean circulation and eddy variability and overall marine climate (mean SST, variance, etc)
  - Model observed historical extremes using climate statistics as predictors: *“extremes” = f(“climate”)*
  
- **For the 2060s climate:**
  - Use fitted model, *f(“climate”)*, and the projected future climate statistics to estimate future extremes
  - Assumes the model is stationary in time



- Bayesian hierarchical model

- **Data Layer**

- Assume that at each location  $j$  the annual maxima  $\mathbf{y}_j$  are distributed according to an extreme value distribution:

$$\mathbf{y}_j \sim EVD(a_j, \phi_j)$$

- **Climate process layer**

- Assume the model parameters over all space  $(\mathbf{a}, \boldsymbol{\phi})$  can be estimated by a linear regression onto a set of predictors  $\mathbf{X}$ , consisting of the mean SST, SST variance, skewness, etc:

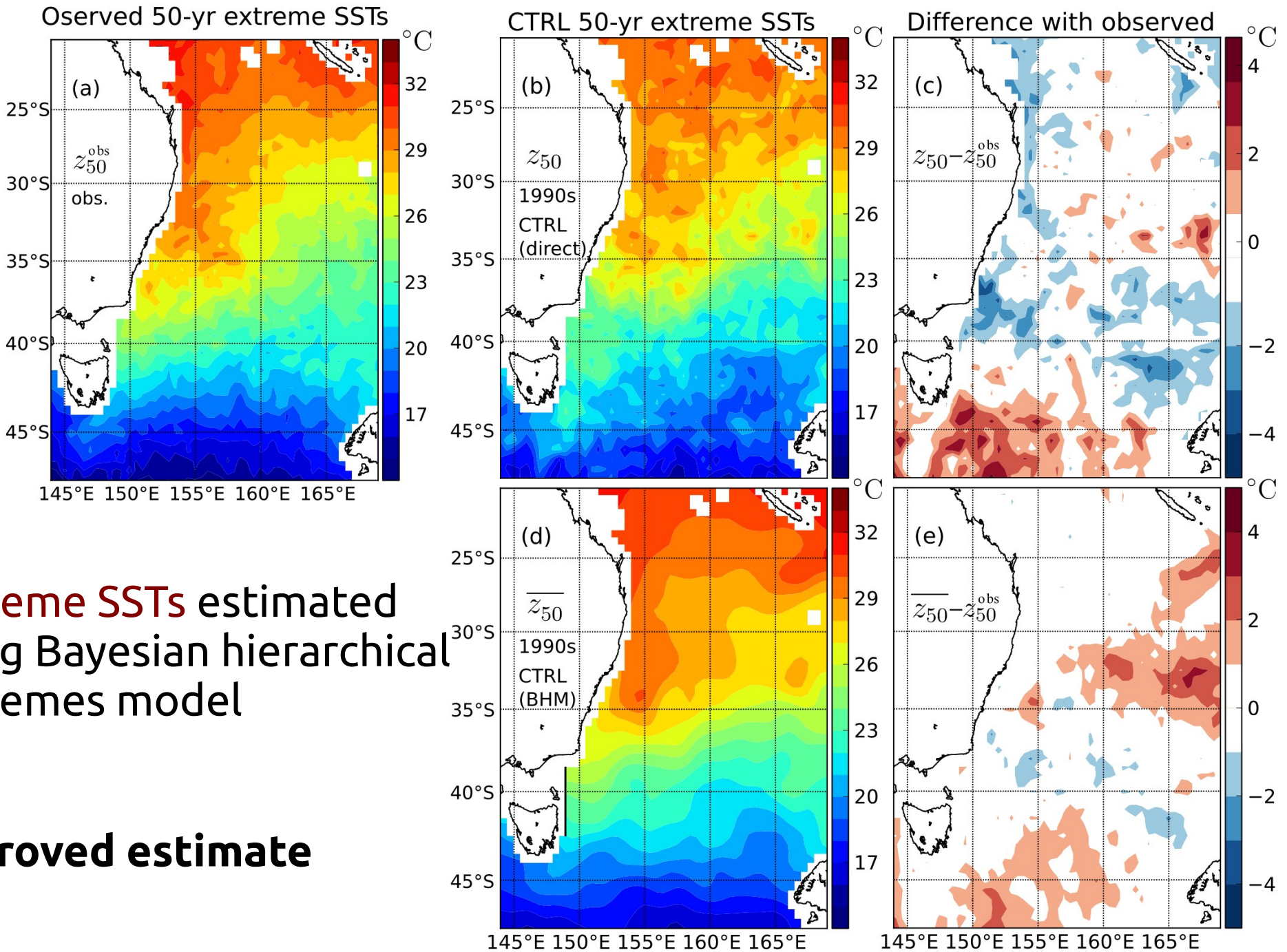
$$\mathbf{a} = \mathbf{X}\boldsymbol{\beta}_a + \boldsymbol{\varepsilon}$$

$$\boldsymbol{\phi} = \mathbf{X}\boldsymbol{\beta}_\phi + \boldsymbol{\varepsilon}$$

- The errors ( $\boldsymbol{\varepsilon}$ ) are assumed to be normally distributed

- **Priors** are diffuse, non-informative

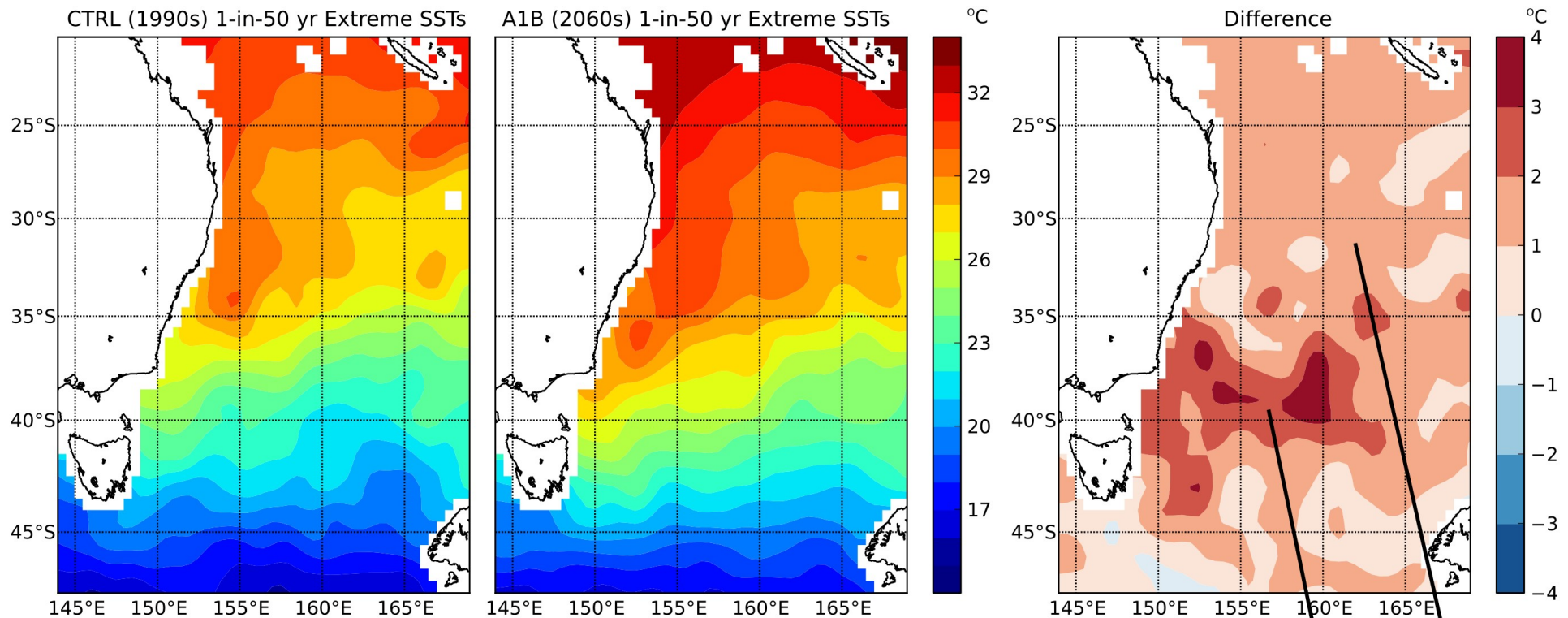
- Parameters are **sampled** using MCMC, Metropolis rule, Gibbs sampler



**Extreme SSTs** estimated using Bayesian hierarchical extremes model

**Improved estimate**

- Projected change in extreme SSTs (50-year return levels) is due to a combination of the changes in mean and variance



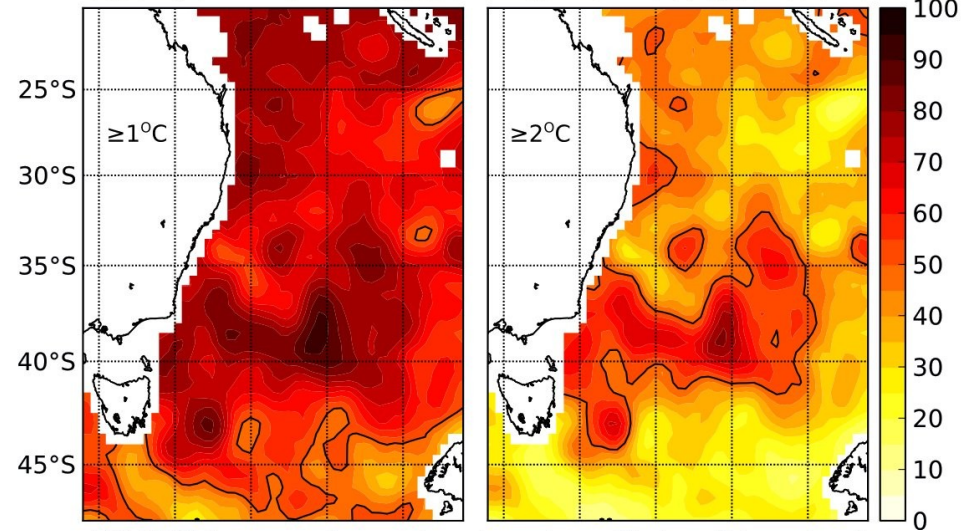
Hotspot further south (due to SST variance)

Overall increase (due to change in mean SST)

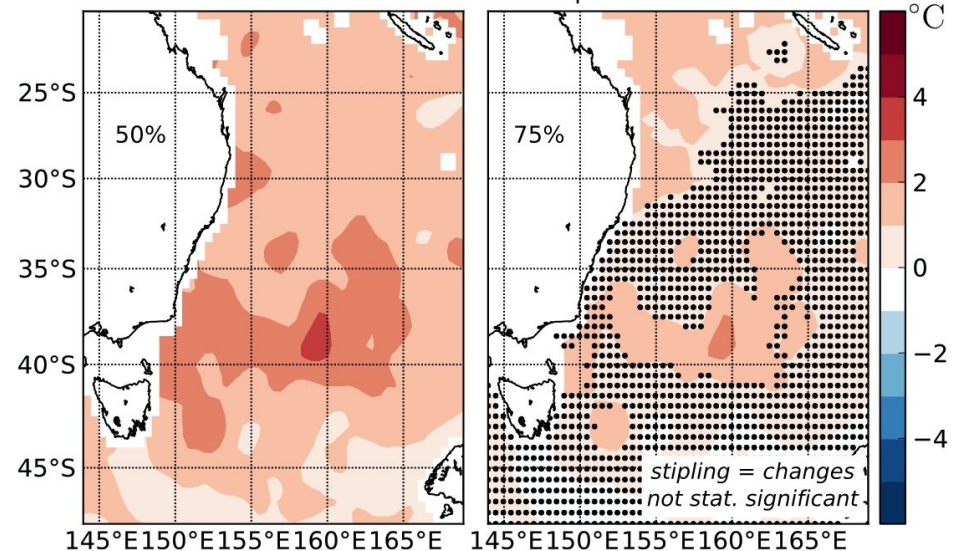


- The extremes model is **probabilistic** in nature (Bayesian) and so we can put **confidence limits** on our predictions
- This type of information is very helpful when making statements about climate change

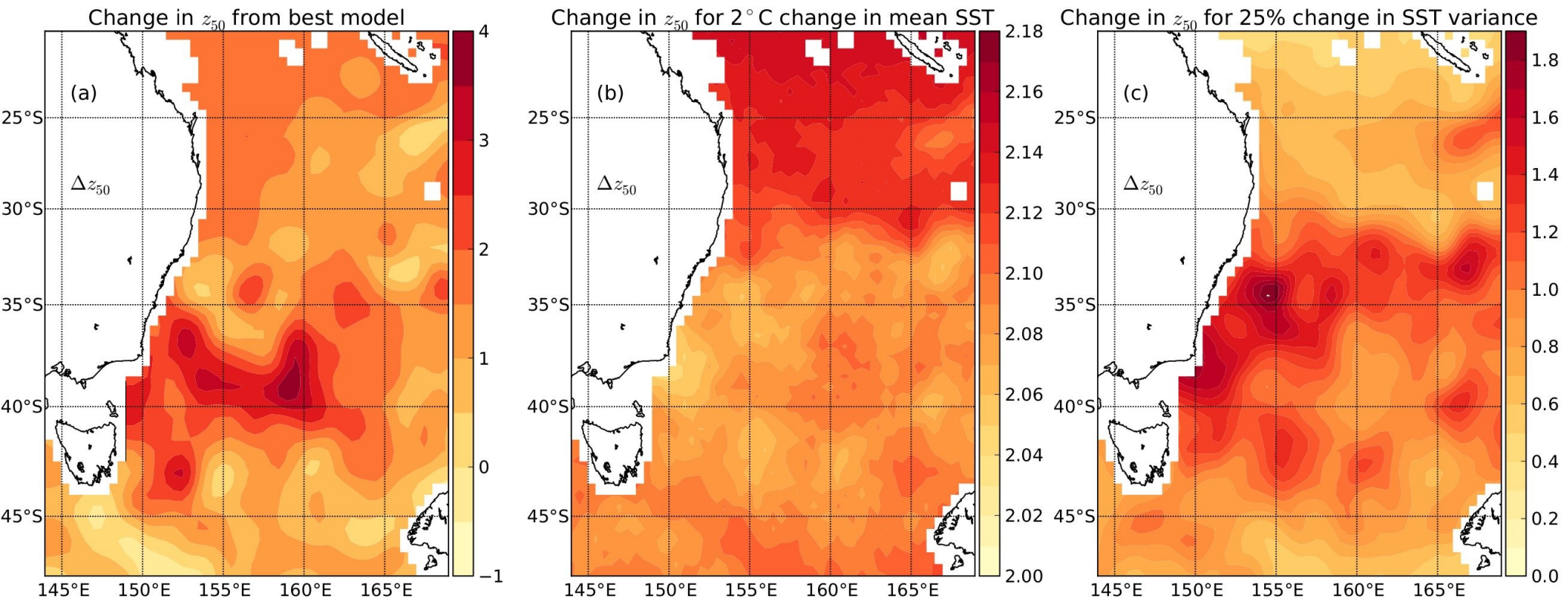
Probability of A1B-CTRL increase of annual maxima by specified amount



A1B-CTRL increase of annual maxima at specified confidence level

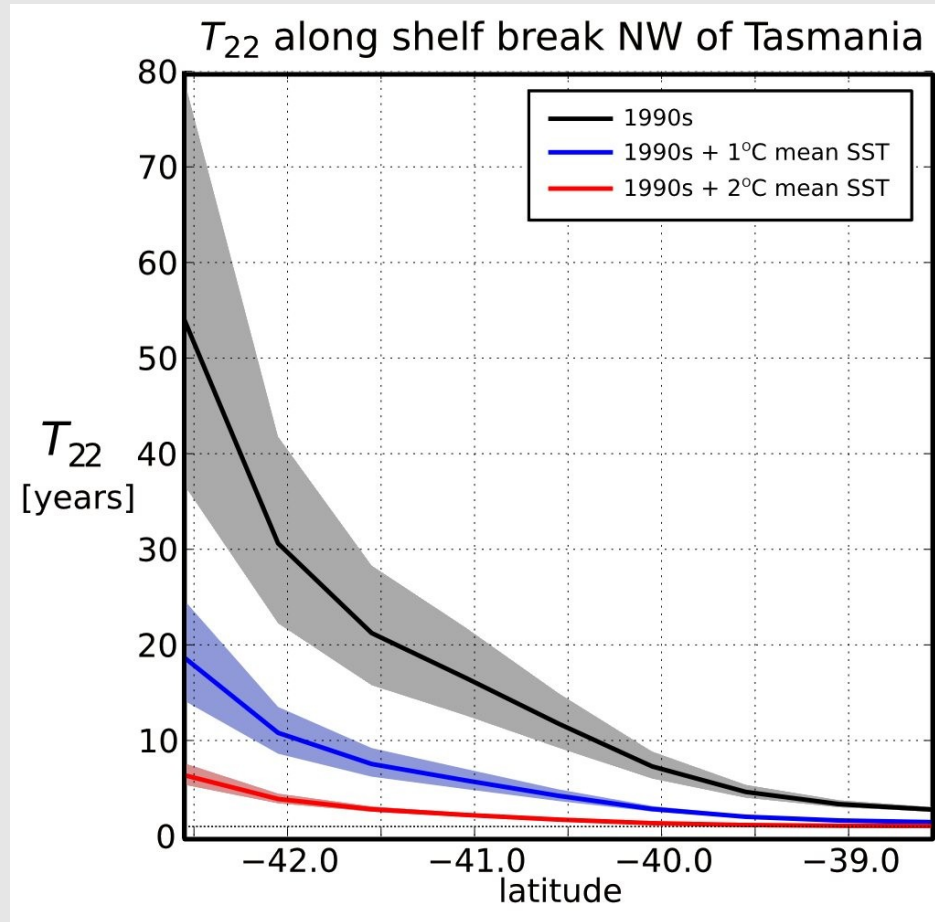
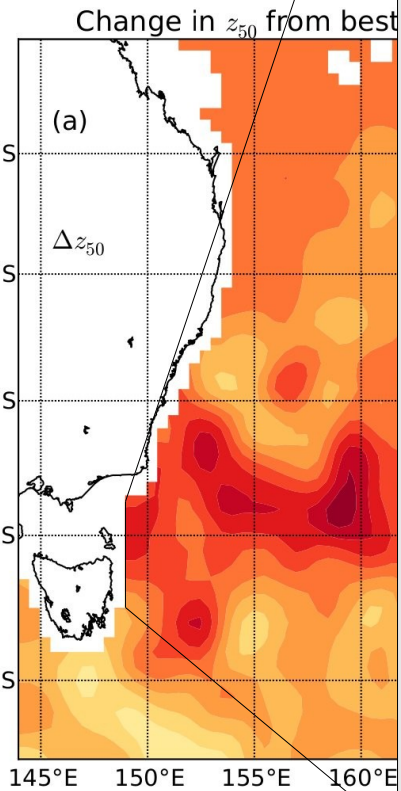


- Can use the extremes model as a “toy model”
- Test the response of the extremes to specified changes in climate

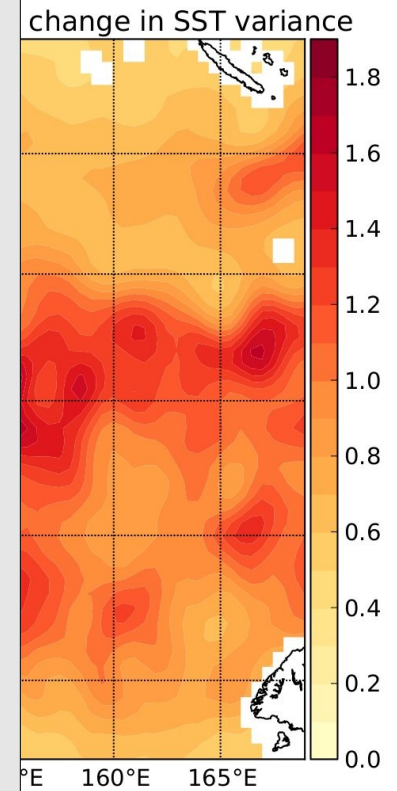




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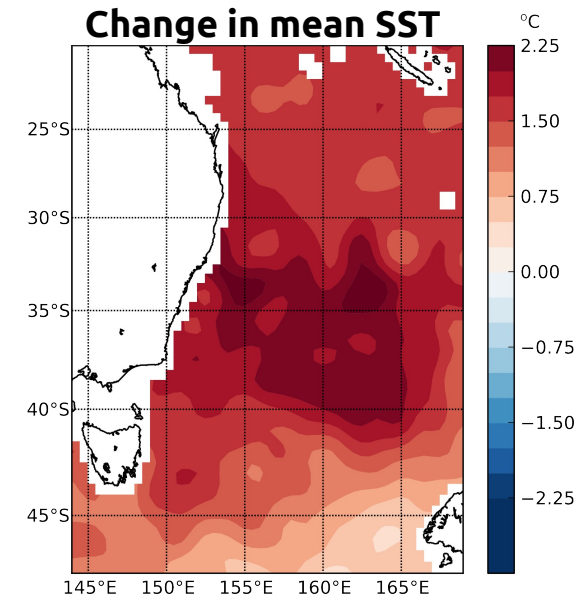


Climate

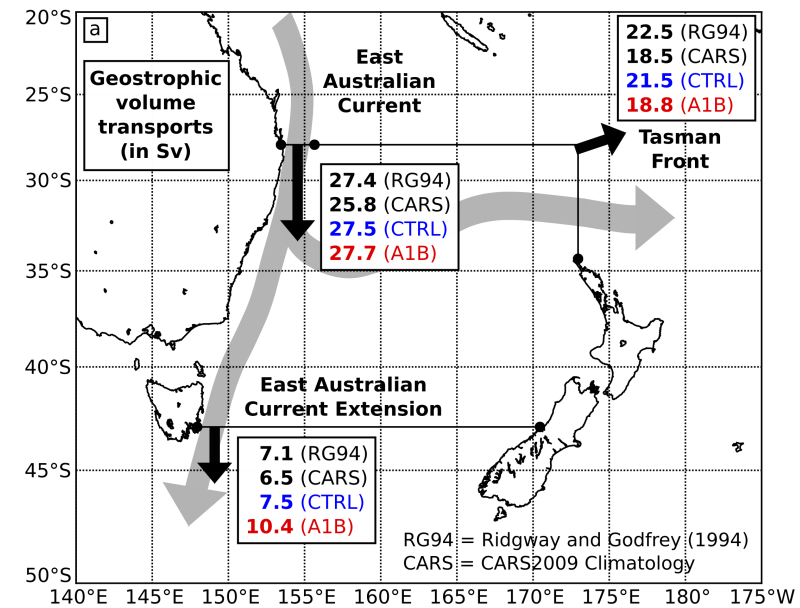
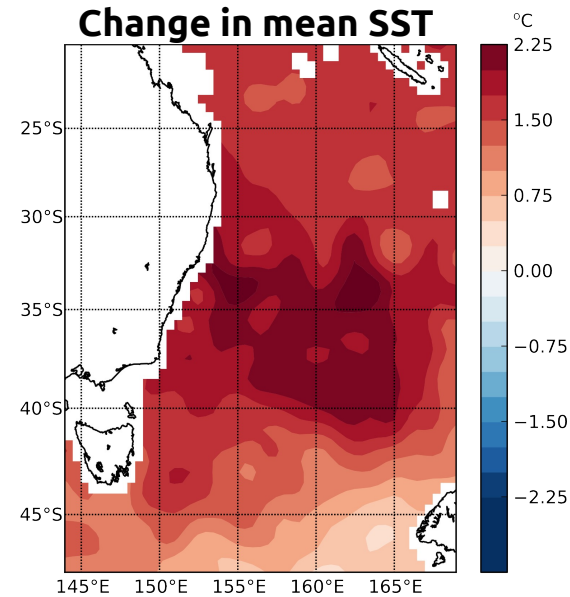




- Projected changes in the mean state:
  - **Tasman Sea SST hotspot**

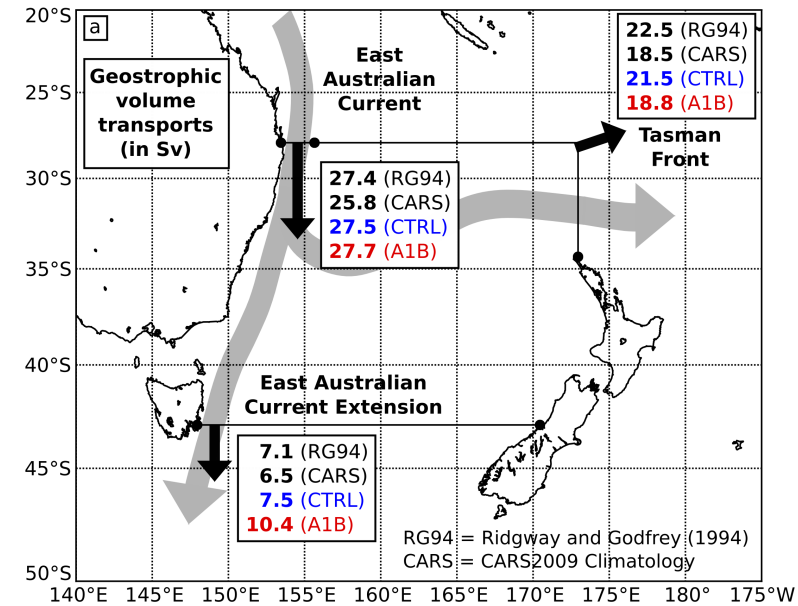
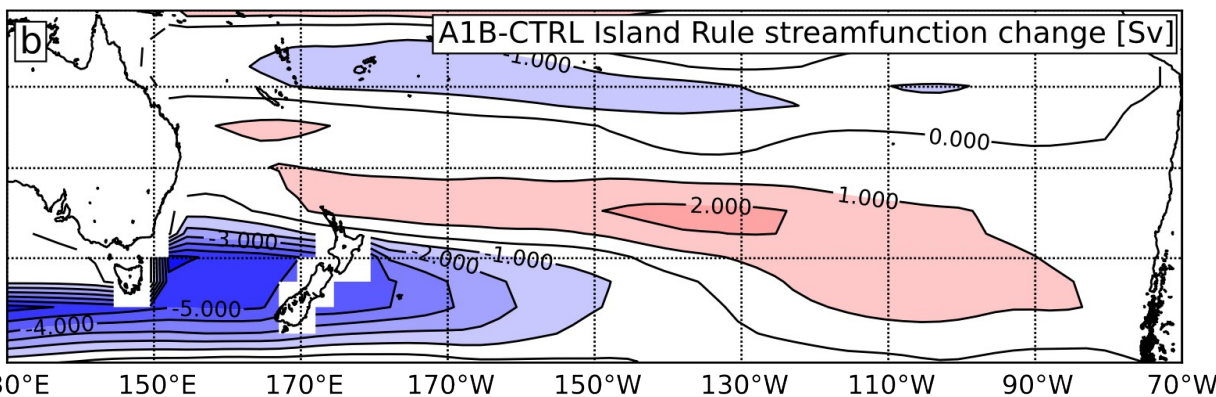
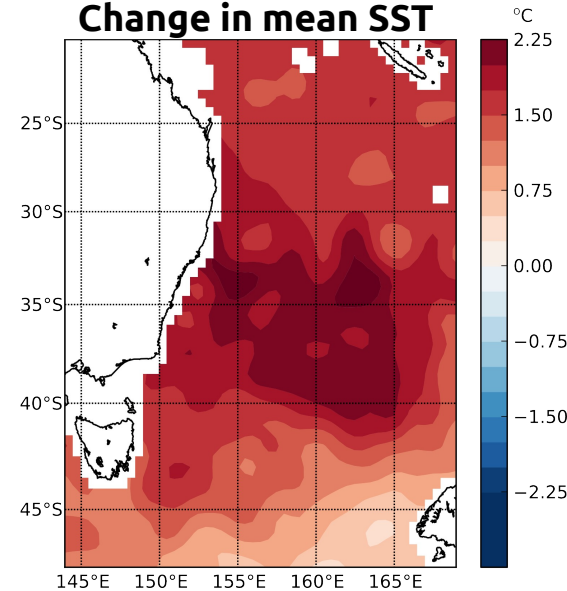


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  - **Redistribution of transport** through Tasman Sea



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- Changes to mean circulation consistent with **linear, wind-driven, barotropic model**

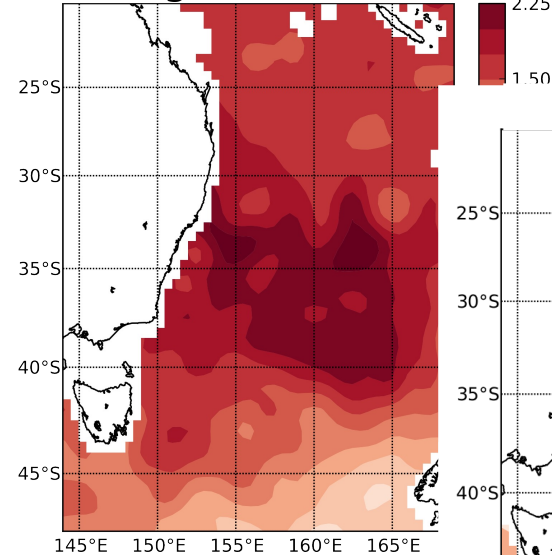
**Change in mean SST**



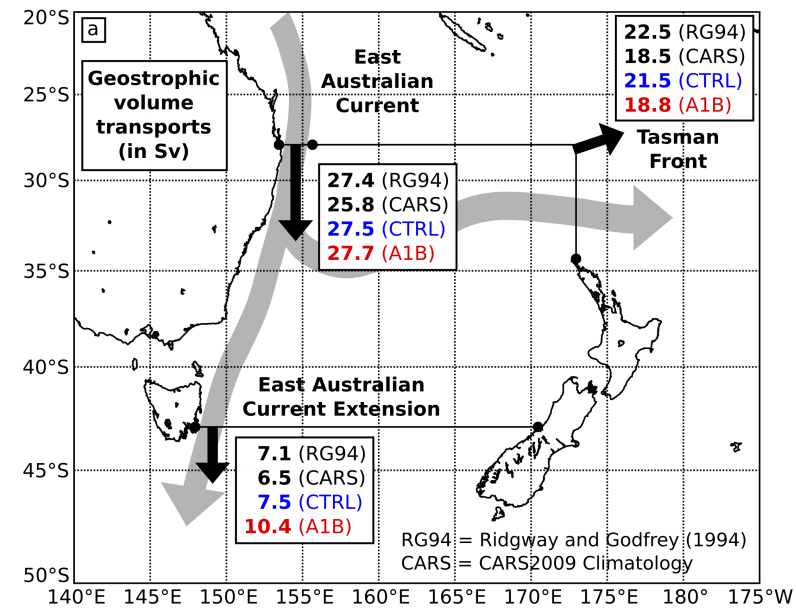
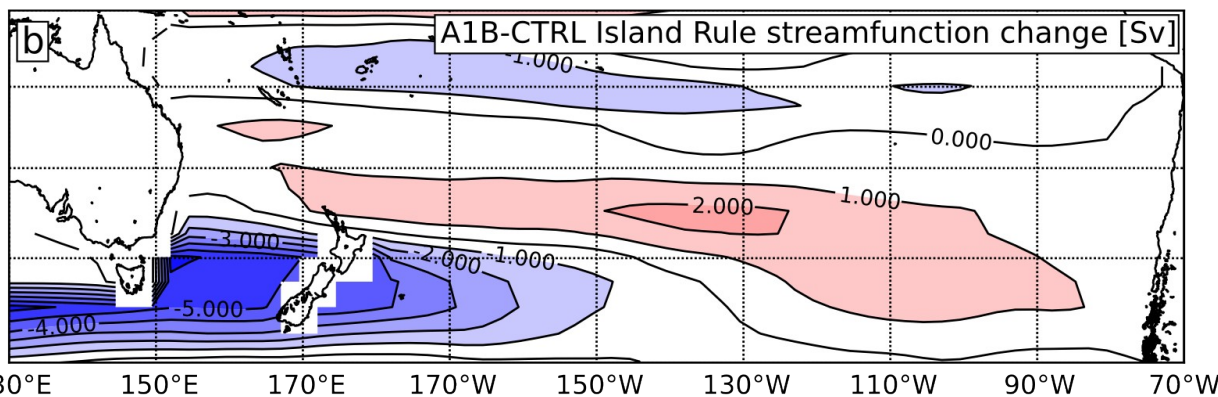
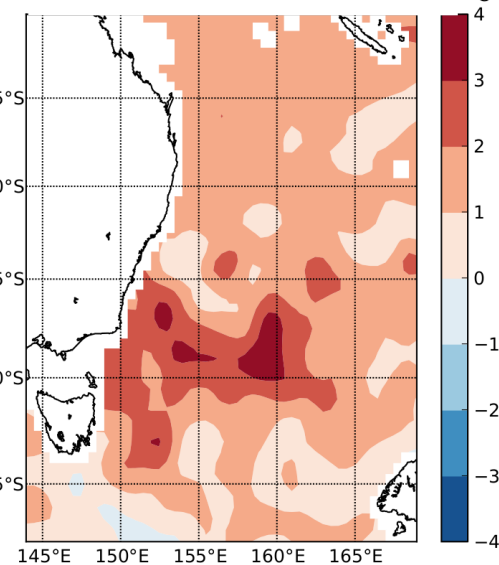


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**Change in mean SST**

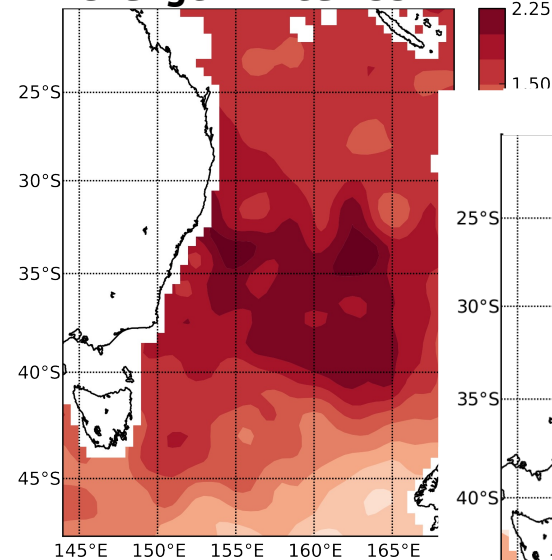


**Change in SST extremes**

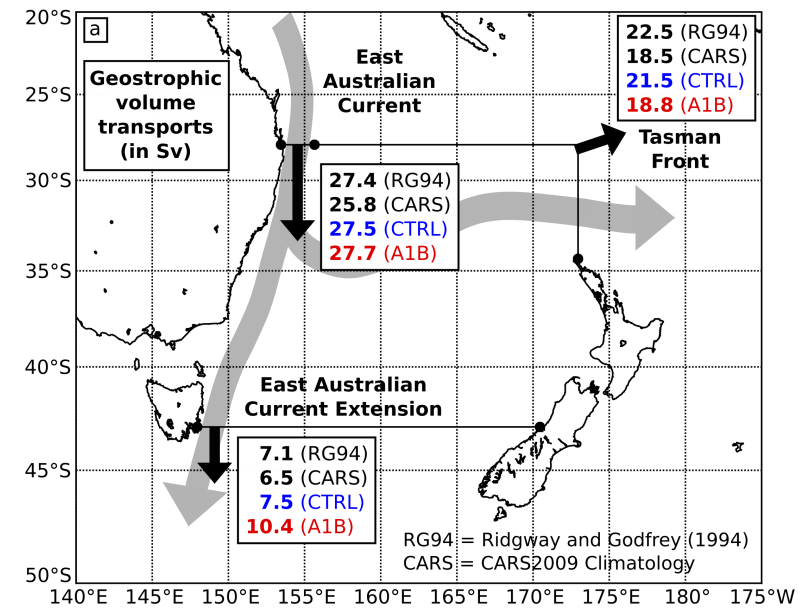
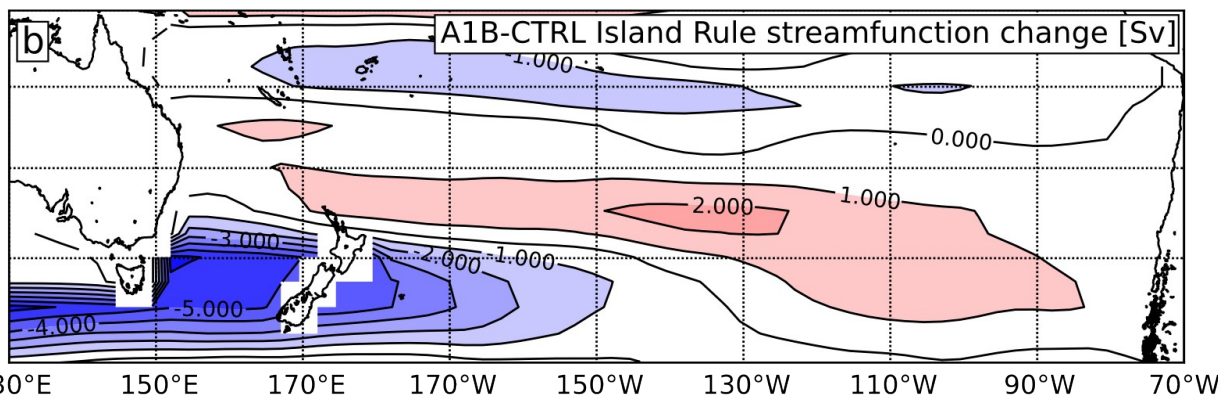
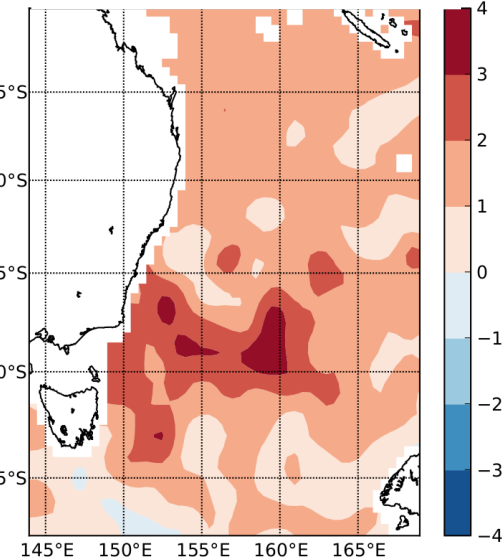


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- Changes to mean circulation consistent with **linear, wind-driven, barotropic model**
- Changes in **SST extremes** are due to combination of changes in SST mean, variance, skewness, etc...
- The **Bayesian hierarchical extremes model** a general framework for estimating extremes from climate/ocean models (bias correction)

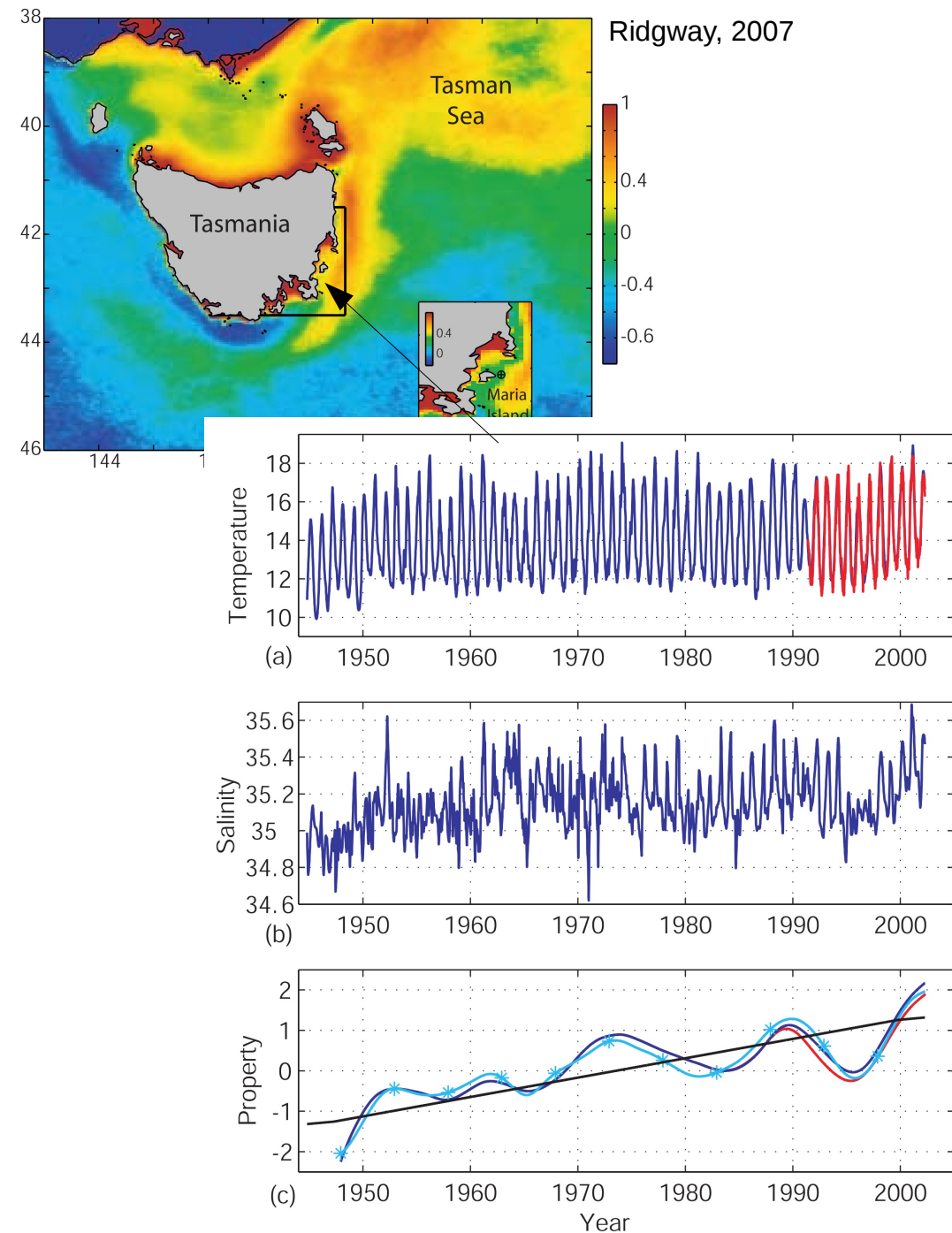
**Change in mean SST**



**Change in SST extremes**



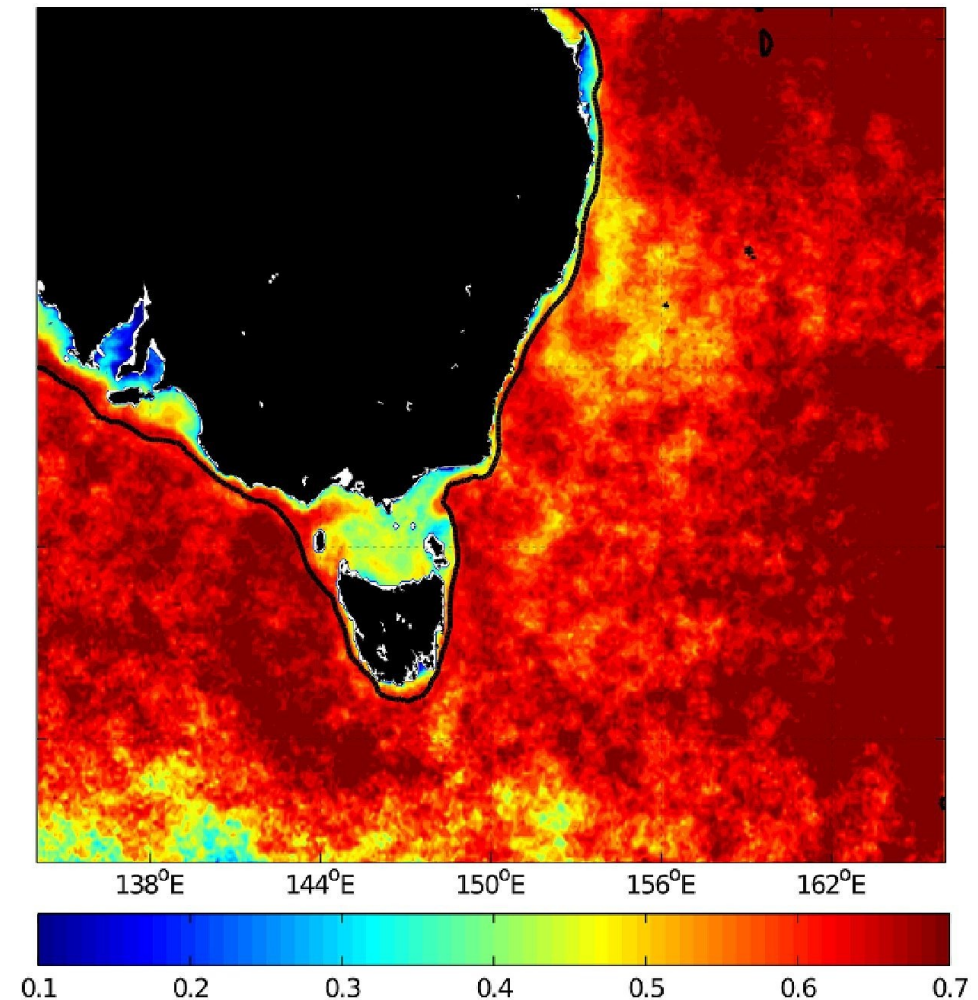
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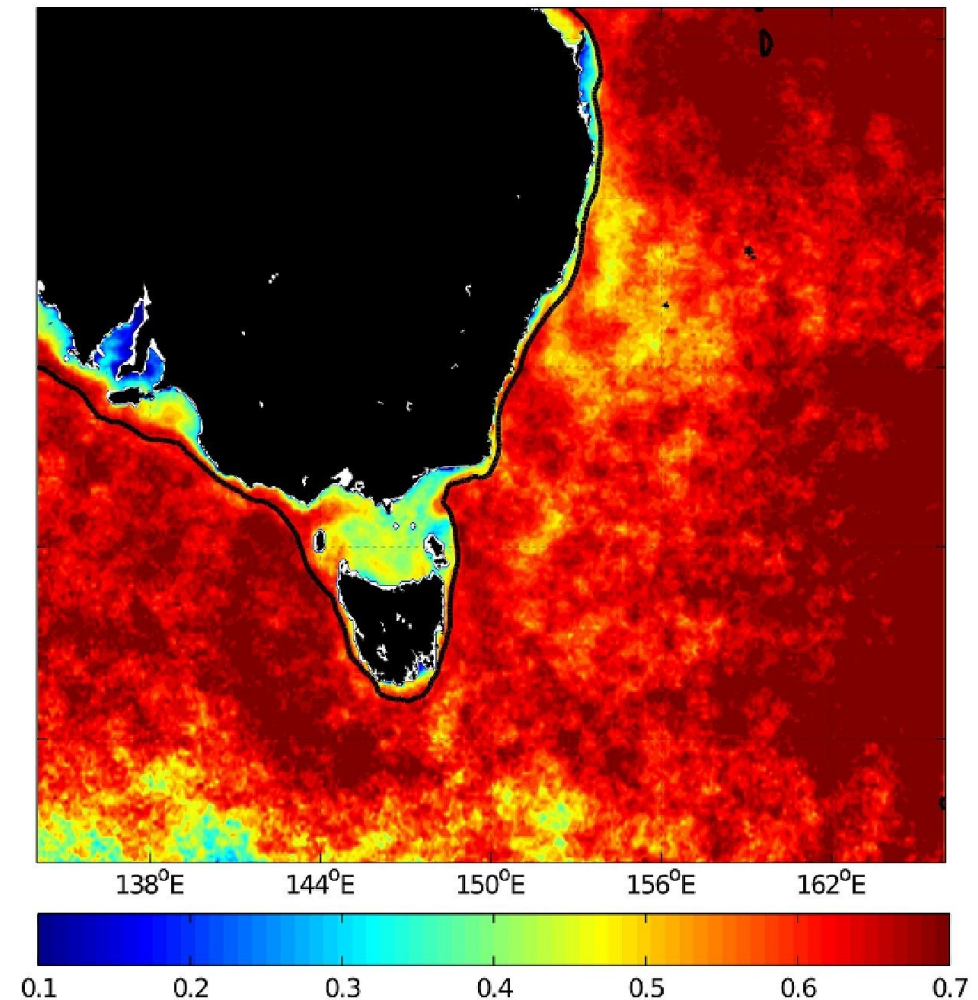
Correlation between observed (AVHRR) and reanalysis (BRAN2) SST



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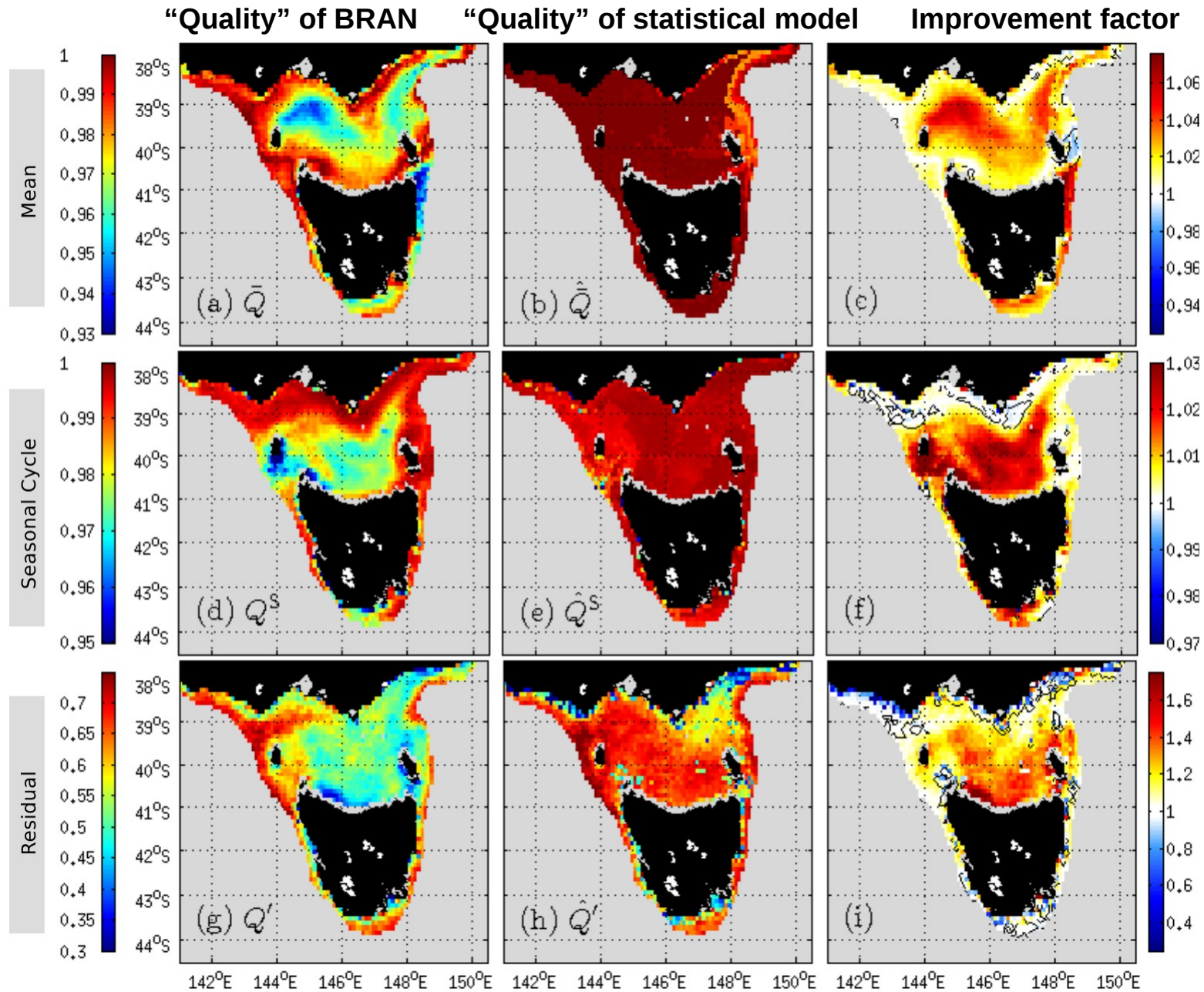
Correlation between observed (AVHRR) and reanalysis (BRAN2) SST



correlation between observed (AVHRR) and reanalysis (BRAN) SST



Oliver and Holbrook (2014; OH14) statistical technique improved estimates of shelf SST





- Technique extended to the **entire continental shelf** for temperate Australia (>20°S)
- OH14 dataset **available online**: [passage.phys.ocean.dal.ca/~olivere/OH14.html](http://passage.phys.ocean.dal.ca/~olivere/OH14.html)
- Technique has been applied to 1990s and 2060s climate projections as well

## Eric C. J. Oliver

Home

Research

Publications

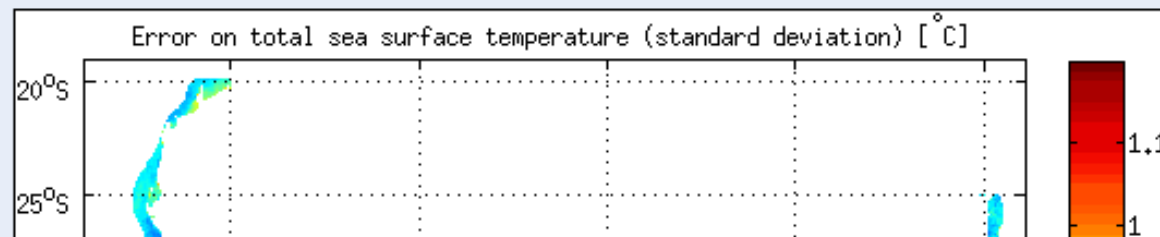
Code

Contact

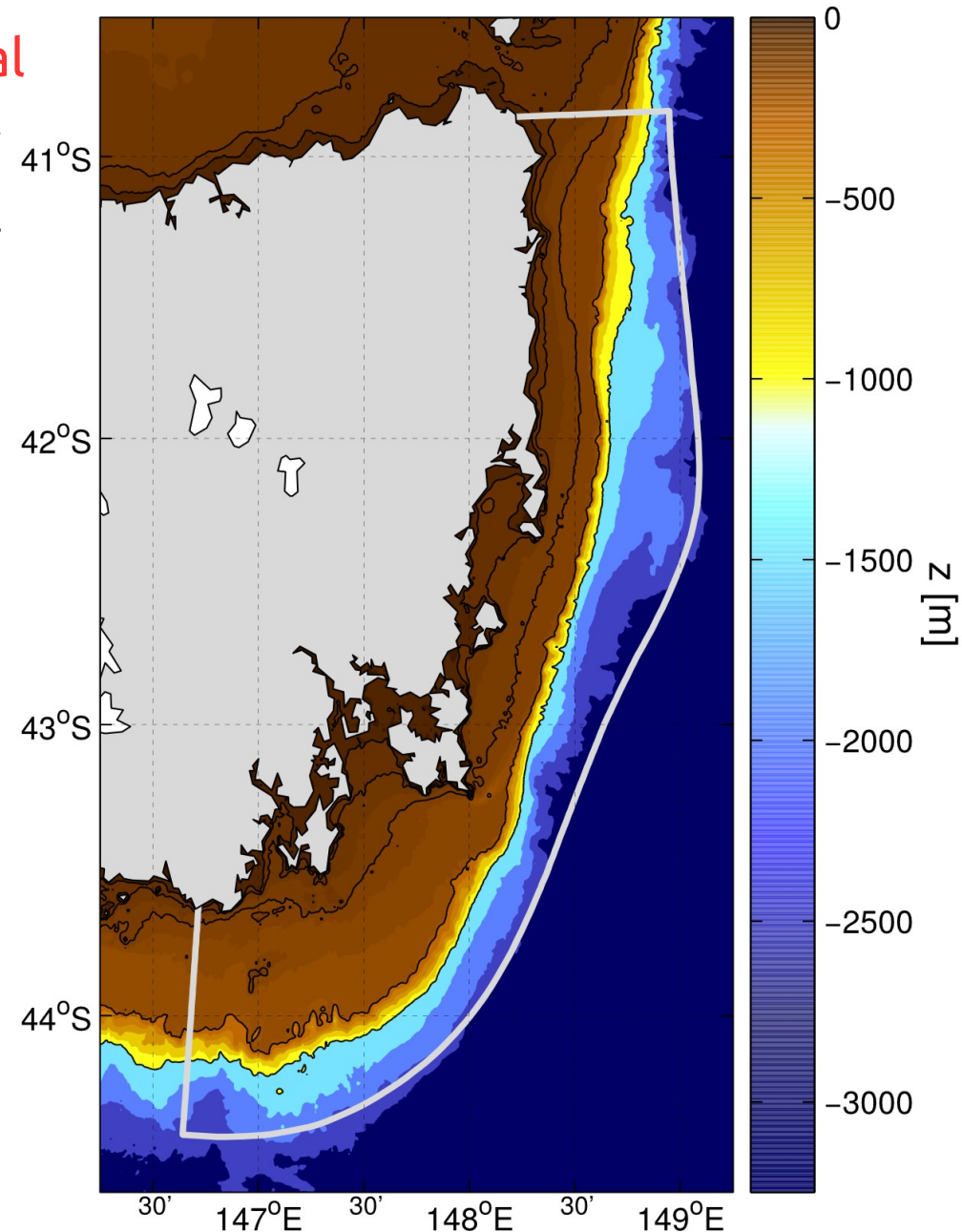
### Statistical downscaling of Australian continental shelf sea surface temperatures

The [Oliver and Holbrook \(Journal Atmospheric and Oceanic Technology, 2014\)](#), or OH14, data set provides spatially and temporally homogeneous measurements of sea surface temperature (SST) variability at high resolution on the continental shelf around Australia.

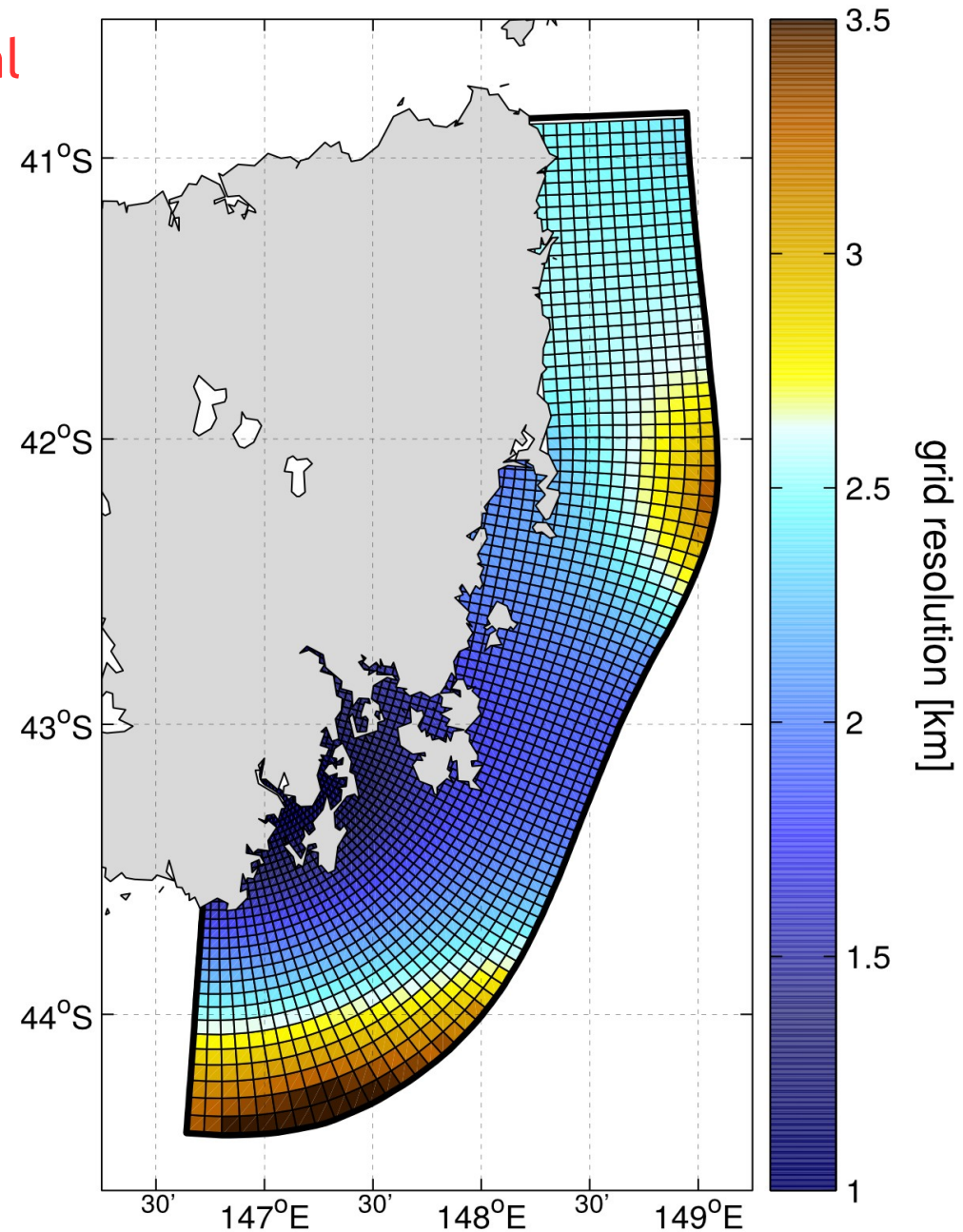
- The data arises from a hybrid statistical-physical downscaling model designed to more accurately and robustly represent SST on the continental shelf informed by large-scale satellite observations and reanalysis data. The downscaled shelf SST is modeled using: (i) offshore SST from BlueLink ReANalysis (BRAN), (ii) the statistical relationship between inshore and offshore SST in observations from the Advanced Very High Resolution Radiometer (AVHRR), and (iii) the mean circulation which provides connectivity information between the shelf and the offshore regions. The SST time series' were separated into the mean, seasonal cycle, and the residual variability, and separate models were developed for each component.
- **The data are provided as a single NetCDF file, along with a User's Manual and MATLAB script for loading the data: [download data](#)**
- The data set provides total SST, mean SST, SST seasonal-cycle, residual SST along with error-estimates. Total SST is defined as the sum of the mean, seasonal cycle and residual. Mean SST and the error estimates are provided as a single value at each of the shelf locations, while the total SST, SST seasonal cycle, and residual SST are provided as daily time series (14 Oct 1992 to 13 May 2008) at each of the shelf locations. The error estimates are provided as a standard deviation and a map of the error for total SST, which also doubles as an indicator for which location data is provided, is shown below:



- **Dynamical downscaling** uses **numerical ocean models** based on our **theoretical understanding of ocean dynamics**
- 
- We modeled the eastern Tasmania continental shelf using the **Sparse Hydrodynamic Ocean Code (SHOC)** model [Herzfeld, 2006]
  - Domain: South Cape to ~Eddystone Point and seaward out to shelf break
  - Bathymetry: Australian Geological Survey Organisation (AGSO) 2002
  - Resolution: ~1.9 km resolution
  - 43 z-levels in the vertical



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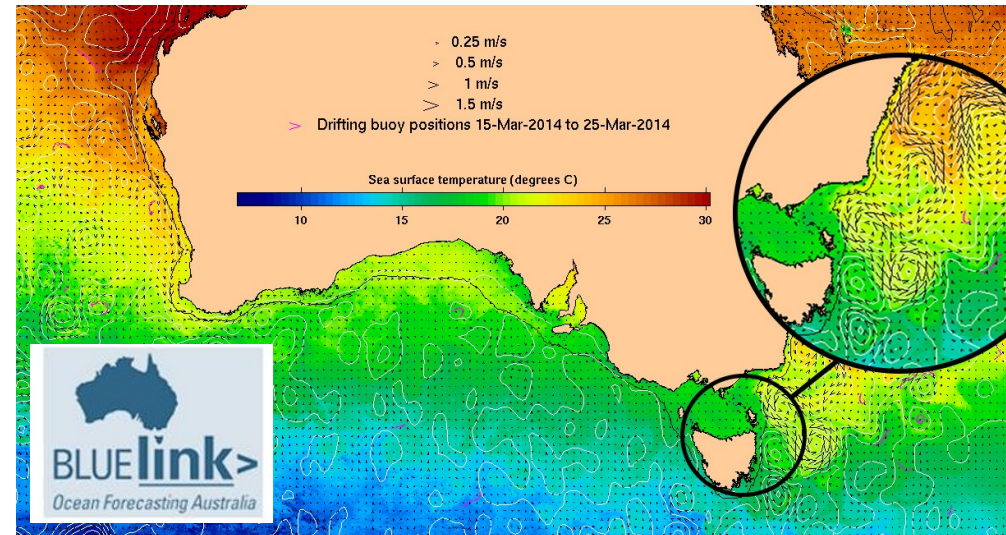




**Model forced by realistic ocean  
and atmosphere at boundaries**

## Model forced by realistic ocean and atmosphere at boundaries

- Lateral boundaries were forced by velocities, temperature and salinity from **Bluelink** reanalysis and analysis fields <sup>1,2</sup>

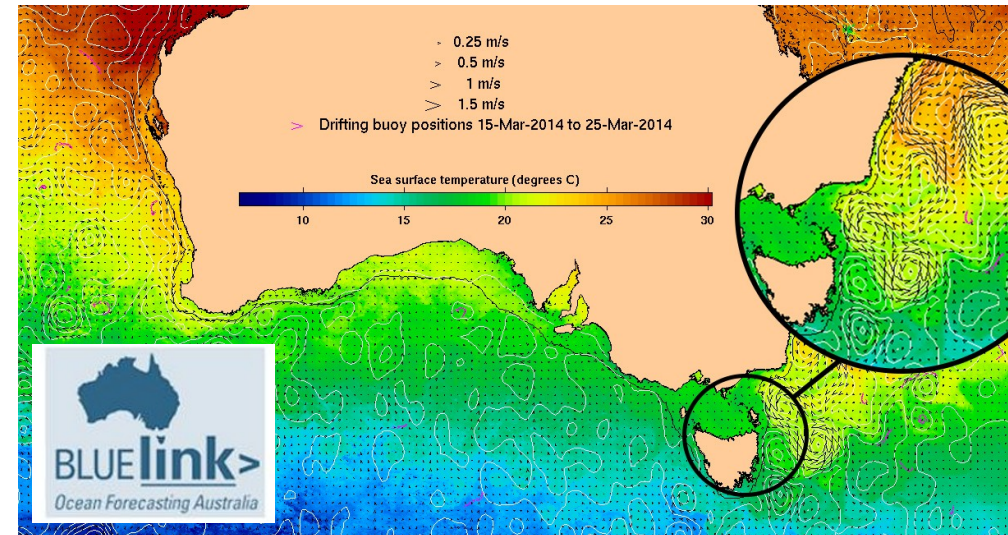


<sup>1</sup> BRAN = Bluelink ReANalysis

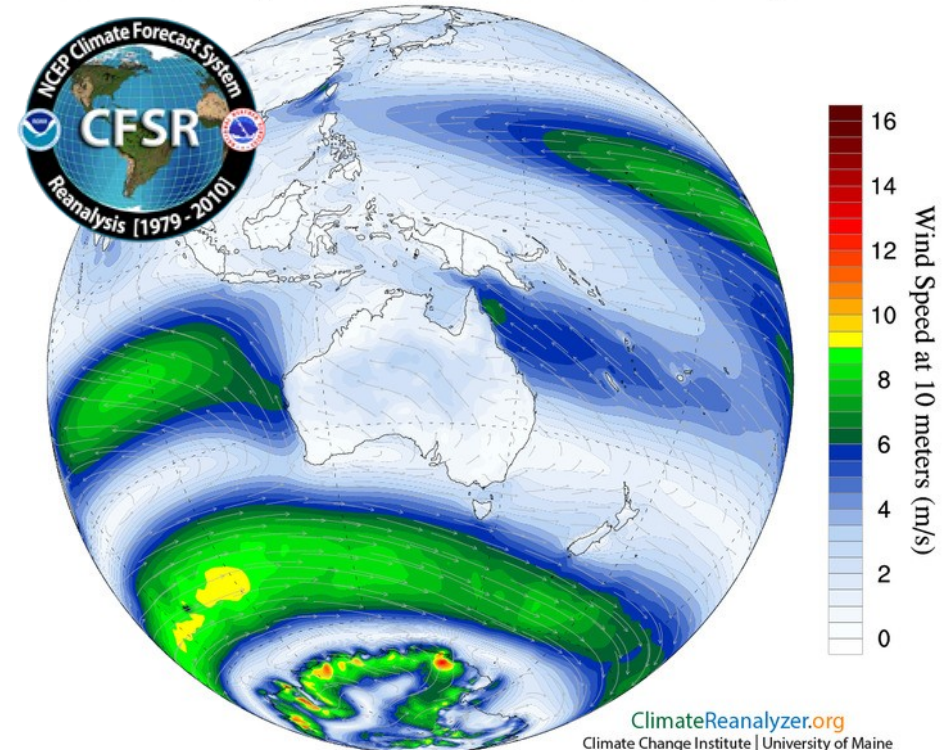
<sup>2</sup> OceanMAPS = Bluelink Ocean Modelling, Analysis, and Prediction System

## Model forced by realistic ocean and atmosphere at boundaries

- Lateral boundaries were forced by velocities, temperature and salinity from **Bluelink** reanalysis and analysis fields <sup>1,2</sup>
- Surface was forcing was provided from the **NCEP Climate Forecast System (CFS) Reanalysis and Reforecast** <sup>3,4</sup>



Climate Forecast System Reanalysis Annual 1979-2013 Average



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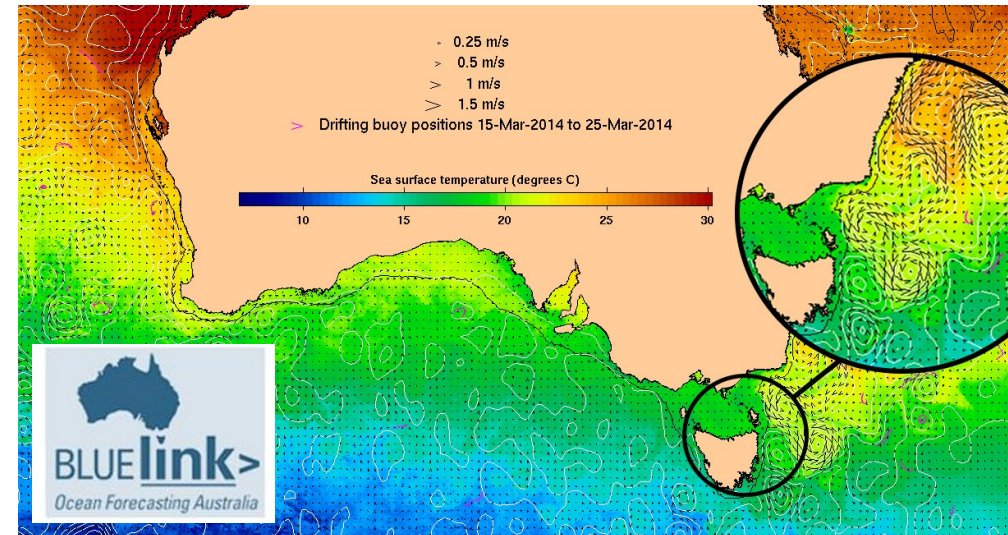
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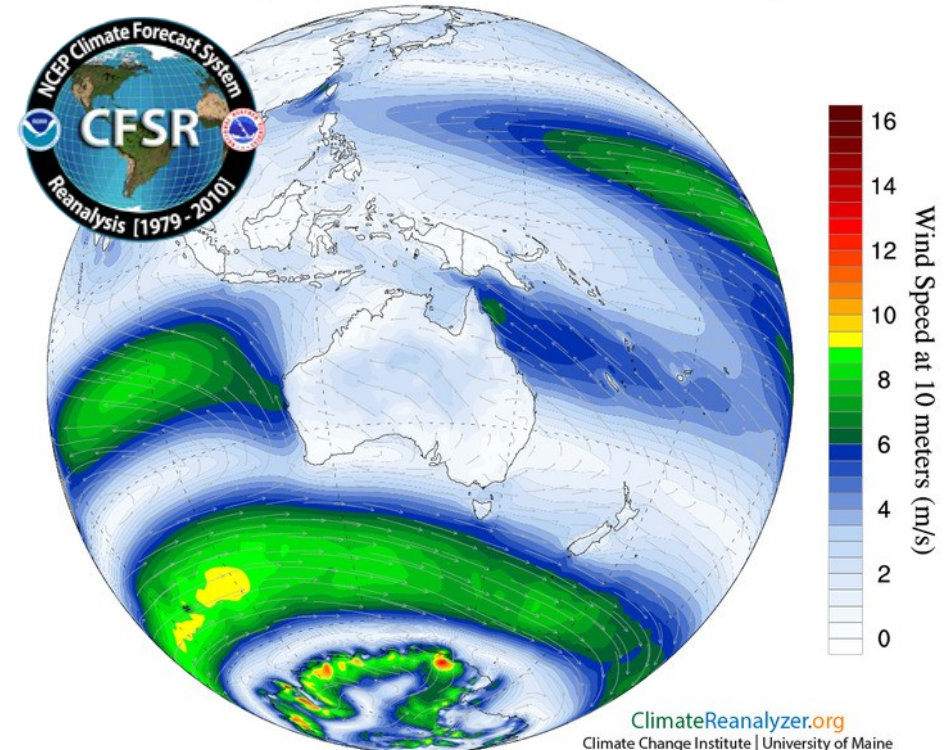


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- Coverage: 1993-2013



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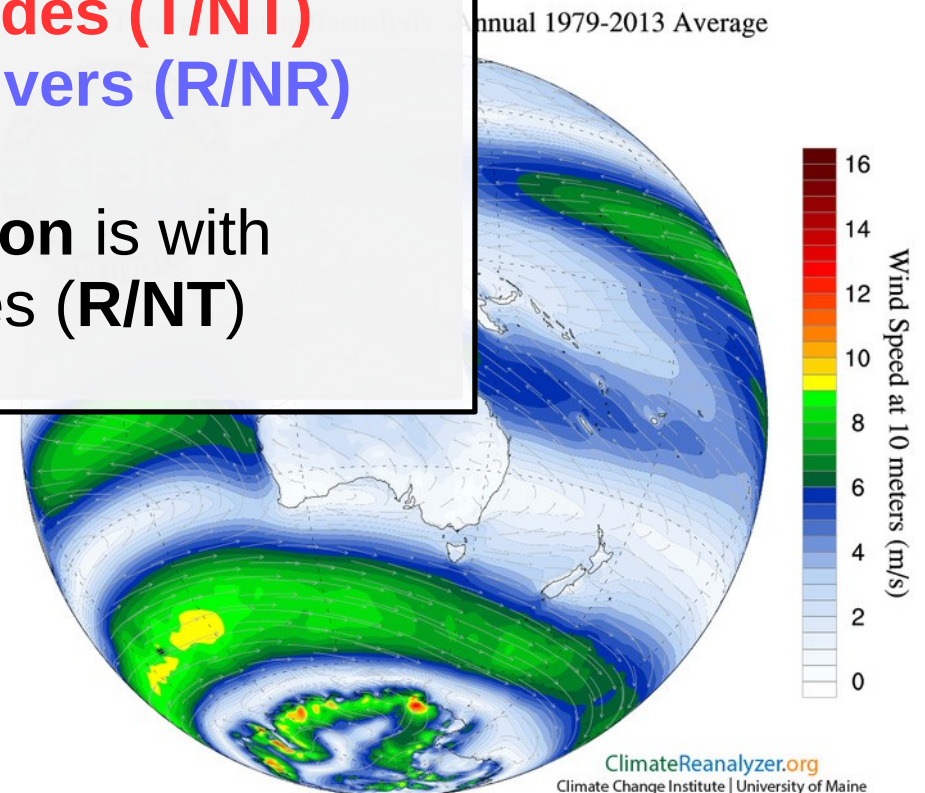
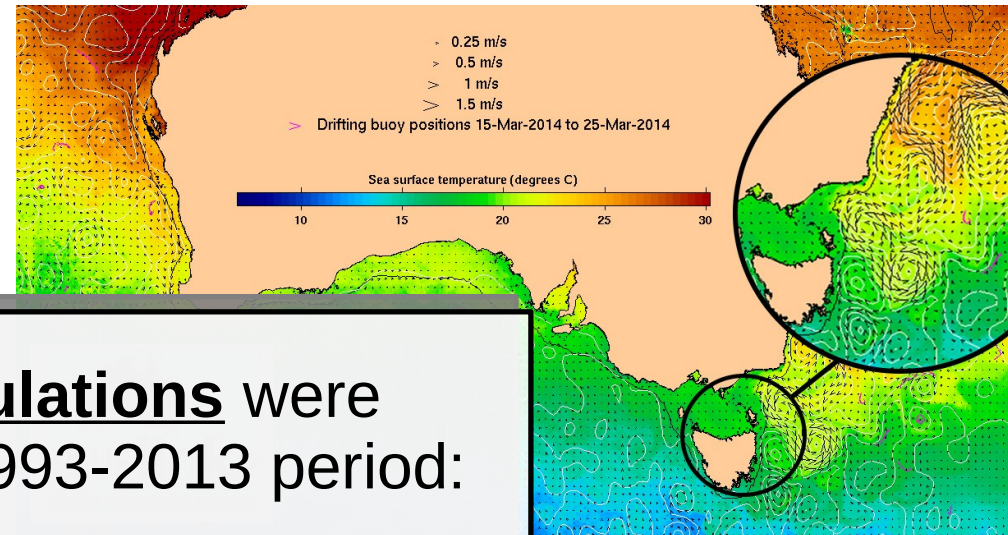
## Model forced by realistic ocean and atmosphere at boundaries

- Lateral boundaries were forced with velocities, temperature and salinity from **Bluelink** reanalysis field
- Surface fluxes were forced from the **NCAR CCSM System (CFSR)** Reforecast<sup>3</sup>
- River input was forced with precipitation over catchments
- Coverage: 1993-2013

Four hindcast simulations were performed for the 1993-2013 period:

- **With and without tides (T/NT)**
- **With and without rivers (R/NR)**

**Base run for validation** is with rivers and without tides (**R/NT**)



<sup>1</sup> BRAN = Bluelink ReANalysis

<sup>2</sup> OceanMAPS = Bluelink Ocean Modelling, Analysis, and Prediction System

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## In-situ time series

### Maria Island time series **[RED]**

- Historical temperature and salinity @ surface and 5 depths
- Quasi-monthly, 1944 - 2008

### Craig Mundy (IMAS-FAC, UTAS), near-bottom temperature gauges **[BLUE]**

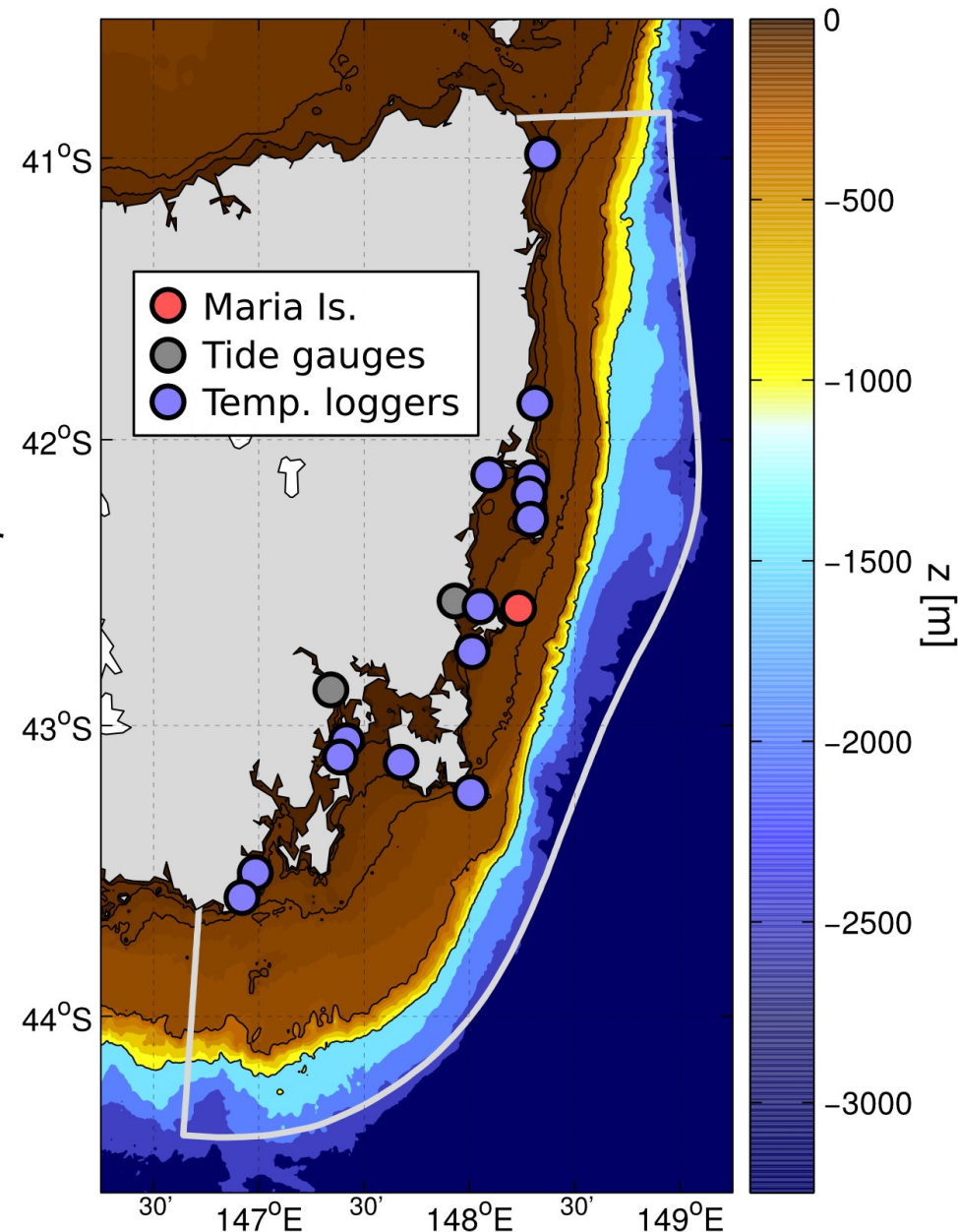
- Near-bottom temperature in 5-20 m water depths
- Daily, 2005 – present

### 2 Tide gauges (Hobart, Spring Bay) **[BLACK]**

- Sea level
- Hourly and daily, 1985 - 2012

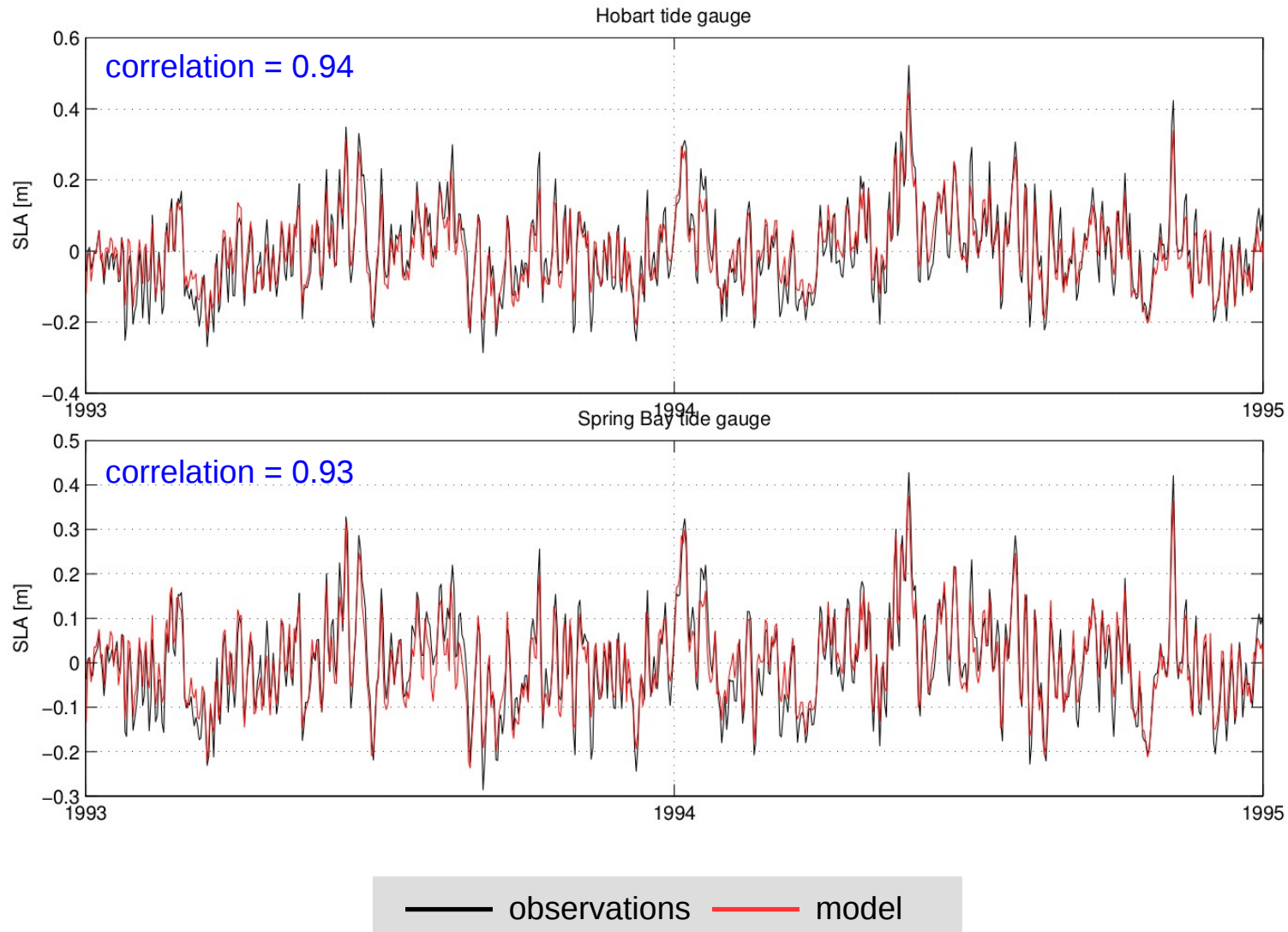
## Remotely sensed

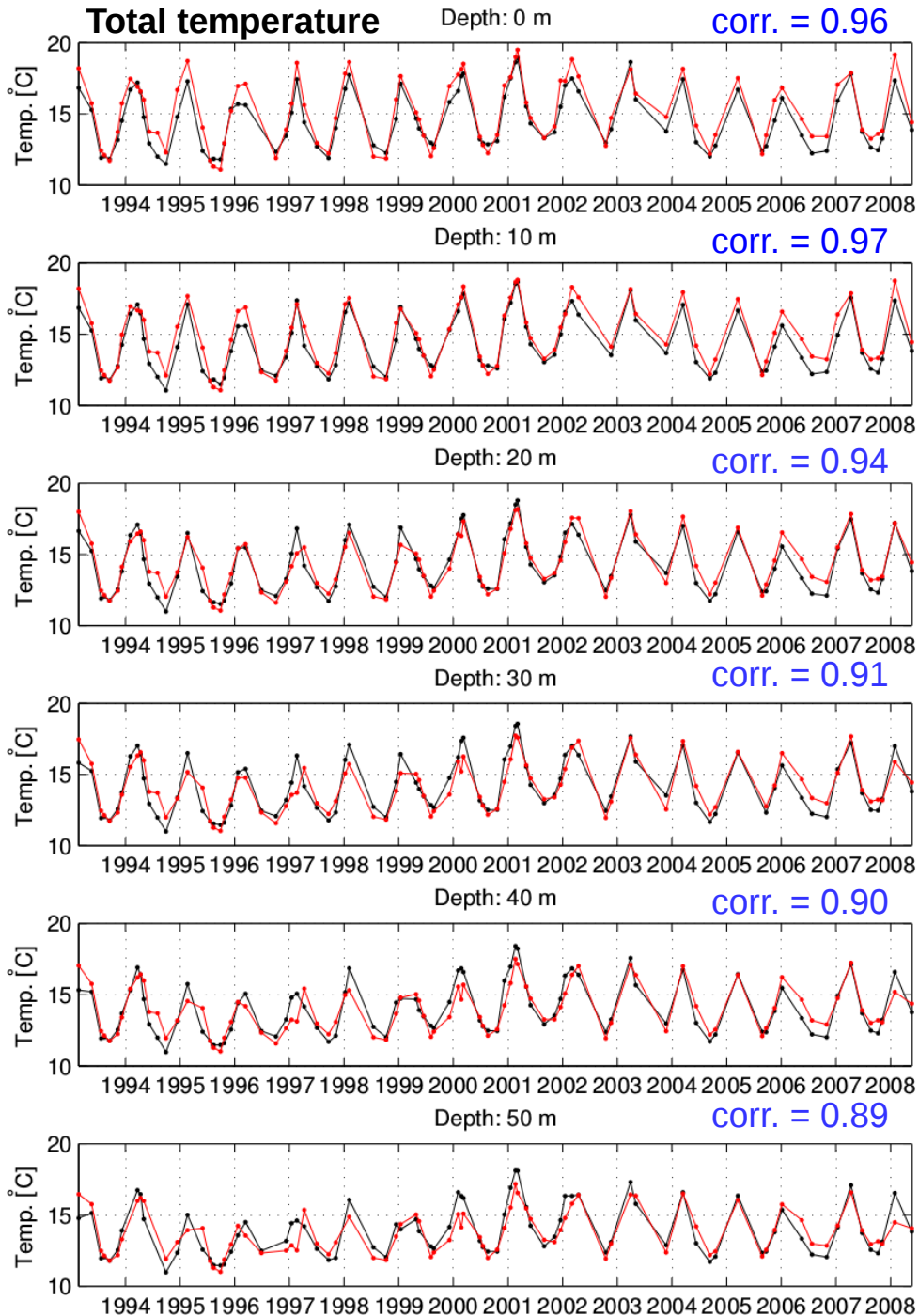
AVHRR: daily, 4 km maps, 1980-2012





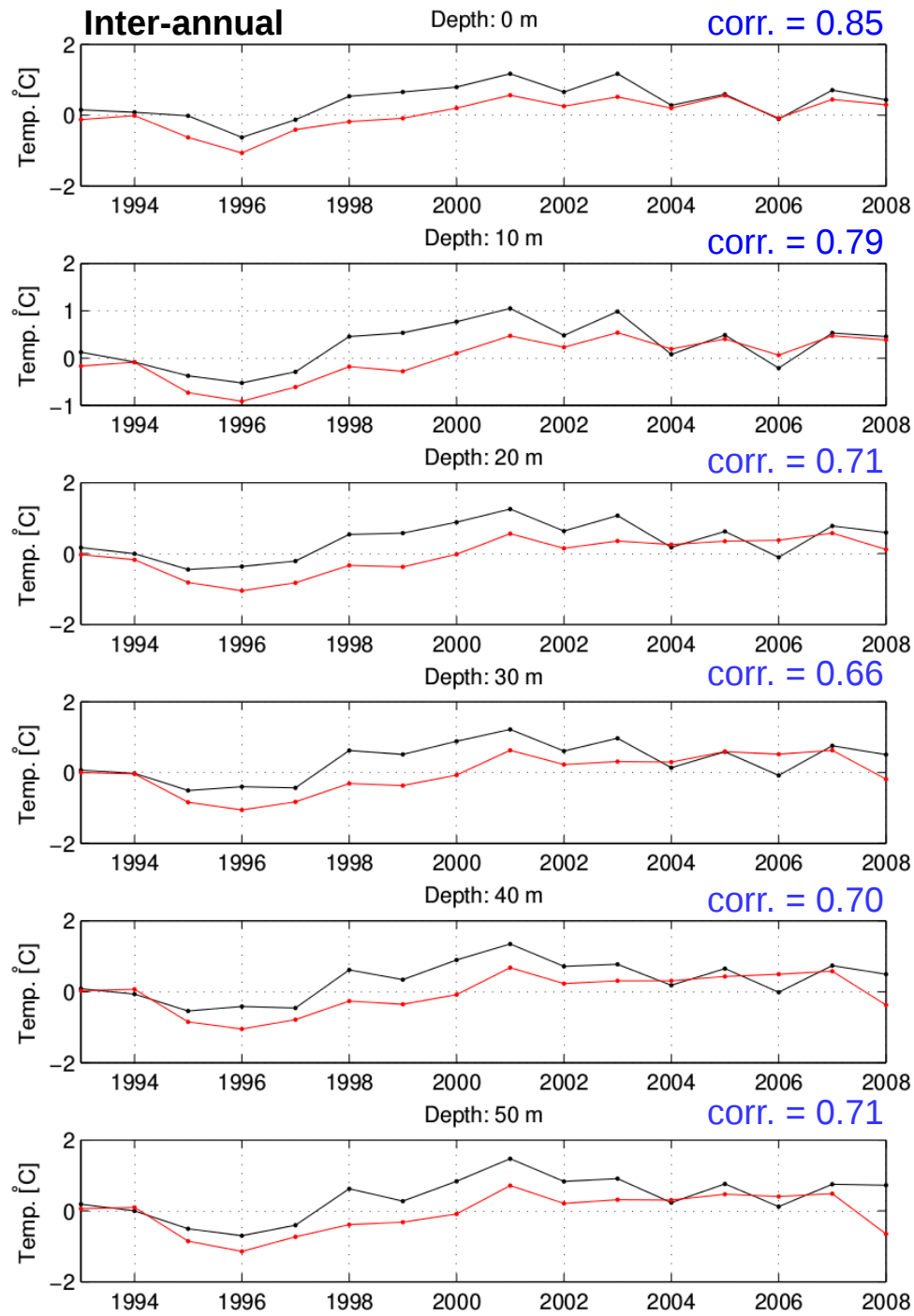
- Model captures well sea level at Hobart and Spring Bay tide gauges





- **Maria Island Time Series**
- Temperature, model captures well:
  - The total variability at all depths
  - The seasonal cycle
  - The non-seasonal variability

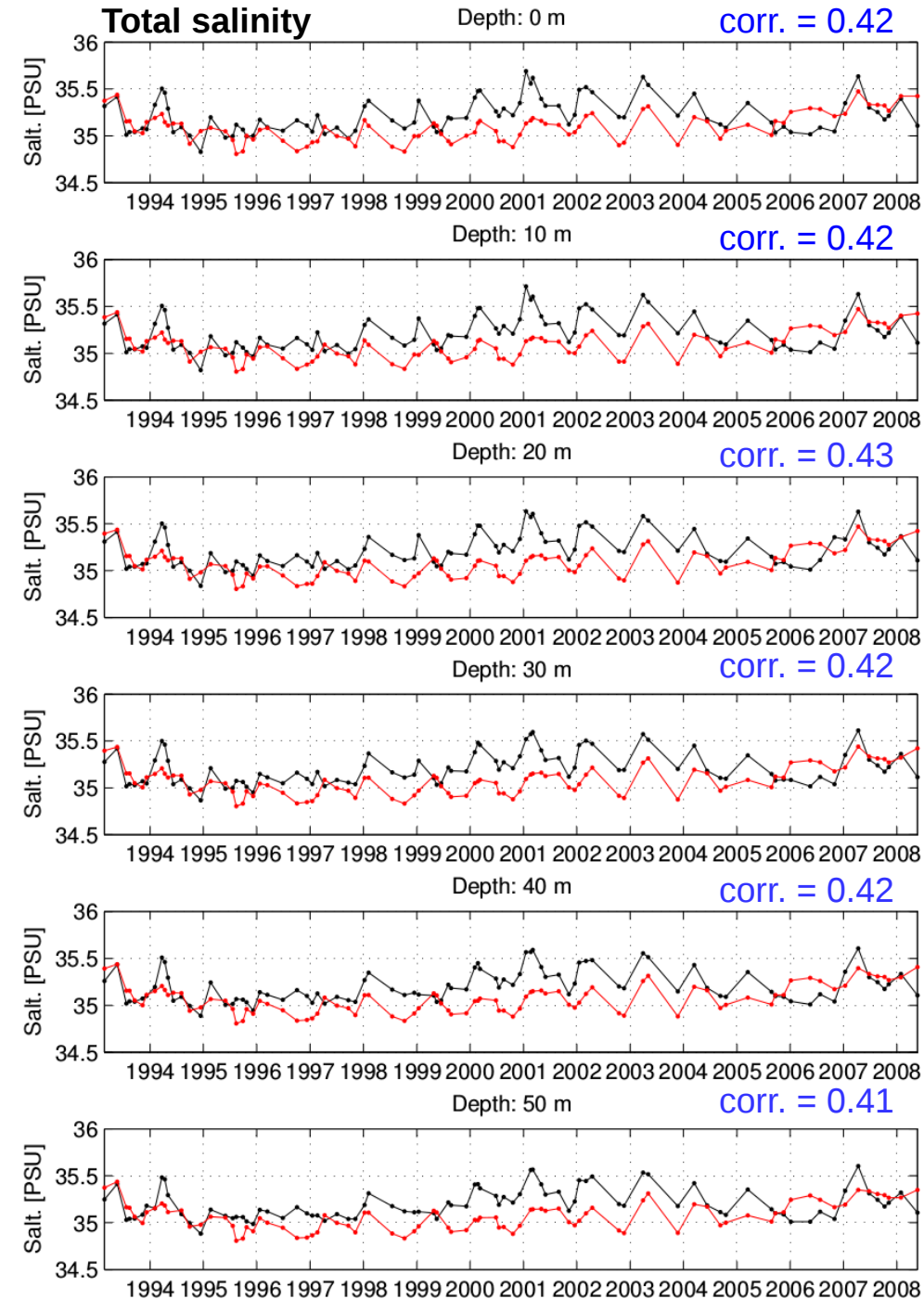
— observations — model



- **Maria Island Time Series**
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  - The inter-annual variability

— observations — model





- **Maria Island Time Series**

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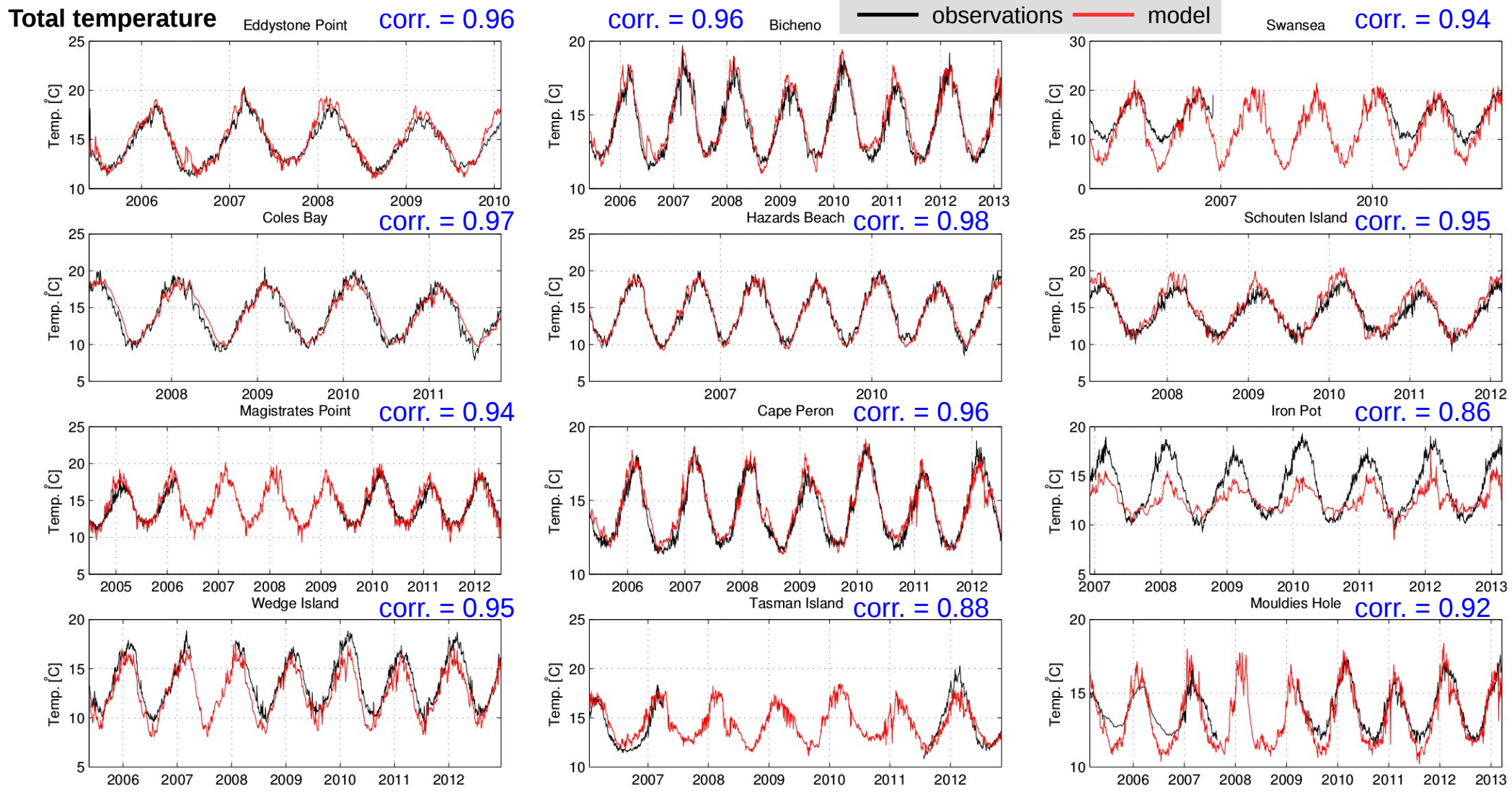
- The total variability at all depths
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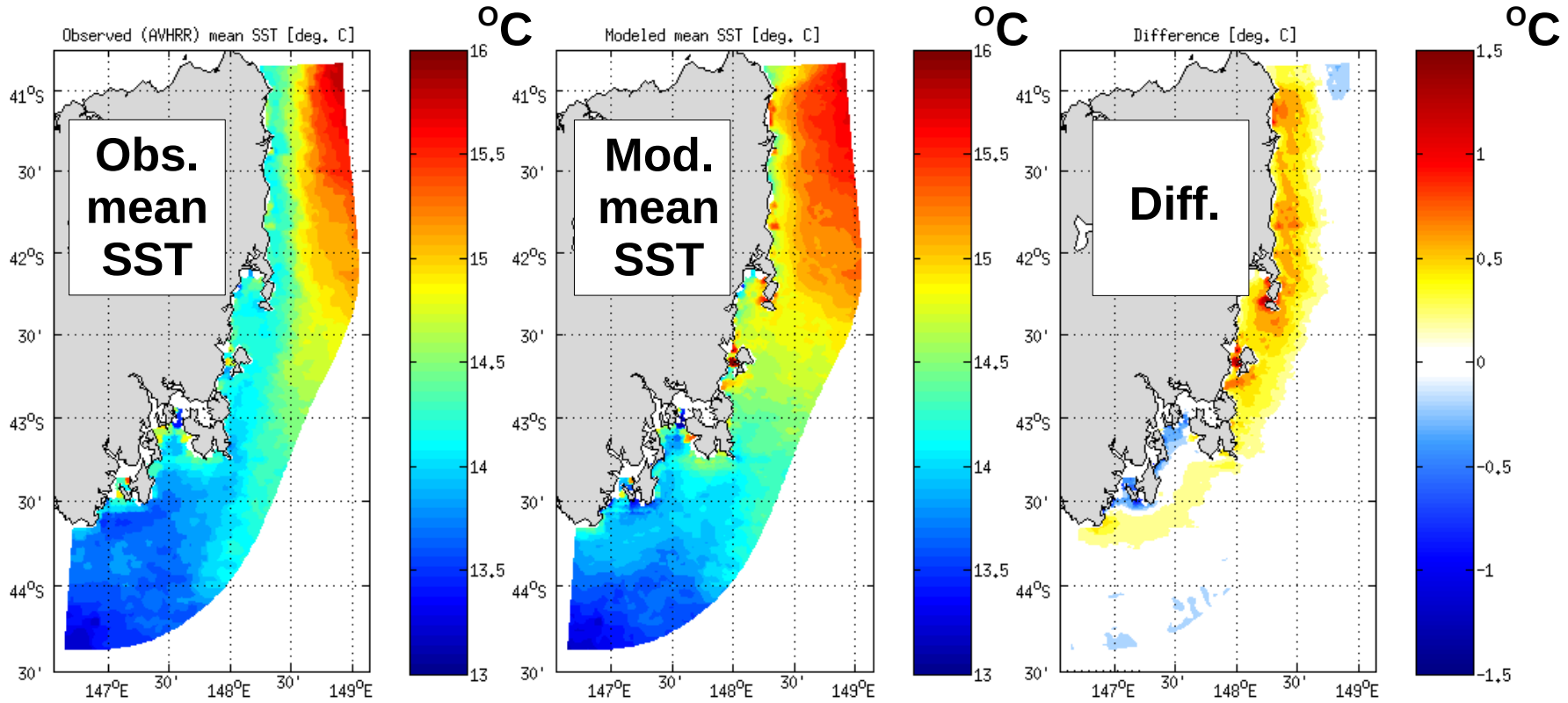
- Salinity:

- A notable bias in mean salinity throughout the water column
- May be related to poor representation of advection in earlier model versions

— observations — model

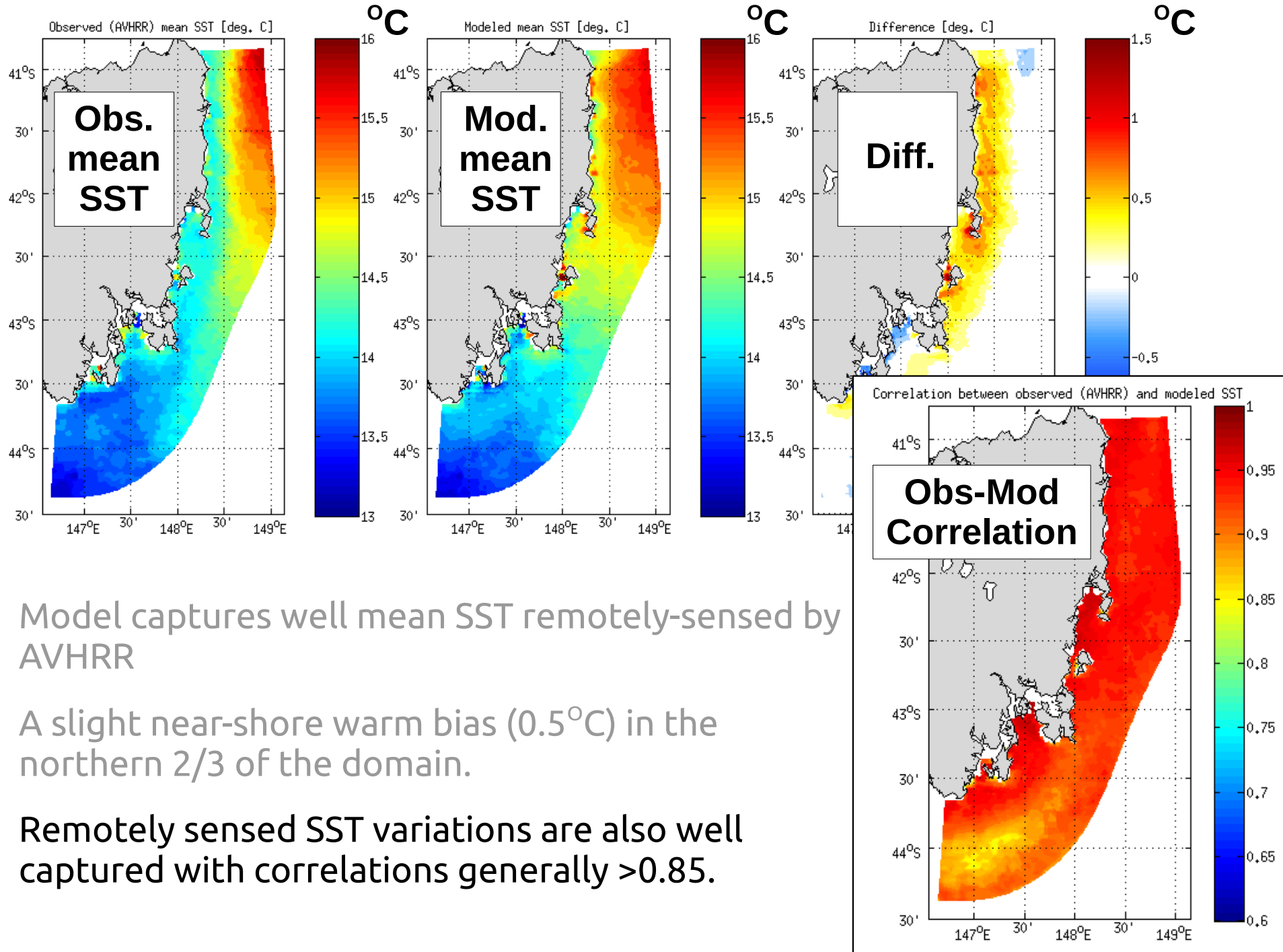
- **Near-bottom temperature loggers**
- Model captures well the total variability, seasonal cycle, and non-seasonal signal





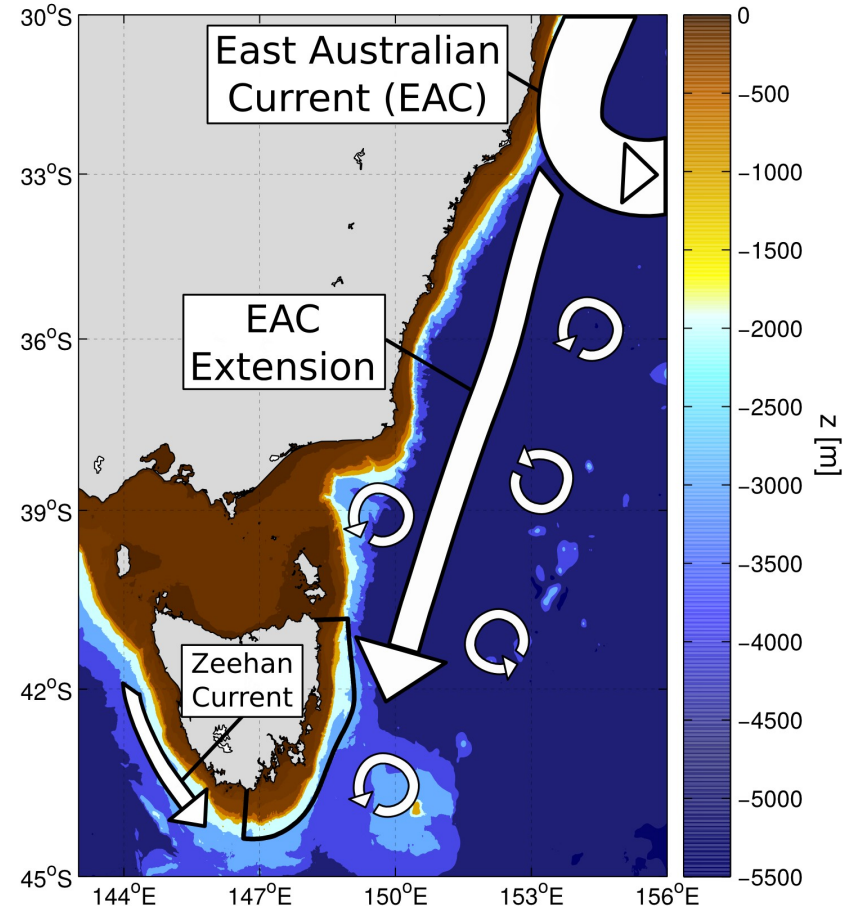
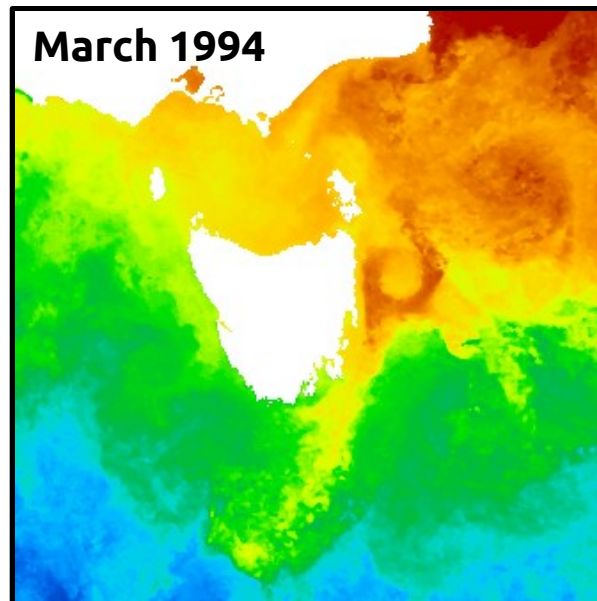
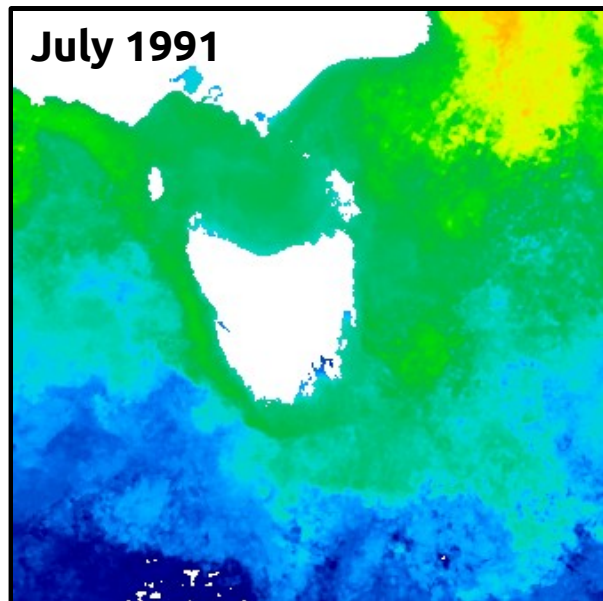
- Model captures well mean SST remotely-sensed by AVHRR
- A slight near-shore warm bias ( $0.5^{\circ}\text{C}$ ) in the northern 2/3 of the domain.





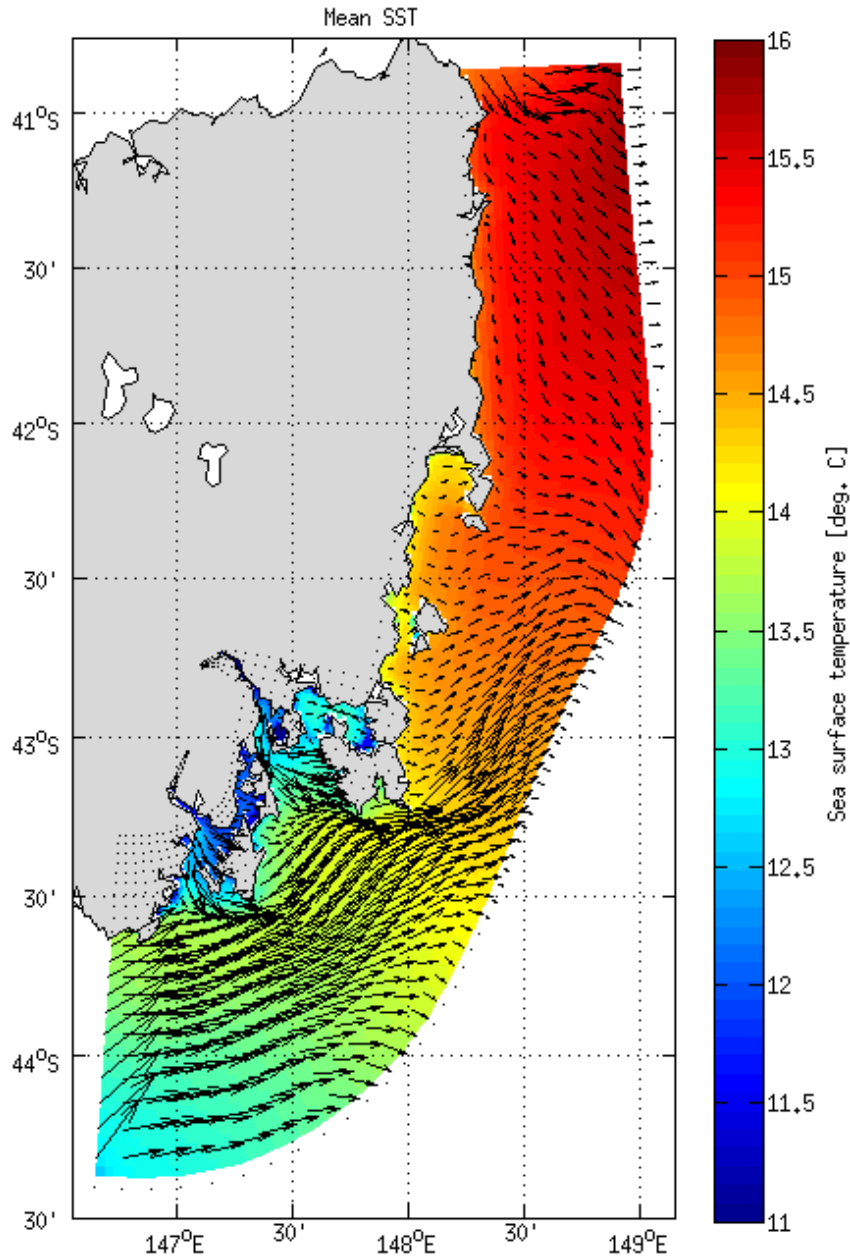
- Model captures well mean SST remotely-sensed by AVHRR
- A slight near-shore warm bias ( $0.5^{\circ}\text{C}$ ) in the northern 2/3 of the domain.
- Remotely sensed SST variations are also well captured with correlations generally  $>0.85$ .

- **East Australian Current (EAC)**, a quasi-steady western boundary current, separates from the coast  $\sim 33^\circ\text{S}$ .
- The **EAC Extension** continues southward transport as far as Tasmania, but as an unsteady, eddy-rich "current"
- The **Zeehan Current**, part of a current system extending all the way to WA, runs southward and eastward along the west and south coasts of Tasmania [Ridgway and Condie, 2004]

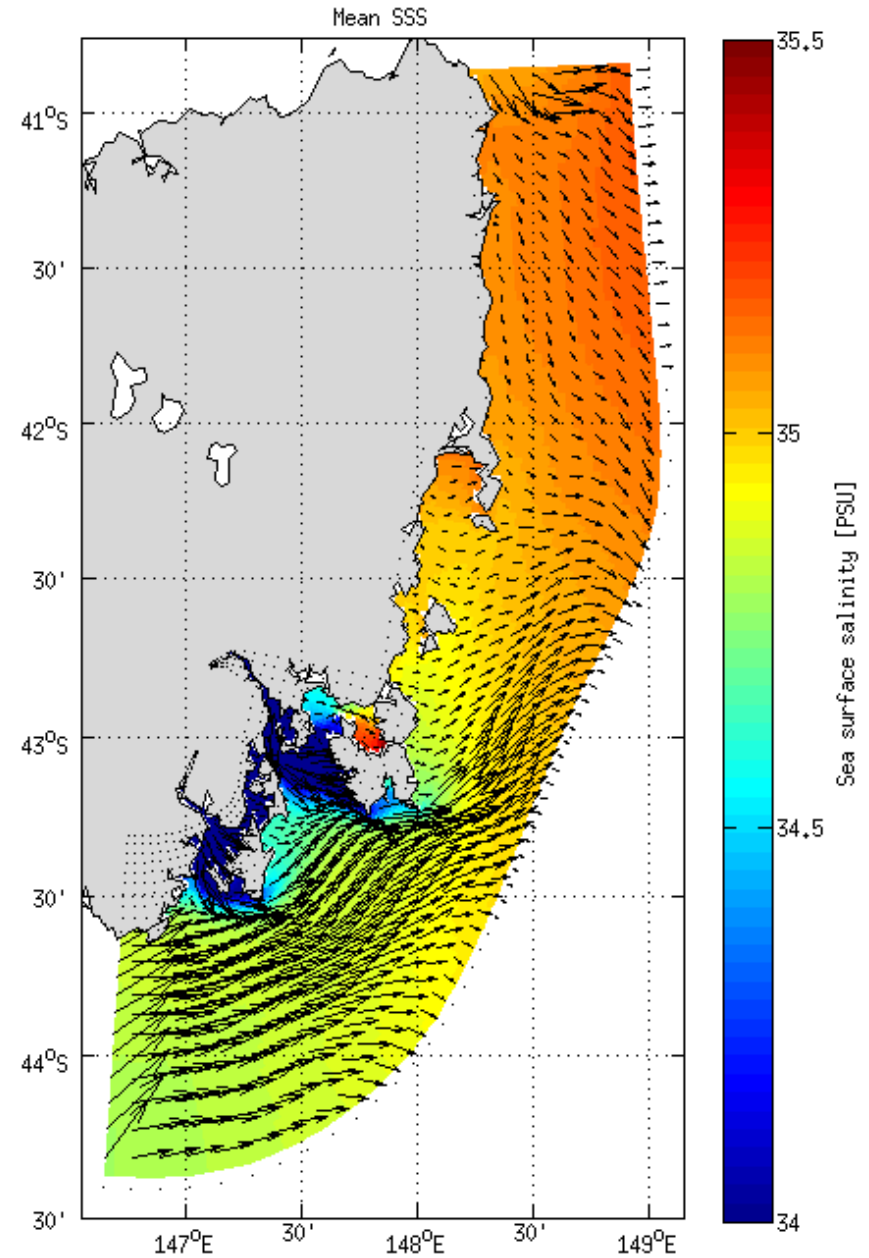


- Along the southeast coast of Tasmania, the **EAC Extension** is dominant in summer and the **Zeehan Current** is dominant in winter

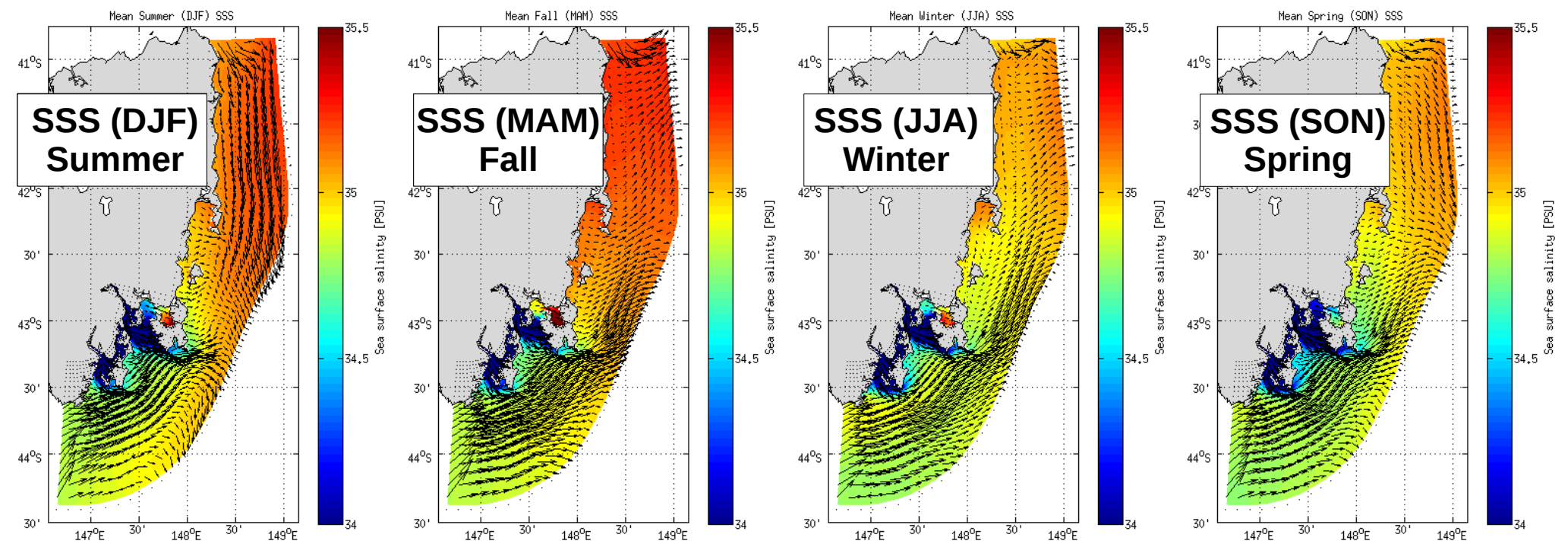
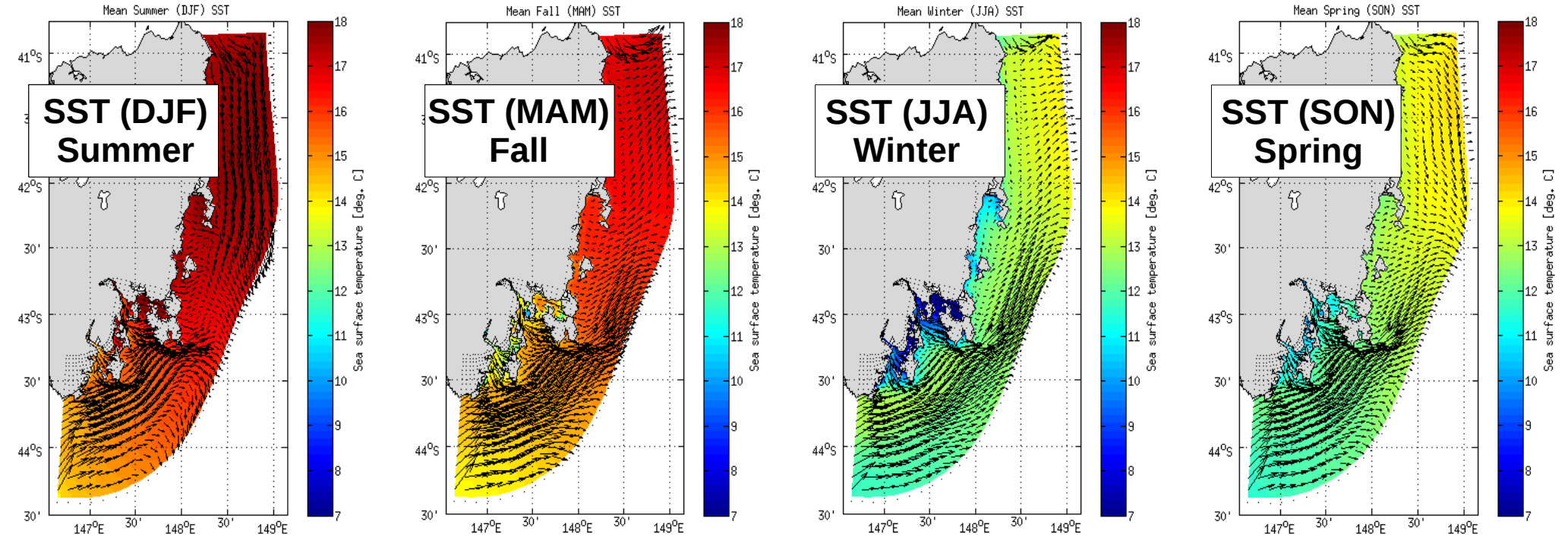
## Mean SST and Circulation

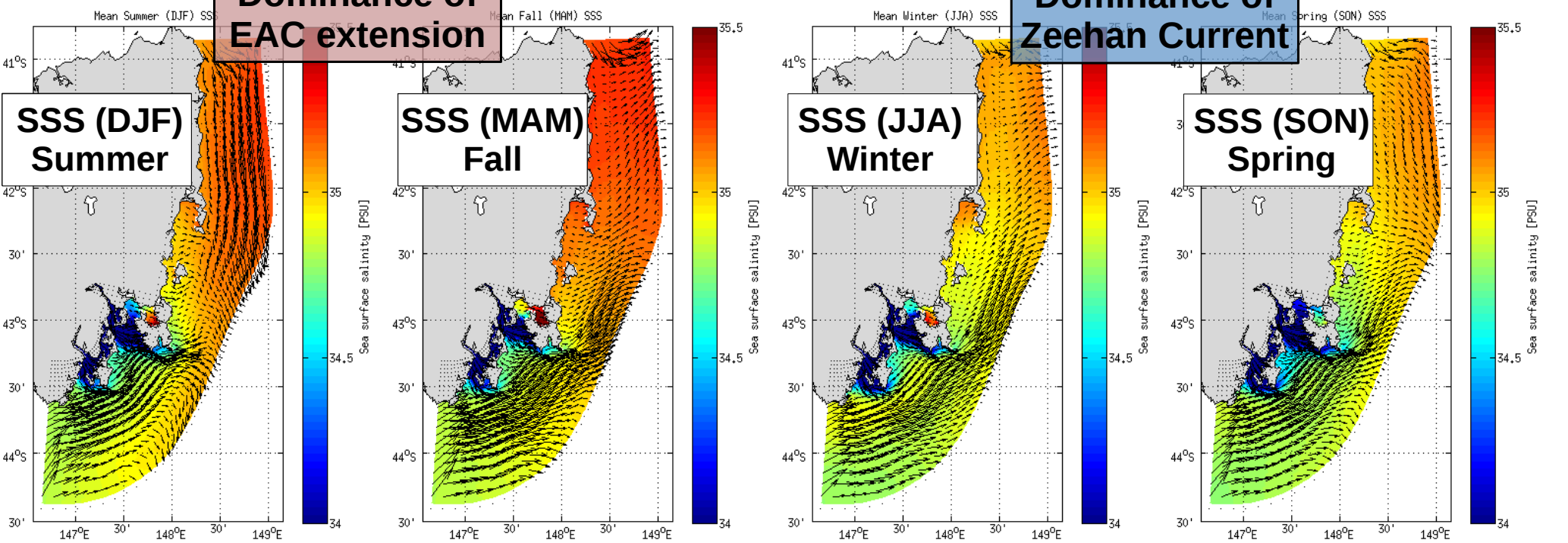
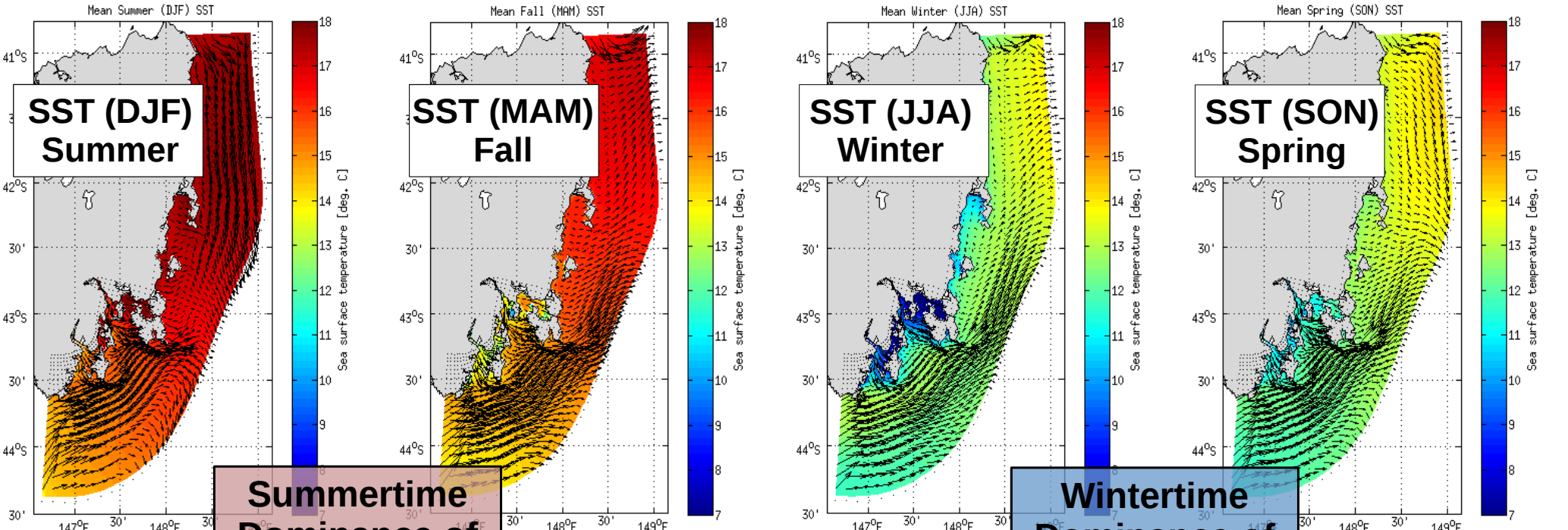


## Mean SSS and Circulation

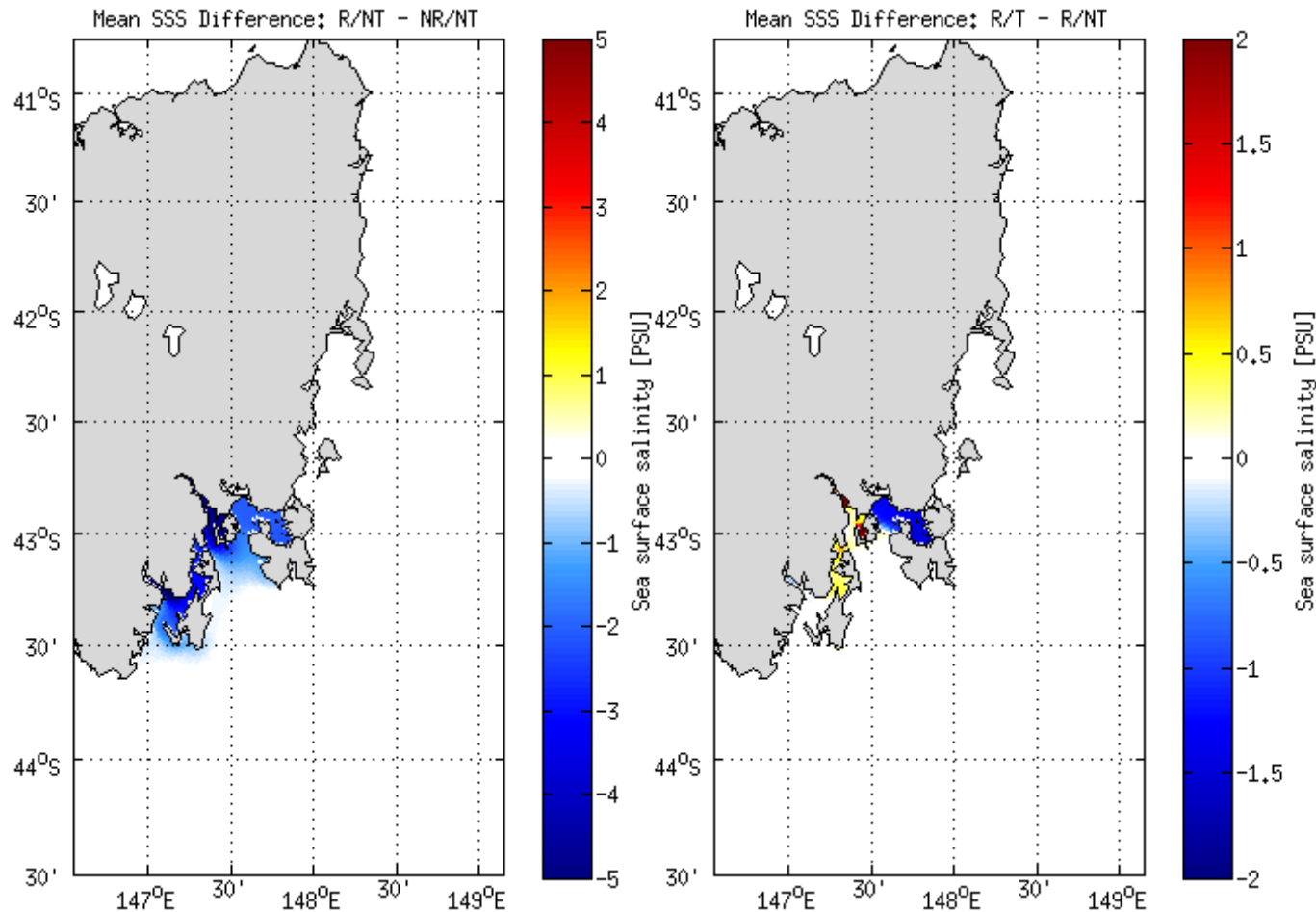






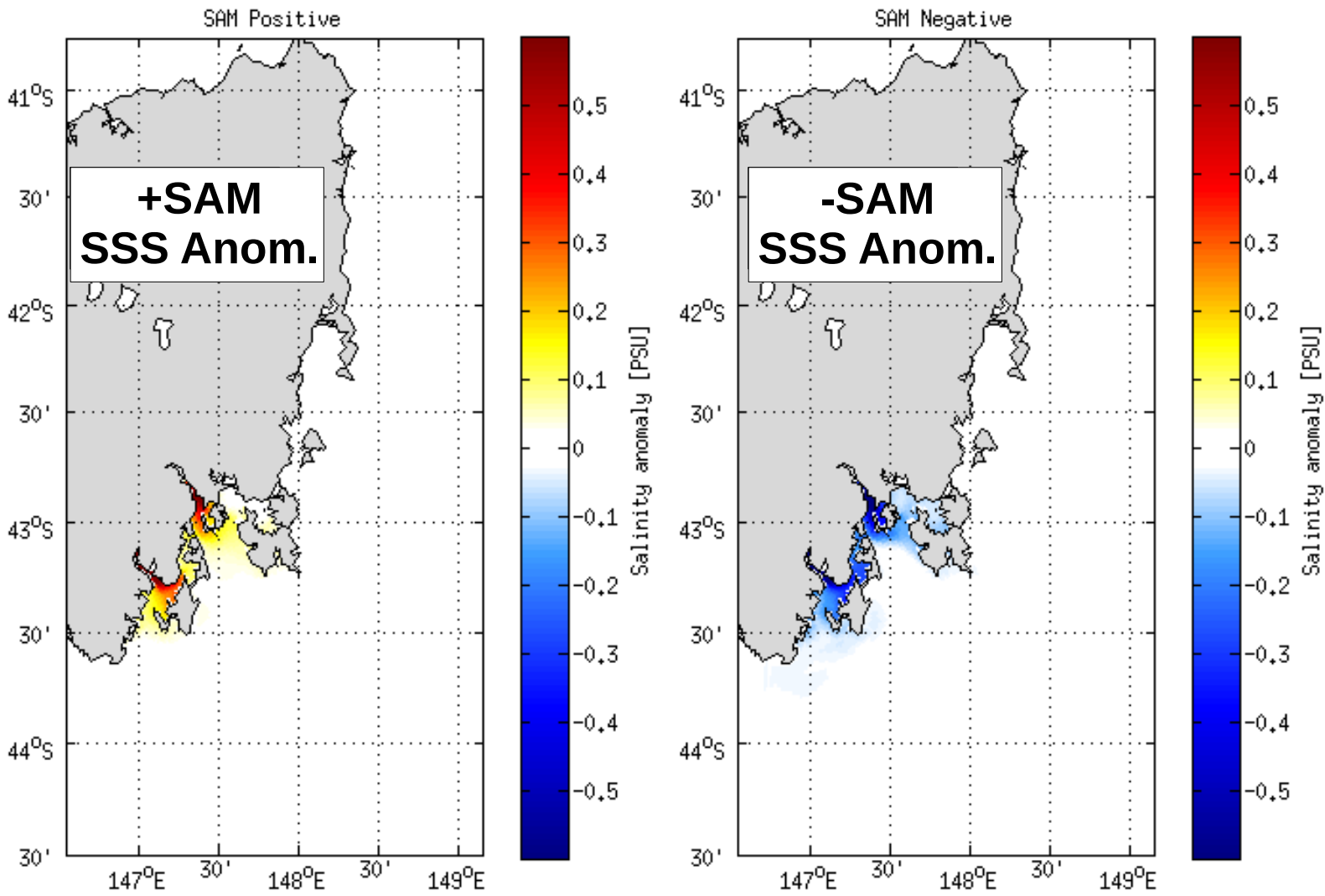


- **Role of the rivers** ( $R/NT - NR/NT$ ):
  - Reduced salinity in Derwent and Huon estuaries
  - Presence of Derwent cools while the Huon warms (not shown)
- **Tidal interactions** ( $R/T - R/NT$ ):
  - Tide-River interactions can be significant in and around river estuaries, Note: Frederick Henry Bay and Norfolk Bay

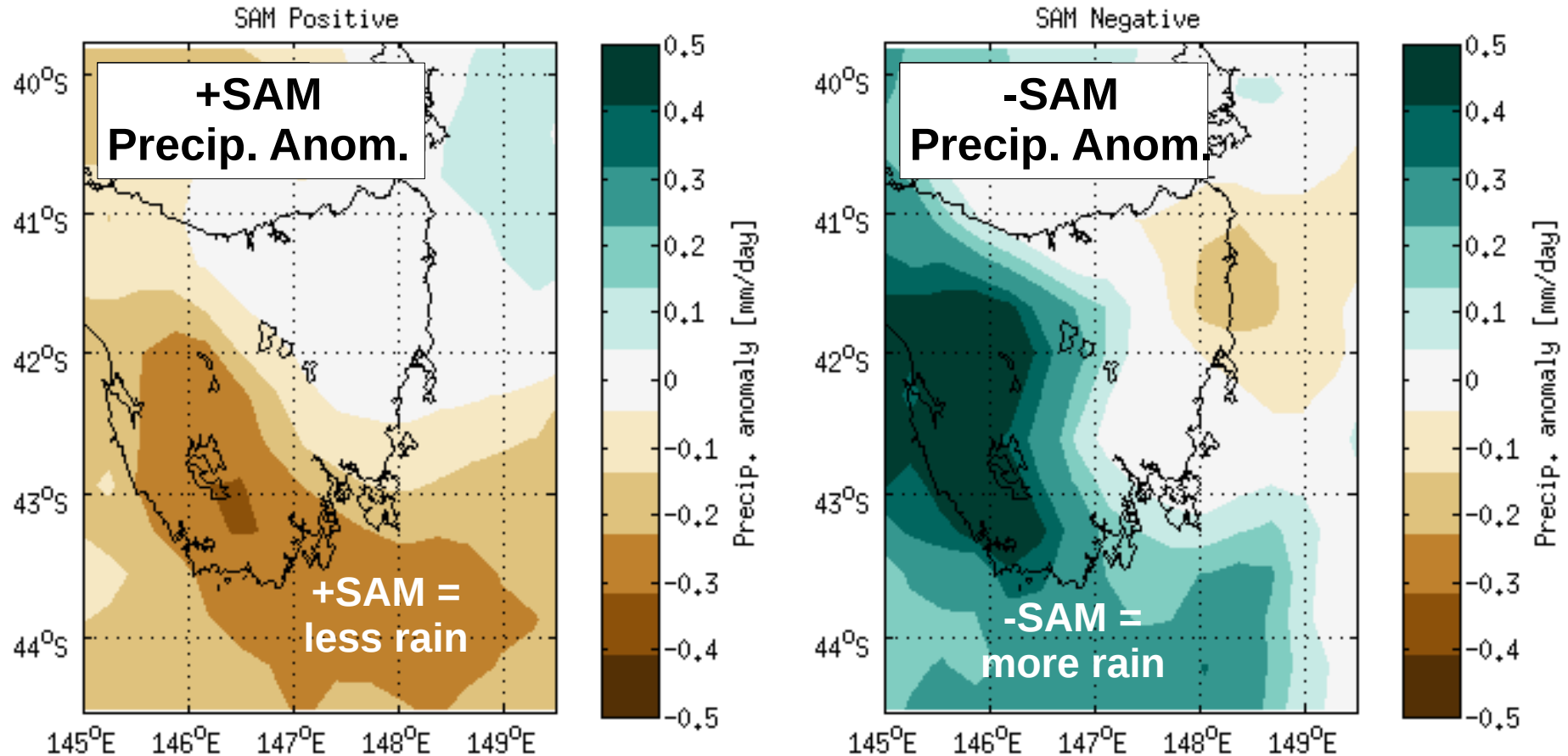




- Composite averages show a strong signature of **Southern Annular Mode (SAM)** on marine climate
- **+SAM leads to increased salinity** in the Derwent and Huon estuaries while **-SAM leads to decreased salinity**



- Composite averages show a strong signature of **Southern Annular Mode (SAM)** on precipitation over the catchment
- **+SAM** leads to decreased rainfall while **-SAM** leads to increased rainfall over SW Tasmania



- **ETAS** model compares well against observed coastal sea level, historical Maria Island time series, near-bottom temperature at a number of sites, and remotely-sensed SST across the shelf
- Model captures **seasonal alternation** between dominance of **Zeehan Current in Winter (JJA)** and **EAC Extension in Summer (DJF)**
- Roles of rivers, tides, and climate modes:
  - **Rivers** freshen and cool estuary waters
  - **Tides** can interact with the rivers in a complex way
  - **Climate mode (SAM)** plays a role in modulating near-shore marine climate through precipitation and thus river inputs
- **Future work:** relative role of surface and boundary forcing, interaction between off-shore eddies and the shelf, influence of ENSO and Tasman Sea blocking, modulation of shelf circulation by climate modes



- **Neil Holbrook** (IMAS) – post-doc supervisor
- **Simon Wotherspoon** (IMAS) – statistics mathematician
- **Matthew Chamberlain, Richard Matear** (CSIRO) – OFAM modelling
- CSIRO EMS Team: **Mike Herzfeld, John Andrewartha, Mark Baird, Farhan Rizwi**
- SSF team: **Martin Marzloff, Craig Johnson, and Neville Barrett** (IMAS)
- **Craig Mundy** (IMAS) – Tassie temperature logger data
- **Mauro Vargas Hernandez, Andre Belo do Couto, Bo Qiu, Keith Thompson, Jessica Benthuisen, Max Nikurashin, Andrew Kiss, Terry O'Kane**, etc... for helpful discussions
- The Super Science Fellowship and the Centre of Excellence for Climate System Science (Australia Research Council), IMAS and UTAS for support, financial and otherwise



ARC CENTRE OF EXCELLENCE FOR  
**CLIMATE SYSTEM SCIENCE**



Australian Government  
Australian Research Council

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## Publications

Oliver, E. C. J. and N. J. Holbrook (2014), Extending our understanding of South Pacific gyre 'spin-up': Modeling the East Australian Current in a future climate, *Journal of Geophysical Research*, 119, 2788-2805

Oliver, E. C. J., S. J. Wotherspoon and N. J. Holbrook (2014), Estimating extremes from global ocean and climate models: A Bayesian hierarchical model approach, *Progress in Oceanography*, 122, 77-91

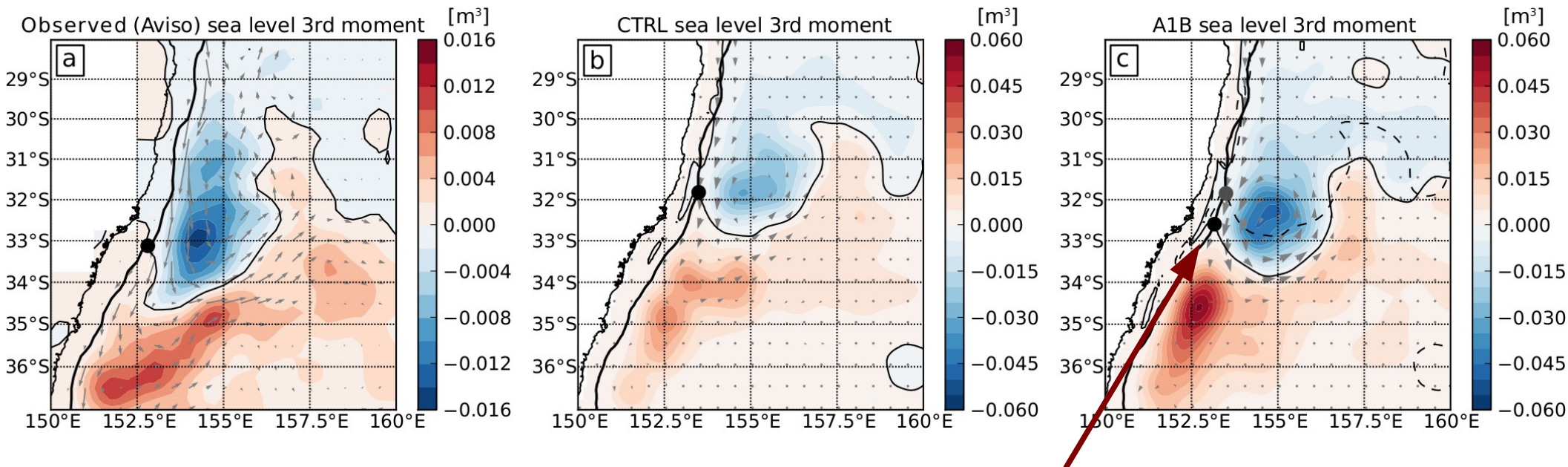
Oliver, E. C. J., S. J. Wotherspoon, M. A. Chamberlain and N. J. Holbrook (2014), Projected Tasman Sea extremes in sea surface temperature through the 21st century, *Journal of Climate*, 27(5), 1980-1998

Oliver, E. C. J. and N. J. Holbrook (2014), A statistical method for improving continental shelf and nearshore marine climate prediction, *Journal of Atmospheric and Oceanic Technology*, 31, 215-232

Extra Slides...

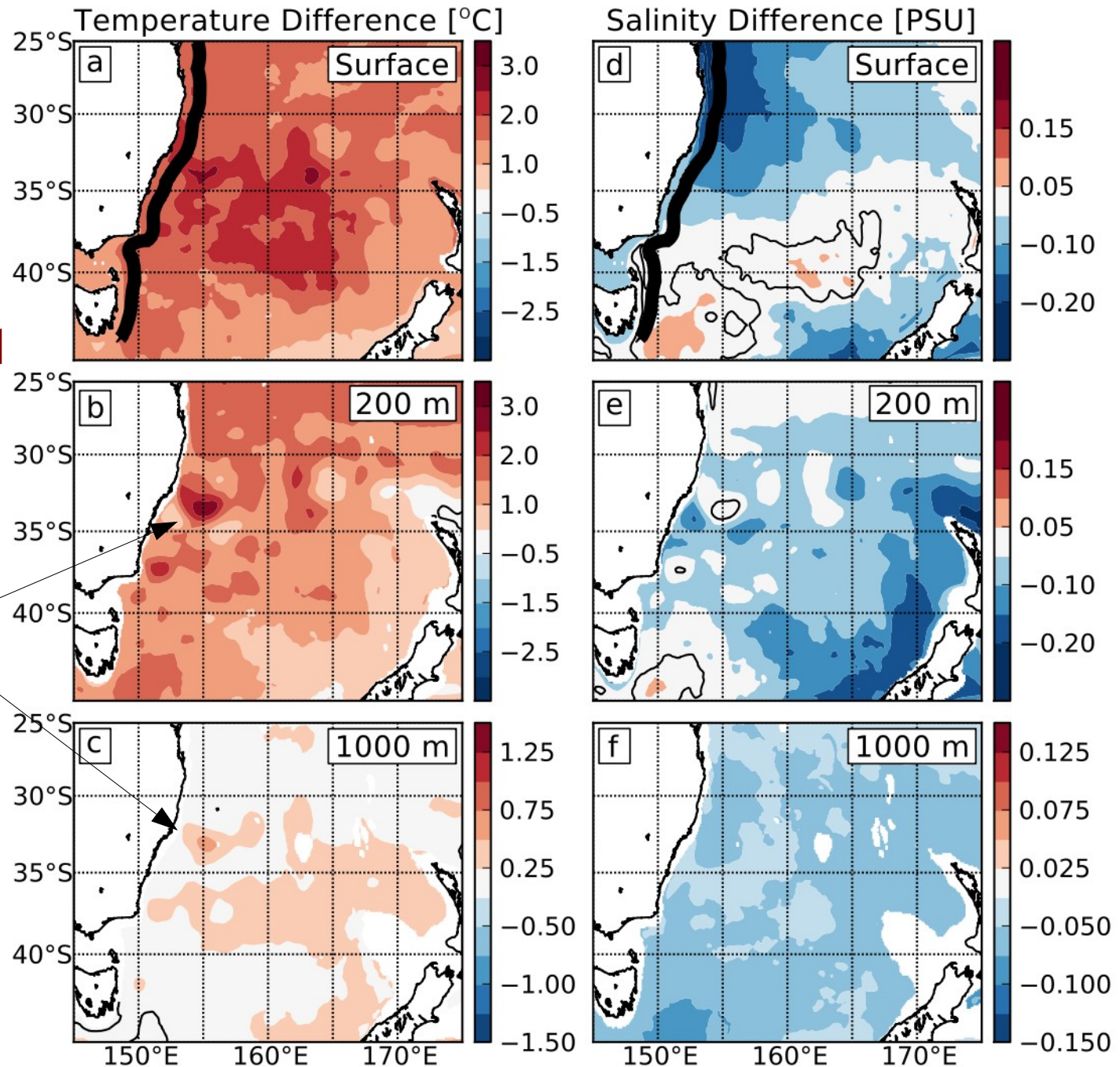


- The third moment of sea level (**sea level skewness**) can be used to map the **mean path of a meandering jet**, such as western boundary currents [Thompson and Demirov, 2006]
- The intersection of the mean jet path with the shelf break is used as a rough indicator of the mean **EAC separation point**

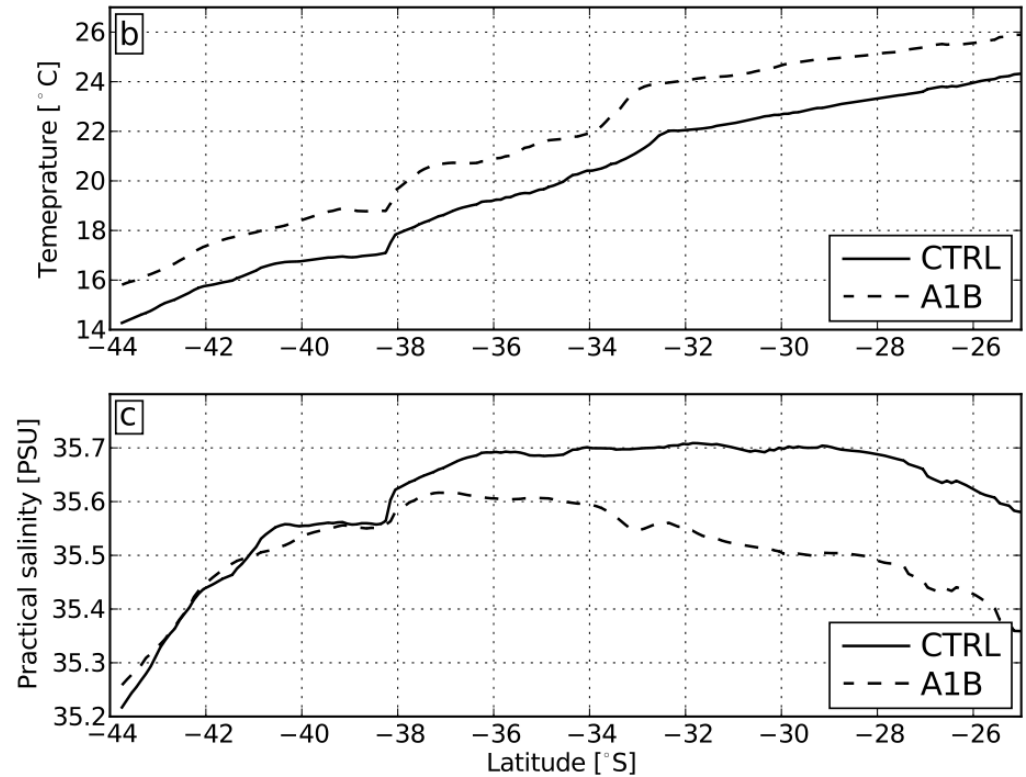
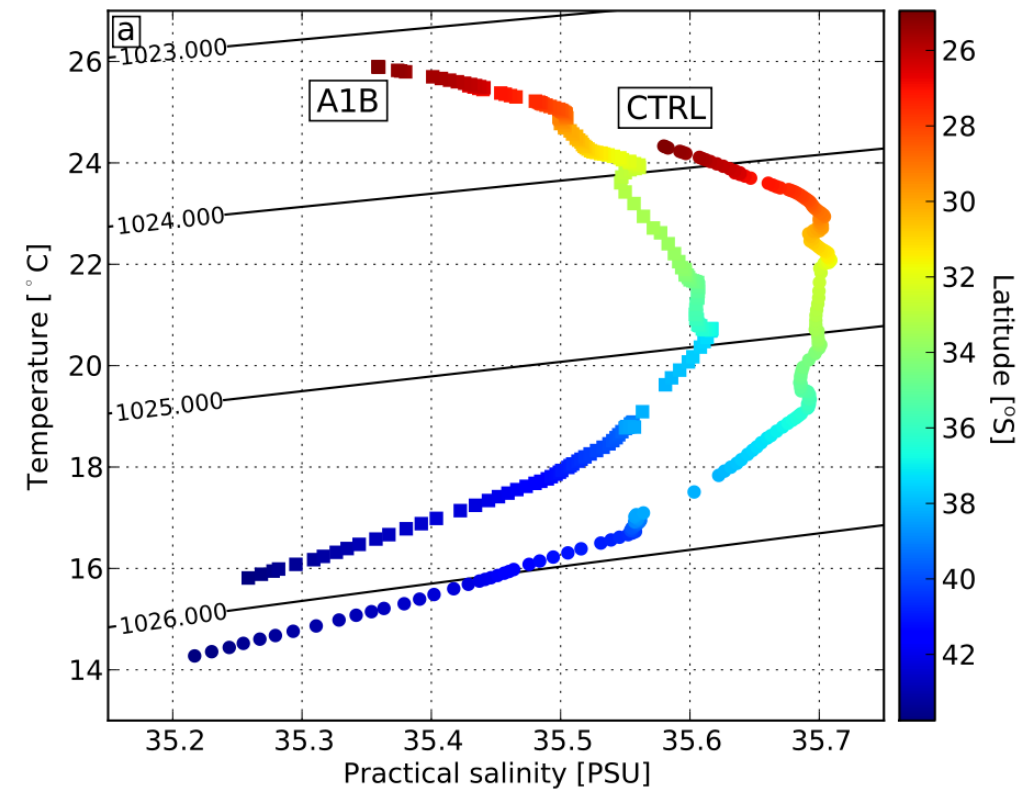


Approx 90 km southward shift in EAC separation

- Changes present throughout the water column: a general **warming and freshening of the Tasman Sea**
- Deepening of EAC anticyclonic recirculation near separation point?



- Surface changes along the shelf break indicate a consistent **warming of  $\sim 2^{\circ}\text{C}$**  and freshening only north of Bass Strait and increasing with latitude





# Model Stationarity

## Fundamental relationship

We posit that there exists a relationship between the extremes and climate parameters  $\mathbf{X}$ :

$$\text{“extremes”} = f(\mathbf{X})$$

This relationship expresses fundamental aspects of the climate system which do not change with time.

## Role of $\beta$ s and $\tau$ s

Effectively, we have performed a linear approximation to  $f(\mathbf{X})$ :

$$f(\mathbf{X}) = \mathbf{X}\beta + O(\mathbf{X}^2)$$

Therefore, the  $\beta$ s (and  $\tau$ s) are stationary since  $f(\mathbf{X})$  is stationary

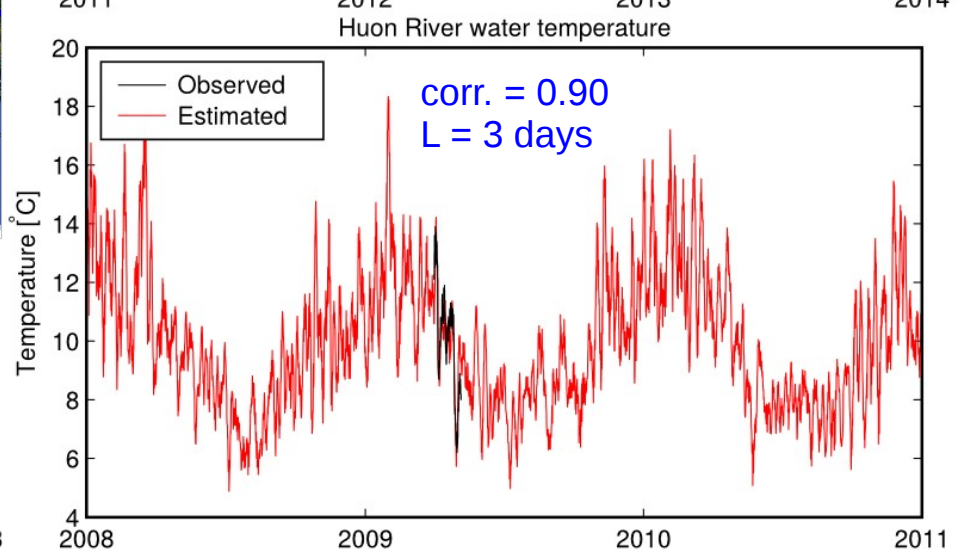
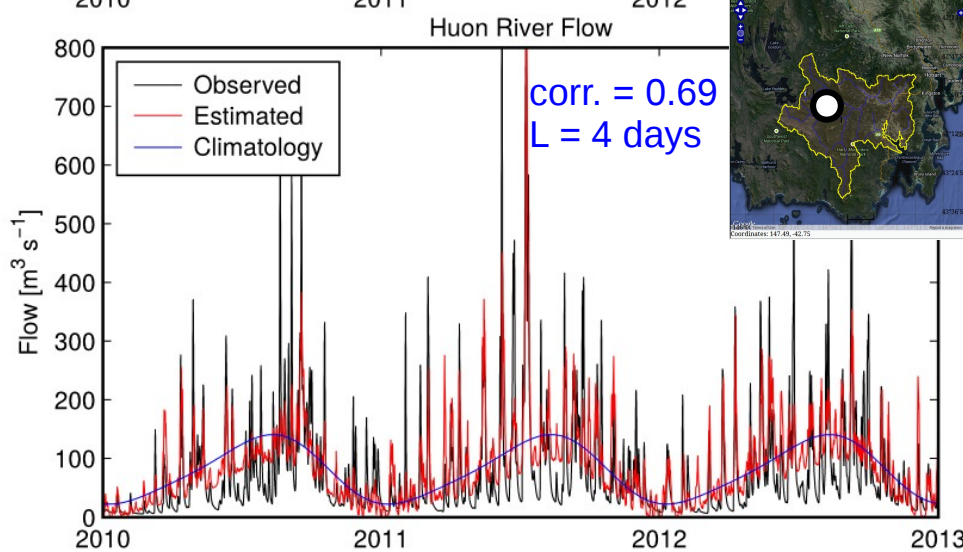
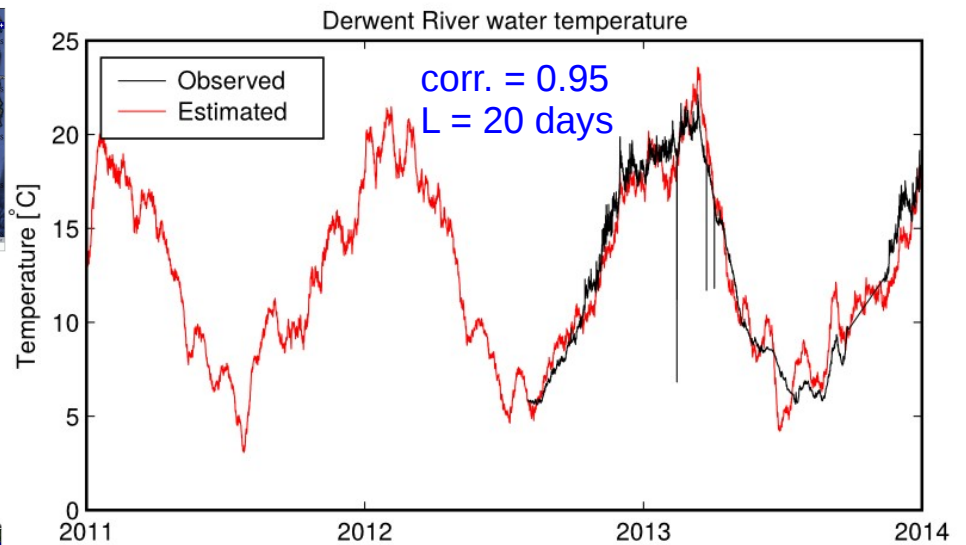
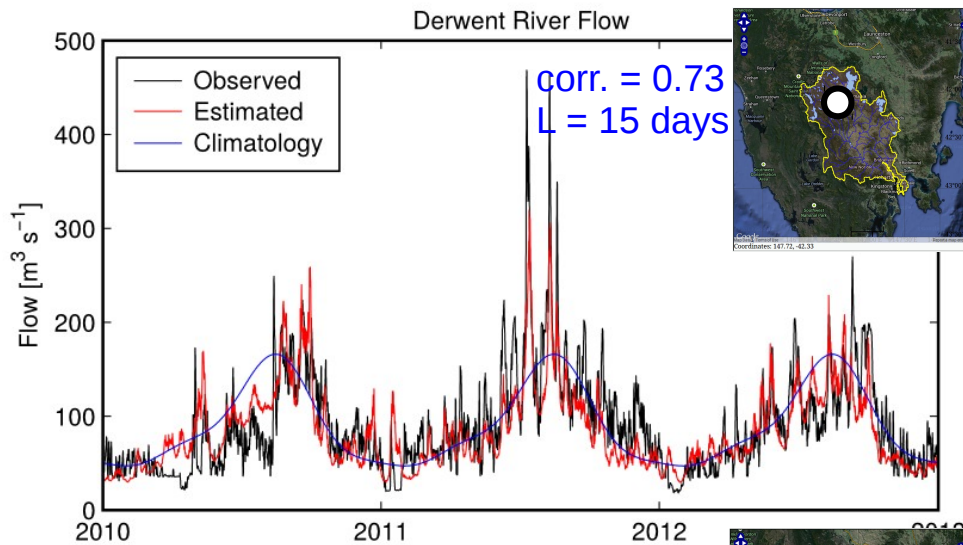
- We also require river input (flow rate and water temperature) for the two major rivers in SE Tasmania: Derwent River and Huon River
- We have observed records of flow ( $\text{m}^3/\text{s}$ ) and water temp for both rivers, but records very short and very recent (Nov/2009 -late/2013; shorter for temp) and we require these quantities over the entire 1993-2013 period
- Therefore, we modeled river flow ( $F$ ) using precipitation ( $P$ ) over the river catchments (from CFSR/CFSv2) as a predictor in a multiple lag-regression model:

$$\log(F_t) = \alpha + \sum_{l=0}^L \beta_l \log(P_{t-l})$$

And a similar model (without log-transforms) to estimate river temperature from local air temperature

- A two-fold cross-validation was performed to determine which value of  $L$  provided the best fit
- Given a satisfactory fit, we used historical precipitation and air temperature from CFSR/CFSv2 to reconstruct river flow and temperature over the entire 1993-2013 period

- River input (flow rate and water temperature) required for Derwent River and Huon River
- River inputs predicted from precipitation and air temperature using a lag-regression model and then reconstructed over 1993-2013

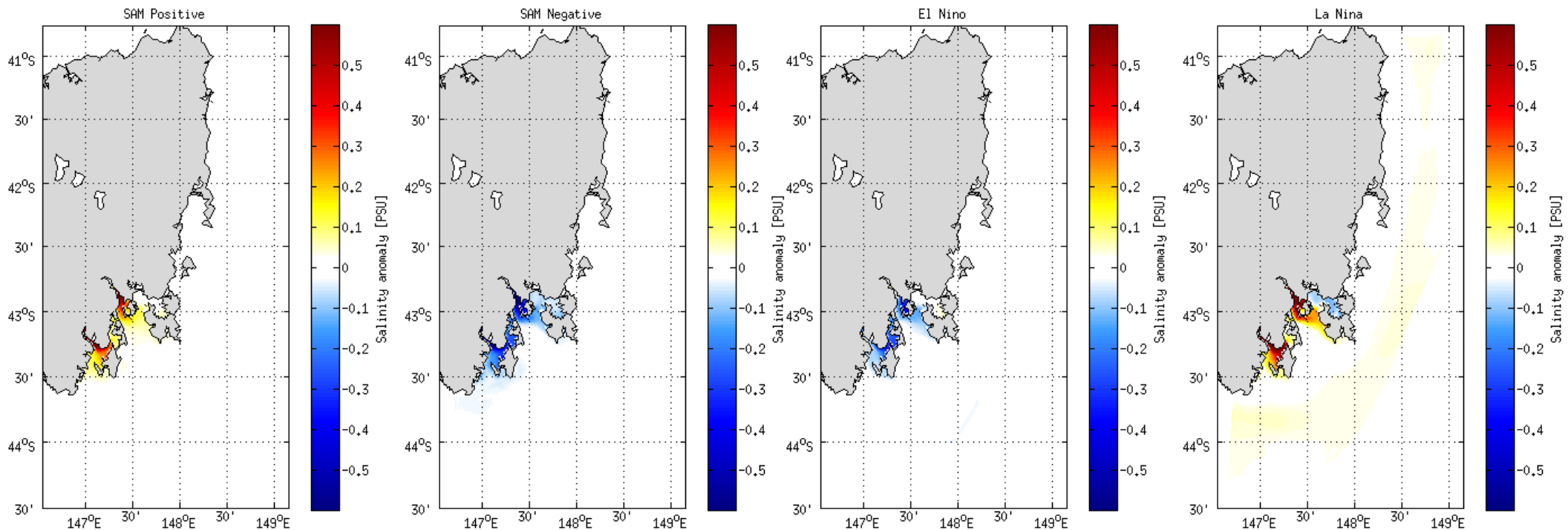




- Spin-up: model was spun up for 5 years using normal year forcing\*, initialized from Bluelink on 1/1/1993
- Historical hindcast: model was then forced by realistic forcing over the 1993-2013 period
- Four runs were performed for all combinations
  - **with and without tidal forcing (T and NT)**, and
  - **with and without river inputs (R and NR)**
  - The **base run for validation** was with river input and no-tides (R/NT)

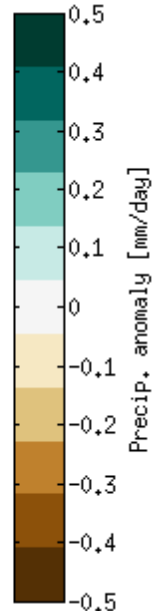
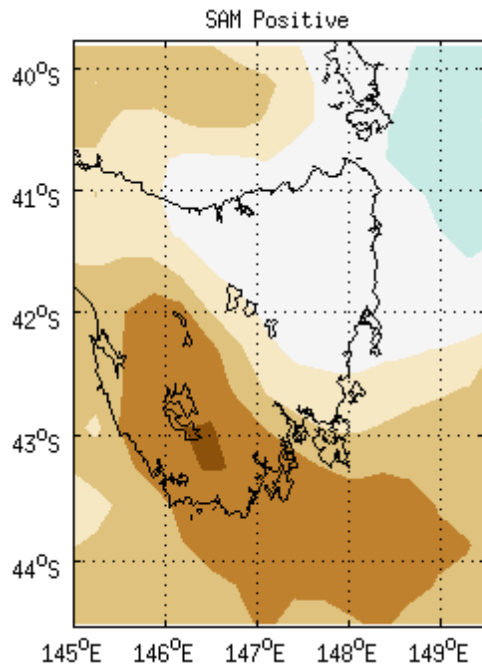
\* NYF: climatological seasonal cycle, subseasonal variability from 1995, mean of 1993; following *Large and Yeager (2004)*; rivers are climatological only

- Composites of surface salinity modes of climate variability show a strong signature of **ENSO** and **SAM** on marine climate
- **+SAM and La Nina lead to increased SSS** in the Derwent and Huon estuaries while **-SAM and El Nino lead to decreased SSS**
- Signal disappears in NR runs: must be **related to river input**
- SAM and ENSO are related to a +/- 6–8 m<sup>3</sup>/s modulation of river flow, which is up to 10% of the mean flow

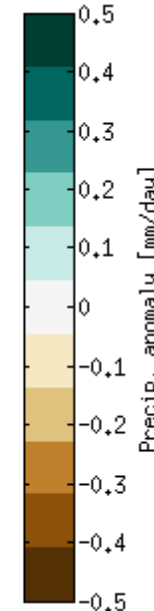
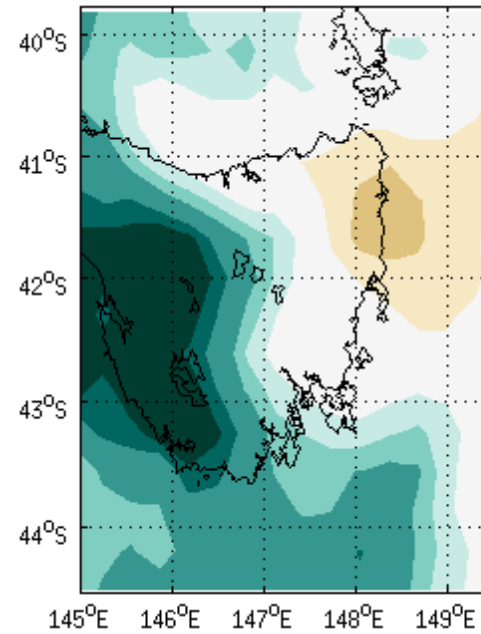


- Clearly related to SAM/ENSO relationship with precipitation over river catchments:

**+SAM =  
less rain**

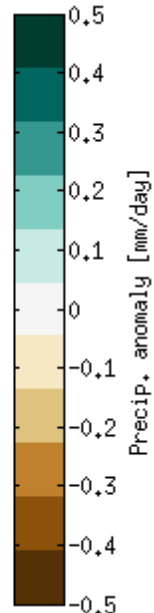
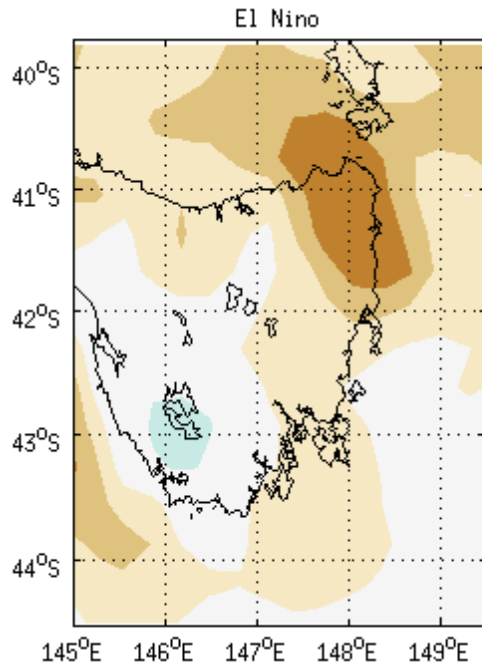


SAM Negative

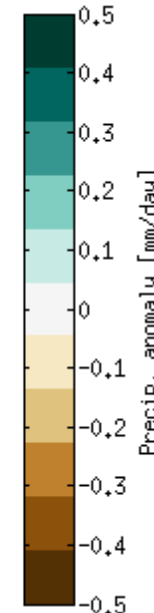
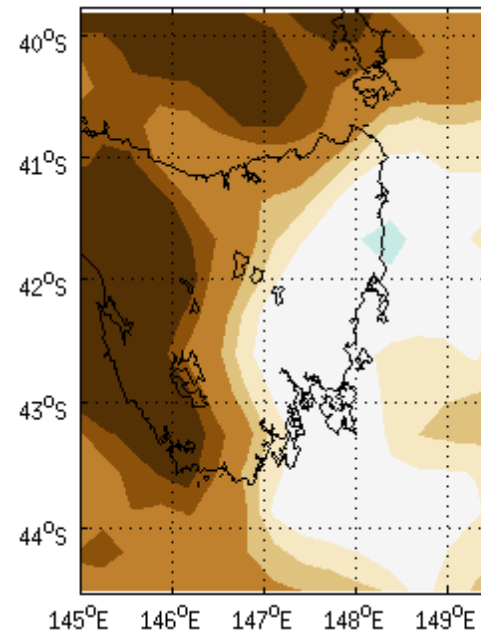


**-SAM =  
more rain**

**El Nino =  
more rain**



La Nina



**La Nina =  
less rain**