

# Marine heatwaves off eastern Tasmania

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*Alistair J. Hobday*<sup>3</sup>

*Craig Mundy*<sup>1</sup>, *Scott Ling*<sup>1</sup>

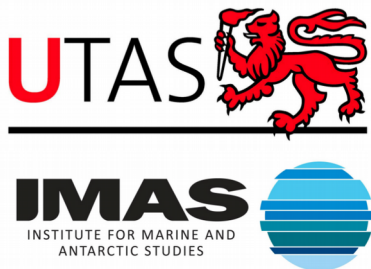
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<sup>2</sup> Australian Research Council Centre of Excellence for Climate System Science

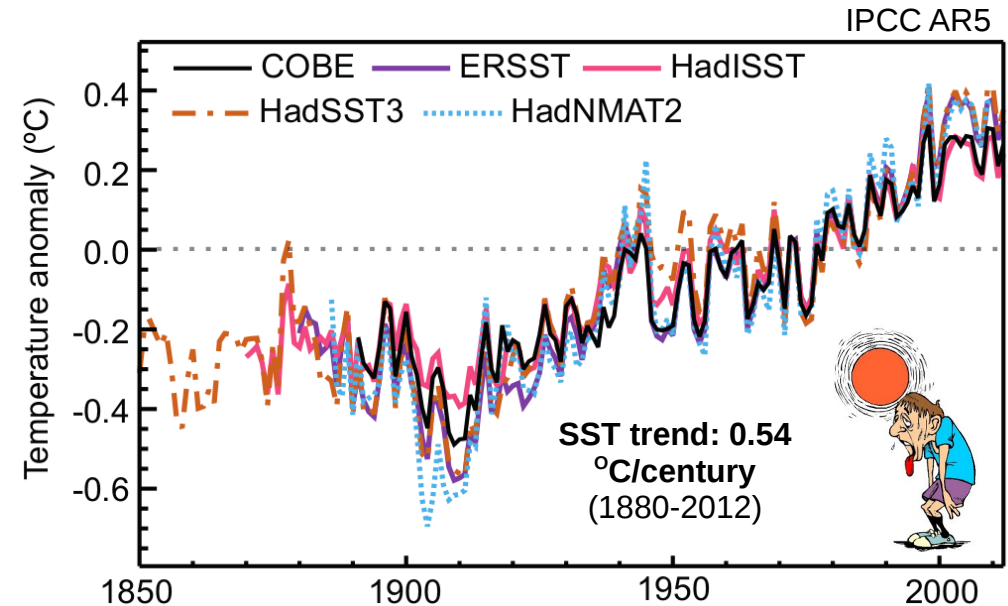
<sup>3</sup> Oceans and Atmosphere Flagship, CSIRO, Hobart, Tasmania, Australia

<sup>4</sup> Australian Institute of Marine Science, Townsville, Queensland, Australia

<sup>5</sup> Climate Change Research Centre, University of New South Wales, Sydney, Australia



- Global marine climate is **warming**
- The SW Pacific (Tasman Sea) is a **hotspot of change**
- Ocean temperature extremes, or **marine heatwaves**, are often the first expression of climate change
- Impacts on **marine ecology** are already being felt
- Ocean dynamics and climate modelling can help us understand historical marine heatwaves:
  - Physical drivers
  - Variability
  - Anthropogenic climate change



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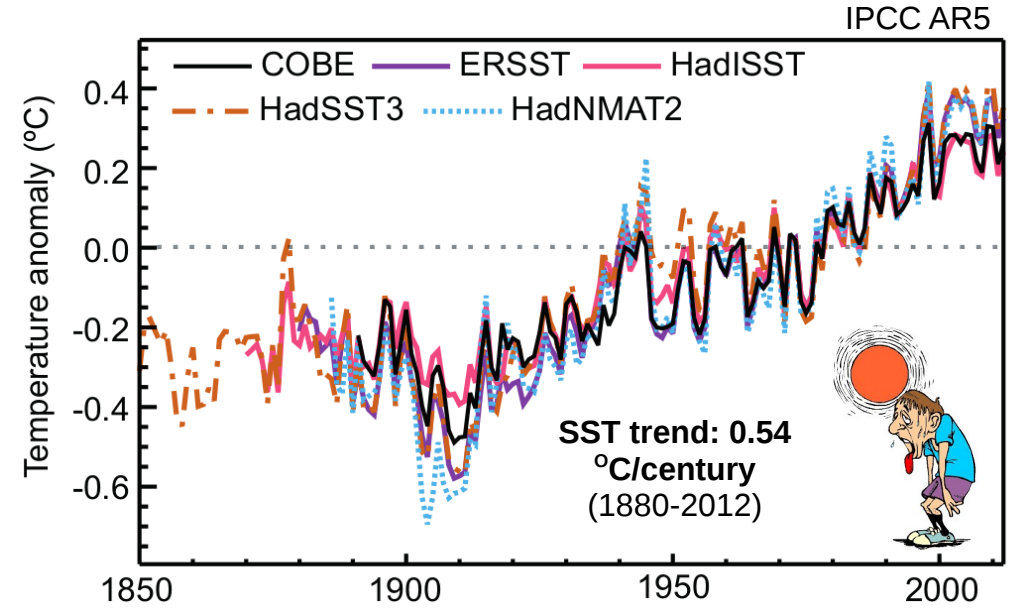
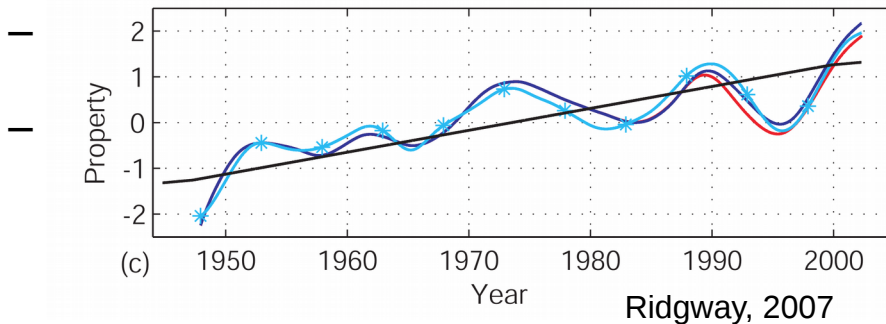
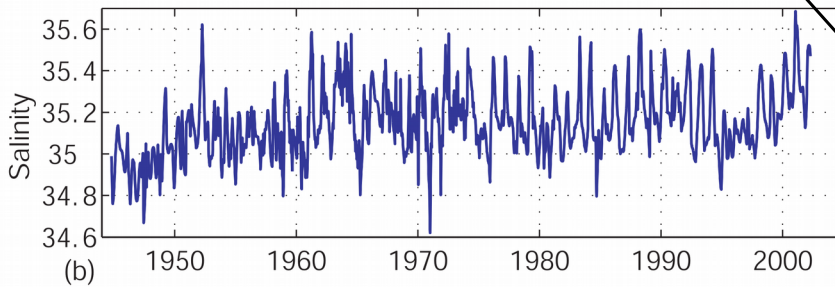
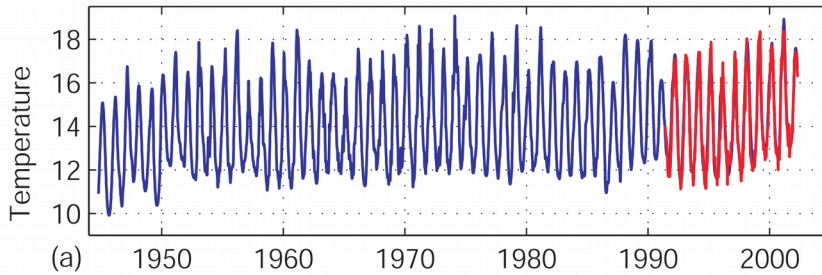
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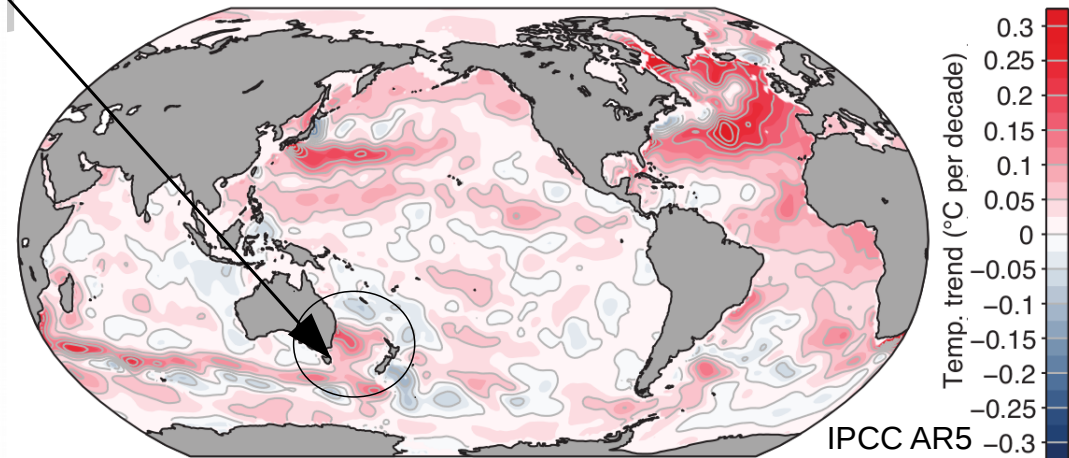
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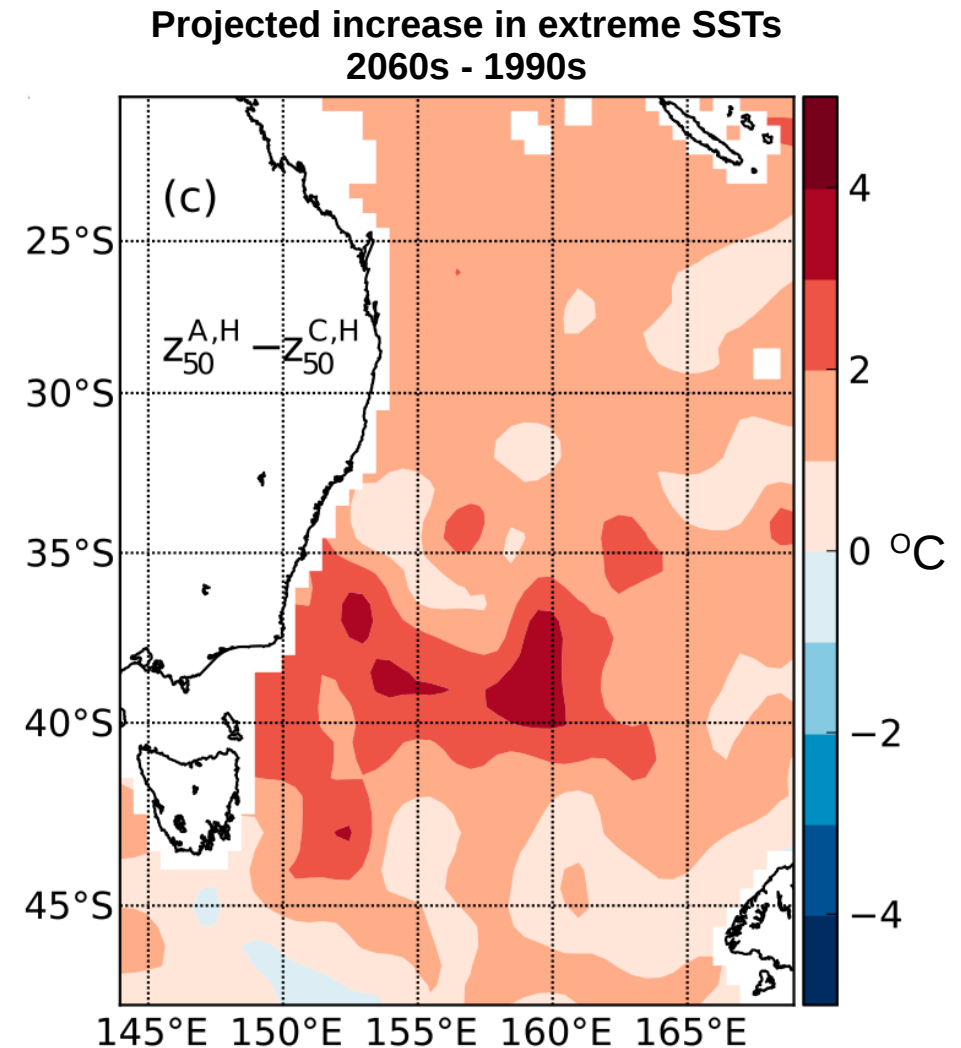
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0-700 m temperature trend (1971-2010)



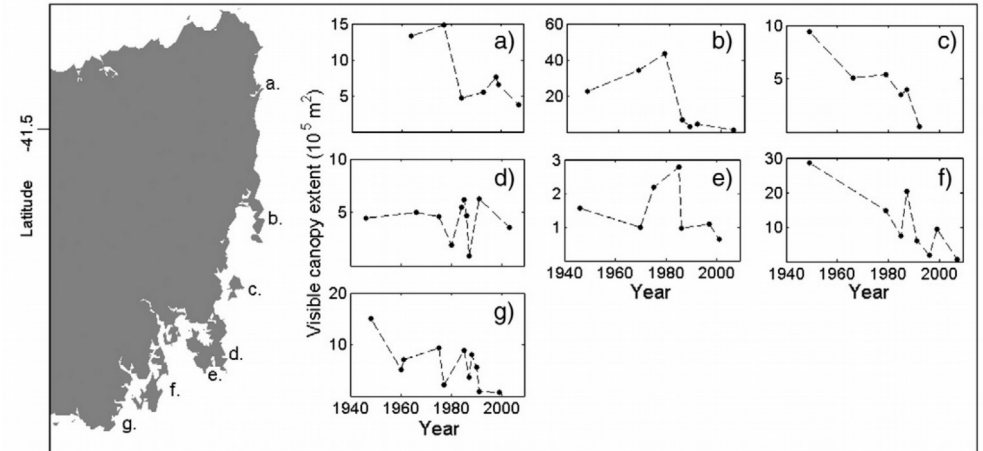
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Johnson et al. (2011)

## During 2015/16 event:

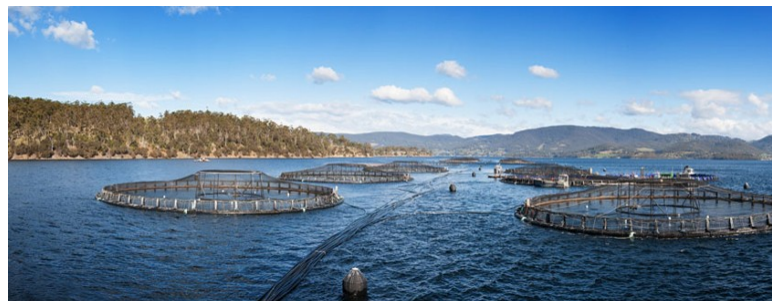


POMS in Oysters



Abalone mortality

Poor salmon performance

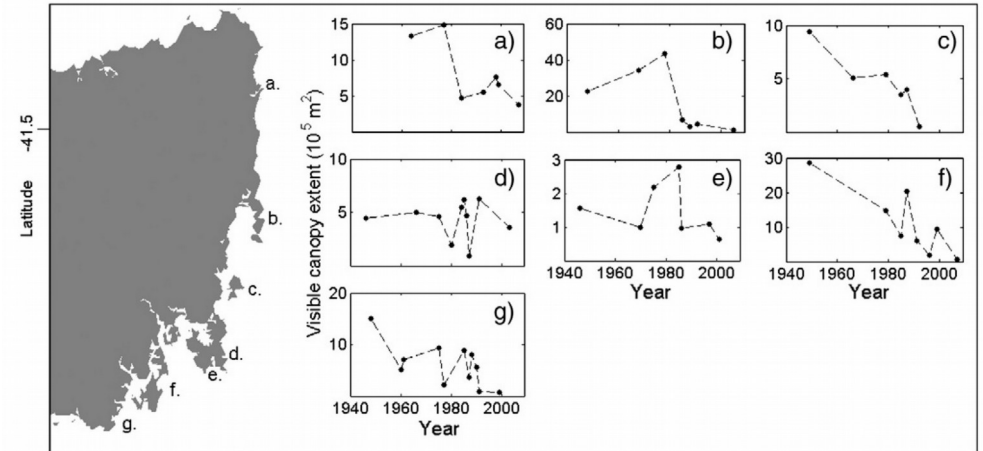


Tropical fish!



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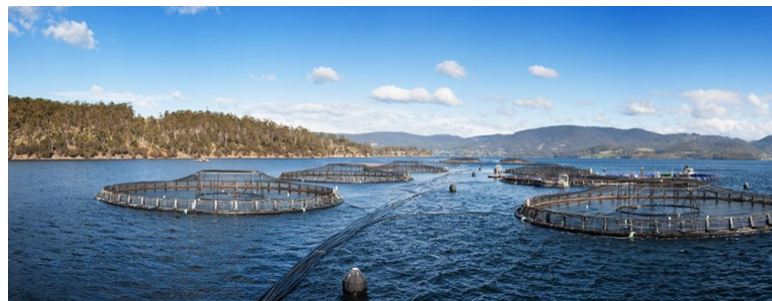


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## Part I

# **Extreme marine heatwave off southeast Australia in austral summer 2015-2016**

Oliver, Benthuysen, Bindoff, Hobday, Holbrook, Mundy and Perkins-Kirkpatrick, *Nat Comms* (under review)

## Part II

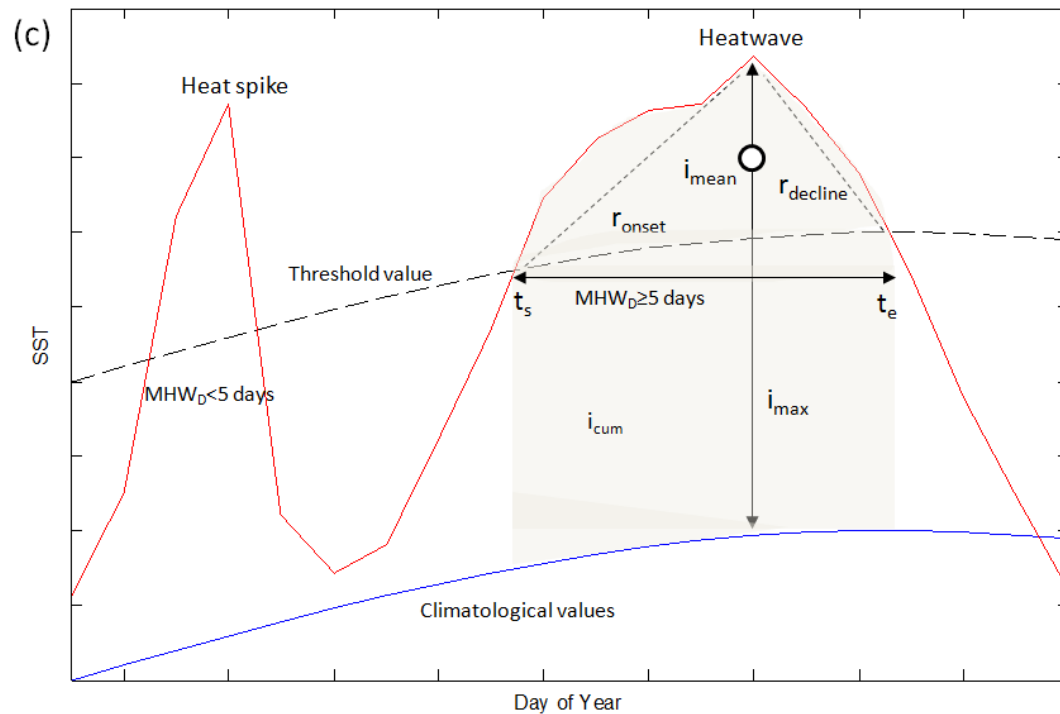
# **Identifying historical marine heatwaves off eastern Tasmania with a regional ocean model**

Oliver, Lago, Holbrook, Hobday, Mundy and Ling, *REGS 2016 Project* + manuscript (in prep.)

# What is a Marine Heatwave?

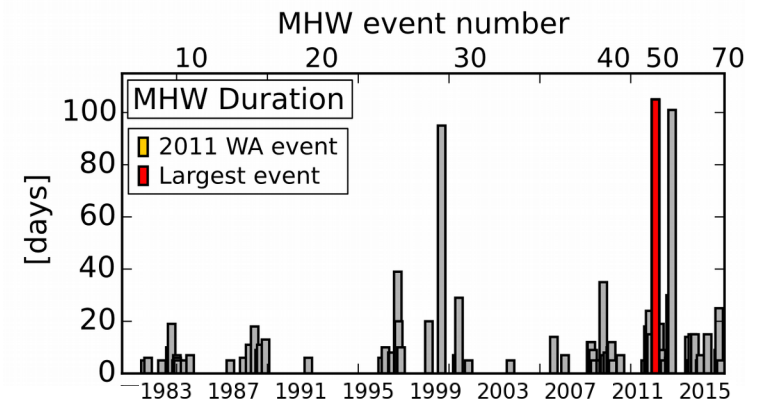
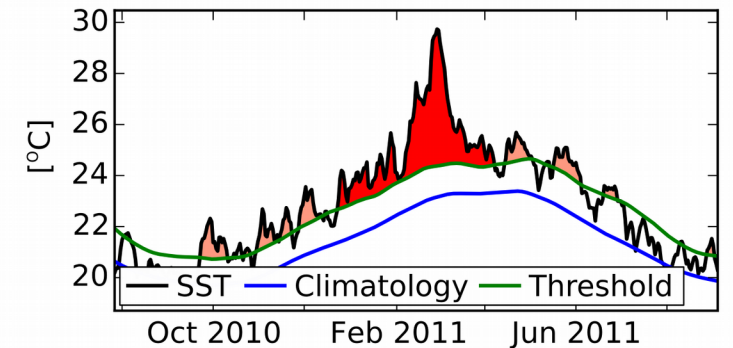
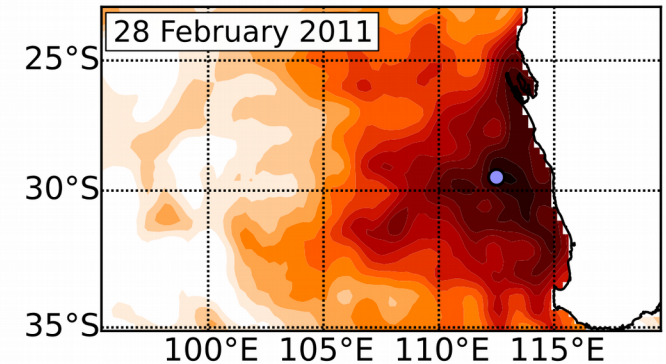
- A **marine heatwave (MHW)** is defined to be a **discrete prolonged anomalously warm water event at a particular location** (Hobday et al., 2016)
- Specifically, **SSTs above the seasonally-varying 90<sup>th</sup> percentile** that **persist for at least 5 days**.
- Definition includes a set of **metrics**, including:

- **Intensity** [ $^{\circ}\text{C}$ ]
- **Duration** [days]



**Software** implementation free-ly available in Python here: [github.com/ecjoliver/marineHeatWaves](https://github.com/ecjoliver/marineHeatWaves)  
and in R here: [github.com/cran/RmarineHeatWaves](https://github.com/cran/RmarineHeatWaves)

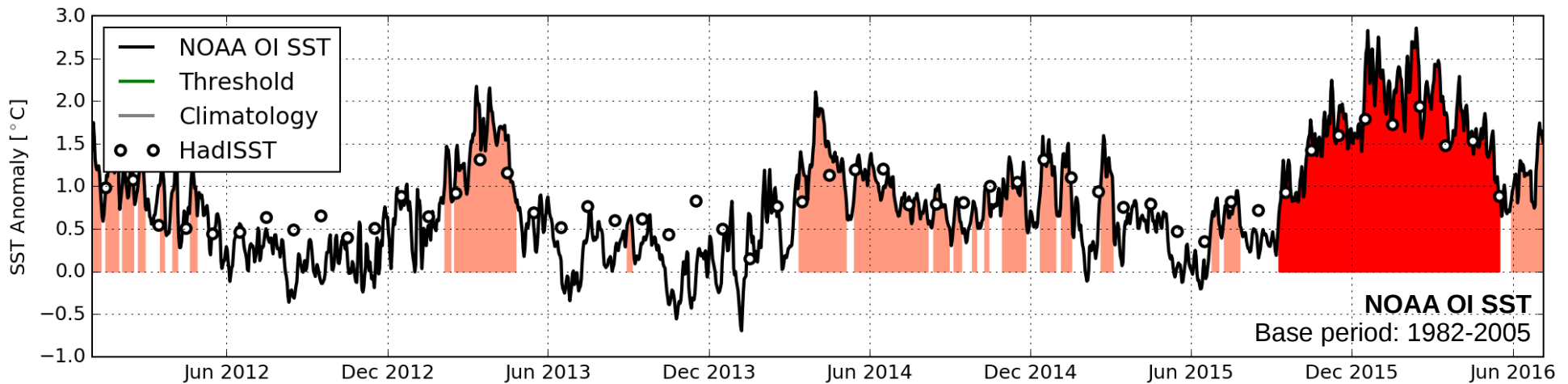
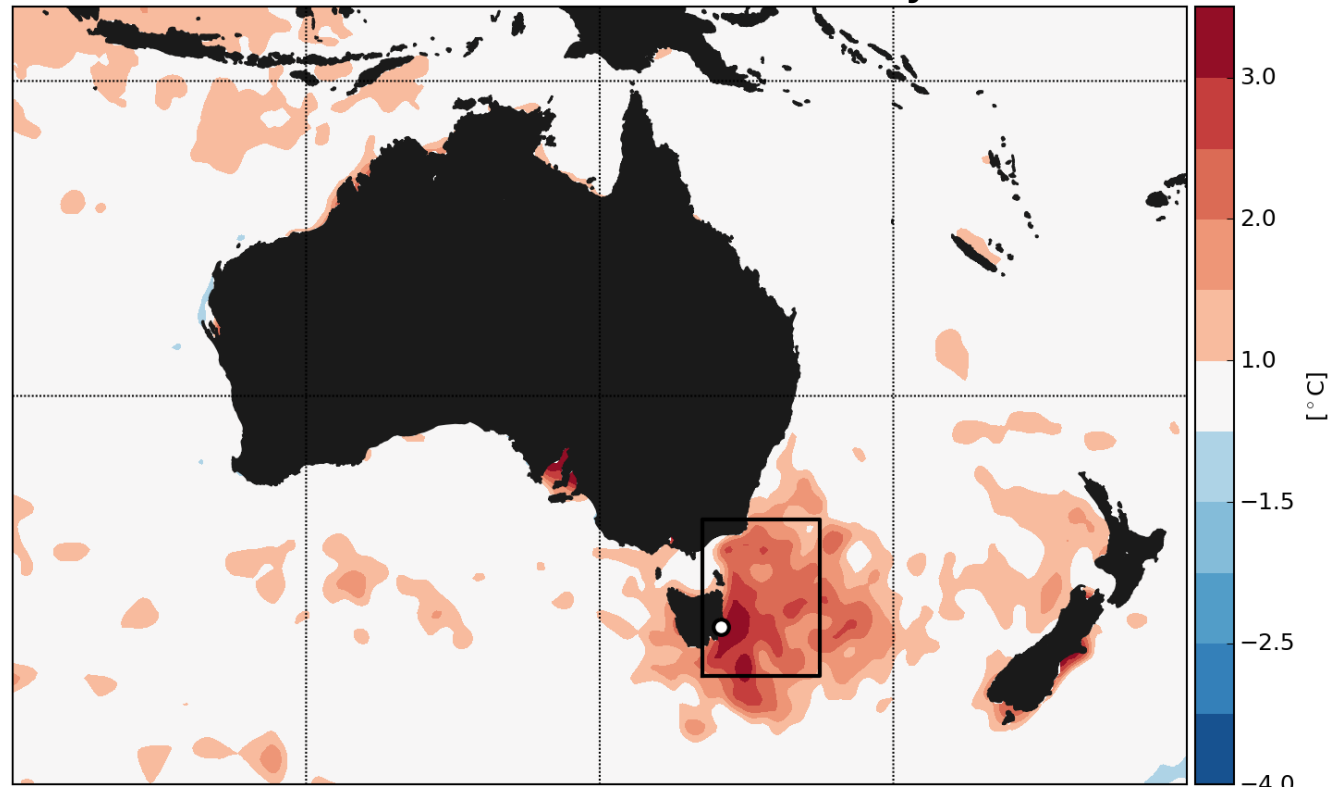
Western Australia (WA) 2011 Event





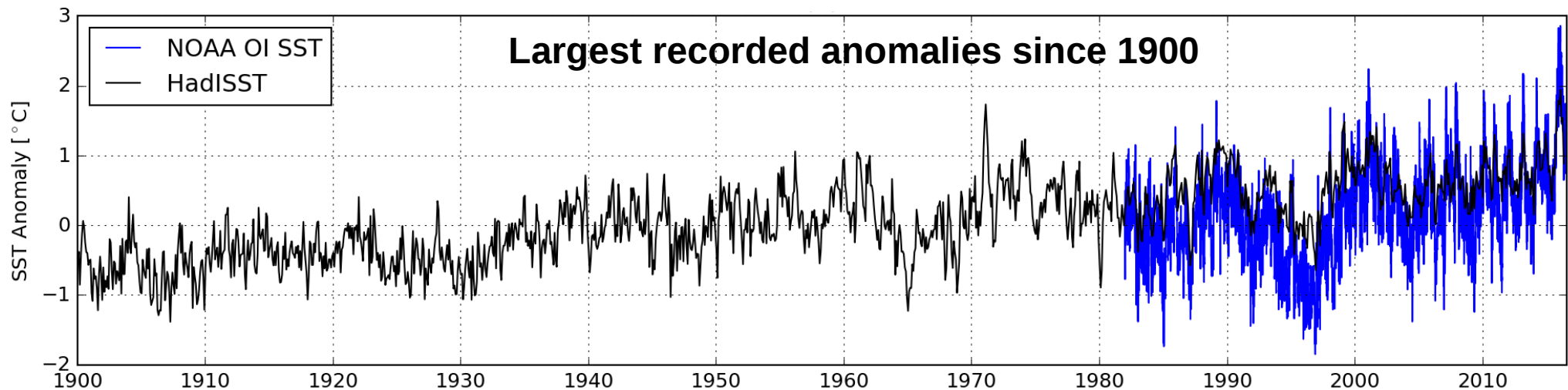
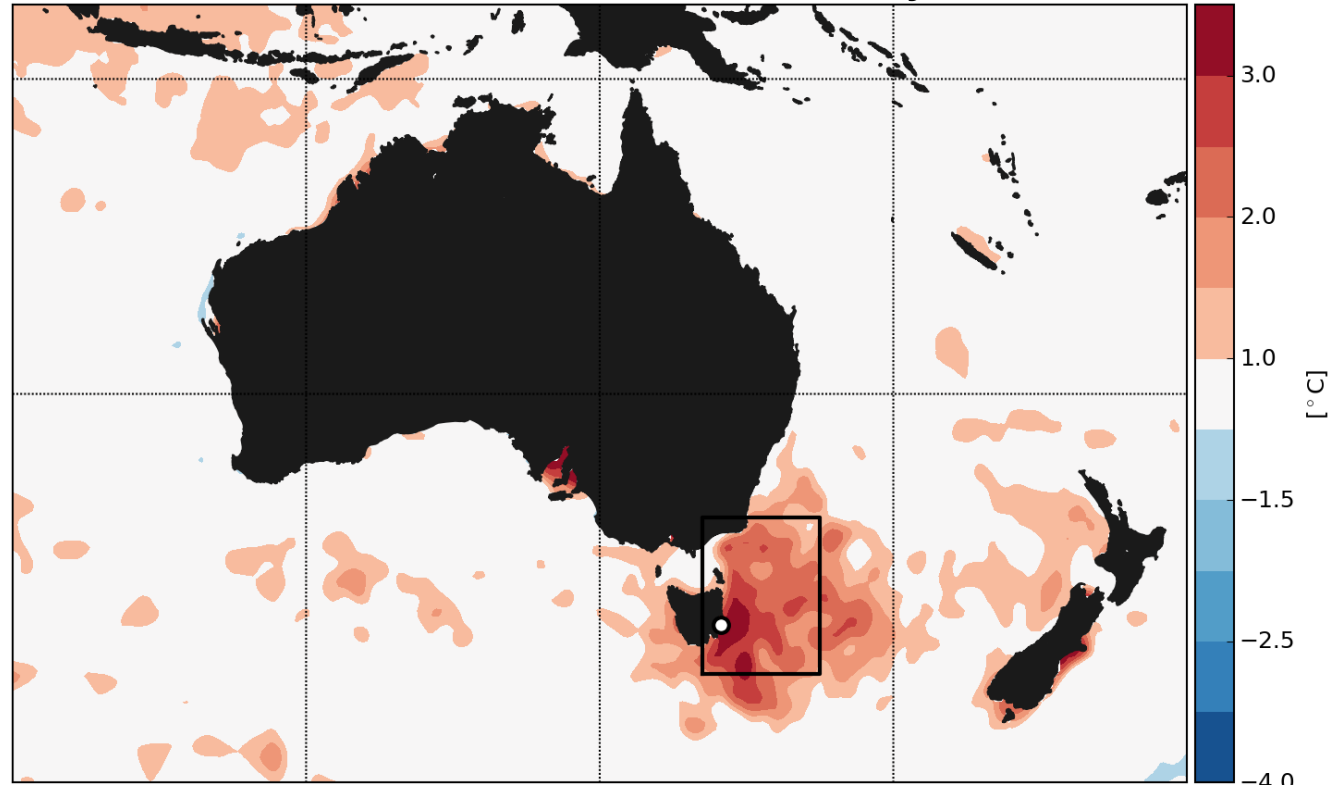
- There was a **marine heatwave** that occurred in **Austral Summer 2015/16** off southeastern Australia: *9 Sep 2015 – 16 May 2016*
- It is unprecedented in
  - **Duration (251 days)**
  - **Intensity (2.9°C max)**
- **Impacts:** POMS (Oysters), dead abalone, poor salmon farm performance, strange fish intrusions, kelp thinning...

Mean 2015-2016 DJF SST Anomaly



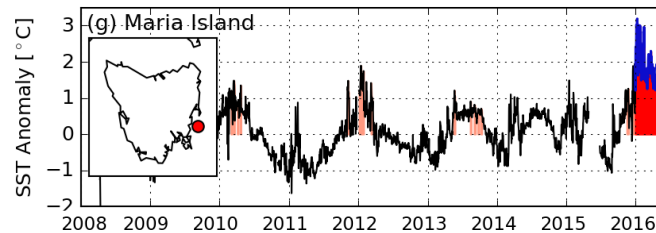
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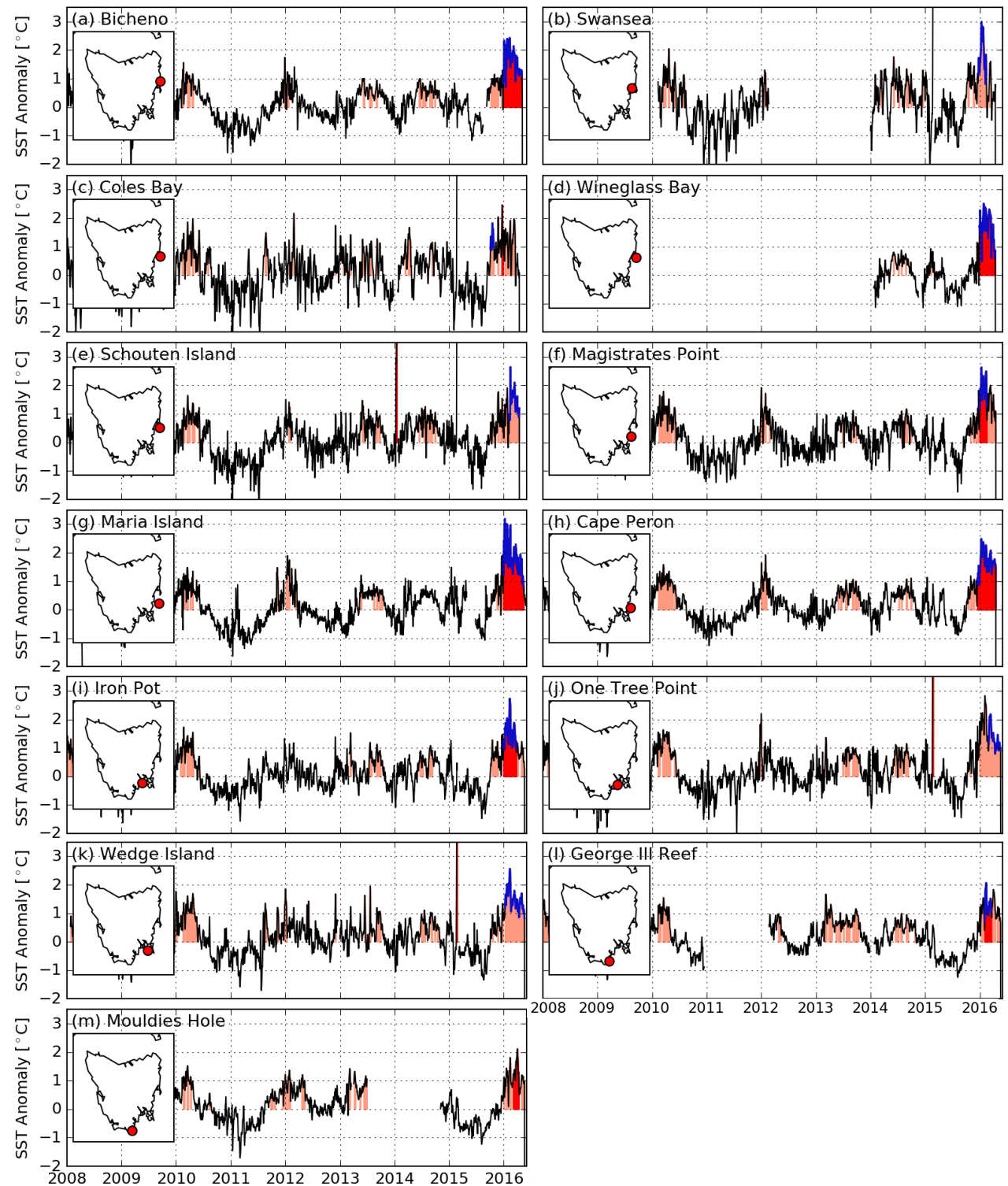
## Nearshore Records

- **IMOS Maria Island NRS**
  - 20 m temperature
  - Full-depth velocities
- **IMAS Nearshore Temperature Monitoring**
  - A number of sites in 6-20 m depth
- This event was **record strength (red)** and duration **(blue)** in the ~10-year coastal records
- Record **southward flows**, possible indication of **forcing mechanism**



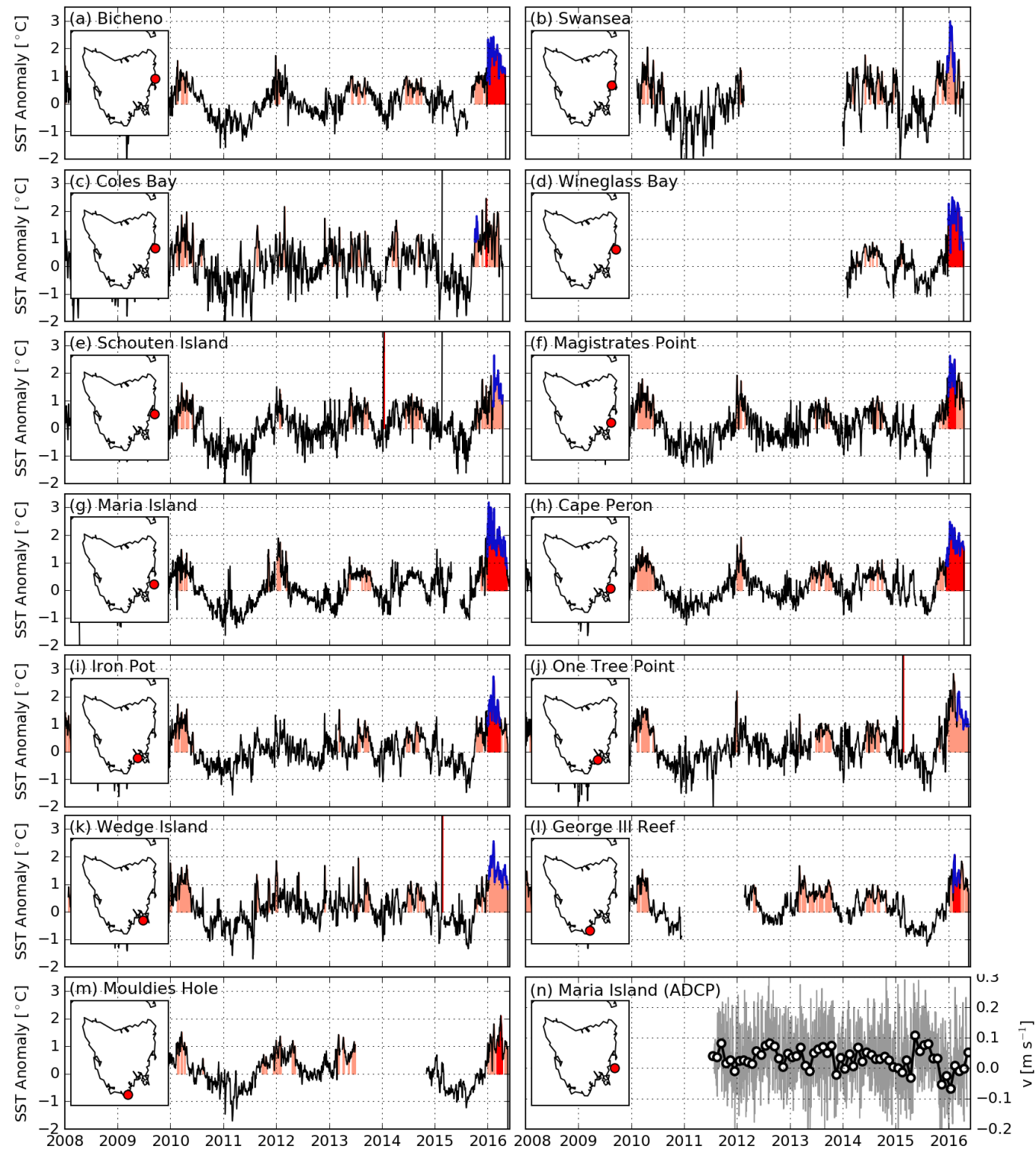
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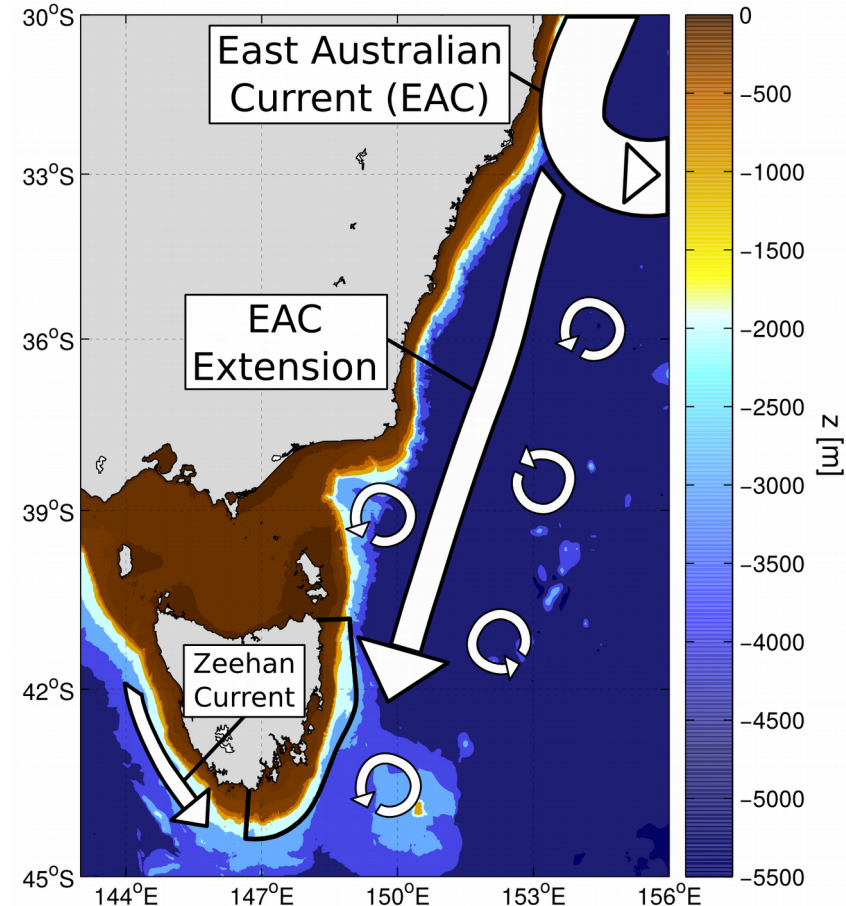
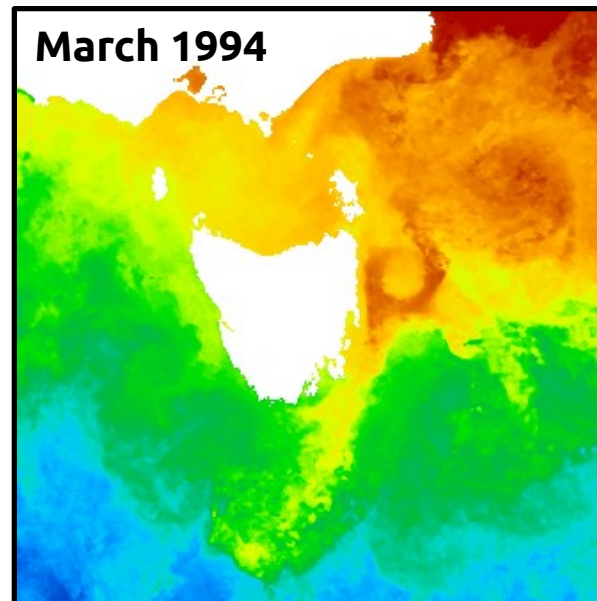
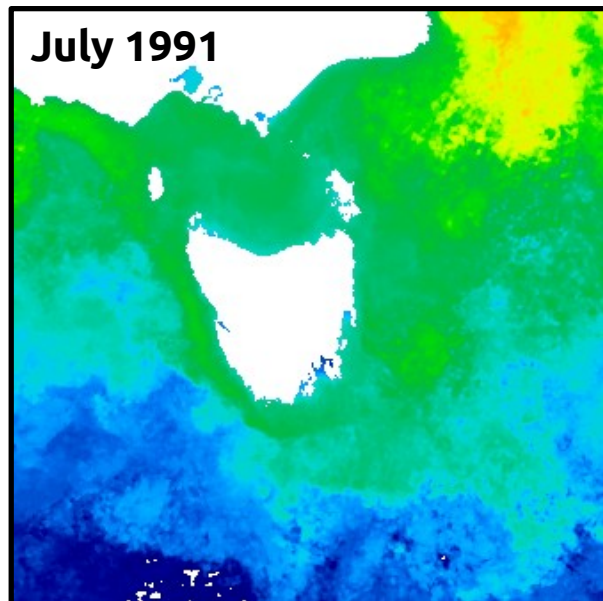


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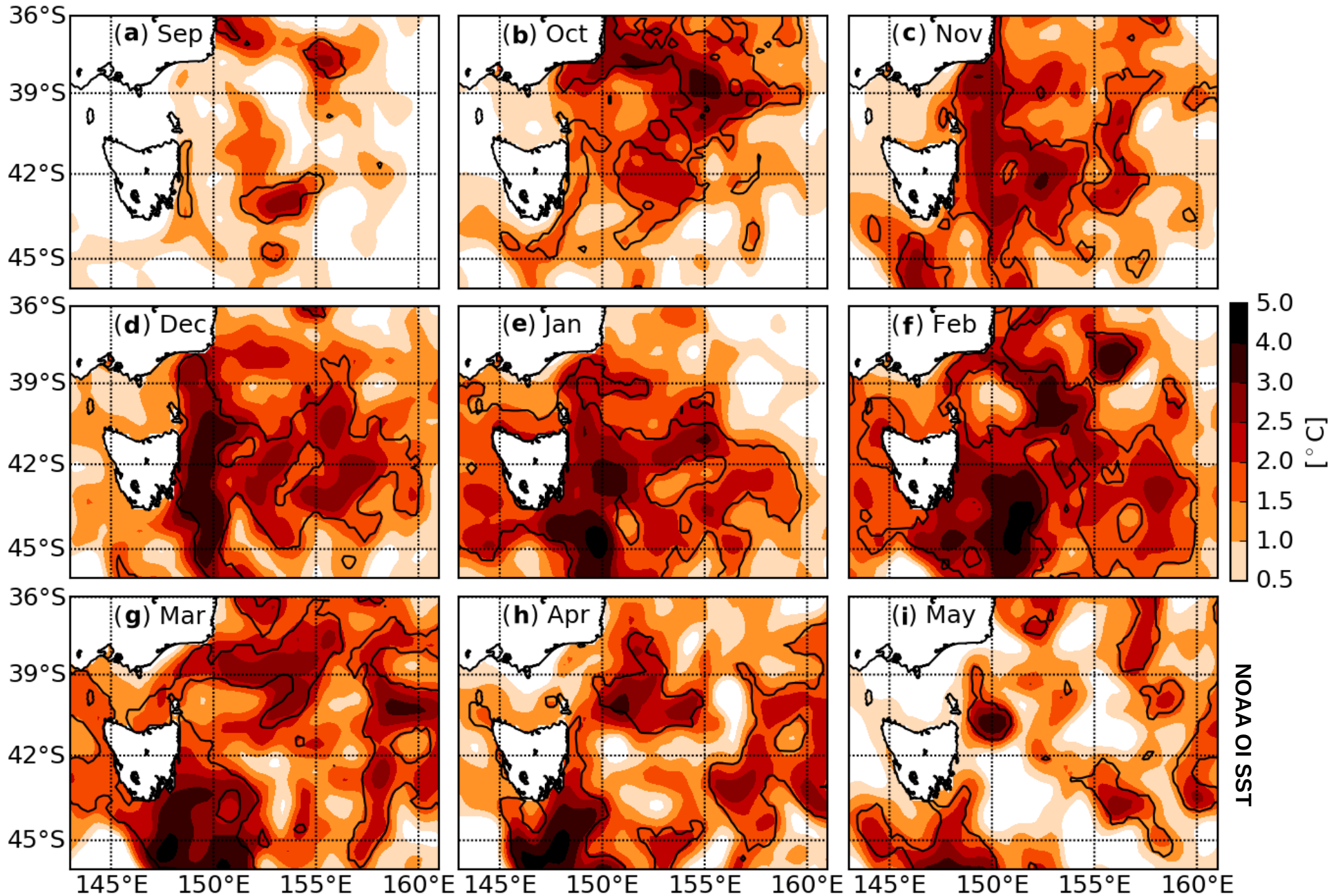


- **East Australian Current (EAC)**, a quasi-steady western boundary current, separates from the coast  $\sim 33^\circ\text{S}$ .
- The **EAC Extension** continues southward transport as far as Tasmania, but as an unsteady, eddy-rich “current”
- The **Zeehan Current (ZC)**, part of a current system extending all the way to WA, runs southward and eastward along the west and south coasts of Tasmania [Cresswell 2000]

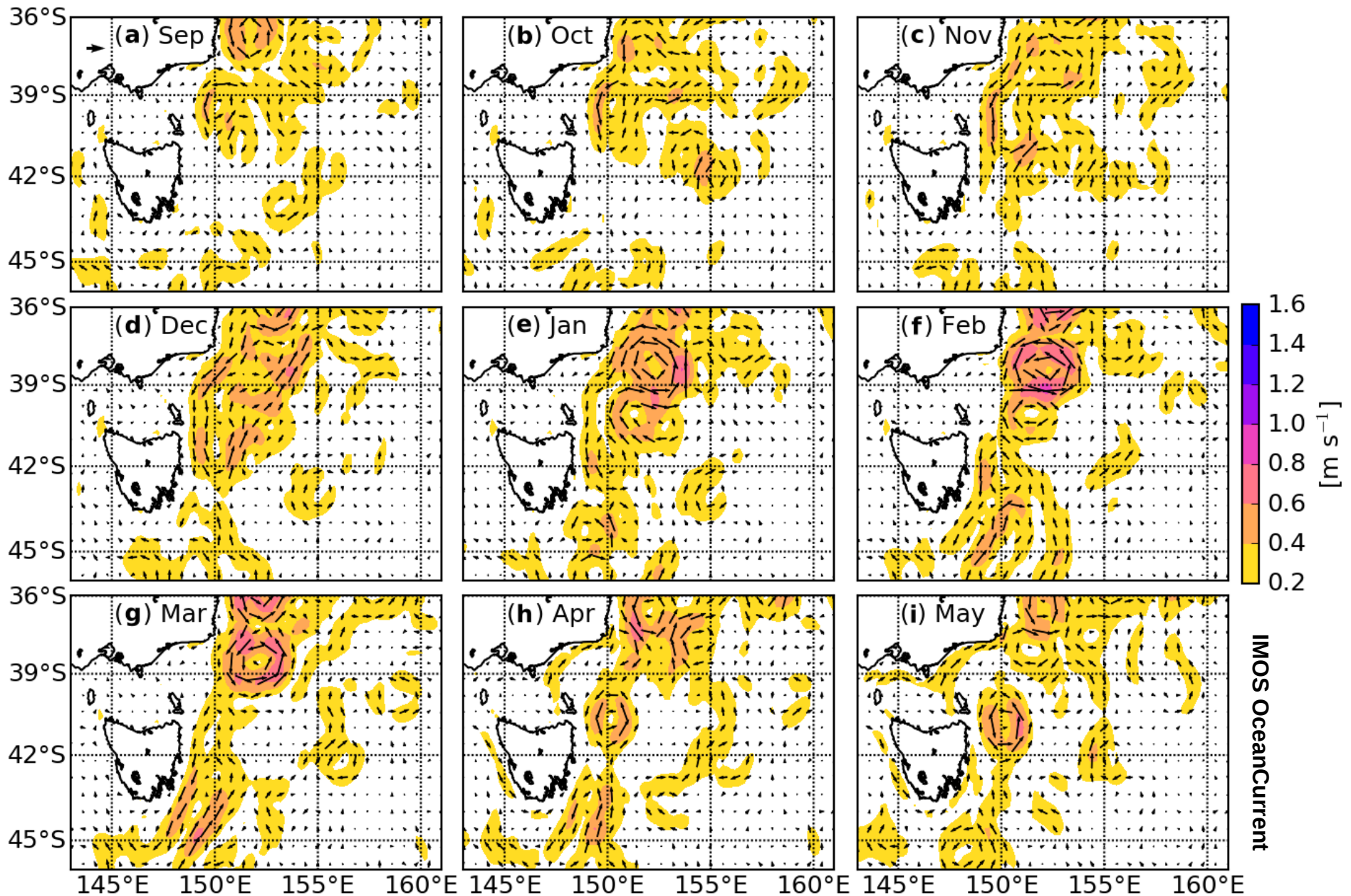


- Along the southeast coast of Tasmania, the **EAC Extension is dominant in summer** and the **Zeehan Current is dominant in winter**

**Monthly SST anomalies:** contour encloses areas that were detected as MHWs for >90% of that month

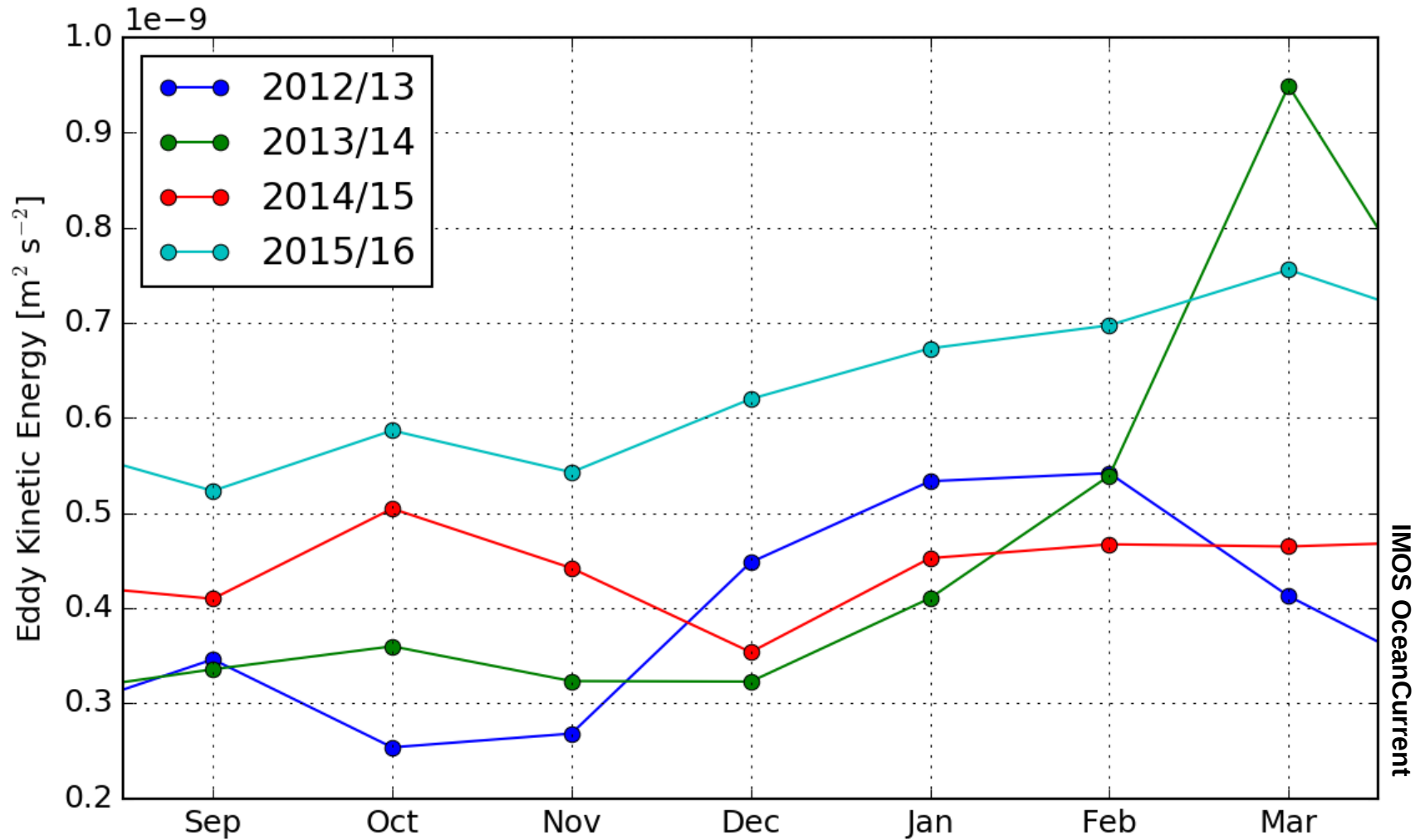


Monthly surface currents ( $u, v$ ) (IMOS OceanCurrent)





Monthly surface Eddy Kinetic Energy (EKE) (IMOS OceanCurrent)



- **Upper ocean temperature budget**, following:
  - Benthuisen et al. (*CSR*, 2014) for 2011 West. Aus. MHW
  - Chen et al. (*JGR*, 2015, 2016) for the 2012 NW Atlantic MHW
- **Volume averaged temperature** tendency equation:

$$\frac{dT}{dt} = -u_H \cdot \nabla_H T + \frac{1}{A} \int_A \frac{Q}{H} dA + \text{Residual}$$

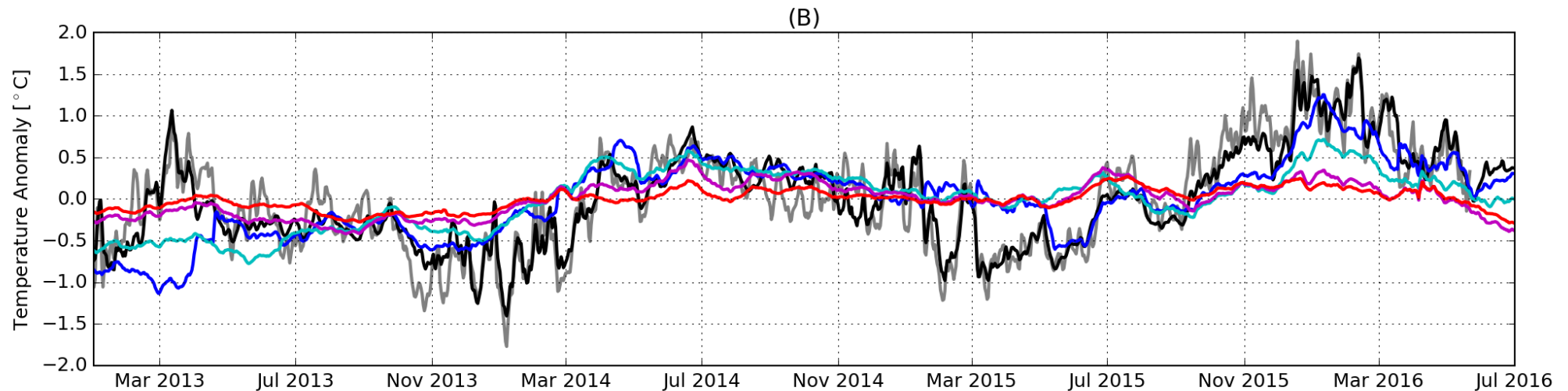
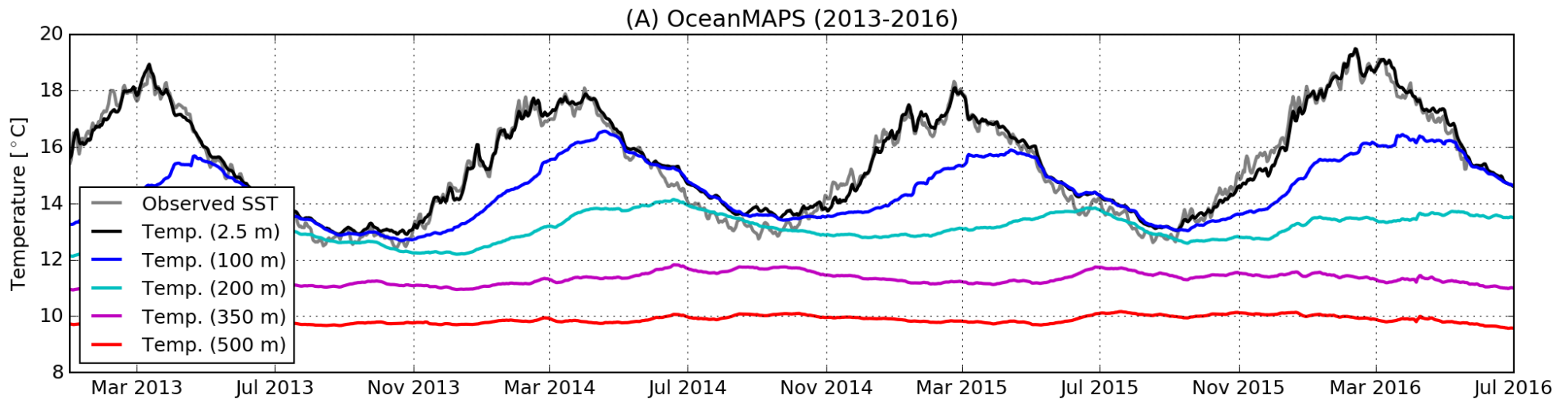
*Horizontal  
temperature  
advection*

*Air-sea  
heat flux*

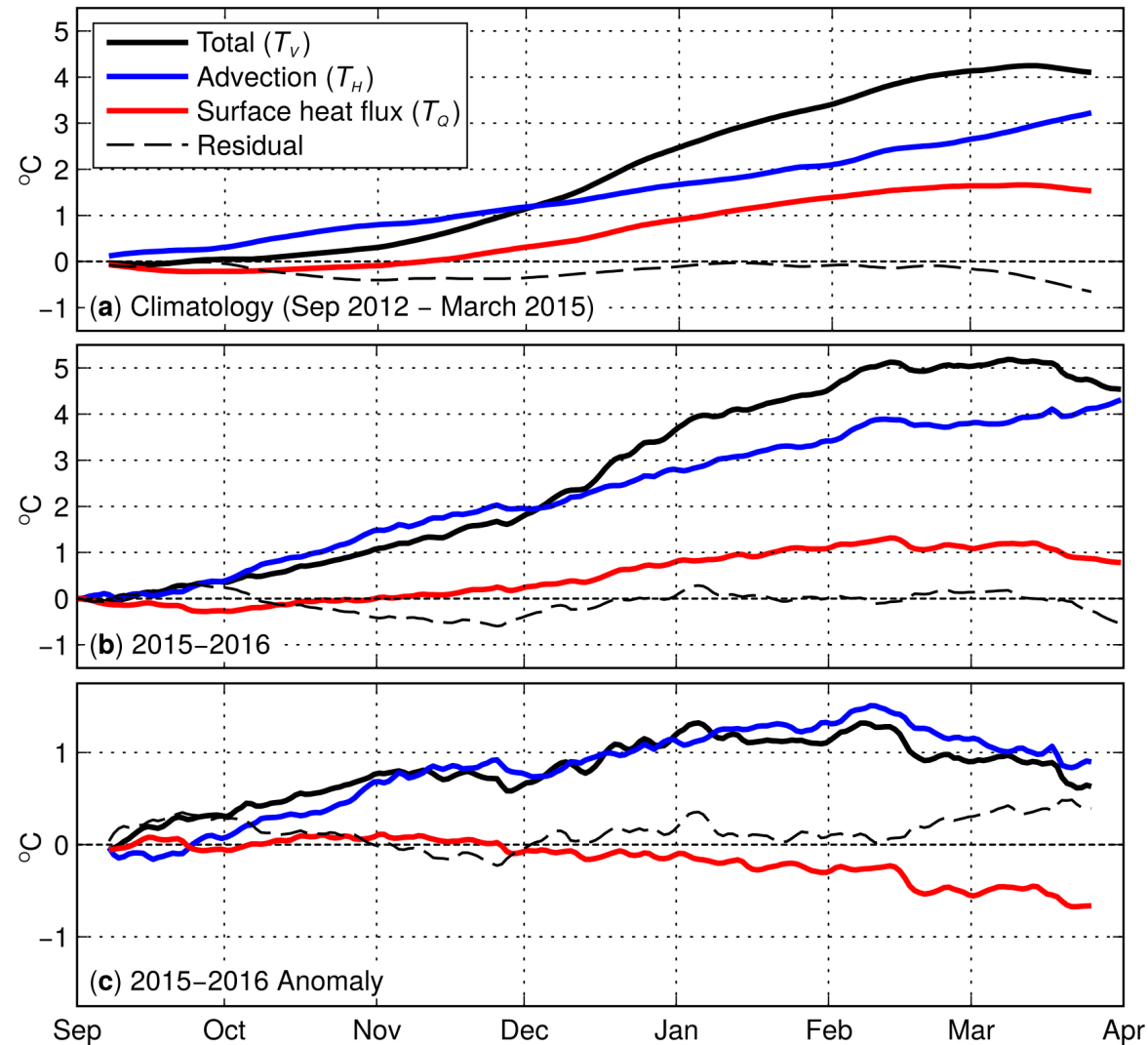
*Includes:  
Horizontal and vertical  
diffusion, vertical advection*

- *Depth:  $H = 100$  m*
- *Area:  $A =$  "SEAus box"*
- *Temperature ( $T$ ) and velocities ( $u_H$ ) from OceanMAPS*
- *Surface heat flux ( $Q$ ) from NCEP CFSv2 reanalysis*

- **How well does OceanMAPS get the temperature?**
- Good agreement at surface → we can trust OceanMAPS
- Warming evident down to 100-200 m →  $H = 100$  m



- **Temperature budget**
- Volume averaged temperature ( $T_V$ ) since Sep 1<sup>st</sup> of:
  - 2012/13, 2013/14, 2014/15, 2015/16
- Consider:
  - Temperature advection ( $T_H$ )
  - Air-sea heat flux ( $T_Q$ )
- **Climatology:** by mid-February  $T_H$  contributes ~60% of the warming while  $T_Q$  contributes ~40%
- **2015-2016:** by mid-February  $T_H$  contributes ~80% of the warming while  $T_Q$  contributes ~20%
- Marine heatwave primarily driven by **anomalous temperature advection**



- **Event Attribution study** following
  - Lewis & Karoly (*GRL*, 2013) on Australia's “angry summer” of 2013
  - King et al. (*ERL*, 2015) on Central England temps. of 2014
- **Calculation:** *Fraction of Attributable Risk (FAR)*:

$$FAR = 1 - \frac{P_{\text{histNat}}}{P_{\text{hist}}}$$

where  $P_x$  is the probability of an the event larger/longer than the event in question based on the modelled climate  $X$ .

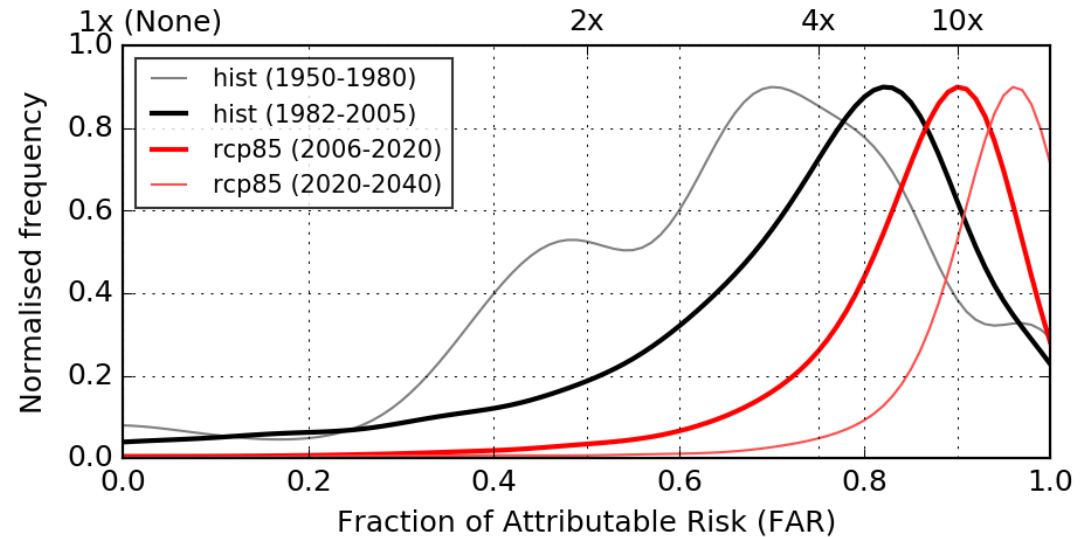
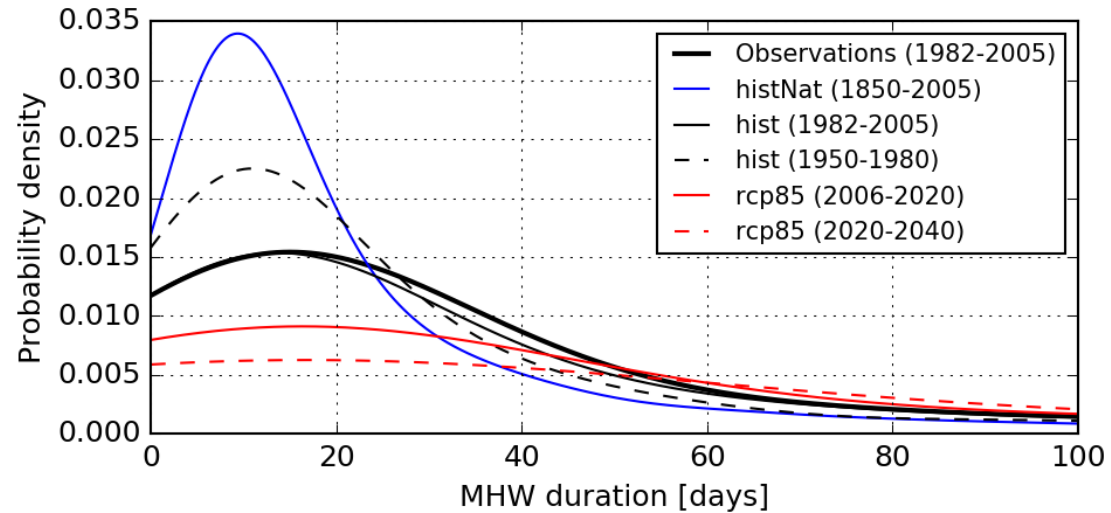
- **Informs:** change in likelihood of occurrence of an event like the one in question due to anthropogenic influence (*hist*) as opposed to a naturally-forced world (*histNat*)
- **Data:** Look at *SEAus* MHWs in CMIP5 *historical*, *historicalNat* and *RCP8.5* runs

- Need *daily* SSTs, limits the number of available models:

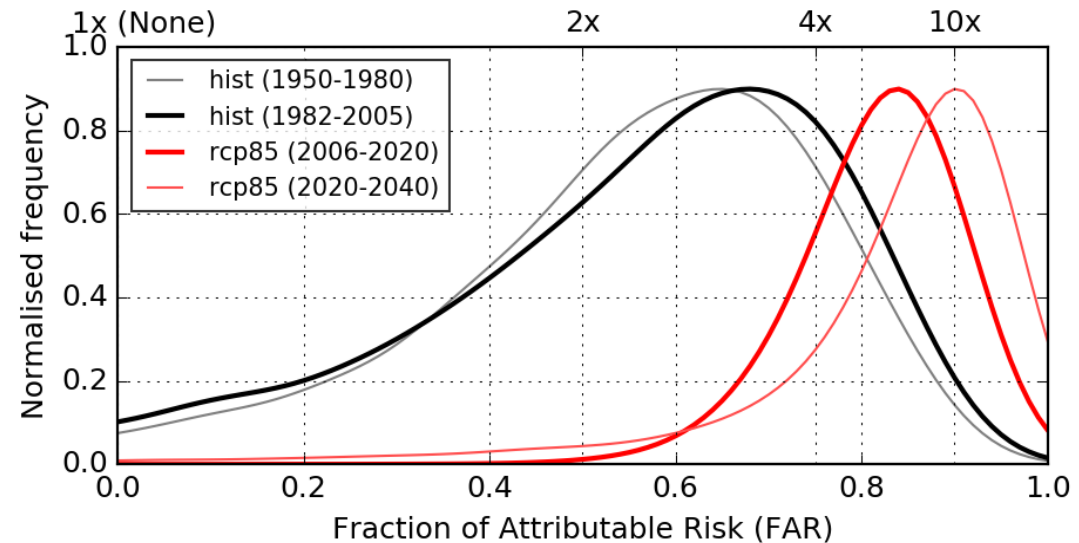
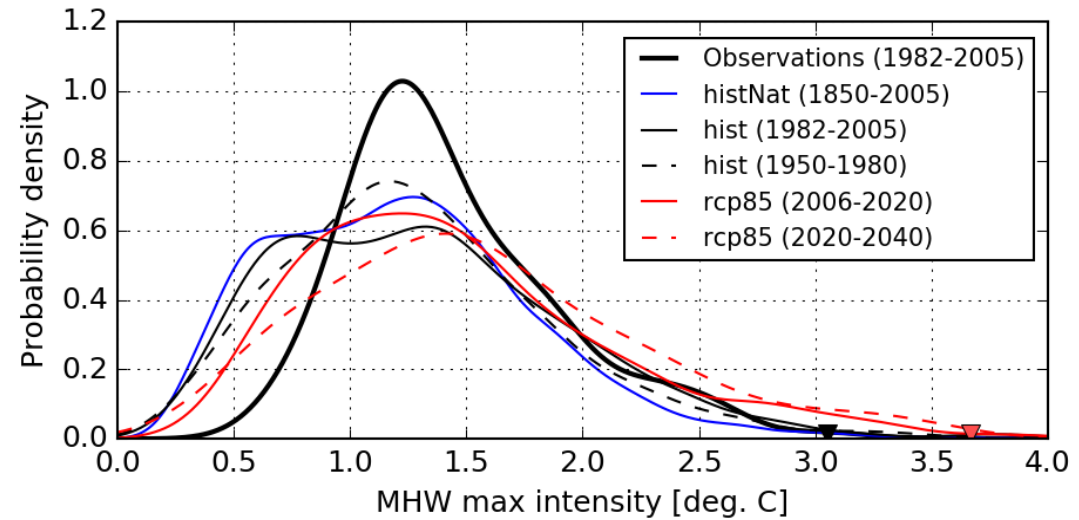
Model	Historical	HistoricalNat	RCP8.5	Bias correction
ACCESS1.3	3	3	1	1.32
CanESM2	1	3	5	1.10
CSIRO Mk3.6.0	10	10	10	1.42
CNRM-CM5	1	5	5	0.80
HadGEM2-ES	4	4	4	0.96
IPSL-CM5A-LR	6	3	4	0.98
IPSL-CM5A-MR	3	3	1	0.91
<b>Total</b>	<b>28</b>	<b>31</b>	<b>30</b>	

- Did a **bias correction** rather than a model selection (so few models):
- **Decompose SST** time series as follows:  $T_t = a + bt + T_t^S + T'_t$
- **Isolate linear trend** ( $a + bt$ ) and *seasonal cycle* ( $T_t^S$ ) by regression, compare variance of non-seasonal variability ( $T'_t$ ) between observations and model historical runs as a *ratio*
- **Bias correct:** *Scale variance of each model run* based on the calculated bias ratio, then add it back to the linear and seasonal component

- **Attribution statement** made separately around 2<sup>nd</sup>-largest (intensity) and 2<sup>nd</sup>-longest (duration) event (1911-1940 base period):
  - 3.1 °C
  - 377 days
- **Duration:** An event of this duration was
  - **4x as likely** in 1982-2005 (hist simulations) compared to the “natural world” (historicalNat 1850-2005 simulations) [95% CI: 0.5-53x]
  - **9x as likely** by 2006-2020 (RCP8.5 simulations) [95% CI: 2-22x]



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- **Intensity:** An event of this intensity was
  - **2x as likely** in 1982-2005 (hist simulations) compared to the “natural world” (historicalNat 1850-2005 simulations) [95% CI: 1-6x]
  - **6x as likely** by 2006-2020 [95% CI: 3-13x]
- → Virtually certain (>99%) that **anthropogenic climate change increased the likelihood** of an event of this duration or intensity by 2005-2020





- **Pacific Oyster Mortality Syndrome (POMS)**

- Absent in March 2015 but present from mid-Dec 2015,
- Linked with anomalously warm waters (NSW, France)



- **Blacklip abalone**

- 5% mortality rate, normally ~zero
- Mortality recorded throughout heatwave across most of east coast

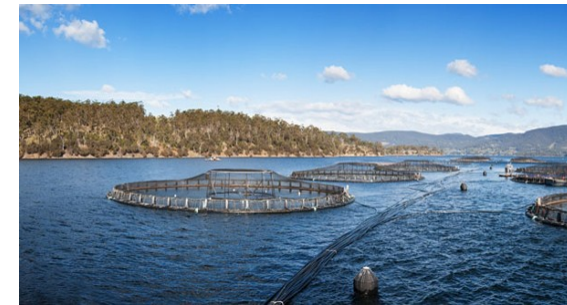


- **Atlantic Salmon**

- Reduced aquaculture performance

- **Out of-range fish**

- More than normal sightings of:
  - Yellowtail kingfish, Snapper, Dusky morwong, Mahi mahi, Blue moki, Moonlighter fish



- Despite the **MHW intensity and duration**, recorded impacts have been **moderate**,

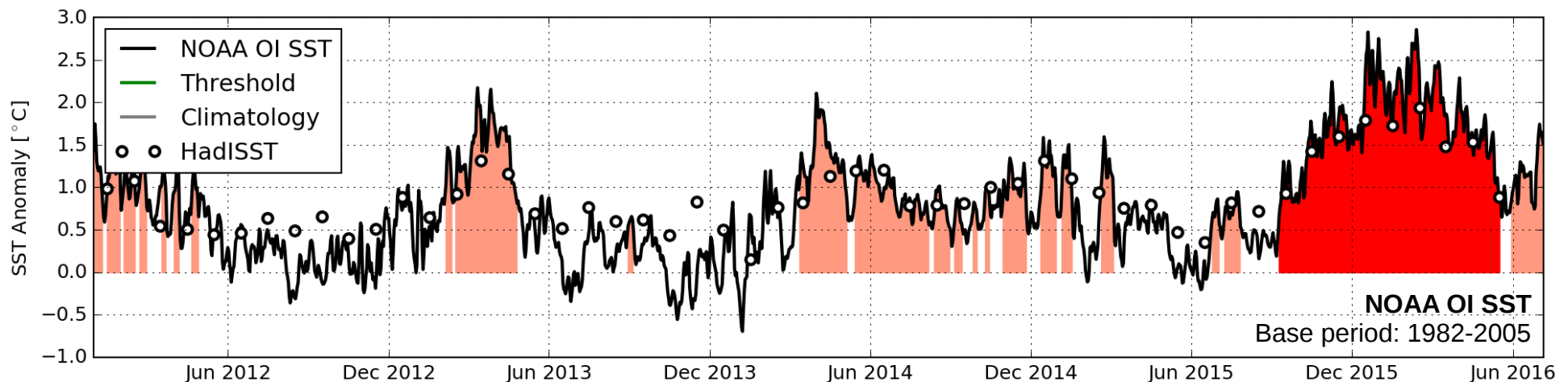
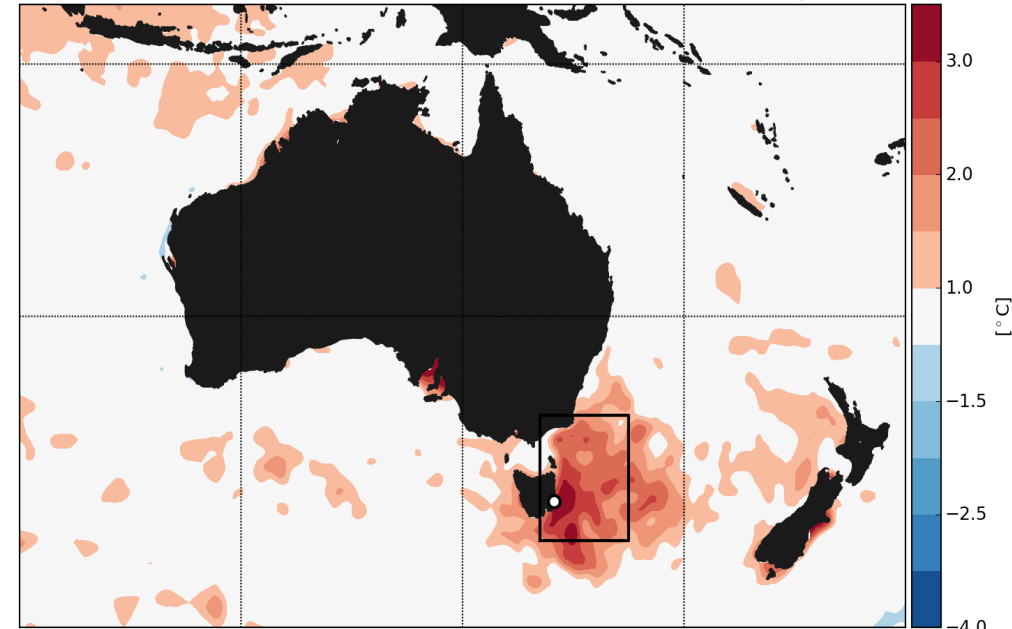
- esp. in comparison to the 2011 WA event



1. The **2015/16 Tasman Sea MHW** was the **longest** and **most intense** ever recorded in this region
2. **Driven** by anomalous temperature advection (an **EAC Extension event**)
3. **Anthropogenic climate change** significantly **raised the likelihood** of such an event

Oliver, Benthuisen, Bindoff, Hobday, Holbrook, Mundy and Perkins-Kirkpatrick, *Nat Comms* (under review)

Mean 2015-2016 DJF SST Anomaly



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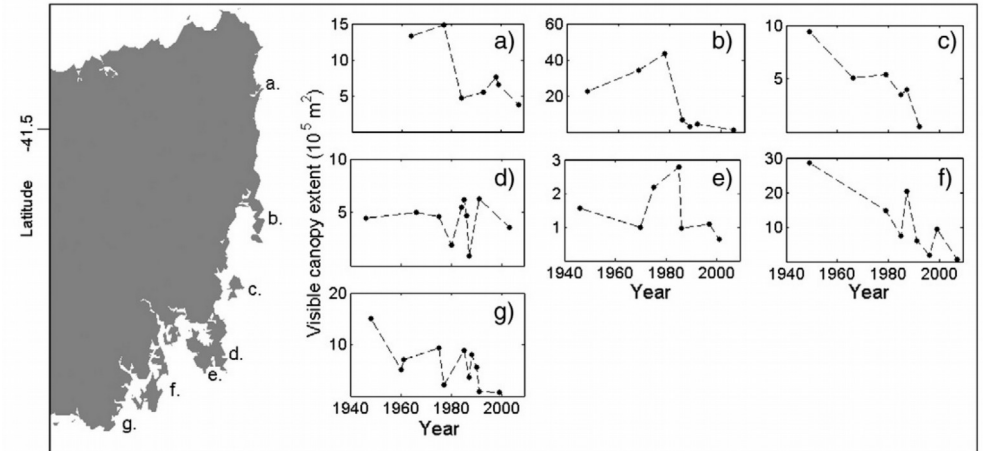
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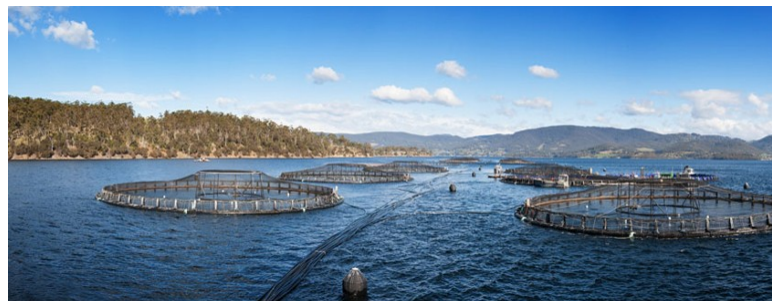


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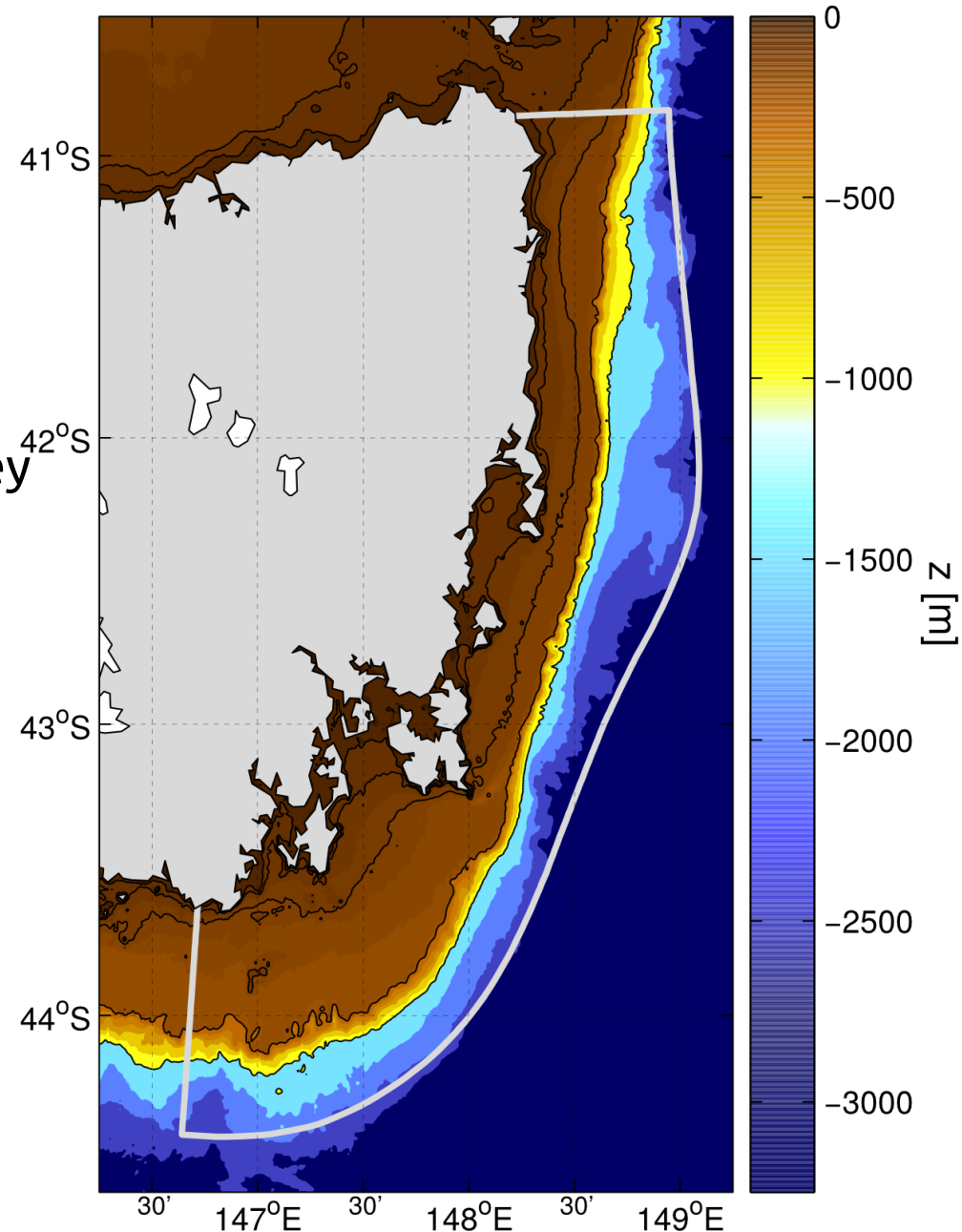
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- We modeled the eastern Tasmania continental shelf using the **Sparse Hydrodynamic Ocean Code (SHOC)** model [Herzfeld, 2006]
- Domain: South Cape to ~Eddystone Point and seaward out to shelf break
- Bathymetry: Australian Geological Survey Organisation (AGSO) 2002 + SETAS
- Resolution: ~1.9 km resolution
- 43 z-levels in the vertical
- Surface forcing: NCEP CFSR, CFSv2  
Boundary forcing: BRAN, OceanMAPS  
Time period: 1993-2015, daily output
- Publication: Oliver et al. (CSR, 2016)

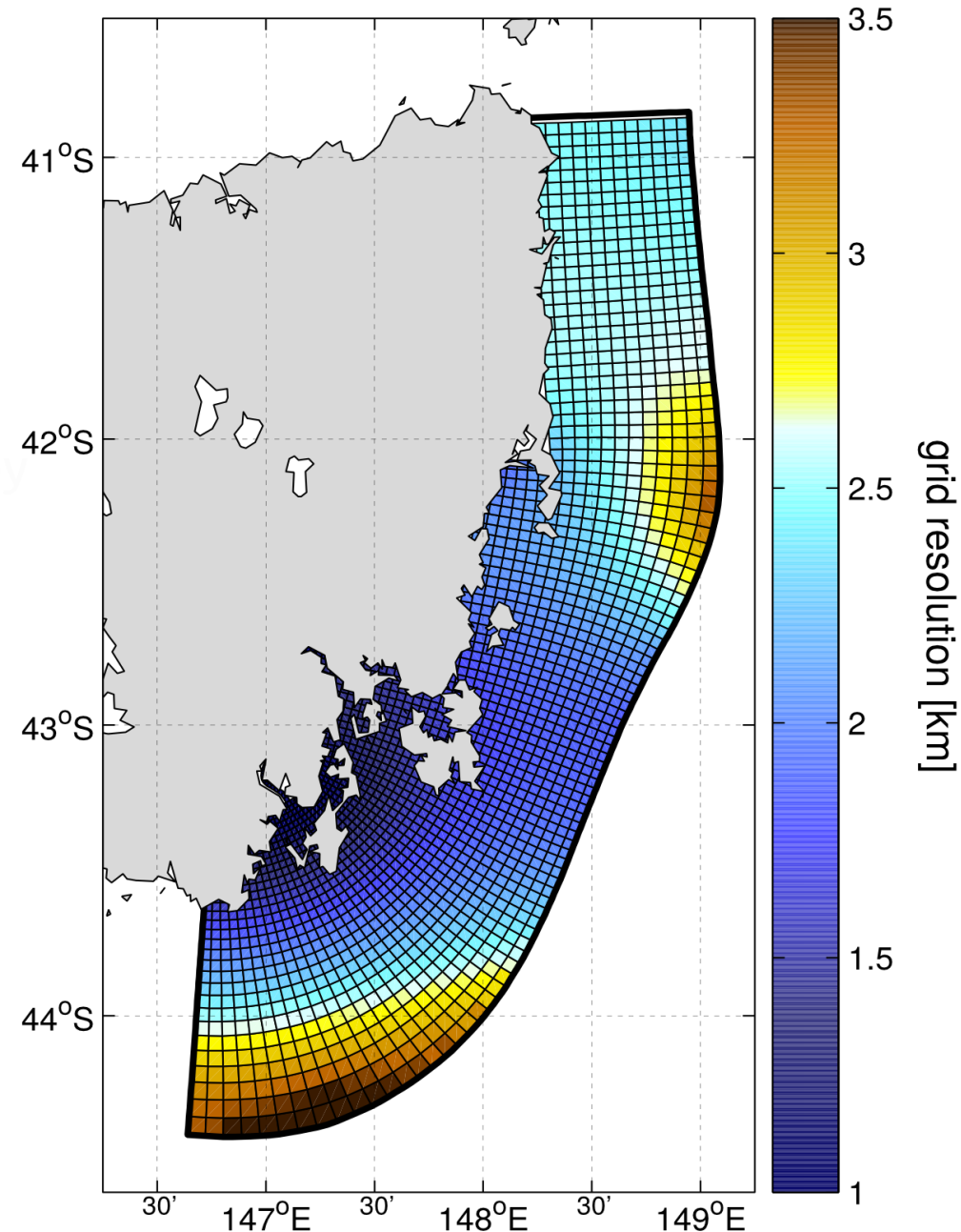


BRAN = Bluelink ReANalysis  
 OceanMAPS = Bluelink Ocean Modelling, Analysis, and Prediction System  
 CFSR = Climate Forecast System Reanalysis  
 CFSv2 = Climate Forecast System version 2 (operational forecast system)

Herzfeld, M. (2006), An alternative coordinate system for solving finite difference ocean models, *Ocean Modelling*, 14 (3-4), 174-196

Oliver, ECJ, M Herzfeld, NJ Holbrook (2016), Modelling the shelf circulation off eastern Tasmania, *Continental Shelf Research*, 130, 14-33, doi: 10.1016/j.csr.2016.10.005

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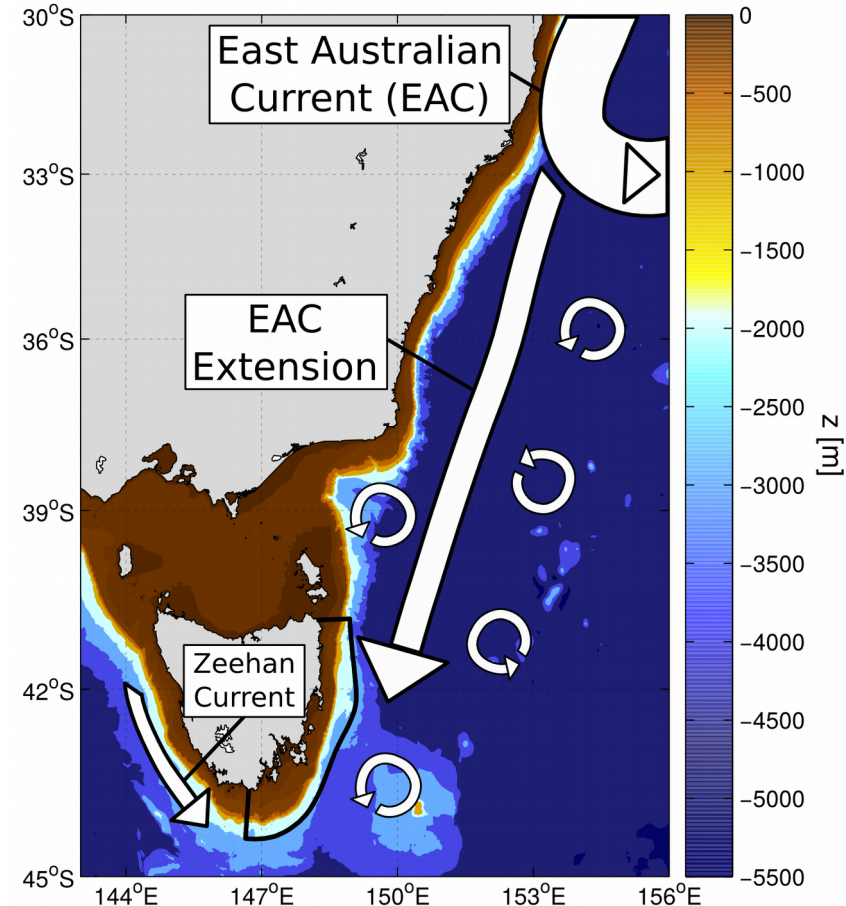
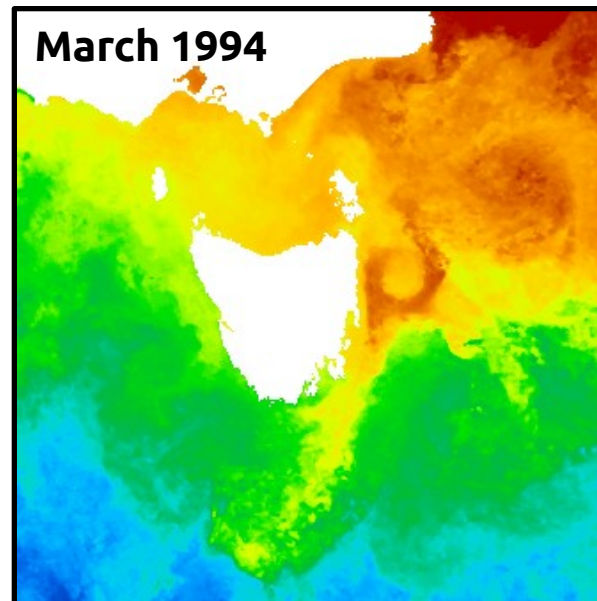
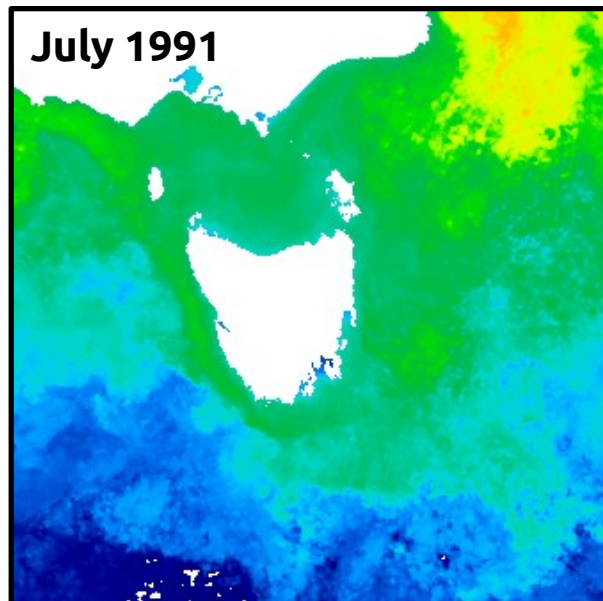


BRAN = Bluelink ReANalysis  
 OceanMAPS = Bluelink Ocean Modelling, Analysis, and Prediction System  
 CFSR = Climate Forecast System Reanalysis  
 CFSv2 = Climate Forecast System version 2 (operational forecast system)

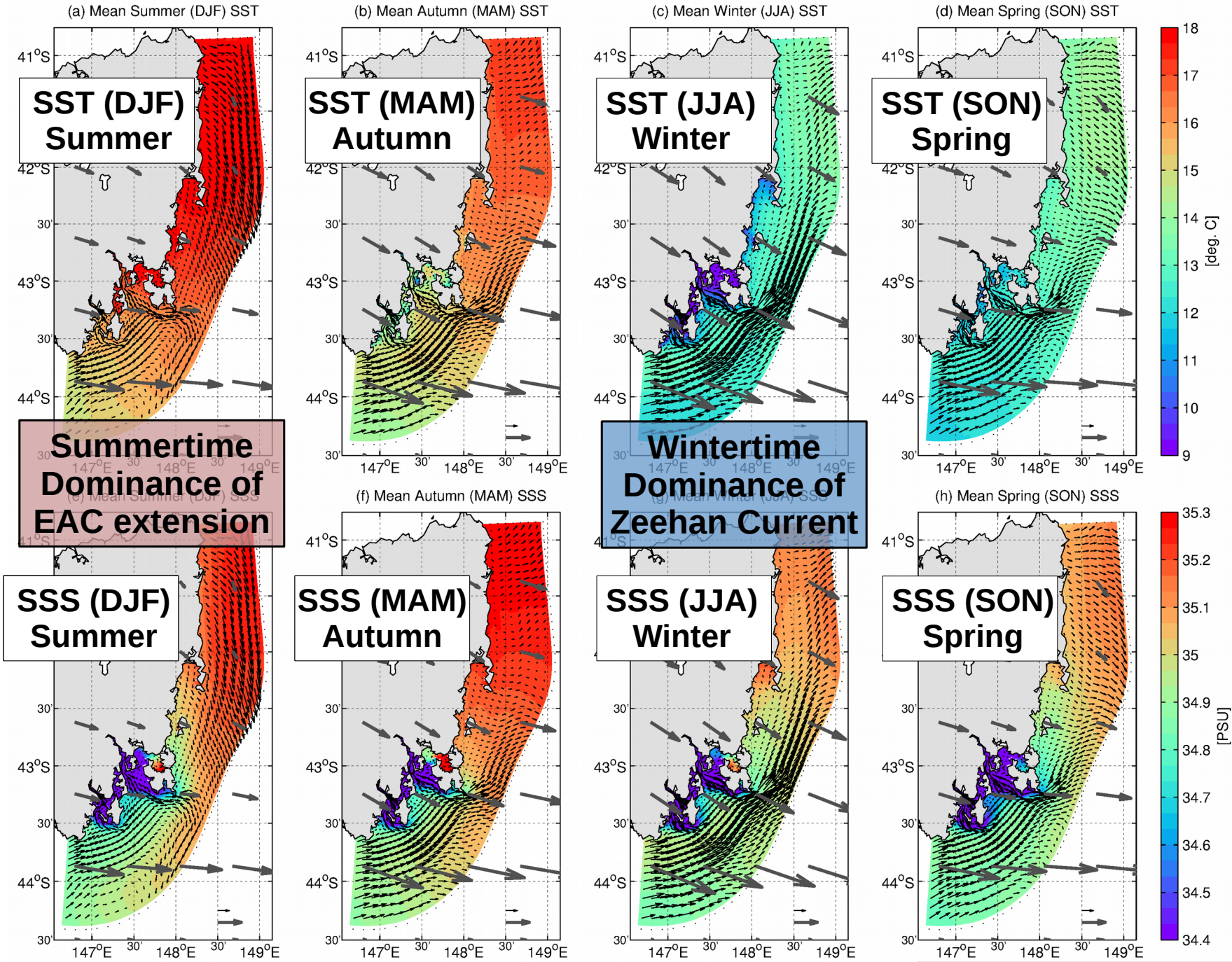
Herzfeld, M. (2006), An alternative coordinate system for solving finite difference ocean models, *Ocean Modelling*, 14 (3-4), 174-196

Oliver, ECJ, M Herzfeld, NJ Holbrook (2016), Modelling the shelf circulation off eastern Tasmania, *Continental Shelf Research*, 130, 14-33, doi: 10.1016/j.csr.2016.10.005

- **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 (ZC)**, part of a current system extending all the way to WA, runs southward and eastward along the west and south coasts of Tasmania [Cresswell 2000]

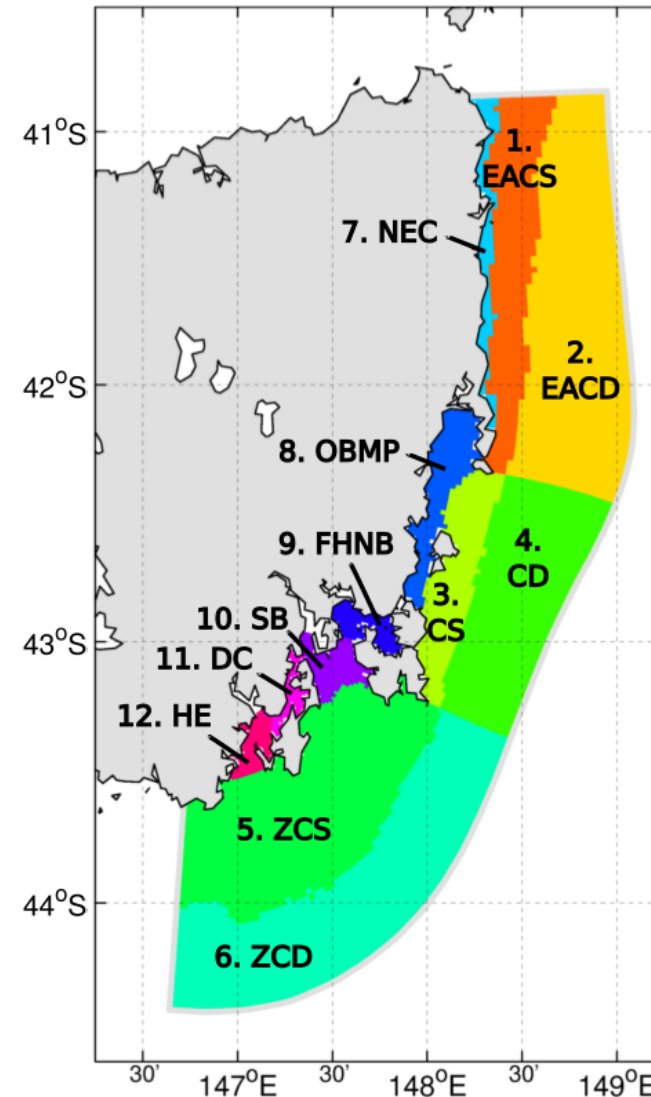


- Along the southeast coast of Tasmania, the **EAC Extension** is dominant in summer and the **Zeehan Current** is dominant in winter





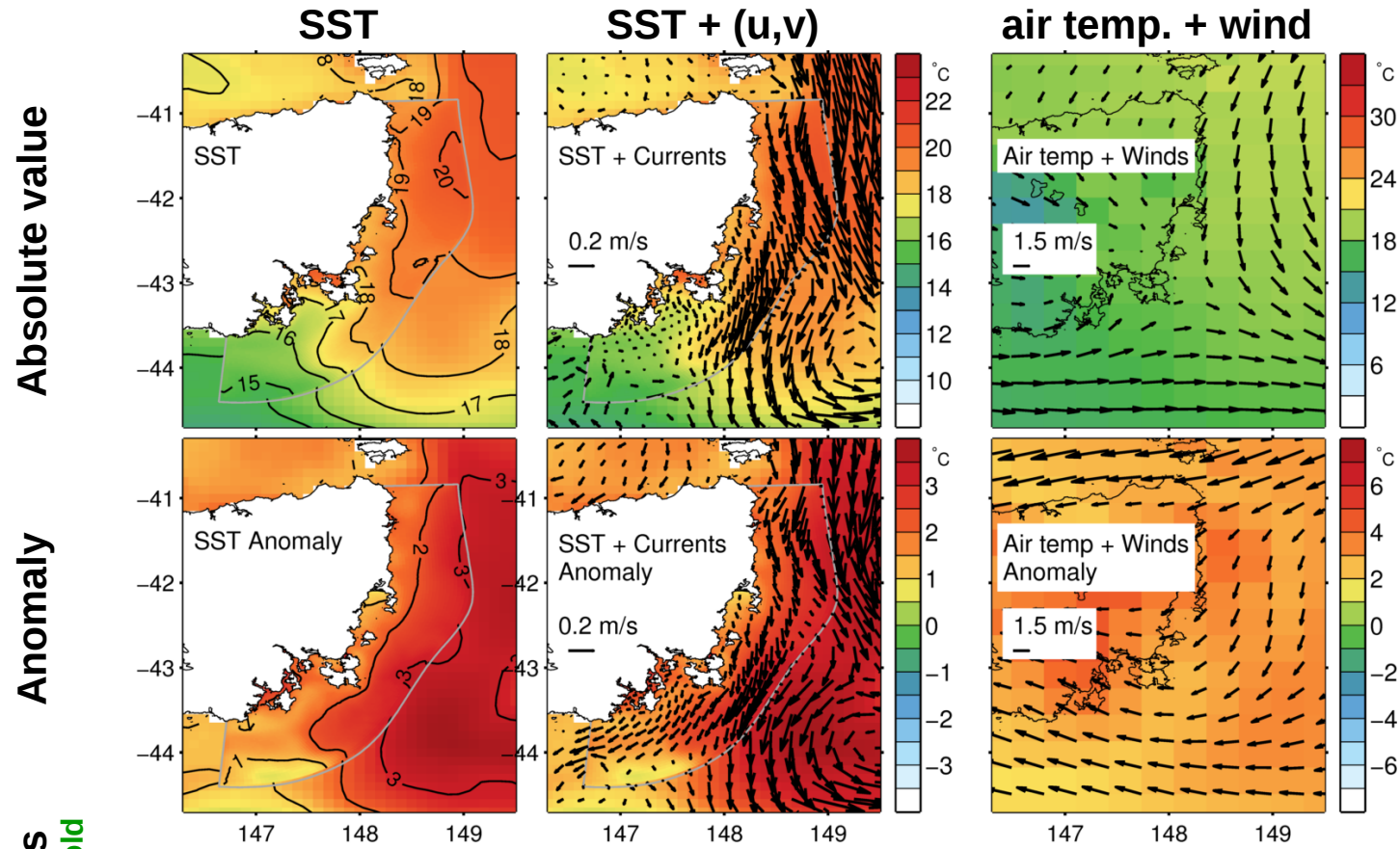
- Domain was divided up into **12 sub-regions**:
  - **3 deep (D) regions** ( $H > 200\text{m}$ )
  - **3 shelf (S) regions** ( $50\text{m} < H < 200\text{m}$ )
    - **Split** in the along-shelf direction based on dominating influence of the **EAC** or the **ZC**, or in their **confluence**
  - **6 nearshore regions**, defined by bays and estuaries
- → 12 spatially averaged **daily SST time series** covering 1993-2015
- MHW def'n applied to each



## LEGEND

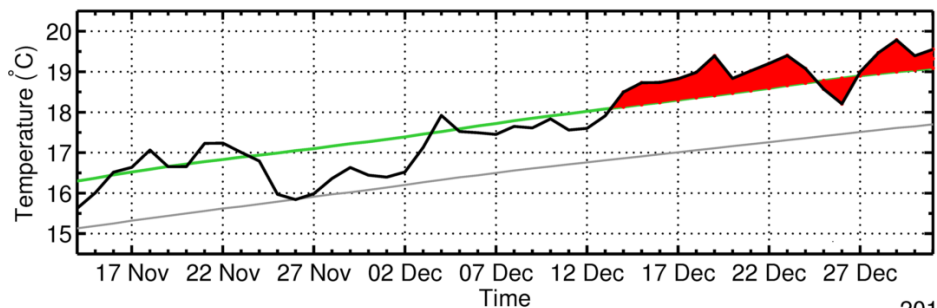
EAC+ = East Australian Current, ZC+ = Zeehan Current, C+ = Confluence  
 +D = Deep ( $H > 200\text{m}$ ), +S = Shelf ( $50\text{m} < H < 200\text{m}$ )  
 NEC = Northeast coast, OBMP = Oyster Bay & Mercury Passage  
 FHNB = Frederick Henry and Norfolk Bays, SB = Storm Bay  
 DC = D'Entrecasteaux Channel, HE = Huon Estuary

- **Event 35 (of 35) in Region 1 (EACS = EAC Shelf)**
- Also calculate regional SST, currents, air temp., wind averaged over event duration



Average Region 1 SST during event #35 (14 Dec 2015 – 31 Dec 2015)

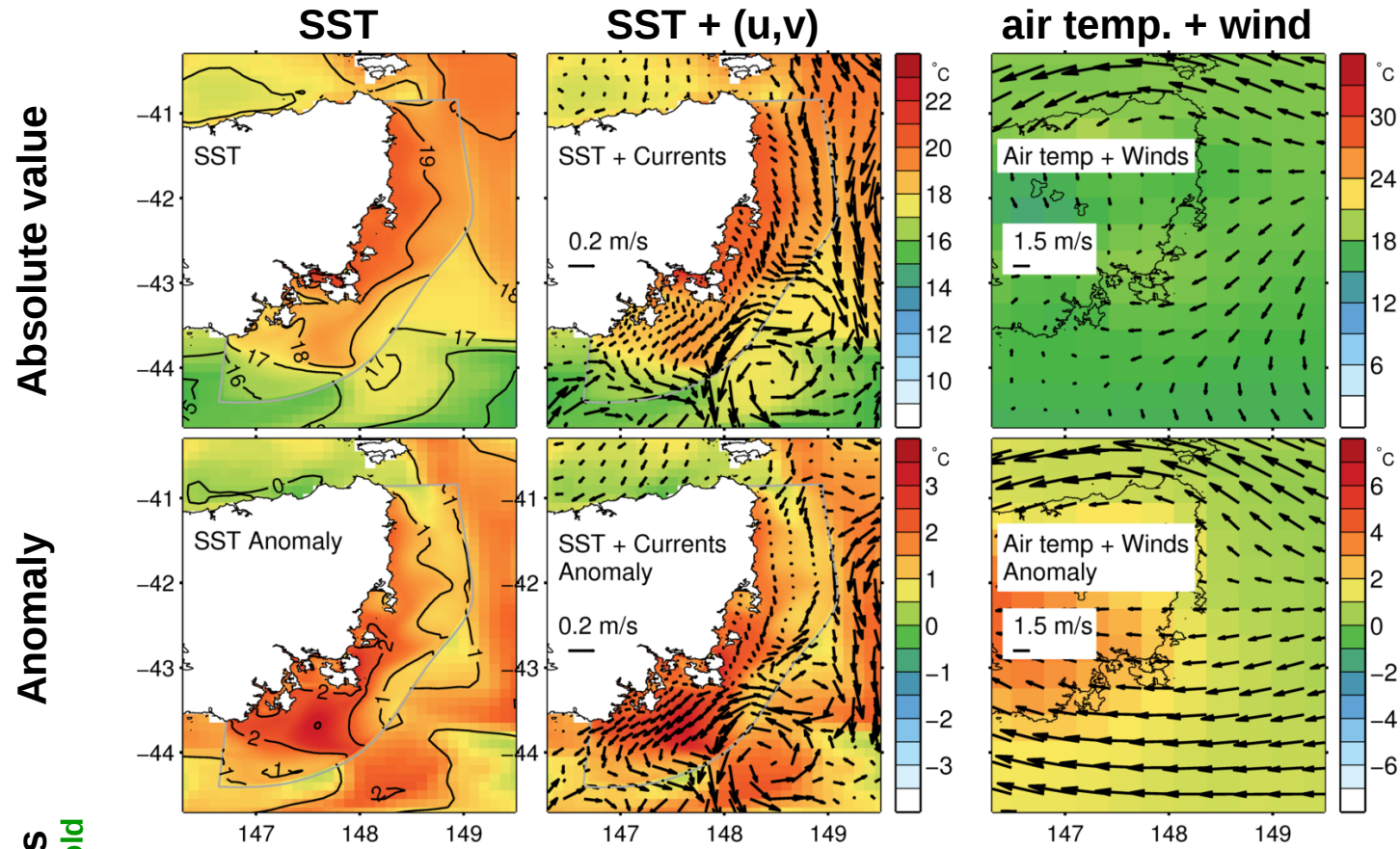
**SST time series**  
climatology, threshold



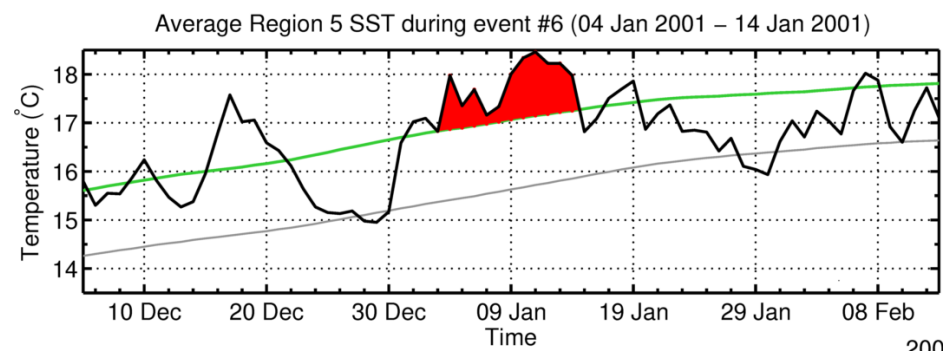
Total number of events: 35	Rank
Duration: 18 days	7/14
Max. intens.: 2.3 °C	3/35
Mean intens.: 1.8 °C	4/34
Cum. intens.: 32 °C-days	5/35
Onset rate: 0.2 °C/day	15/35
Decl. rate: 0.04 °C/day	30/35
Depth: 270 m	1/16

**Event properties and rank**

- **Event 6 (of 37) in Region 5 (ZCS, roughly the “Bruny Island bioregion”)**
- Also calculate regional SST, currents, air temp., wind averaged over event duration



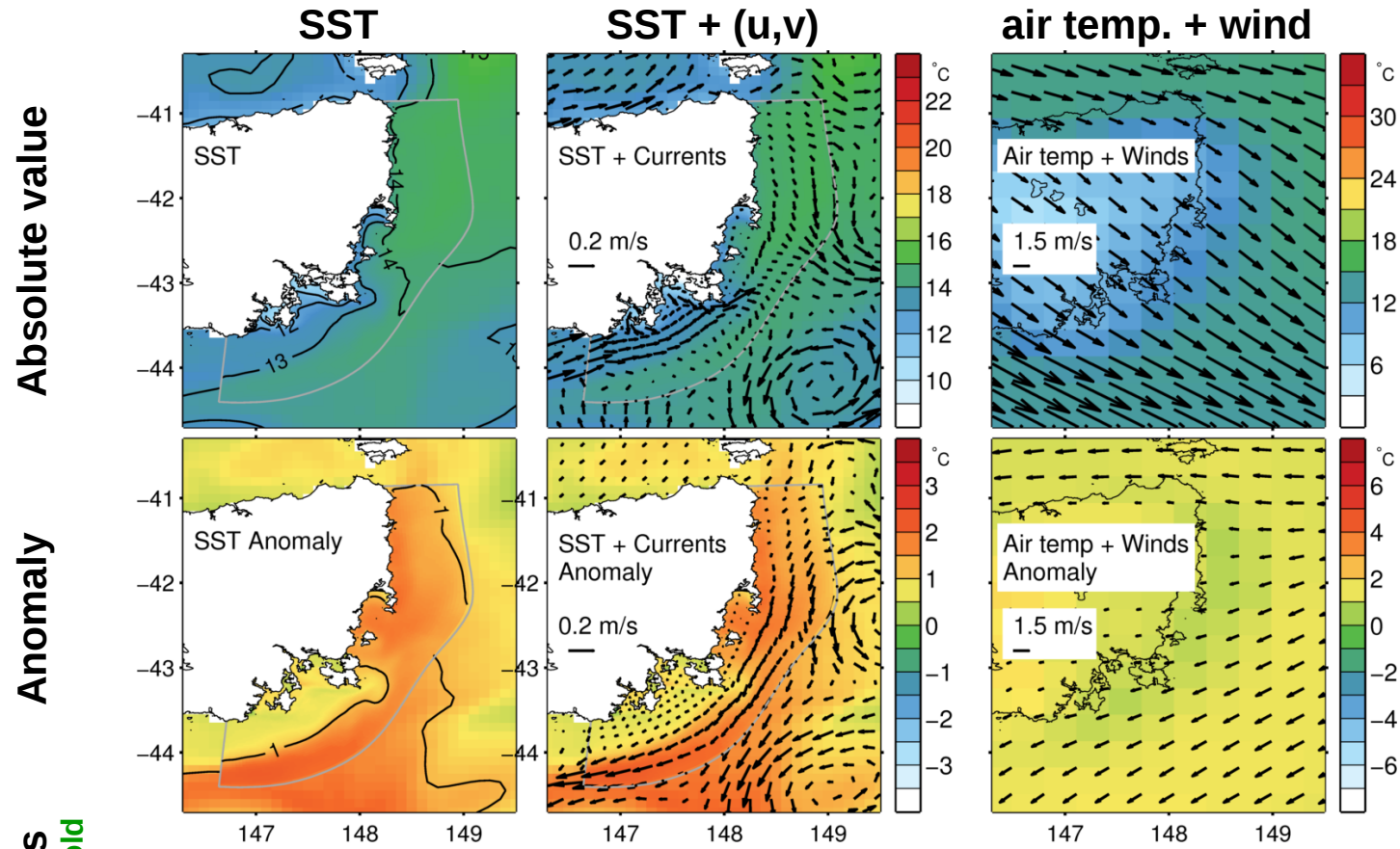
**SST time series**  
climatology, threshold



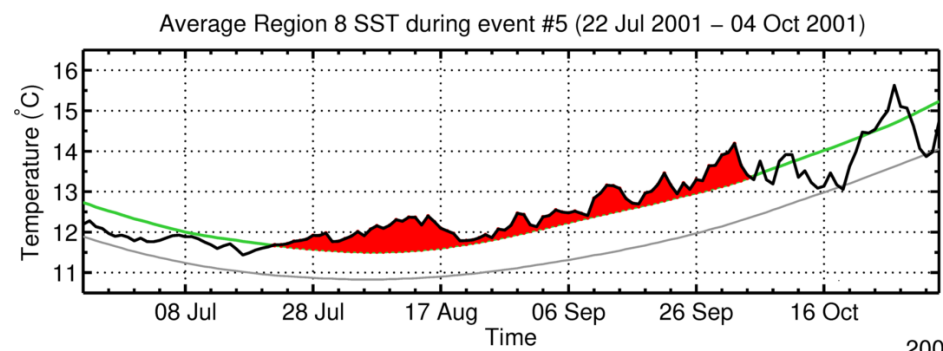
Total number of events: 37	Rank
Duration: 11 days	11/17
Max. intens.: 2.7 °C	2/37
Mean intens.: 2.3 °C	1/37
Cum. intens.: 25 °C-days	9/37
Onset rate: 0.1 °C/day	30/37
Decl. rate: 0.4 °C/day	14/37
Depth: 12 m	12/15

**Event properties and rank**

- **Event 5 (of 36) in Region 8 (Oyster Bay – Mercury Passage)**
- Also calculate regional SST, currents, air temp., wind averaged over event duration



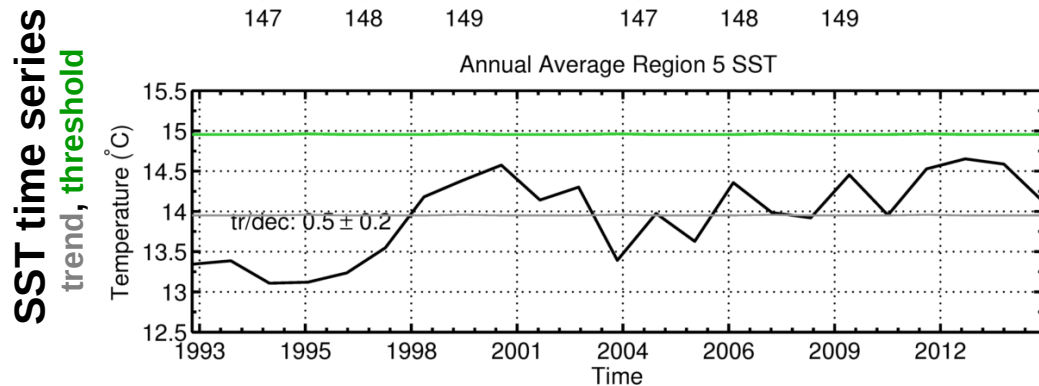
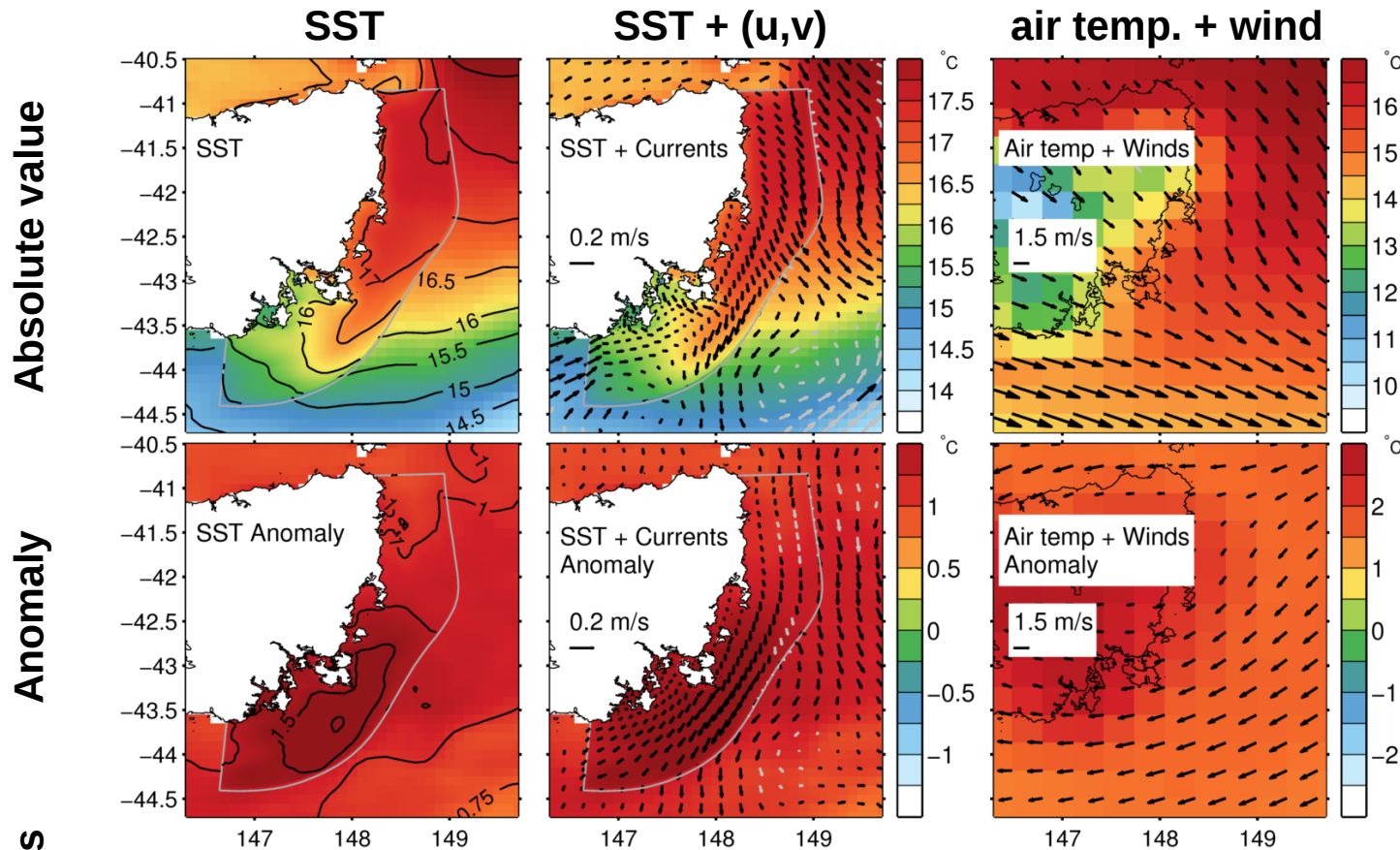
**SST time series**  
climatology, threshold



Total number of events: 36	Rank
Duration: 75 days	1/17
Max. intens.: 2.0 °C	20/36
Mean intens.: 1.2 °C	23/36
Cum. intens.: 91 °C-days	1/36
Onset rate: 0.02 °C/day	34/36
Decl. rate: 0.4 °C/day	12/36
Depth: 80 m	1/7

**Event properties and rank**

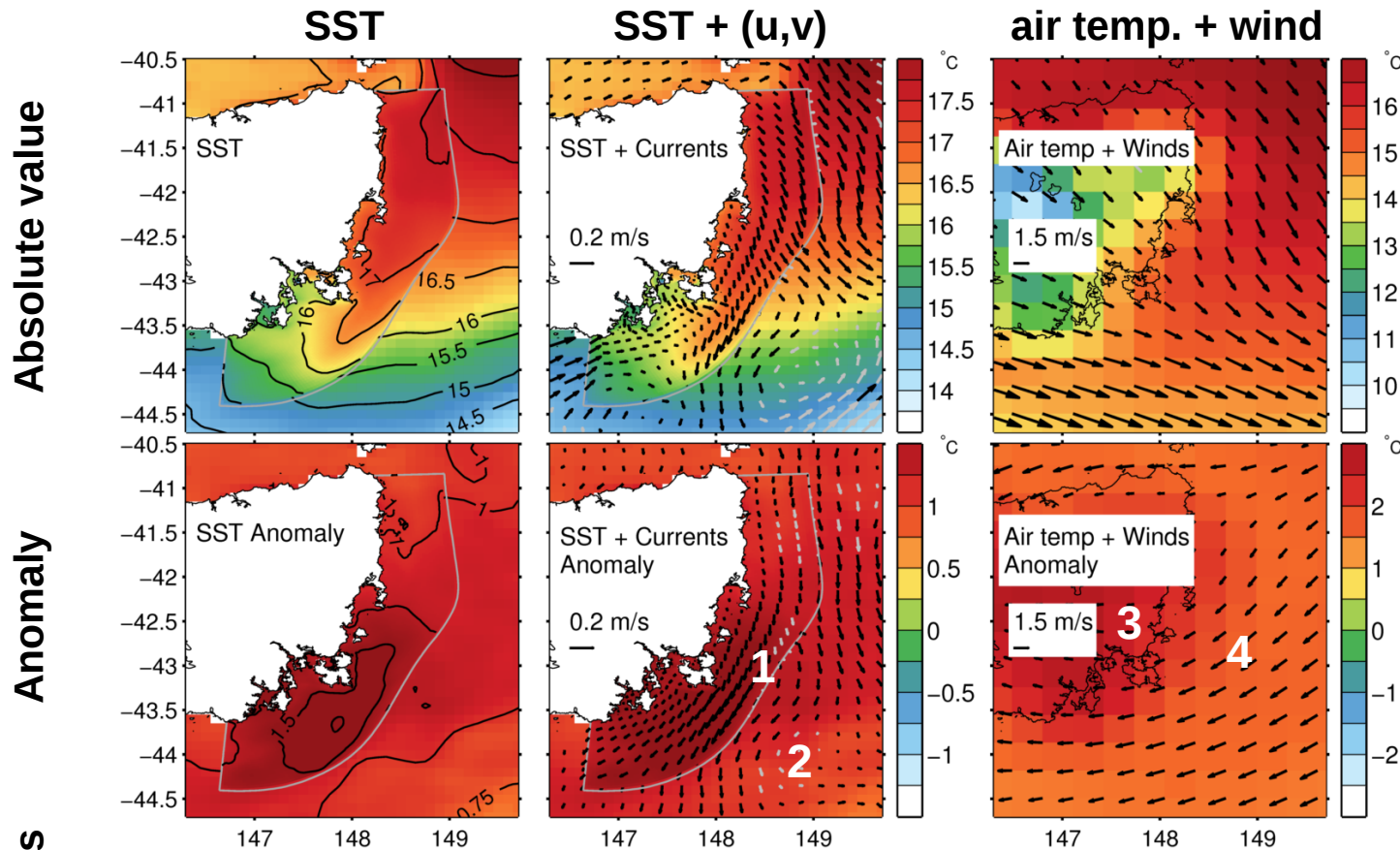
- Average across all events in Region 5 (ZCS, roughly the “Bruny Island bioregion”)
- Grey dots/arrows/± indicate statistical significance (95% confidence)



Property (units)	Trend (decade <sup>-1</sup> )
Frequency (# events)	$1.0 \pm 1.0$
Duration (days)	$15.5 \pm 12.5$
Max. intens. (°C)	$-0.21 \pm 0.35$
Mean intens. (°C)	$-0.24 \pm 0.25$
Cum. intens. (°C-days)	$16.0 \pm 13.5$
Depth (m)	$111.2 \pm 72.6$

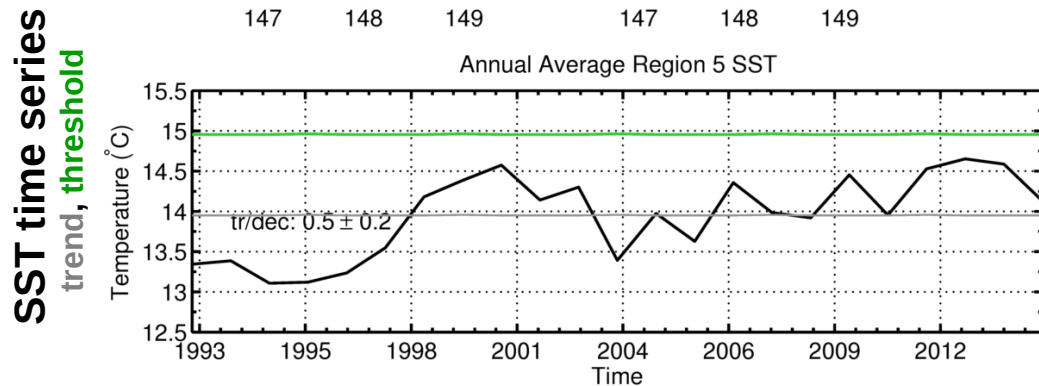
## Property trends

- Average across all events in Region 5 (ZCS, roughly the “Bruny Island bioregion”)
- Grey dots/arrows/ $\pm$  indicate statistical significance (95% confidence)



**MHWs in the southeast tend to co-occur with:**

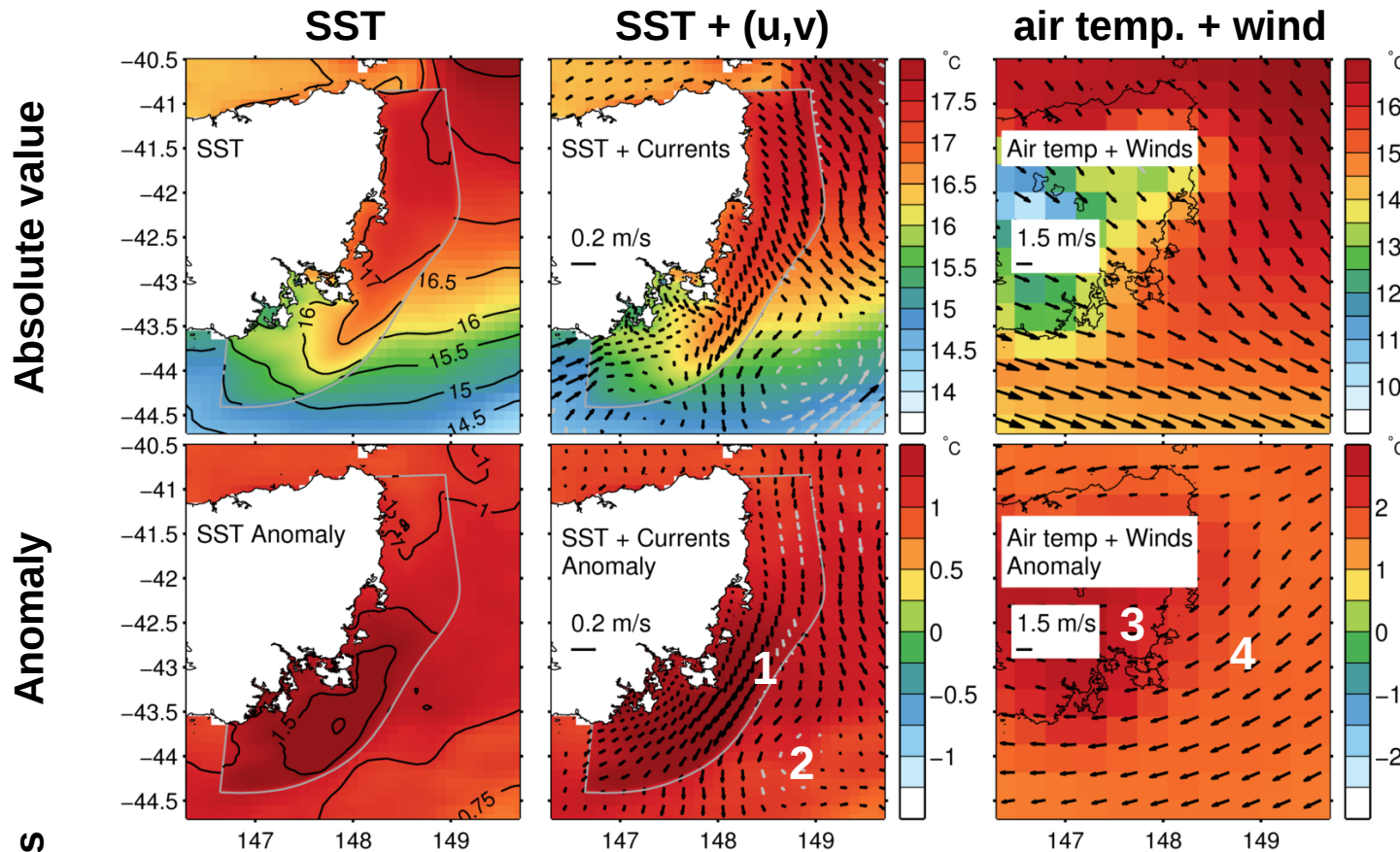
1. Anomalously strong southward (EAC?) flow
2. An anticyclonic eddy of the SE of Tasmania
3. Warm air over the SE of Tasmania
4. Weak anomalous NE-erlies



Property (units)	Trend (decade <sup>-1</sup> )
Frequency (# events)	1.0 $\pm$ 1.0
Duration (days)	15.5 $\pm$ 12.5
Max. intens. (°C)	-0.21 $\pm$ 0.35
Mean intens. (°C)	-0.24 $\pm$ 0.25
Cum. intens. (°C-days)	16.0 $\pm$ 13.5
Depth (m)	111.2 $\pm$ 72.6

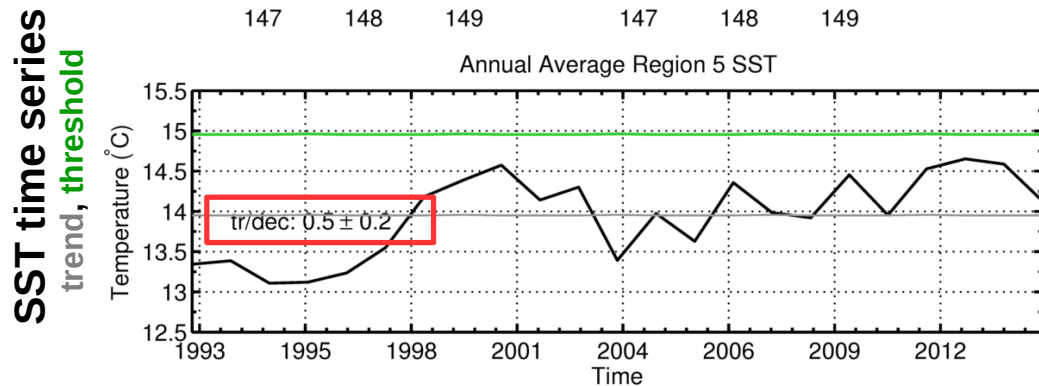
**Property trends**

- Average across all events in Region 5 (ZCS, roughly the “Bruny Island bioregion”)
- Grey dots/arrows/± indicate statistical significance (95% confidence)



**MHWs in the southeast tend to co-occur with:**

1. Anomalously strong southward (EAC?) flow
2. An anticyclonic eddy of the SE of Tasmania
3. Warm air over the SE of Tasmania
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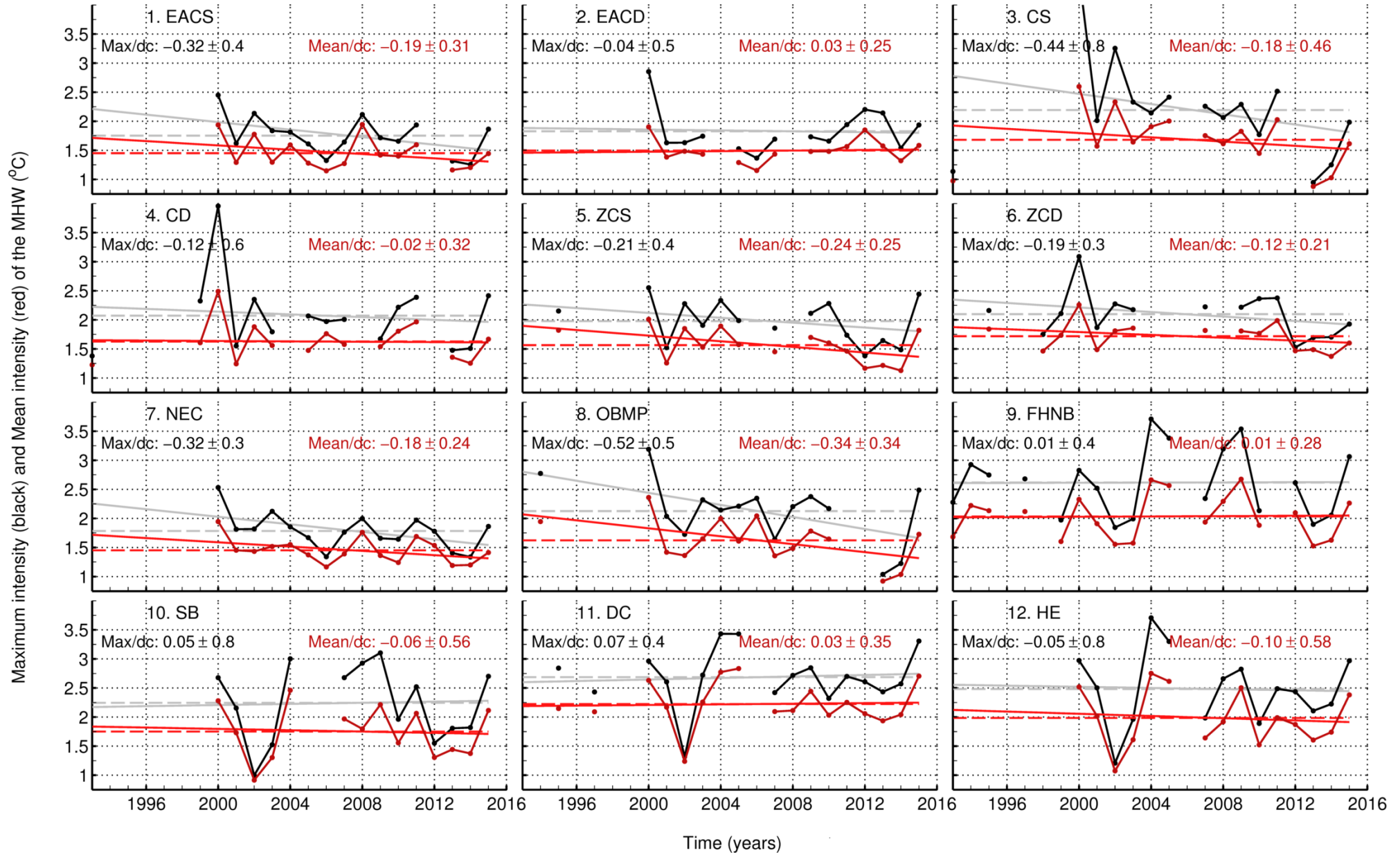


Property (units)	Trend (decade <sup>-1</sup> )
Frequency (# events)	1.0 ± 1.0
Duration (days)	15.5 ± 12.5
Max. intens. (°C)	-0.21 ± 0.35
Mean intens. (°C)	-0.24 ± 0.25
Cum. intens. (°C-days)	16.0 ± 13.5
Depth (m)	111.2 ± 72.6

**Property trends**

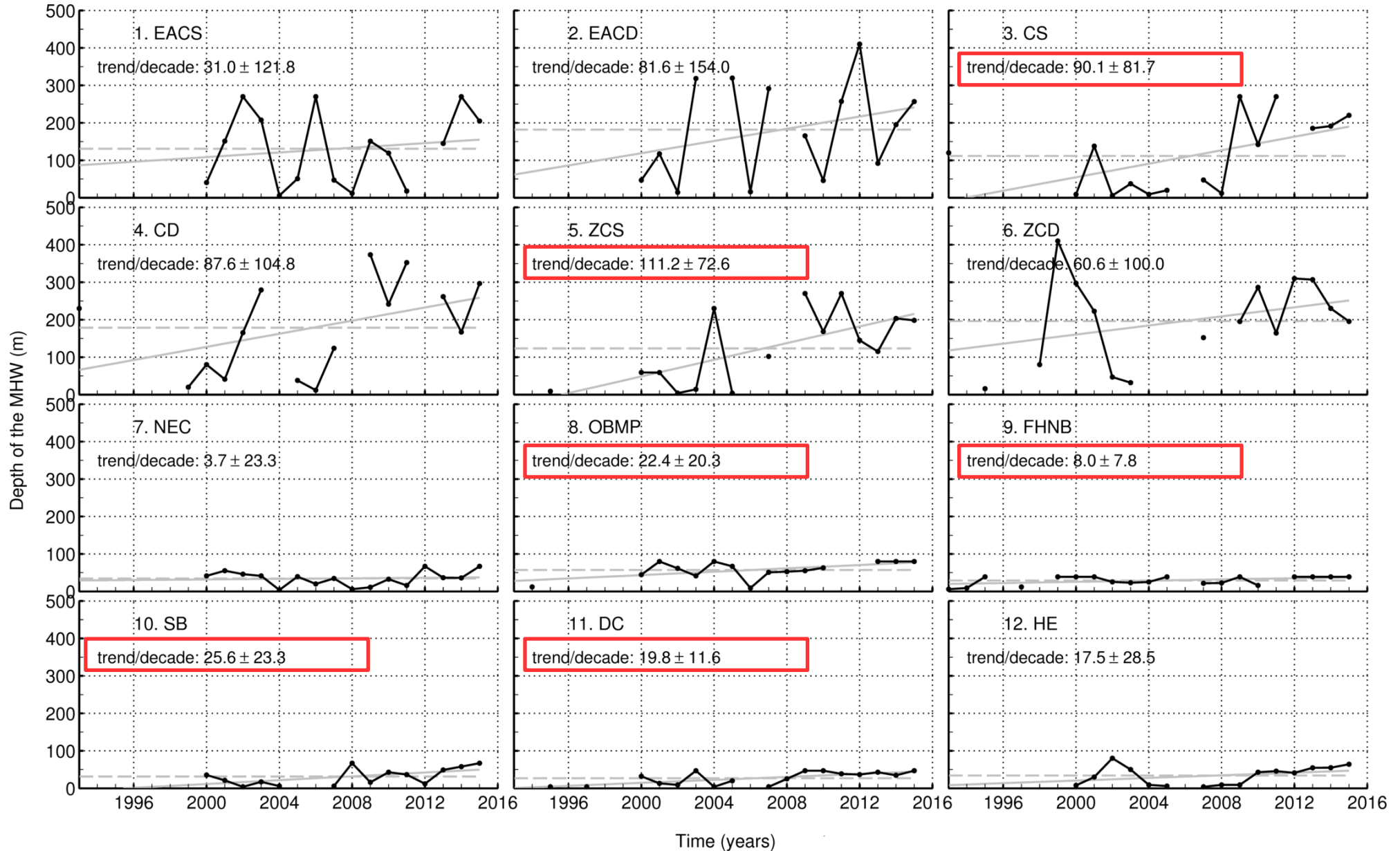
**Significant linear trends in SST, MHW duration, Cum. Intensity, Depth**

- Annual time series' of **maximum and mean intensity** of MHWs
- No consistent trend in MHW intensity

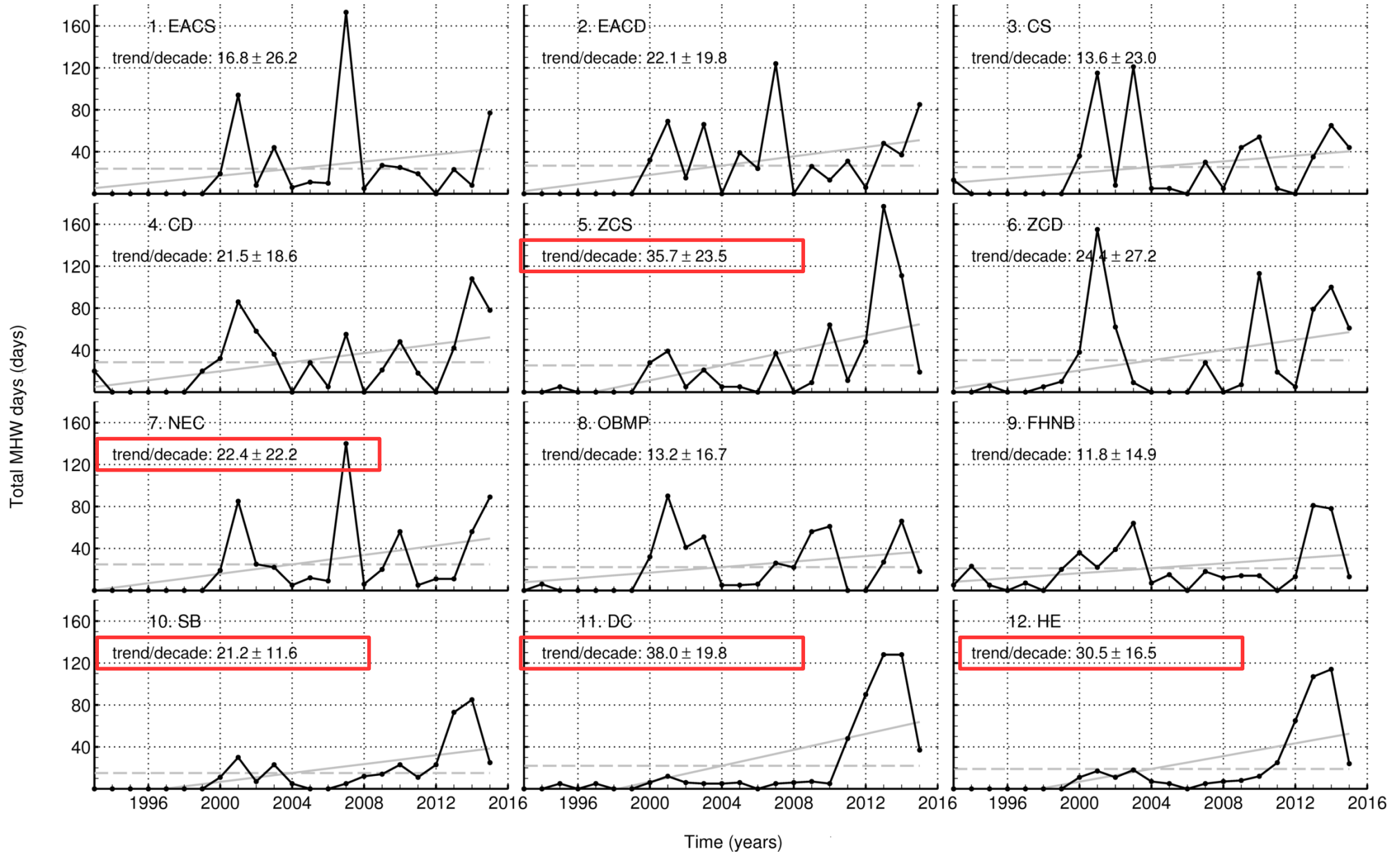




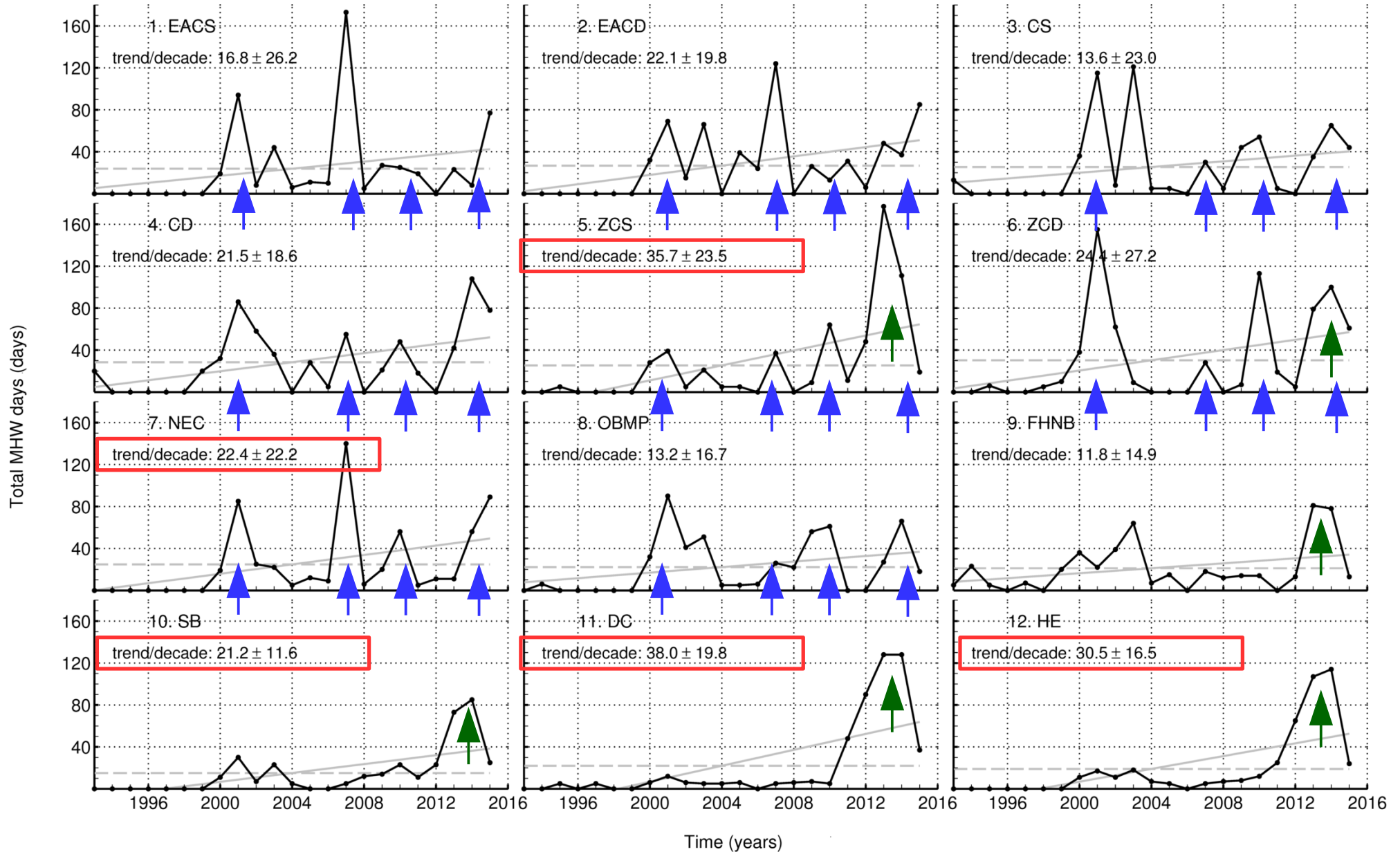
- Annual time series' of **maximum depth** of MHWs
- Significant trends in half of the regions



- Annual time series of **Total MHW days** i.e. “the count of MHW days in each year”
- **Spatial variation in linear trends**

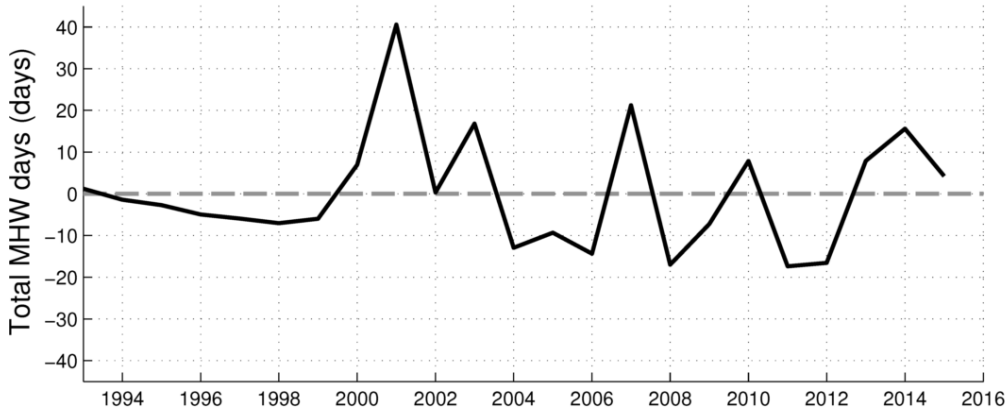


- Annual time series of **Total MHW days** i.e. “the count of MHW days in each year”
- **Spatial variation in linear trends and variability** → (two modes?)

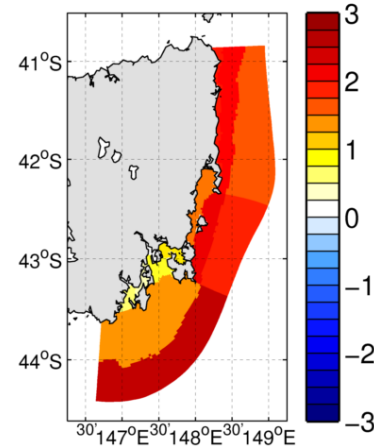


- **Principal Component Analysis of Total MHW Days** (linear trend removed)
- Two modes of variability, spatially separated
  - **Mode 1:** *Interannual* mode picks 2001, 2007, 2010, 2014 for most regions excl. SE nearshore
  - **Mode 2:** Lower frequency mode (*~decadal*) picks up 2004-2011 low and 2012-2014 high for nearshore southeastern Tasmania & opposite for northern regions

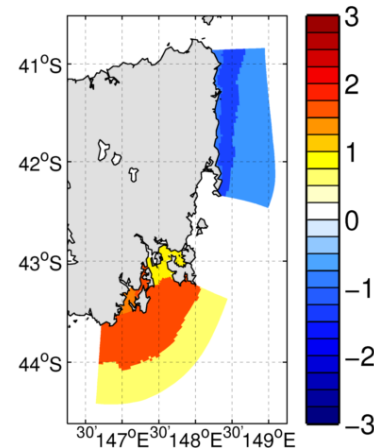
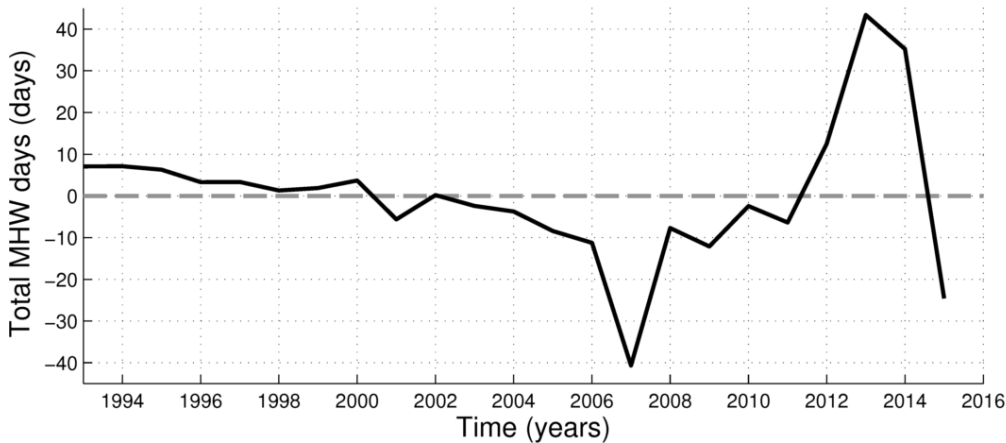
Principal Component t.s.: 49 % of variance



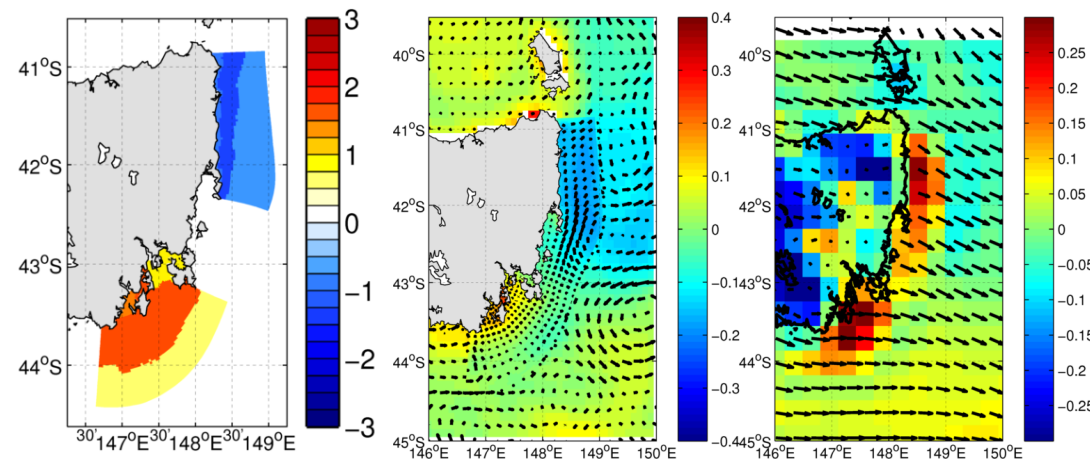
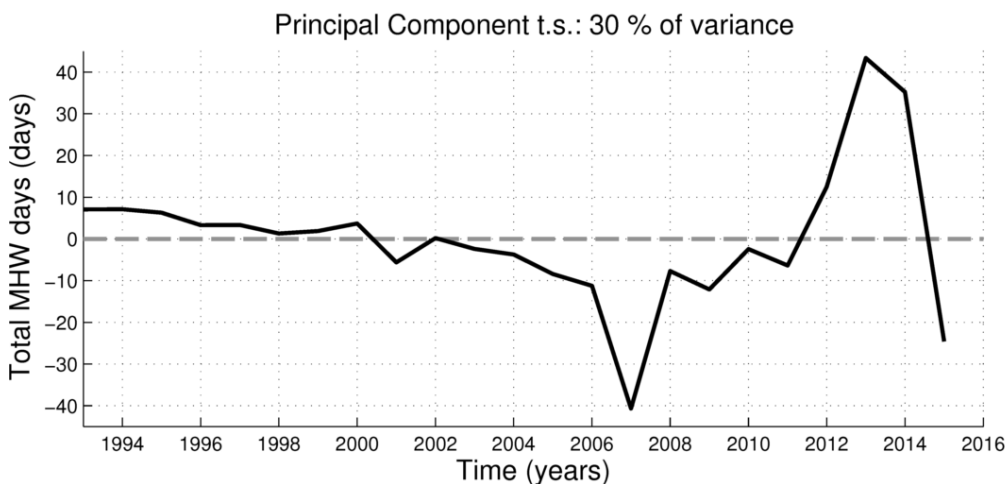
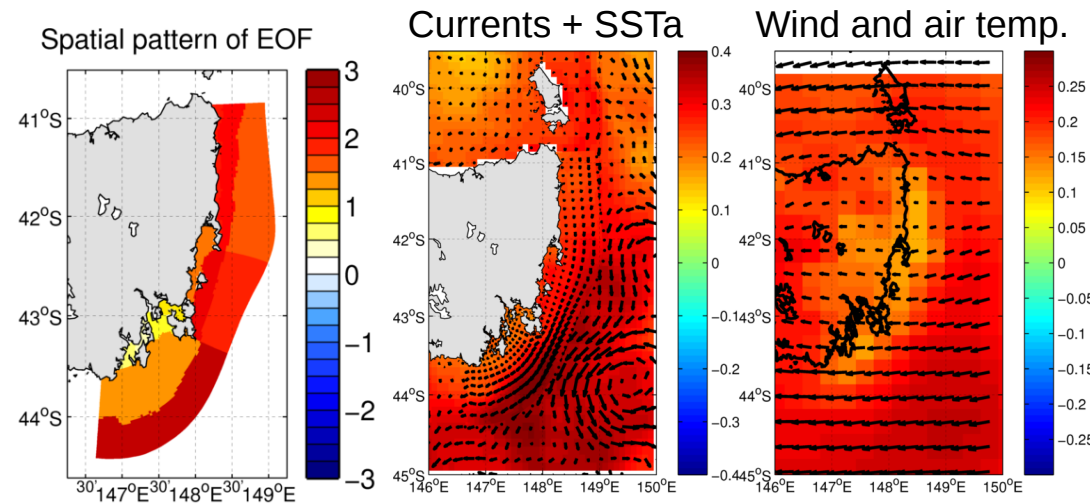
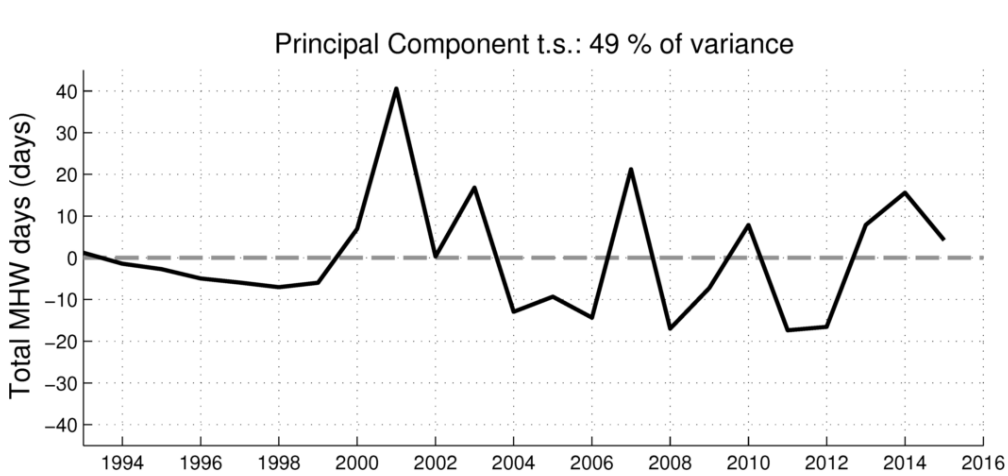
Spatial pattern of EOF



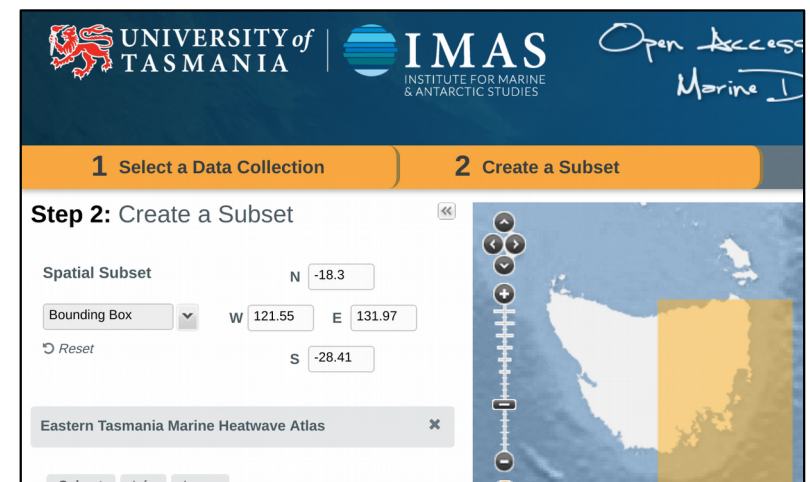
Principal Component t.s.: 30 % of variance



- **Principal Component Analysis of Total MHW Days** (linear trend removed)
- Two modes of variability:
  - **Mode 1:** *Interannual* mode picks 2001, 2007, 2010, 2014 for most regions excl. SE nearshore
  - **Mode 2:** Lower frequency mode (*~decadal*) picks up 2004-2011 low and 2012-2014 high for nearshore southeastern Tasmania & opposite for northern regions



- **ETAS** model can be used to identify and characterise all MHWs off eastern Tasmania over 1993-2015 period, including
  - MHW properties (intensity, duration, etc...)
  - Concurrent oceanographic and atmospheric and conditions
- **Averaging** across **events** in **all years** or in **a single year** tells us
  - **1.** Typical ocean and atmosphere forcing conditions
    - Clear role of the EAC Extension, possibly offshore eddies also
  - **2.** Long-term trends (strong increases in the southeast, “canary in the coalmine” for climate change?)
    - MHWs getting more frequent, longer, deeper but not more intense\*
- **Modes of variability** indicate two modes with different time scales (interannual, decadal), with Mode 1 picking up the EAC signal
- Looking into Self **Organising Maps** to detect MHW “typologies”
- **Data:** IMAS Data Portal (data.imas.utas.edu.au):
  - “Eastern Tasmania Marine Heatwave Atlas”<sup>1</sup>
  - Complete 1993-2015 ETAS data files<sup>2</sup>



<sup>1</sup><http://data.imas.utas.edu.au/portal/search?uuid=20188863-0af6-4032-98f8-def671cdaa58>

<sup>2</sup><http://thredds.imas.utas.edu.au/thredds/catalog/IMAS/catalog.html>

Dalhousie University



2017-?

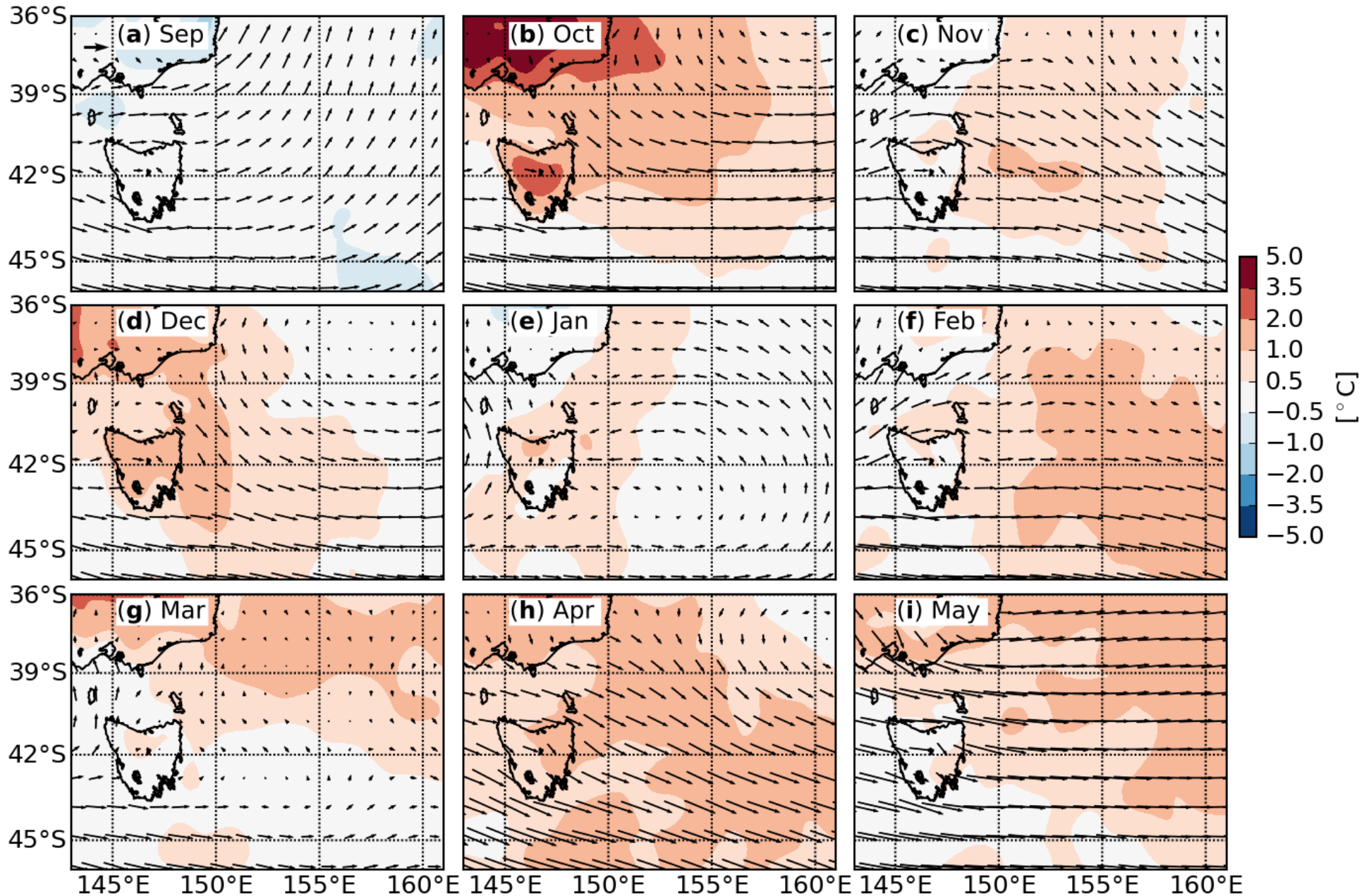
# Farewell Tassie

2012-2017

IMAS/UTAS

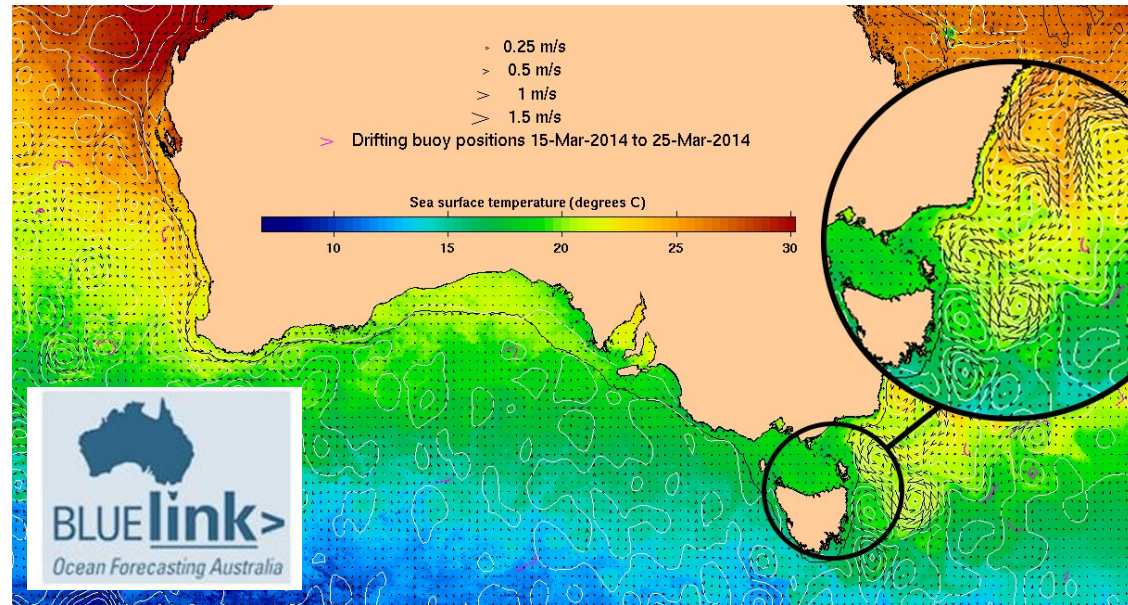


Monthly SAT and 10 m wind anomalies (NCEP CFSv2)

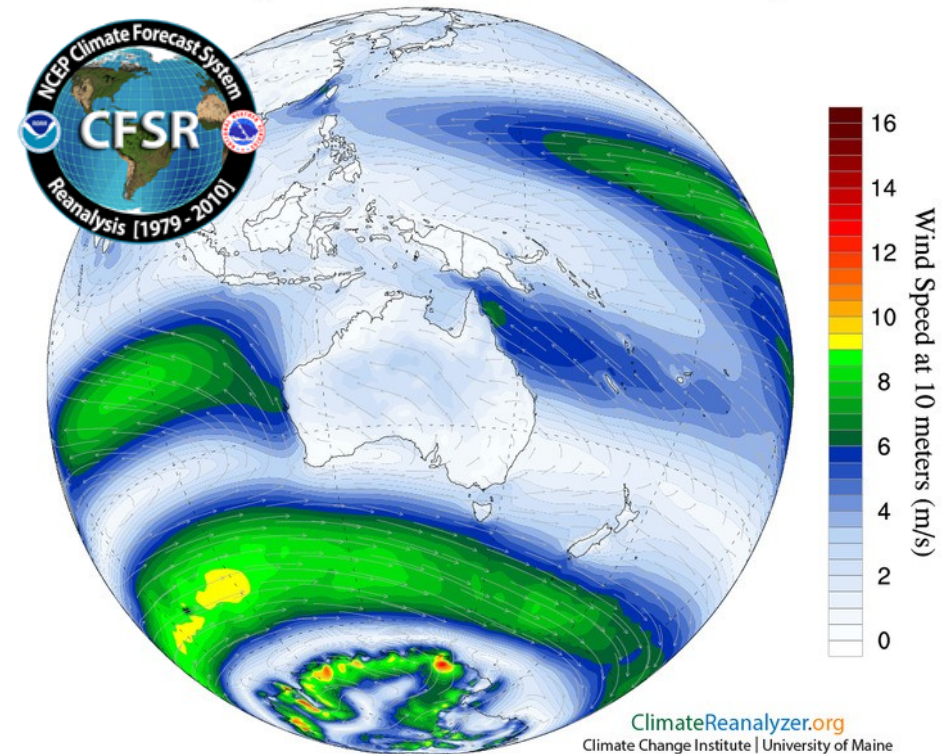




- Boundary conditions used the recently-developed Dirichlet boundary condition of Herzfeld and Andrewartha (2012)
- Lateral boundaries were forced by velocities, temperature and salinity from **Bluelink** reanalysis and analysis fields
- Surface forcing was provided from the **NCEP Climate Forecast System (CFS)** Reanalysis and Reforecast
- Coverage: 1993-2015



Climate Forecast System Reanalysis Annual 1979-2013 Average



Herzfeld, M. and J. R. Andrewartha (2012), A simple, stable and accurate Dirichlet open boundary condition for ocean model downscaling, *Ocean Modelling*, 43-44, 1-21

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OceanMAPS = Bluelink Ocean Modelling, Analysis, and Prediction System  
CFSR = Climate Forecast System Reanalysis  
CFSv2 = Climate Forecast System version 2 (operational forecast system)