

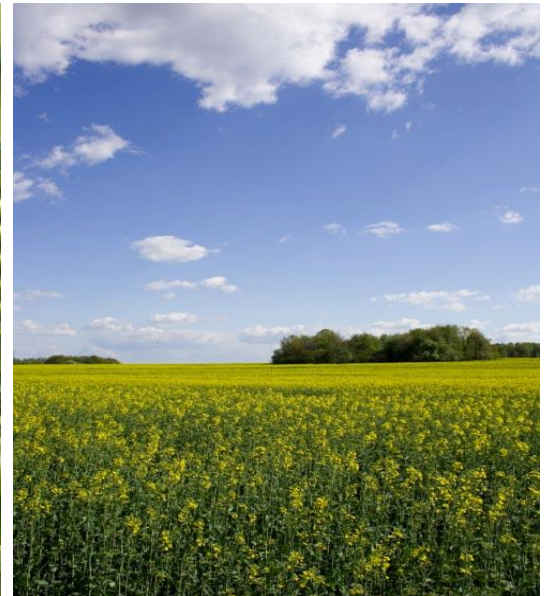


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The Bureau of Meteorology Coupled Data Assimilation System for ACCESS-S

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Outline

- Background: sub-seasonal to seasonal prediction
- Summary of the operational POAMA data assimilation and initialisation scheme at the BOM
- ACCESS-S1: issues and improvements
- Coupled data assimilation plans for ACCESS-S2 and ACCESS-S3
- Some preliminary results

Background

- Need to support a sub-seasonal to seasonal prediction system
- Have made substantial improvements to forecast skill and reliability in the past by modifying the DA and ensemble generation.
- A key innovation was a coupled-model breeding method which produces an ensemble of perturbed atmosphere and ocean states. The new scheme impacted favourably on the sub-seasonal and seasonal forecast skill compared to an ensemble generated using lagged atmospheric initial conditions.



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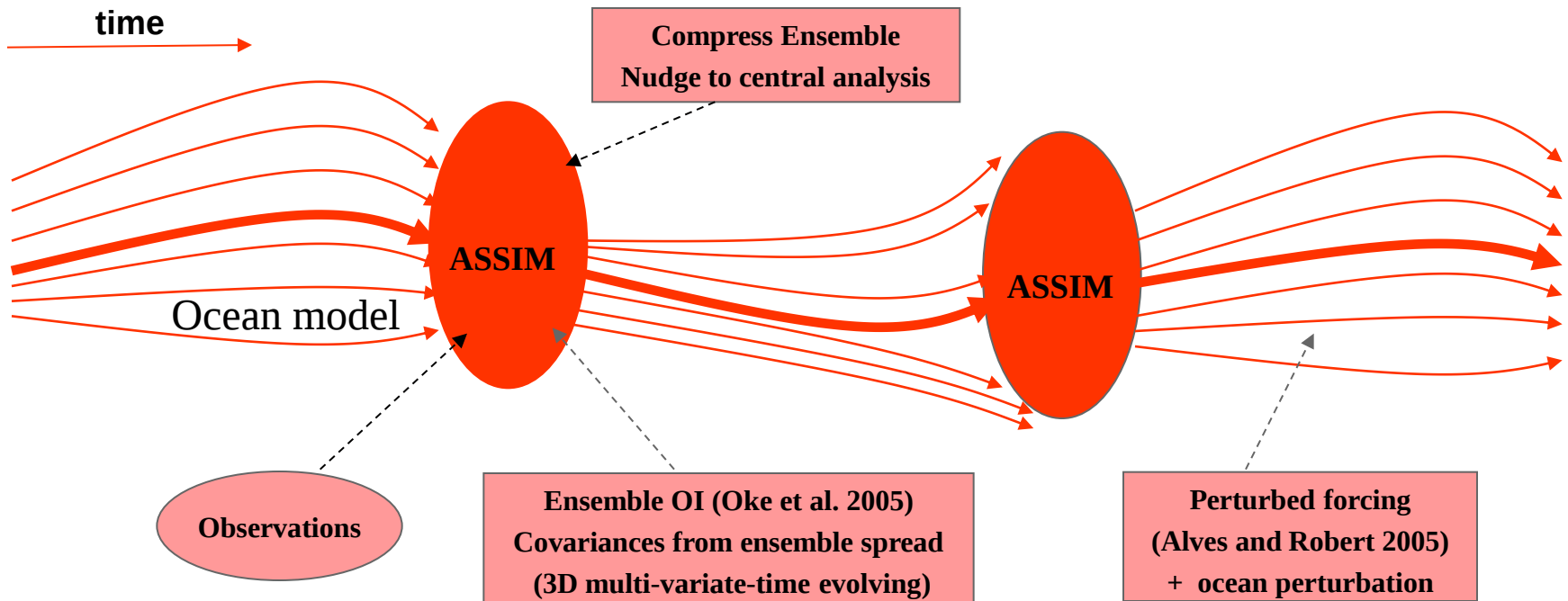
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Data assimilation at BoM for POAMA2

ALI: Atmosphere Land Initialisation scheme	• Offline POAMA atmospheric GCM forced by observed sea-surface temperatures is nudged (u,v,T,q) every 6 hours towards an analysis (ERA for hindcasts; NWP for real-time) • Land surface is initialised indirectly through the nudged atmosphere
PEODAS: POAMA Ensemble Ocean Data Assimilation System	• Similar to Ensemble Kalman Filter • Includes state-dependent estimate of the background error covariance • Provides an ensemble of initial ocean states • Assimilates in situ ocean temperature and salinity

Ocean data assimilation: PEODAS

POAMA **E**nsemble **O**cean **D**ata **A**ssimilation **S**ystem
used in POAMA-2 (Yin et al. 2011, MWR)



An approximate form of the EnKF so as to be efficient for operational implementation
(it is more similar to a ESRF than to an EnKF)



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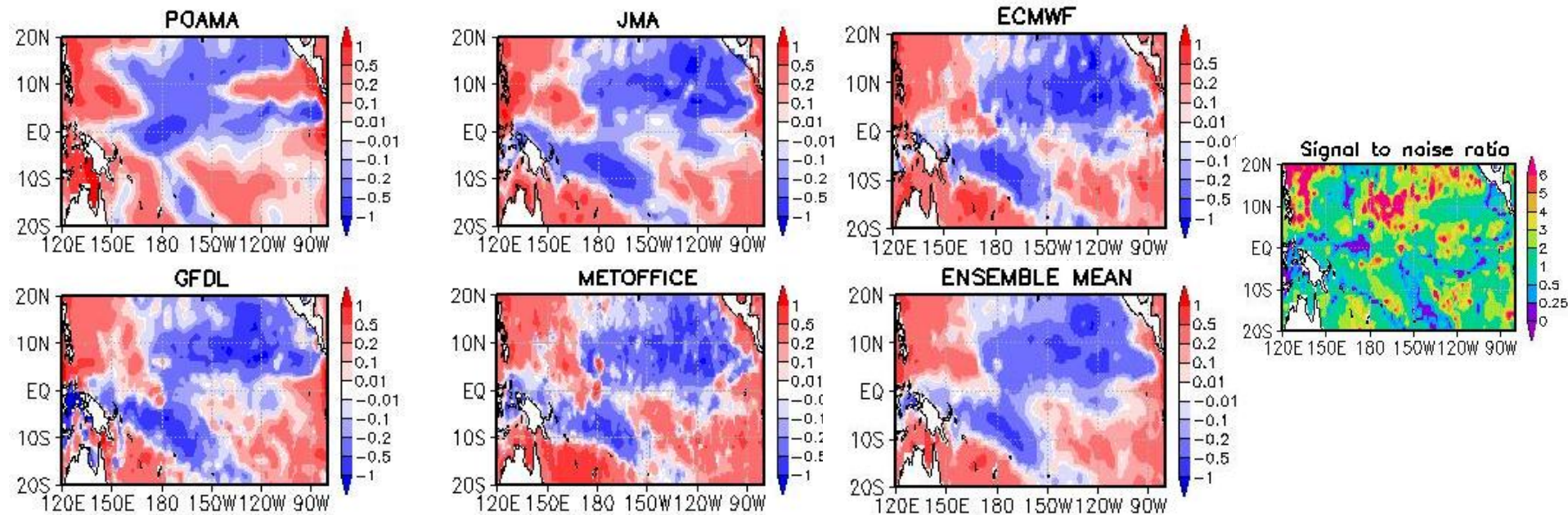
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Real-Time Ocean Reanalysis Intercomparison

Salinity: <http://poama.bom.gov.au/project/salinity/>

Temperature: http://www.cpc.ncep.noaa.gov/products/GODAS/multiora_body.html

SALT ANOM at z=5m: 201607



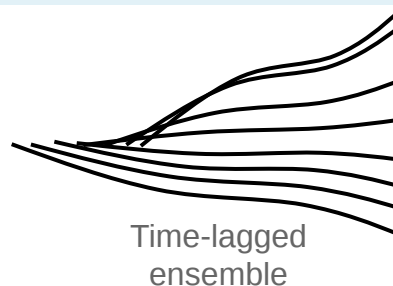
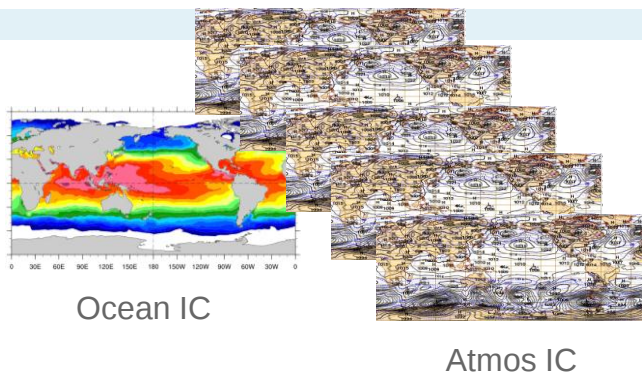


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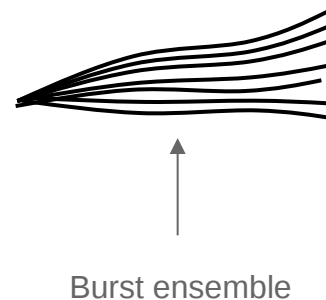
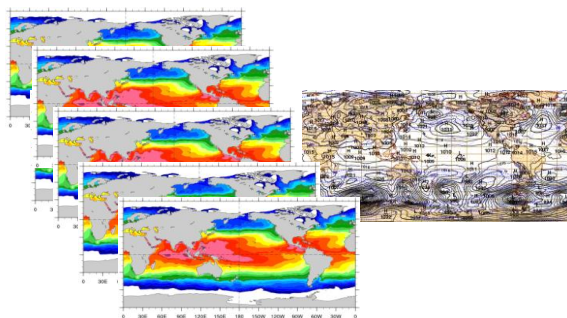
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Moving to sub-seasonal prediction

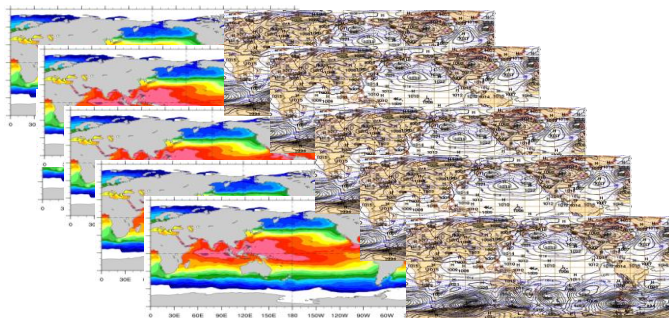
POAMA-1.5



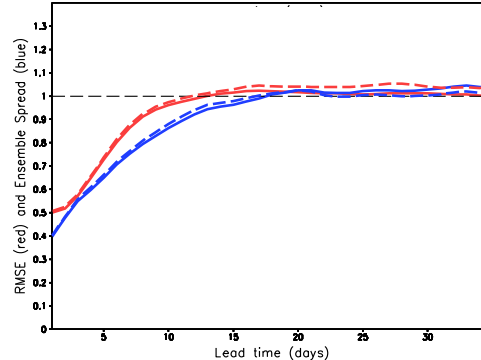
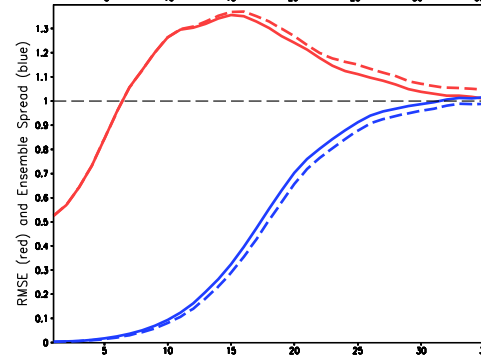
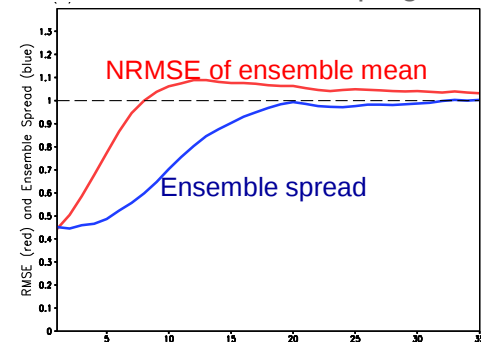
POAMA-2 seasonal



POAMA-2 operational

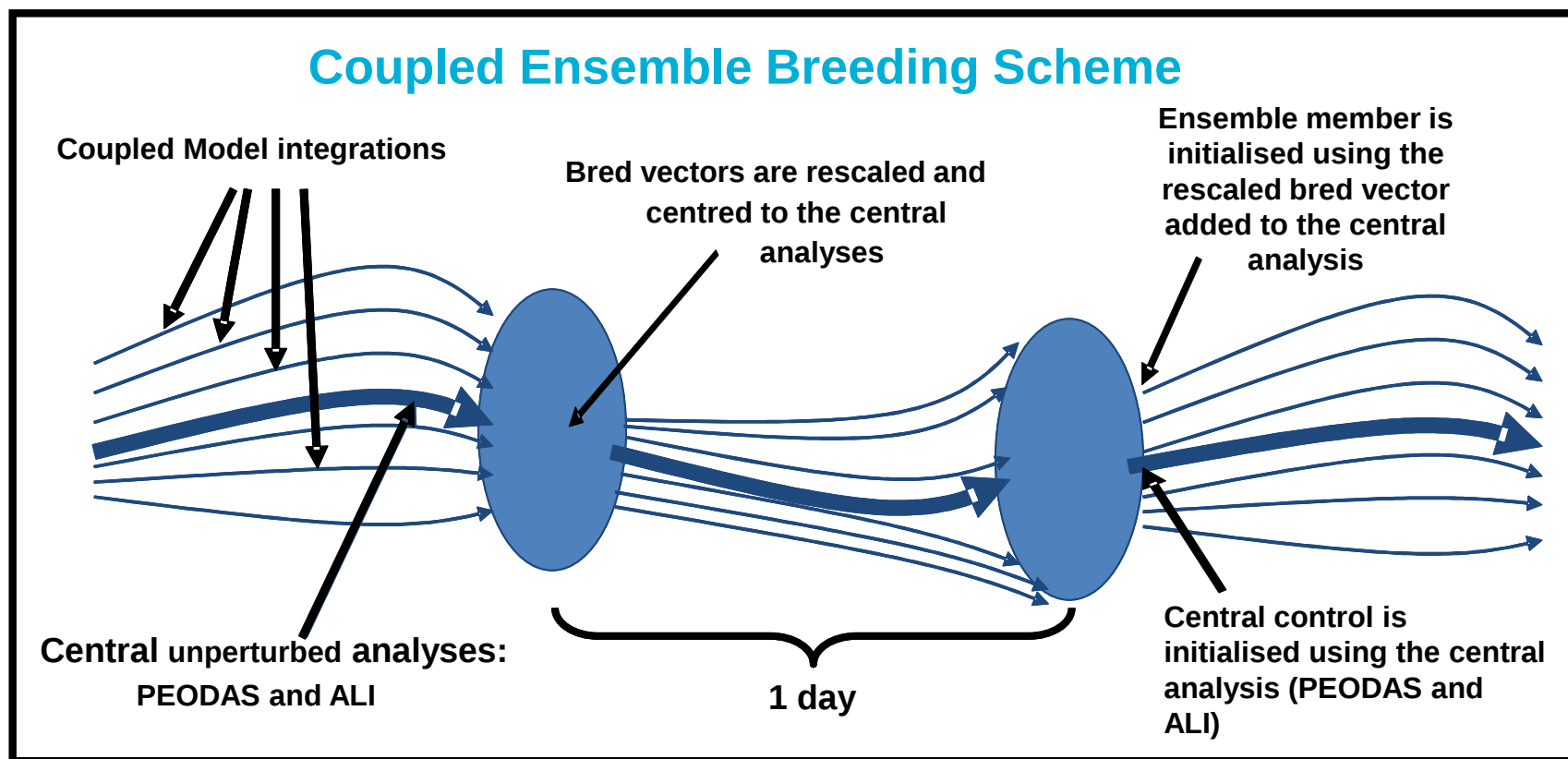


SHEM 500 hPa Geop hghts



Ensemble generation at BoM for POAMA2

Towards Coupled Assimilation: Based on the PEODAS infrastructure



Generates coupled bred perturbations of the atmosphere and ocean based on a breeding method

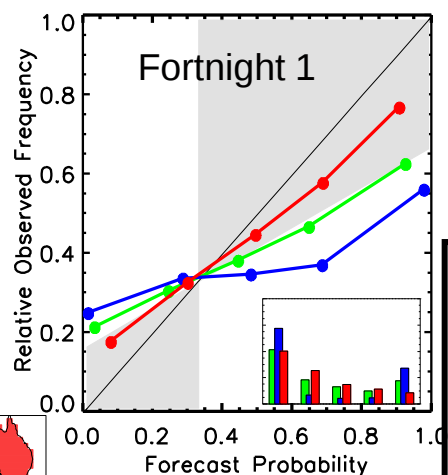


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Improved forecast reliability and skill

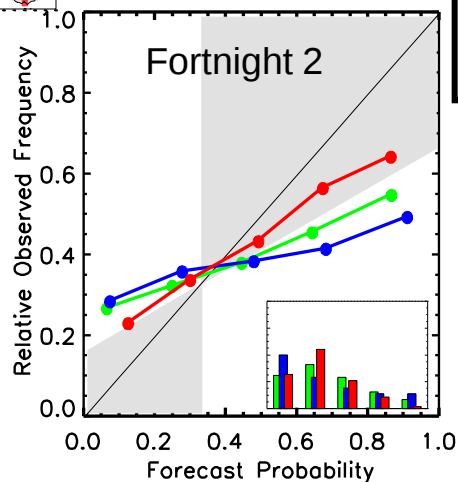
Reliability: Upper tercile rainfall



POAMA-1.5
(lagged
atmos)

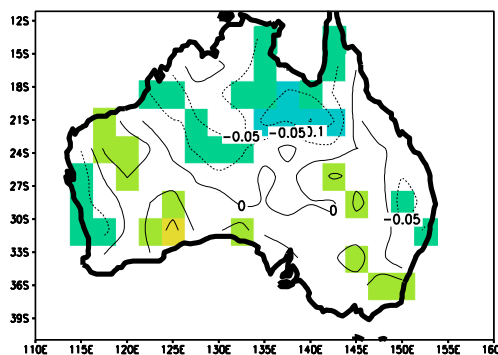
POAMA-2
(ocean perts)

POAMA-2
(atmos+ocean
perts)

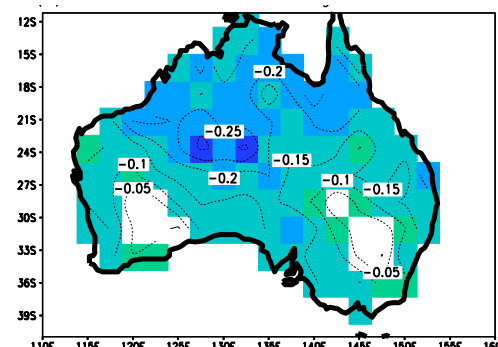


Brier Skill Score: Fortnight 2 Upper tercile Tmax

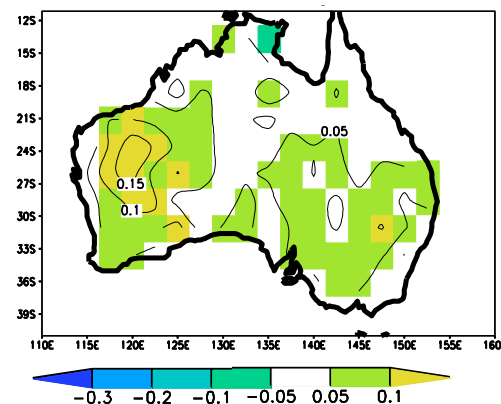
POAMA-1.5 (lagged atmos)



POAMA-2 (ocean perts)

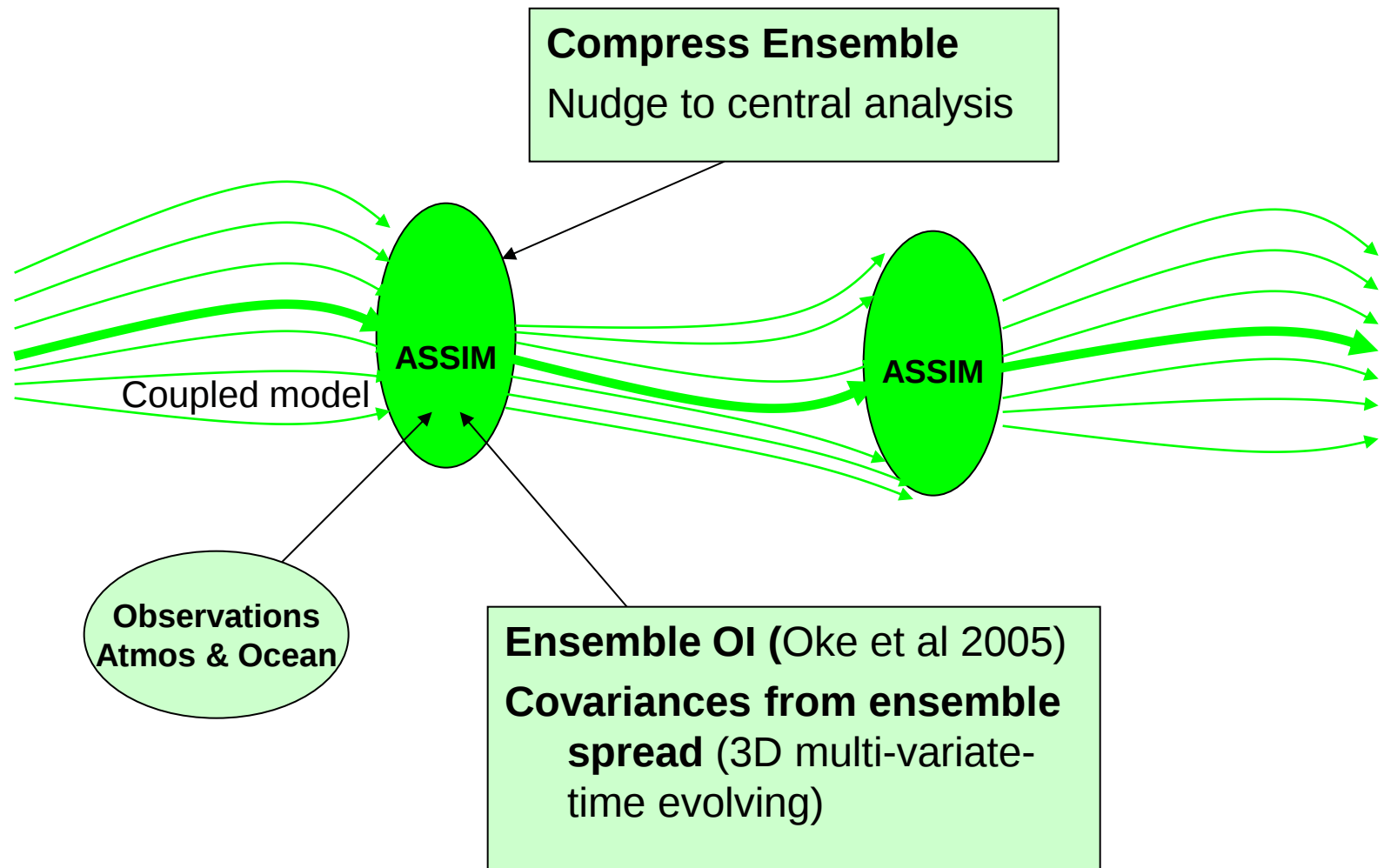


POAMA-2 (atmos + ocean perts)





Further development: Weakly coupled DA with implicit bred vectors





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POAMA-2 vs ACCESS-S

	POAMA-2	ACCESS-S
Atmospheric model	Bureau Atmospheric Model (BAM) ~10 years old	Latest UK MetOffice atmospheric model which is part of the UK MetOffice coupled model GC2
Atmospheric resolution	Horizontal: 250 km (T47) Vertical: 17 levels (does not extend into the stratosphere)	Horizontal: ~60 km in the midlatitudes (N216) Vertical: 85 levels (extending into the stratosphere)
Land surface model	Simple bucket model for soil moisture and 3-layers for soil temperature.	State-of-the-art land surface model (JULES) with 4 soil levels. Sophisticated representation of soil and surface hydrology and of fluxes of heat and moisture within the soil and to the atmosphere. Land cover heterogeneity is represented.
Ocean model	Modular Ocean Model (MOM version 2). ~13 years old	Latest NEMO model from France which is part of the UK MetOffice coupled model GC2
Ocean resolution	Horizontal: ~200 km x 100 km Vertical: 25 levels; level thicknesses range from 15 m near the surface to almost 1000 m near the bottom	Horizontal: ~25 km Vertical: 75 levels; level thicknesses range from 1 m near the surface to about 200 m near the bottom (6000m depth)
Model Physics	>10 years old	Latest from UK MetOffice and France

ACCESS-S1

ACCESS-S1: An intermediate system dependent on UKMO

UKMO GC2 (stochastic physics, greenhouse gases, etc.)

UKMO initial conditions + locally developed ensemble generation

Hindcasts increased from 15 to 23 years

Hindcasts ensemble members increased from 3 to 11 per start date

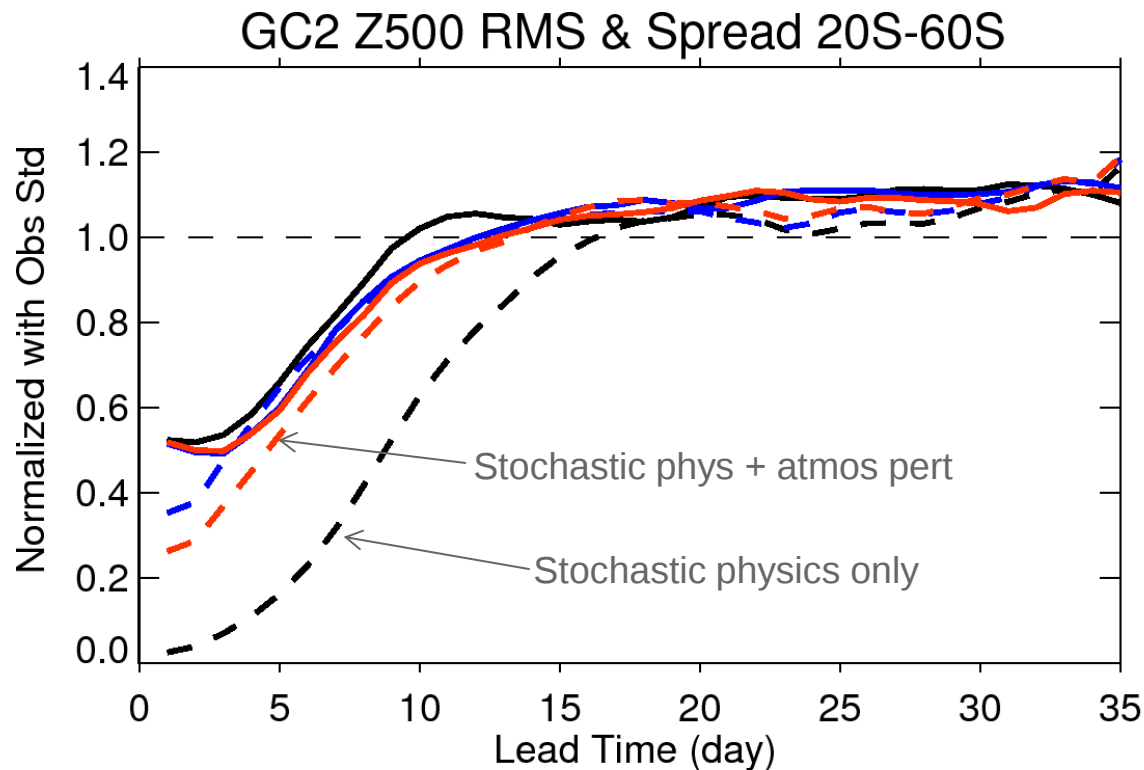
Real-time forecasts: 11 ensembles per day, 6 months lead



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Atmospheric perturbations produce a more reliable ensemble for sub-seasonal

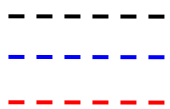


Test hindcasts:
1 May 1990-2012
ACCESS-S1
5 member ensemble

RMSE



SPREAD



Control

Trial 1

Trial 2

Control: Stochastic physics only

Trial 1: Stochastic phys + atmos pert

perturbations scaled to have obs uncertainty=rmsd(ERA-NCEP)

Trial 2: Stochastic phys + atmos pert

max perturbation limited to 20% of observed standard deviation



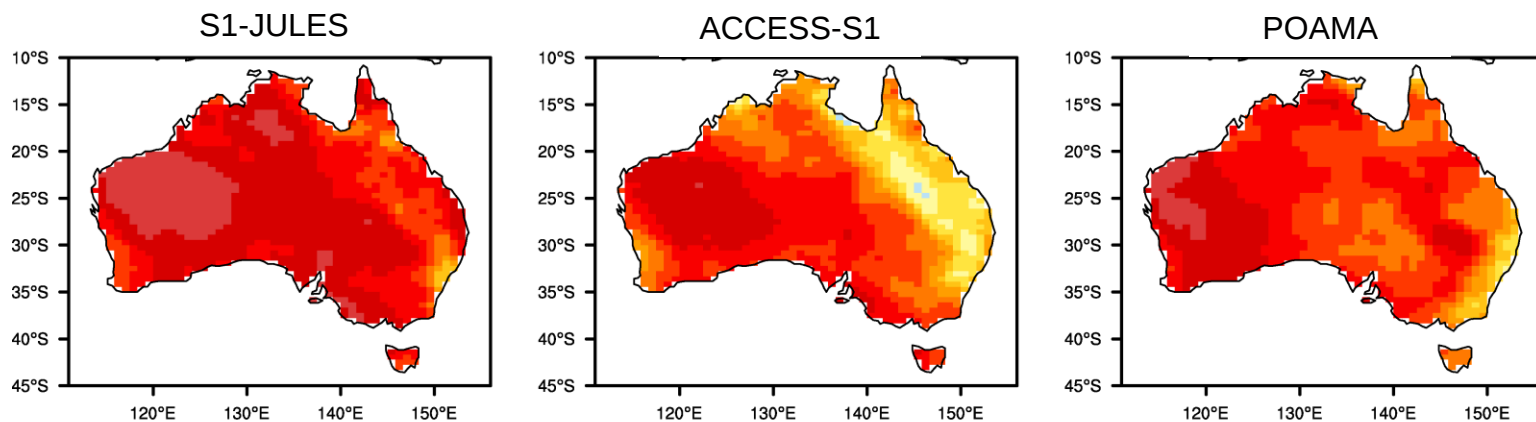
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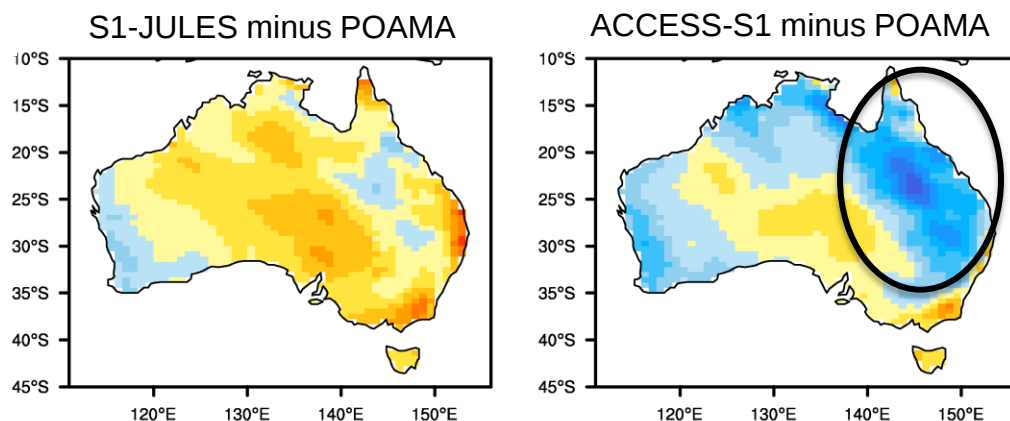
Issue: Initialising the land

Tmax ACC with AWAP: 1990-2012, 0501, lt0

Correlation



Correlation difference





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CDA plans for ACCESS-S

- Preliminary version of BoM EnKF/EnOI weakly-coupled data assimilation + ensemble generation for ACCESS-S2
- Ocean observations (temperature, salinity) assimilated (altimeter for ACCESS-S3?)
- Static background ocean error covariance fields (EnOI) (time-varying EnKF for ACCESS-S3)
- Atmosphere nudged to a pre-existing analysis (direct assimilation for ACCESS-S3)
- Includes land surface initialisation
- Breeding scheme creates ensemble of perturbed atmos, land, ocean
- Sea-ice???
- EnKF-C written in C and efficient on massively parallel systems (DEnKF/ETKF/EnOI)
- Progress: preliminary version of the ACCESS-S2 DA has been set up and a two year reanalyses is being performed to evaluate the system and measure the impact on the forecasts

EnOI ensemble

$$X(n) = (X(n-1) + X(n) + X(n+1))/3$$

n: for month

X: T, S, U, V

23 years (1990-2012) of ICs for day 01/09/17/25 every month for GC2 run in MetOffice

Ensemble size:

Standard: 92 (23x4) for each month

Augmented: 184

(92+46(last half of last month)+46(first half of next month))

Obs error estimation and tuning

Measurement + representiveness + ...

Adaptive moderation of observations (Sakov et al. 2012)

$$\sigma_{obs}^2 \leftarrow \left[(\sigma_f^2 + \sigma_{obs}^2)^2 + \sigma_f^2 d^2 / K^2 \right]^{1/2} - \sigma_f^2$$

R-factor: shift the balance between fitting to model and observations: $rf=1/\alpha$

$$PH^T / (HPH^T + rf R) = \alpha PH^T / (\alpha HPH^T + R)$$



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Exps of CDA for ACCESS-S2

Atmosphere: **ALI** nudging towards ERA-Interim

Ocean: **EnOI** scheme (T,S,U,V incs)

Assim: every 1 day with 1 day time window

Obs: EN4 Temp. & Sali. profiles, including CTD, XBT, Argo

Model: UKMO GC2 (with strongly SST relaxation to daily obs)

Observation errors: uncorrelated in space

Localisation radius: horizontally 1000km

EXP1: Orig_obs_error: 0.05° C(T), 0.01psu(S), Kf=1,Rf=6

EXP2: Orig_obs_error: 0.05° C(T), 0.01psu(S), Kf=3,Rf=6

EXP3: Orig_obs_error: 0.5° C(T), 0.1psu(S), Kf=999,Rf=2

CTL: same run without ocean assimilation

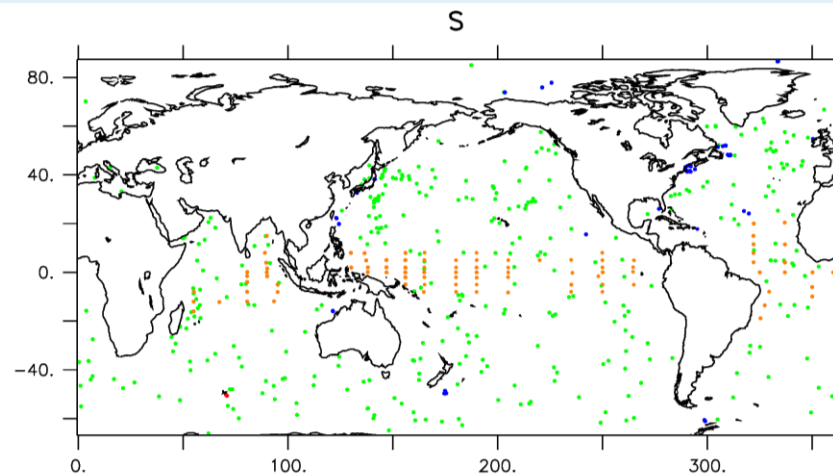
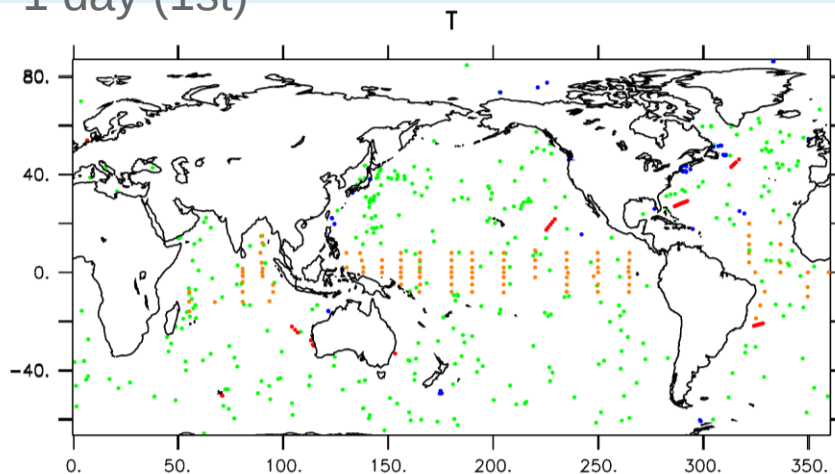


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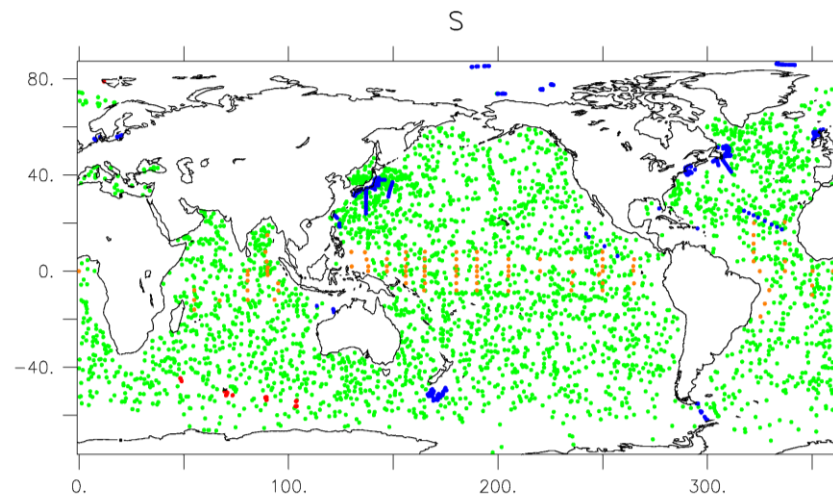
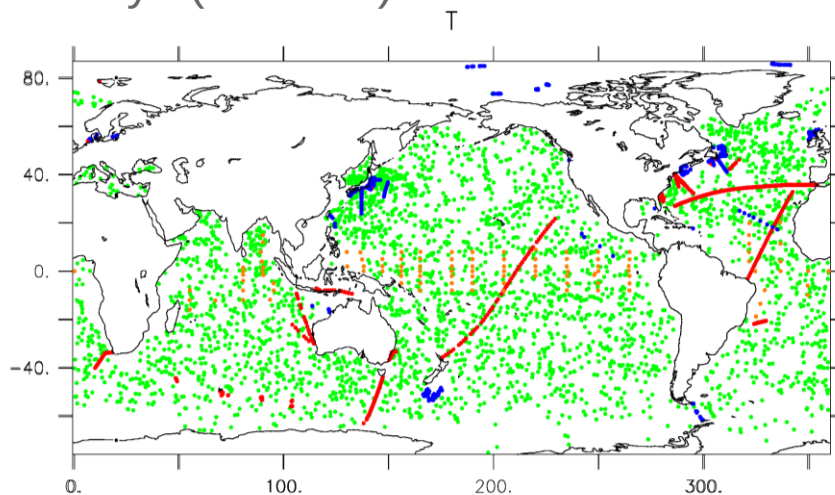
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Spatial distribution of the assimilated ocean observation (EN4 T/S) for December 2011

1 day (1st)



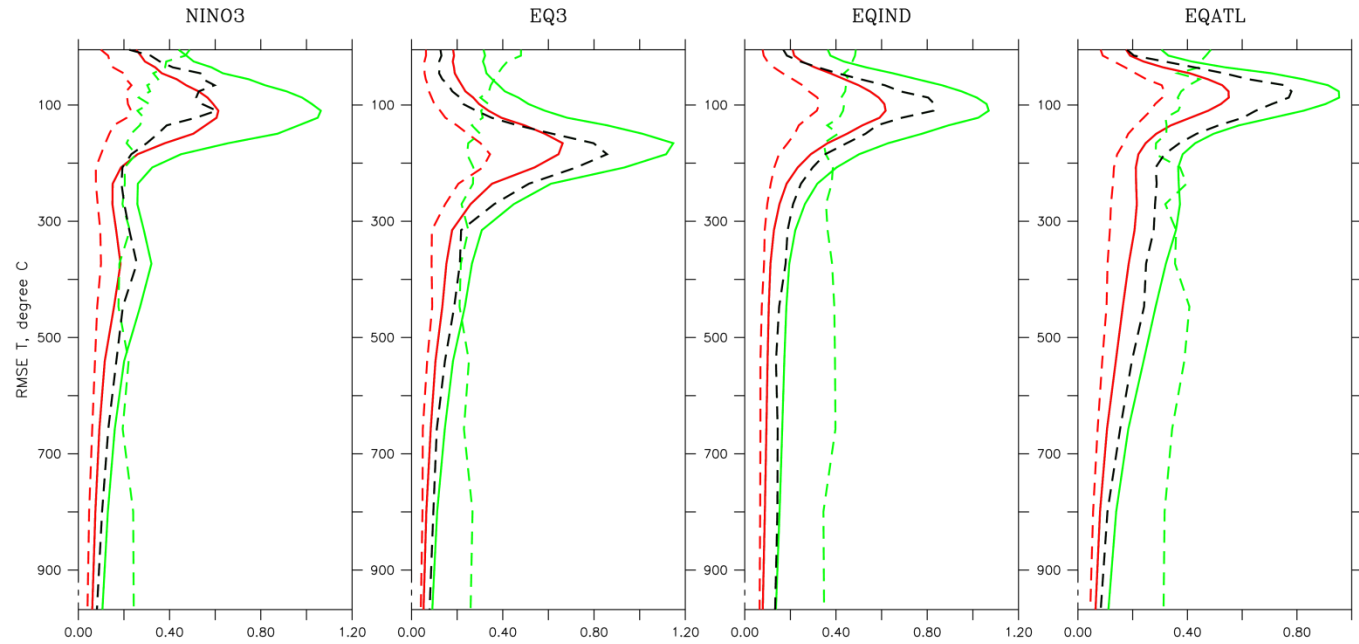
10 days (1st-10th)



Background error(solid) vs Observation error(dashed) 201112 for EXP1, EXP2 and EXP3

Note: Solid black and red line overlapped due to the same Rfactor used

T



Kfactor=1,3,999

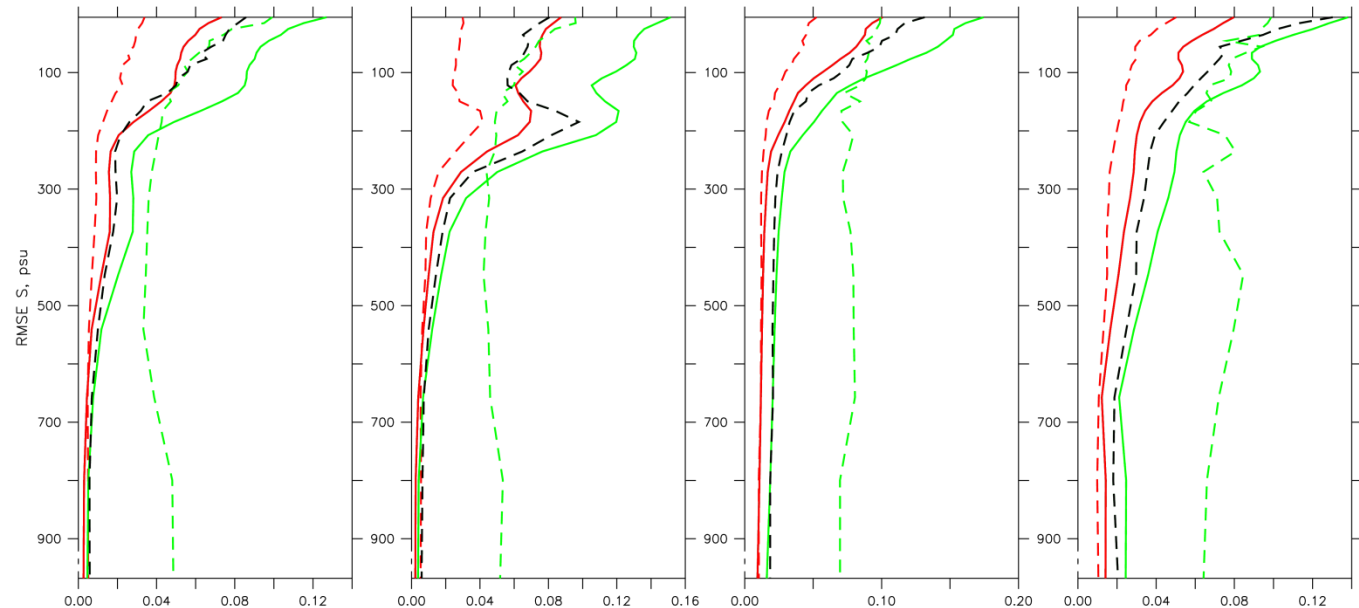
Rfactor=6,6,2

Ali_alpha=0.85

$\sigma T=0.05, 0.05, 0.5^\circ \text{ C}$

$\sigma S=0.01, 0.01, 0.1 \text{ psu}$

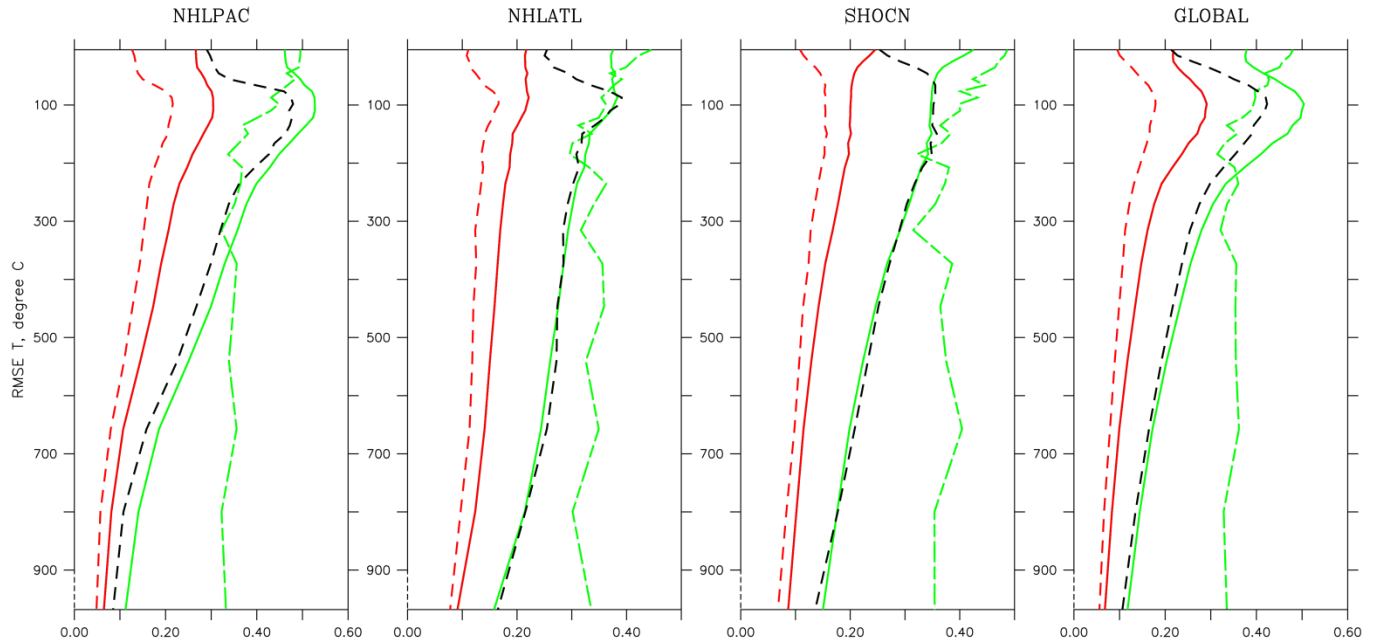
S



Background error(solid) vs Observation error(dashed) 201112 for EXP1, EXP2 and EXP3

Note: Solid black and red line overlapped due to the same Rfactor used

T



Kfactor=1,3,999

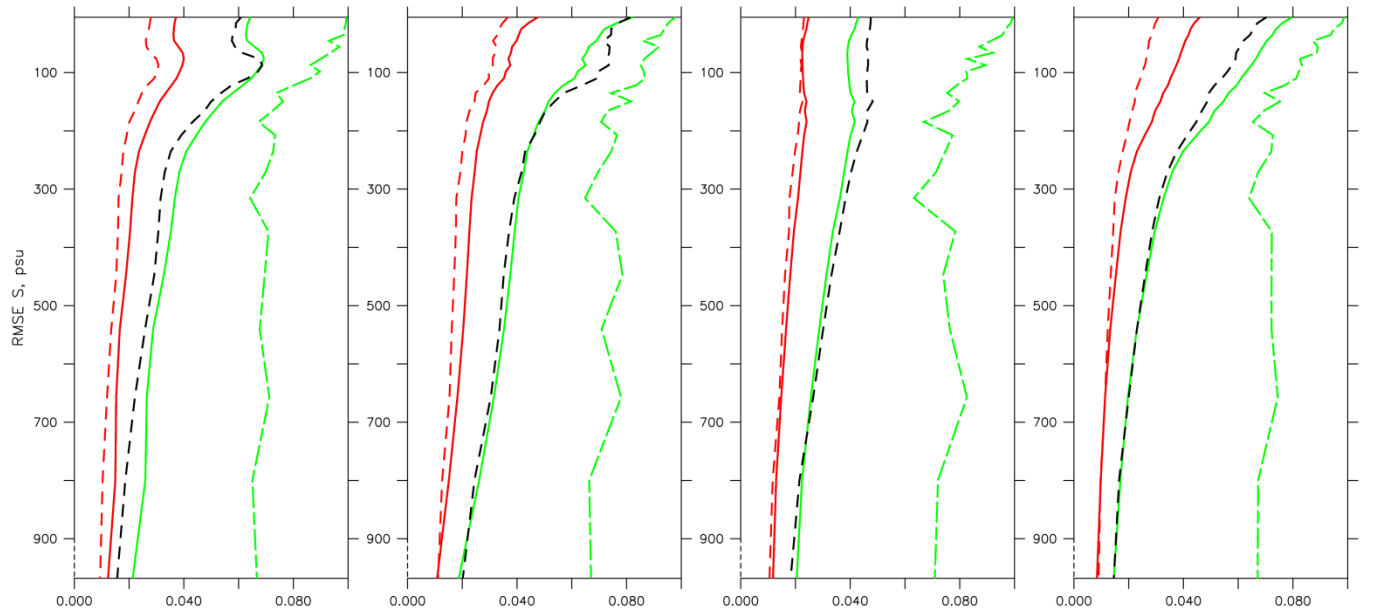
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Ali_alpha=0.85

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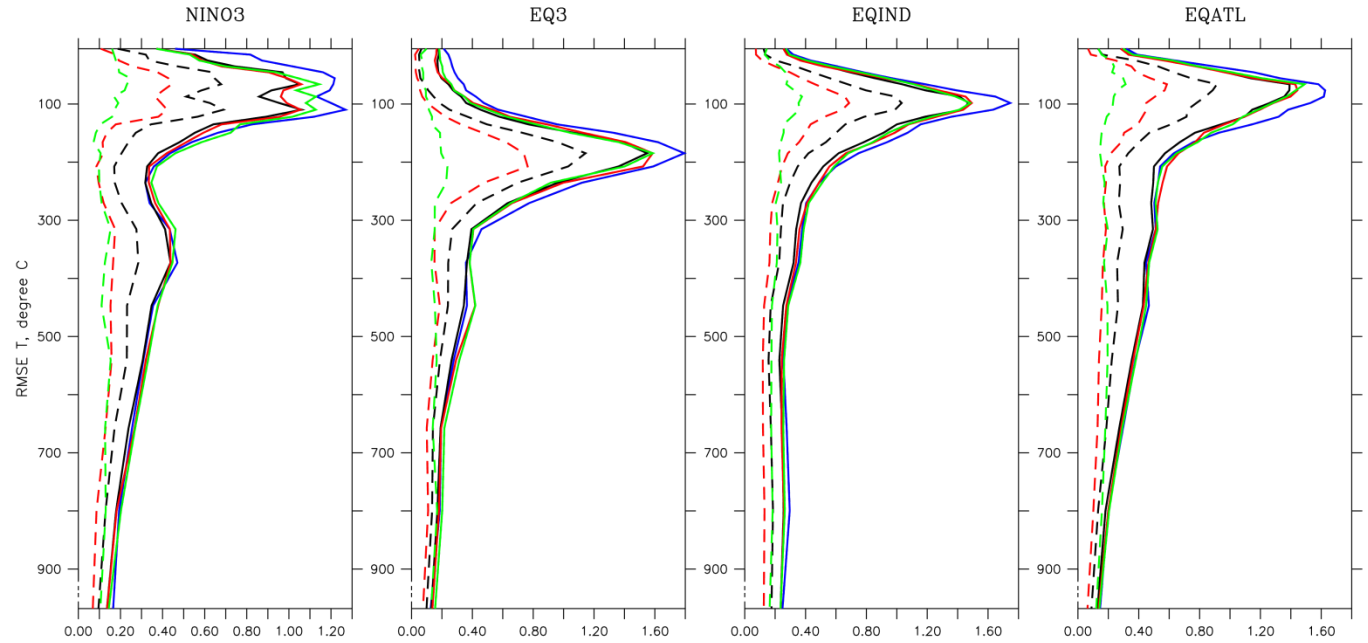
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S

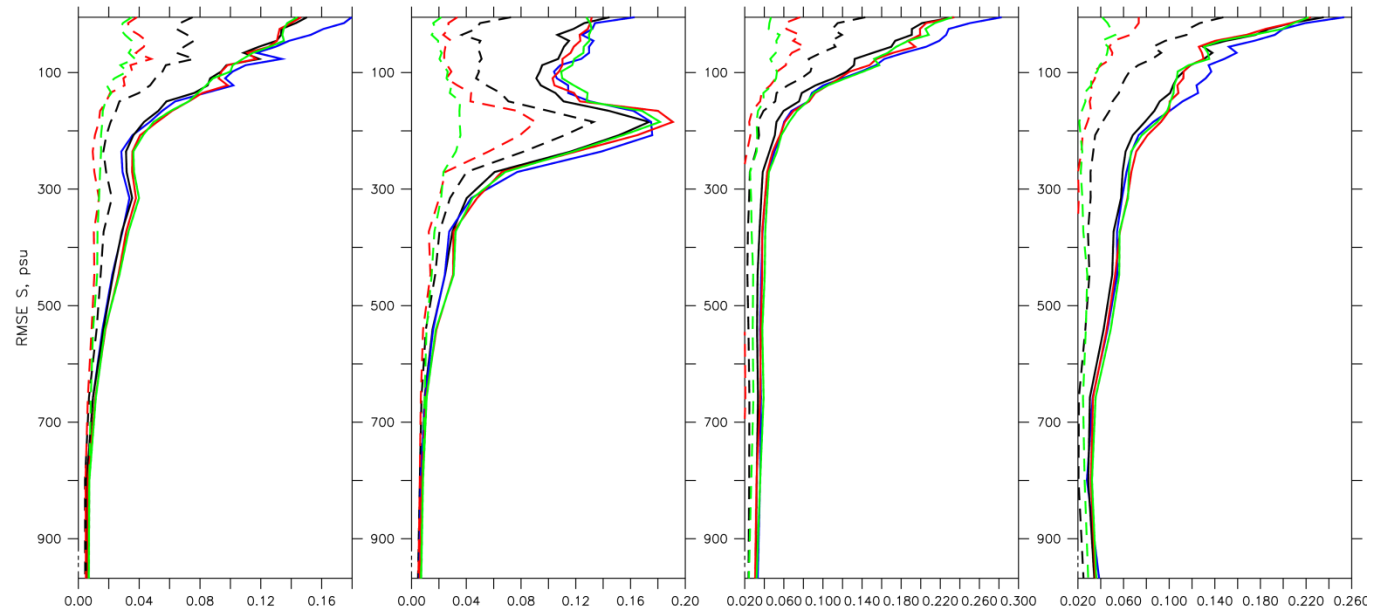


RMS O-B(solid), O-A(dashed) 201112 for EXP1, EXP2, EXP3 and CTL

T



S



Kfactor=1,3,999

Rfactor=6,6,2

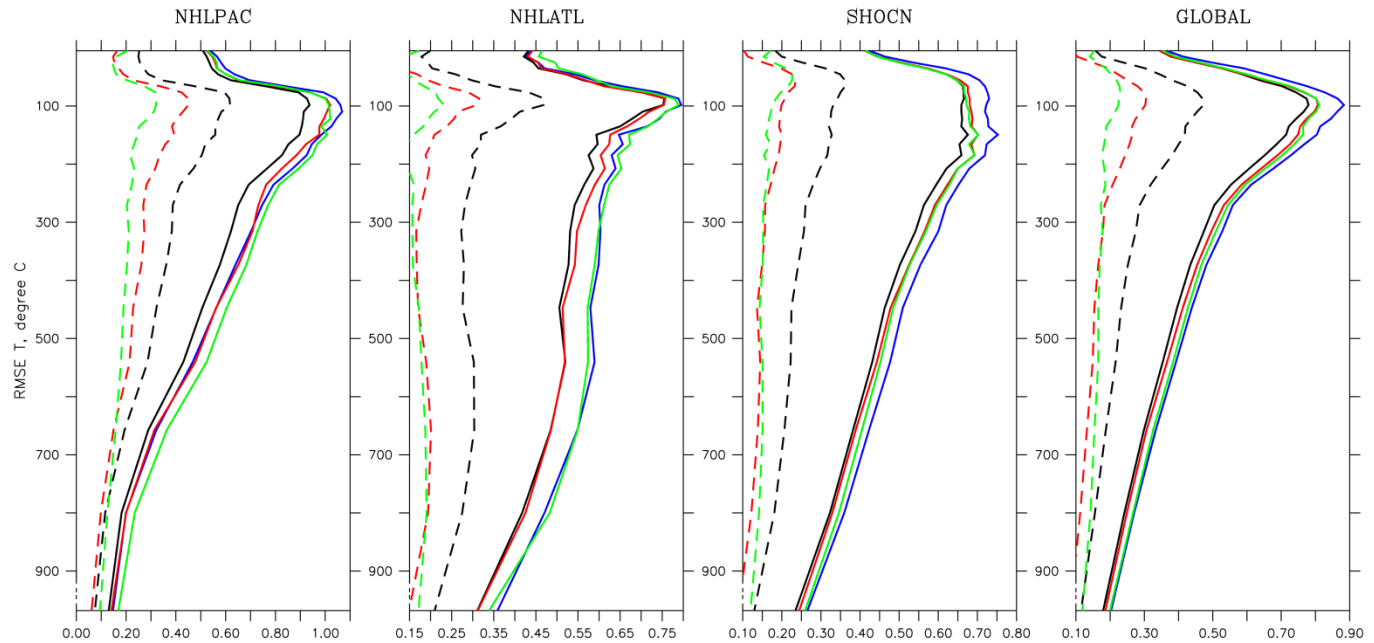
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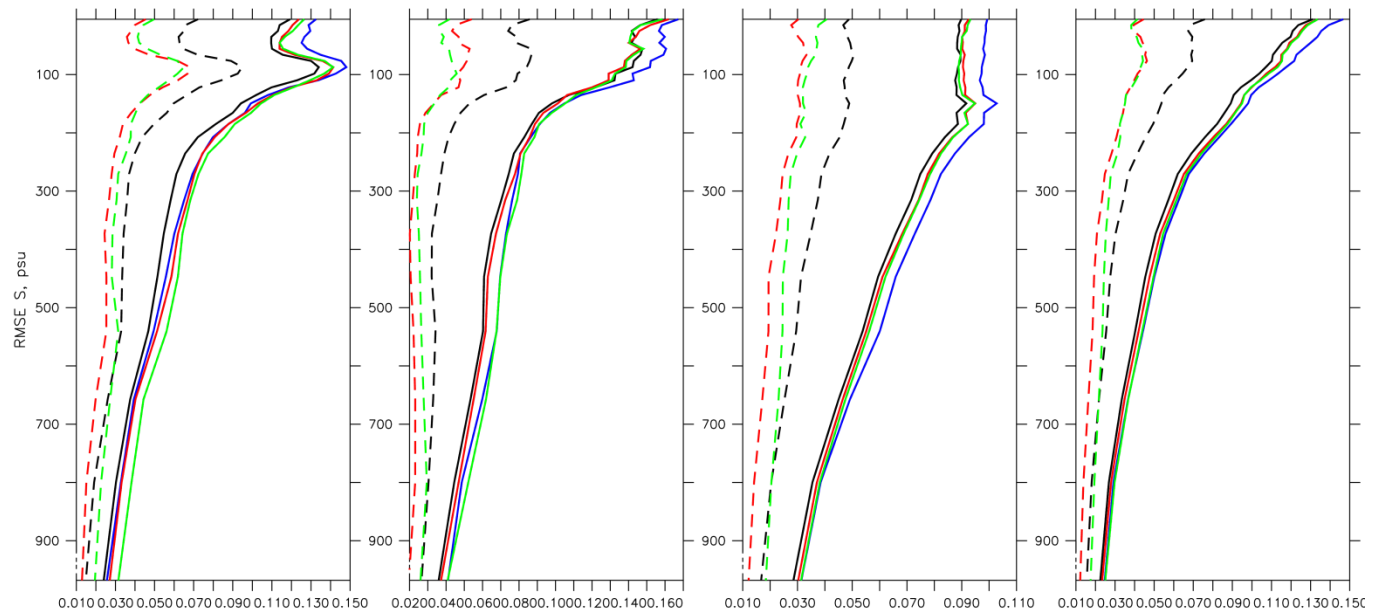
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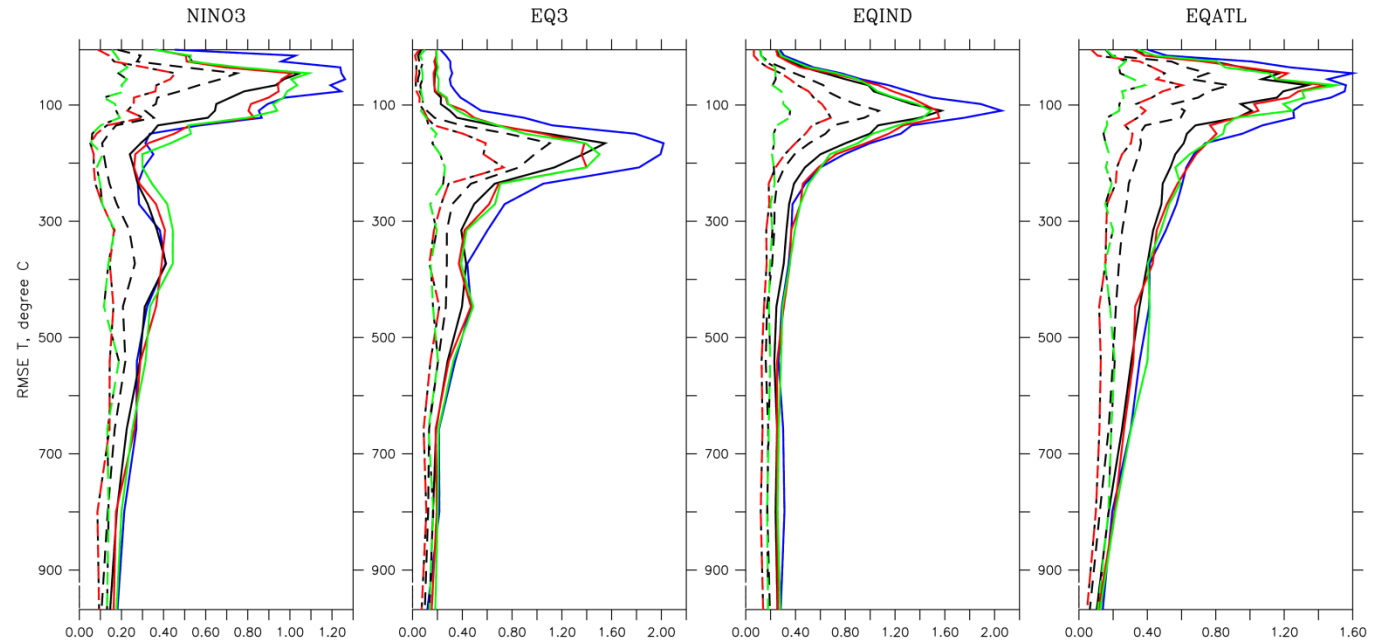
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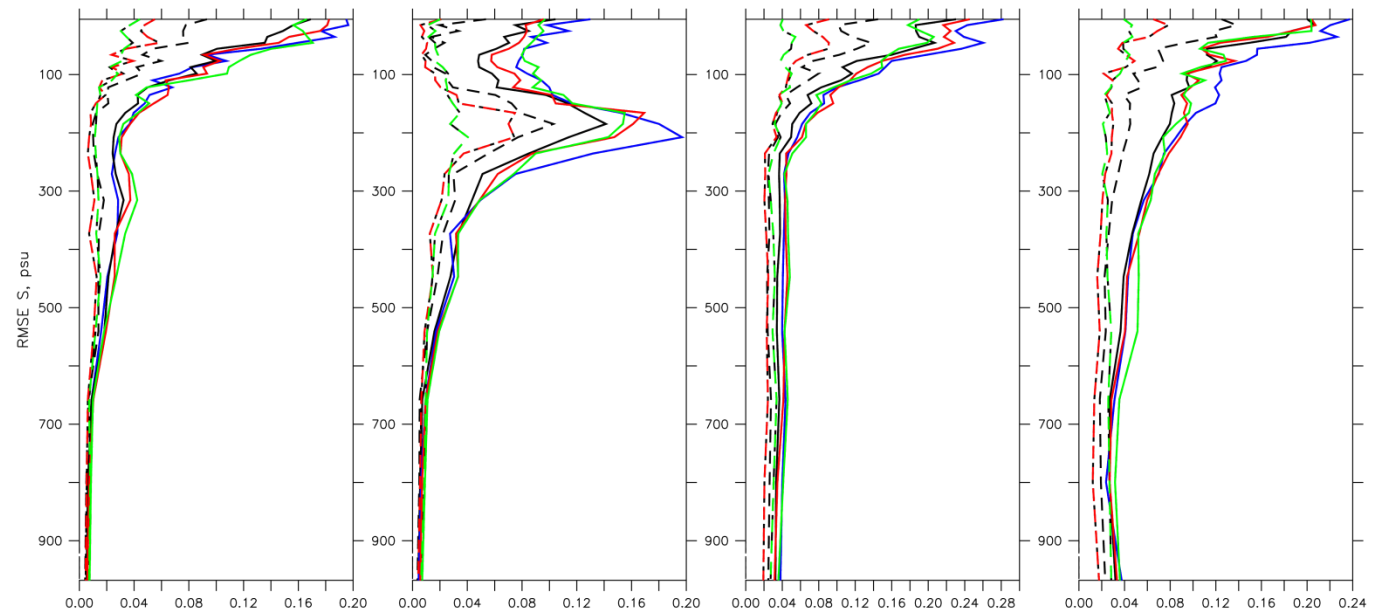
$\sigma S = 0.01, 0.01, 0.1 \text{ psu}$

RMS O-B(solid), O-A(dashed) 201112 (24-30 mean) for EXP1, EXP2, EXP3 and CTL

T



S



Kfactor=1,3,999

Rfactor=6,6,2

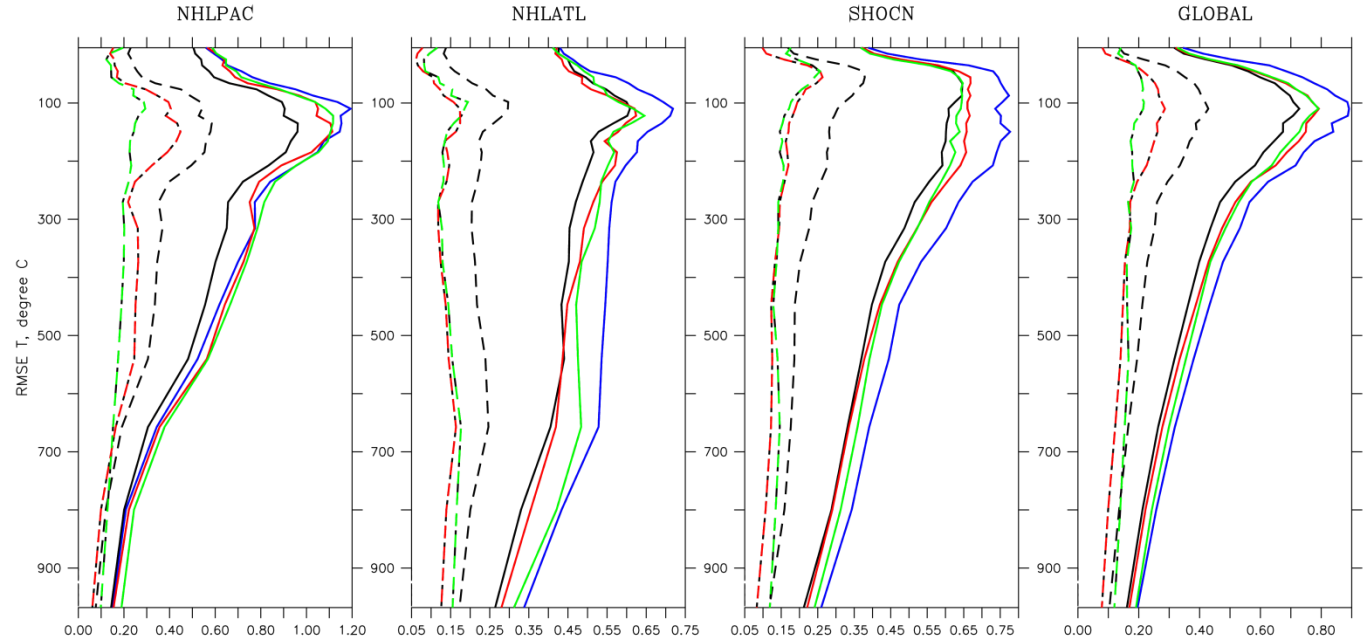
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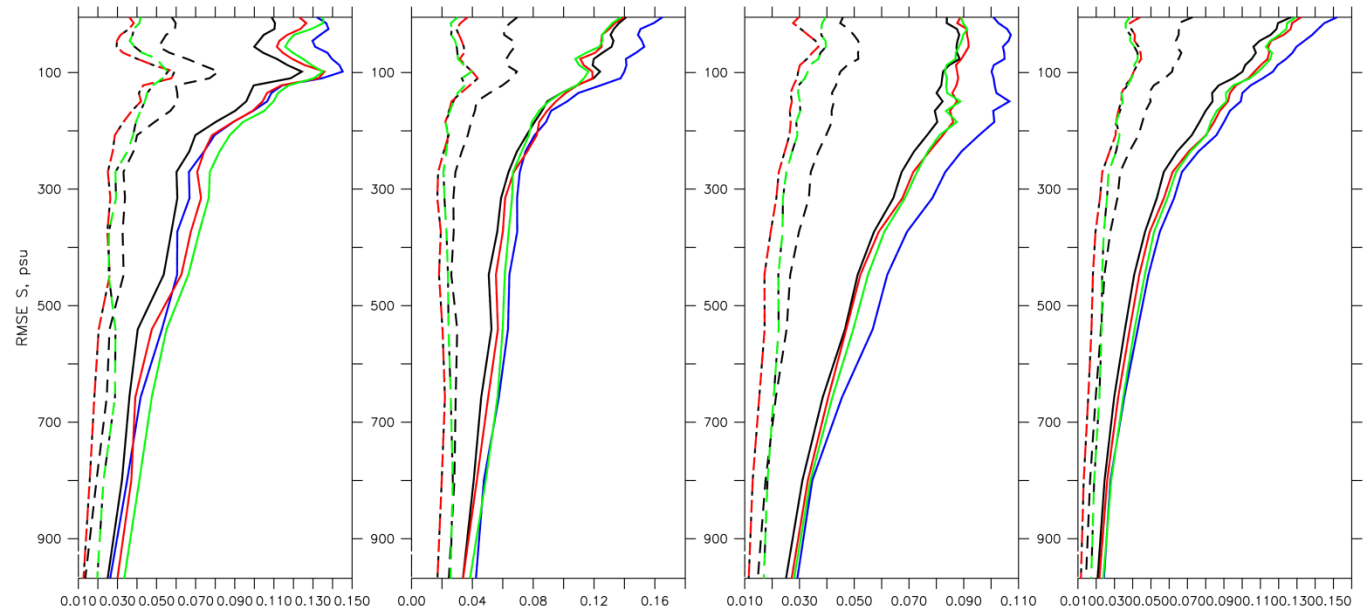
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T



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Summary

- Need to support a sub-seasonal to seasonal prediction system
- Implementing EnKF weakly coupled DA and ensemble generation with ACCESS-S2 and S3
- Ensemble of perturbations to the atmosphere, land and ocean for initialising forecasts



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Thank you...