

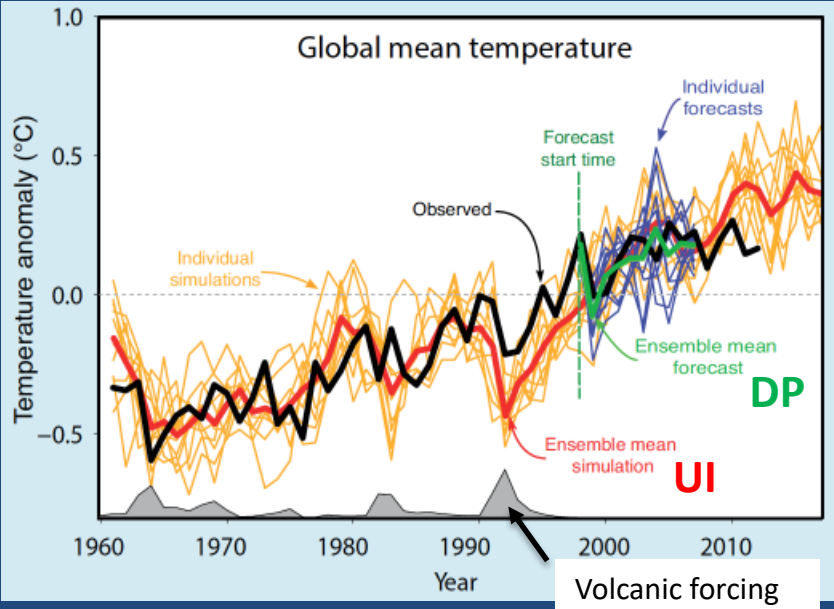
Decadal Climate Prediction in the Large Ensemble Limit

Steve Yeager

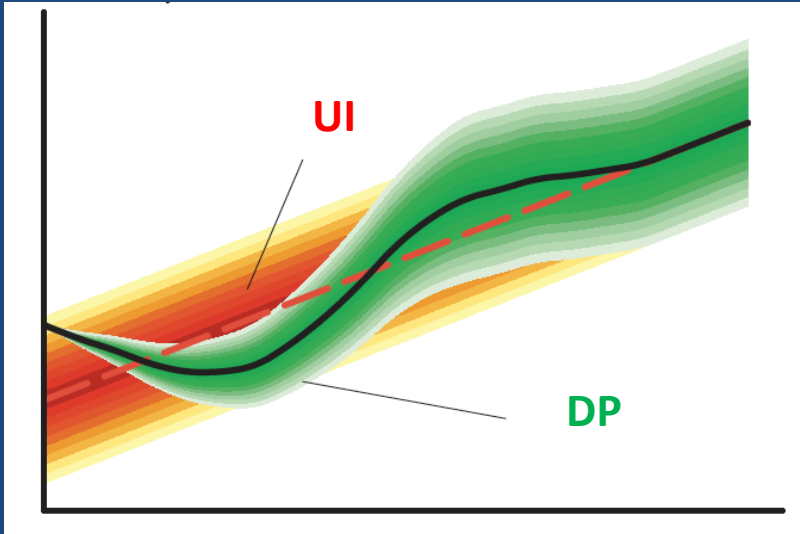
with the NCAR Decadal Prediction Group
(Nan Rosenbloom, Gary Strand, Gokhan Danabasoglu, Alicia Karspeck,
Keith Lindsay, Matt Long, Susan Bates, Jerry Meehl, Haiyan Teng)



Climate Projections vs. Climate Predictions



DP: initialized decadal prediction ensemble
UI: "uninitialized" 20th century ensemble
 Kirtman & Power (2013)

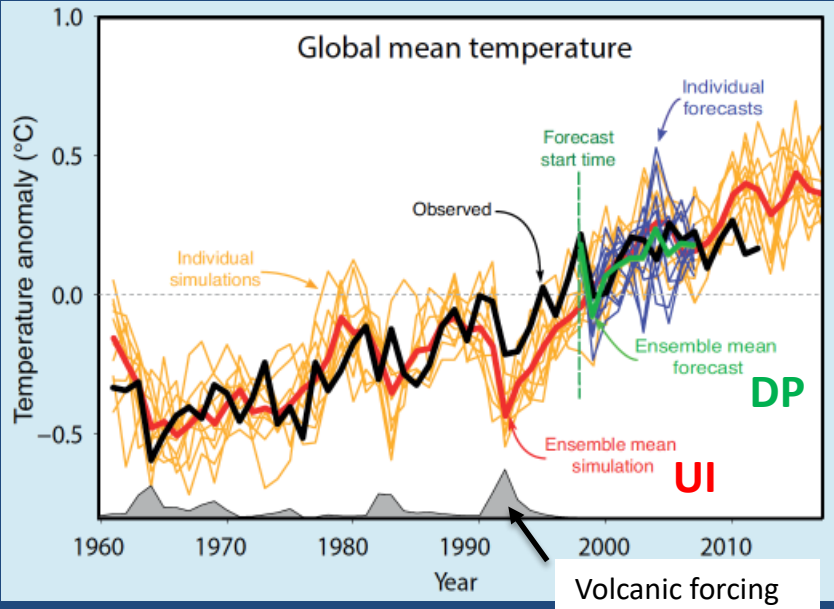


Branstator & Teng (2010)

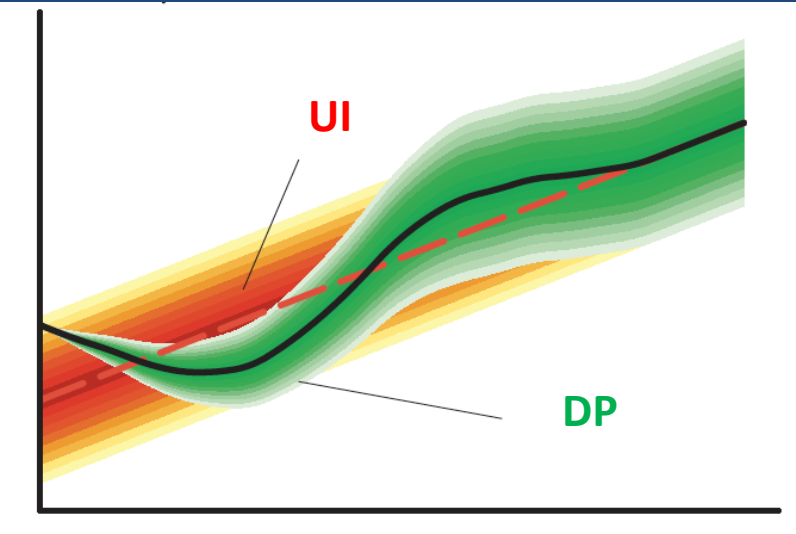
UI → Earth system response to **external** forcing (greenhouse gases, volcanic & anthropogenic aerosols, solar variations).
 "historical/projection simulations"

DP → Earth system response to external forcing and **internal** property redistributions (of heat, etc.) related to historical initialization.
 "hindcasts/forecasts"

Climate Projections vs. Climate Predictions



DP: initialized decadal prediction ensemble
UI: "uninitialized" 20th century ensemble
Kirtman & Power (2013)



Branstator & Teng (2010)

➔ Both ensembles (UI and DP) are needed to fully understand the mechanisms underpinning Earth system prediction. To what extent does initialization improve near-term regional climate outlooks?

The CESM Decadal Prediction Large Ensemble

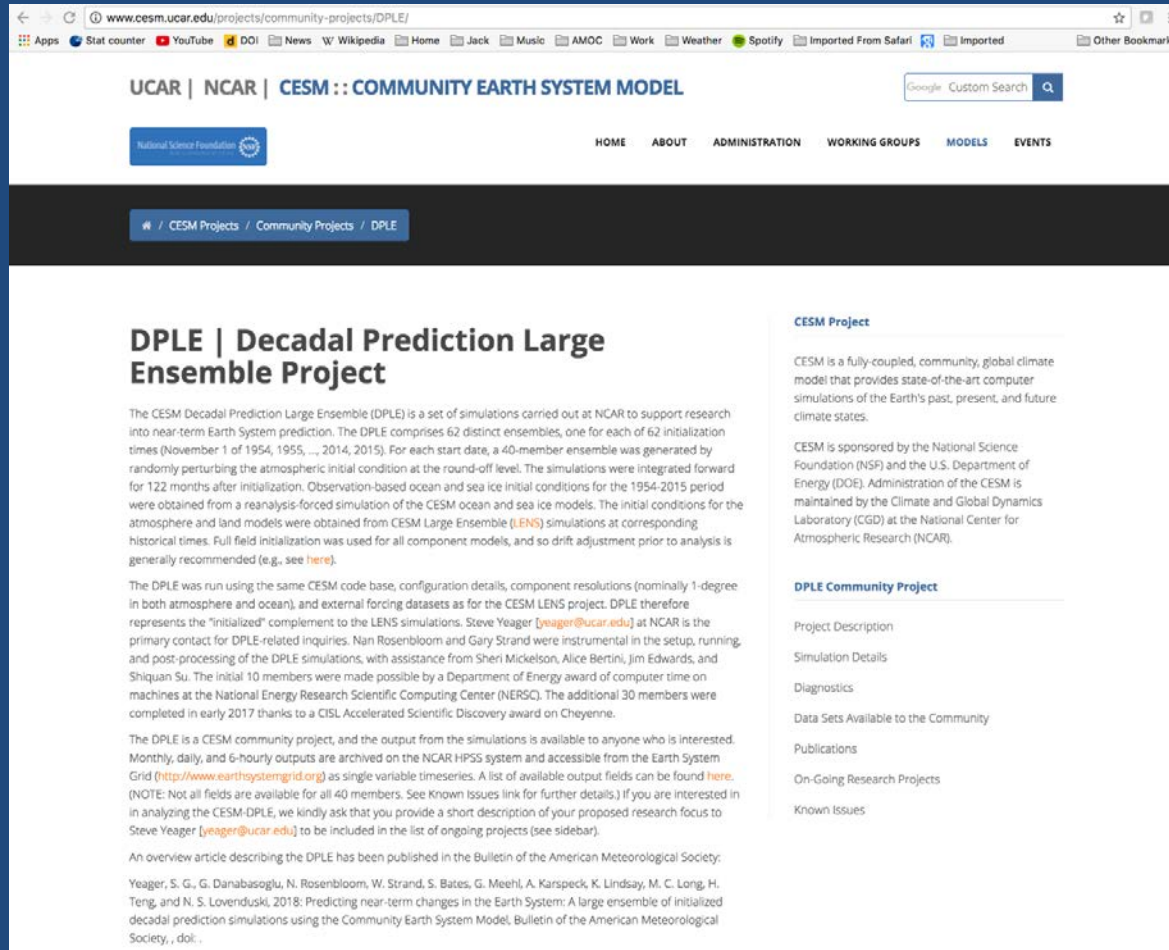
| Experiment Name | CCSM4-DP | CESM-DP-LE |
|---|---|---|
| <u>Model</u> -atm -ocn -ice -Ind | CCSM4 CAM4 (FV 1°, 26lvl) POP2 (1°, 60lvl) CICE4 (1°) CLM4 | CESM1.1 CAM5 (FV 1°, 30lvl) POP2 (1°, 60lvl) w/ BGC CICE4 (1°) CLM4 |
| UI Ensemble | 6-member CCSM4 20 th century ensemble (Meehl et al., 2012) | 40-member CESM 20th century Large Ensemble (Kay et al., 2015) |
| Forcing | -2005: CMIP5 historical 2006-: CMIP5 RCP 4.5 | -2005: CMIP5 historical 2006-: CMIP5 RCP 8.5 |
| <u>Initialization</u> -method -atm -ocn -ice -Ind | full field UI CORE-forced FOSI CORE-forced FOSI UI | full field UI CORE*-forced FOSI CORE*-forced FOSI UI |
| <u>DP Ensembles</u> -ensemble size -start dates -ensemble generation -simulation length | 10 annual; Jan. 1 st 1955-2014 (N=60) Variable January start days + round-off perturbation of atm initial conditions 120 months | 40 annual; Nov. 1st 1954-2015 (N=62) round-off perturbation of atm initial conditions 122 months |

CMIP5-era (2011)

CMIP6-era (2017)

The CESM Decadal Prediction Large Ensemble

<http://www.cesm.ucar.edu/projects/community-projects/DPLE/>



The screenshot shows the website for the CESM Decadal Prediction Large Ensemble (DPLE) project. The header includes the UCAR | NCAR | CESM logo and a navigation menu with links for HOME, ABOUT, ADMINISTRATION, WORKING GROUPS, MODELS, and EVENTS. A search bar is also present. The main content area features a breadcrumb trail: # / CESM Projects / Community Projects / DPLE. The title of the page is "DPLE | Decadal Prediction Large Ensemble Project". The text describes the project as a set of simulations carried out at NCAR to support research into near-term Earth System prediction. It mentions that the DPLE comprises 62 distinct ensembles, one for each of 62 initialization times (November 1 of 1954, 1955, ..., 2014, 2015). For each start date, a 40-member ensemble was generated by randomly perturbing the atmospheric initial condition at the round-off level. The simulations were integrated forward for 122 months after initialization. Observation-based ocean and sea ice initial conditions for the 1954-2015 period were obtained from a reanalysis-forced simulation of the CESM ocean and sea ice models. The initial conditions for the atmosphere and land models were obtained from CESM Large Ensemble (LENS) simulations at corresponding historical times. Full field initialization was used for all component models, and so drift adjustment prior to analysis is generally recommended (e.g., see [here](#)).

The DPLE was run using the same CESM code base, configuration details, component resolutions (nominally 1-degree in both atmosphere and ocean), and external forcing datasets as for the CESM LENS project. DPLE therefore represents the "initialized" complement to the LENS simulations. Steve Yeager [yeager@ucar.edu] at NCAR is the primary contact for DPLE-related inquiries. Nan Rosenbloom and Gary Strand were instrumental in the setup, running, and post-processing of the DPLE simulations, with assistance from Sheri Mickelson, Alice Bertini, Jim Edwards, and Shiquan Su. The initial 10 members were made possible by a Department of Energy award of computer time on machines at the National Energy Research Scientific Computing Center (NERSC). The additional 30 members were completed in early 2017 thanks to a CISL Accelerated Scientific Discovery award on Cheyenne.

The DPLE is a CESM community project, and the output from the simulations is available to anyone who is interested. Monthly, daily, and 6-hourly outputs are archived on the NCAR HPSS system and accessible from the Earth System Grid (<http://www.earthsystemgrid.org>) as single variable timeseries. A list of available output fields can be found [here](#). (NOTE: Not all fields are available for all 40 members. See Known Issues link for further details.) If you are interested in analyzing the CESM-DPLE, we kindly ask that you provide a short description of your proposed research focus to Steve Yeager [yeager@ucar.edu] to be included in the list of ongoing projects (see sidebar).

An overview article describing the DPLE has been published in the Bulletin of the American Meteorological Society: Yeager, S. G., G. Danabasoglu, N. Rosenbloom, W. Strand, S. Bates, G. Meehl, A. Karspeck, K. Lindsay, M. C. Long, H. Teng, and N. S. Lovenduski, 2018: Predicting near-term changes in the Earth System: A large ensemble of initialized decadal prediction simulations using the Community Earth System Model. Bulletin of the American Meteorological Society, doi: .

The right sidebar contains a "CESM Project" section with a description of CESM as a fully-coupled, community, global climate model that provides state-of-the-art computer simulations of the Earth's past, present, and future climate states. It also mentions that CESM is sponsored by the National Science Foundation (NSF) and the U.S. Department of Energy (DOE). Administration of the CESM is maintained by the Climate and Global Dynamics Laboratory (CGD) at the National Center for Atmospheric Research (NCAR).

Below that is a "DPLE Community Project" section with a list of links: Project Description, Simulation Details, Diagnostics, Data Sets Available to the Community, Publications, On-Going Research Projects, and Known Issues.



Want to analyze CESM-DP-LE? Send me a short description of your research topic.

Yeager et al., 2018: Predicting near-term changes in the Earth System: A large ensemble of initialized decadal prediction simulations using the Community Earth System Mode, *Bull Amer Meteor Soc*, in revision.

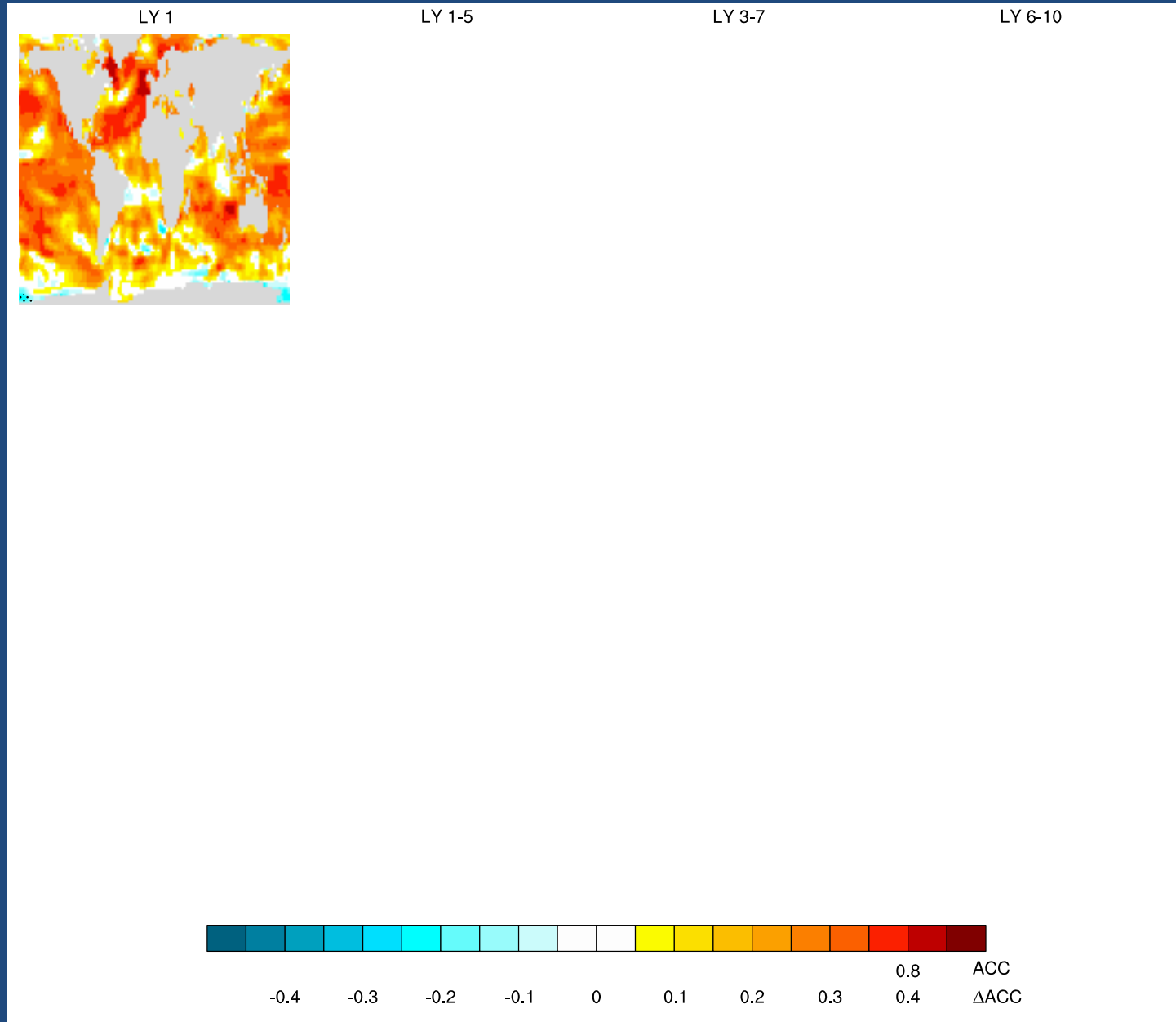
Annual Ocean Heat Content (295m)

(OBS = EN4)

→ Anomaly correlation coefficient (ACC)

→ Skill improvement over persistence

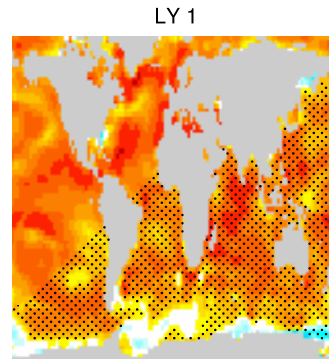
→ Skill improvement over UI



→ Anomaly correlation coefficient (ACC)

→ Skill improvement over persistence

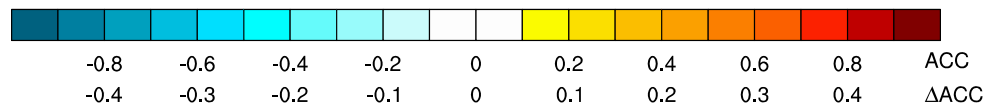
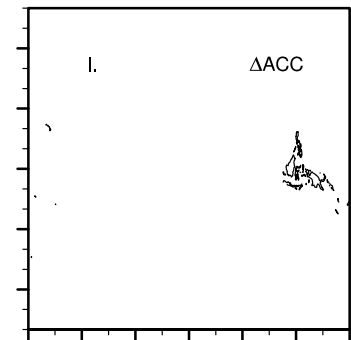
→ Skill improvement over UI



LY 1-5

LY 3-7

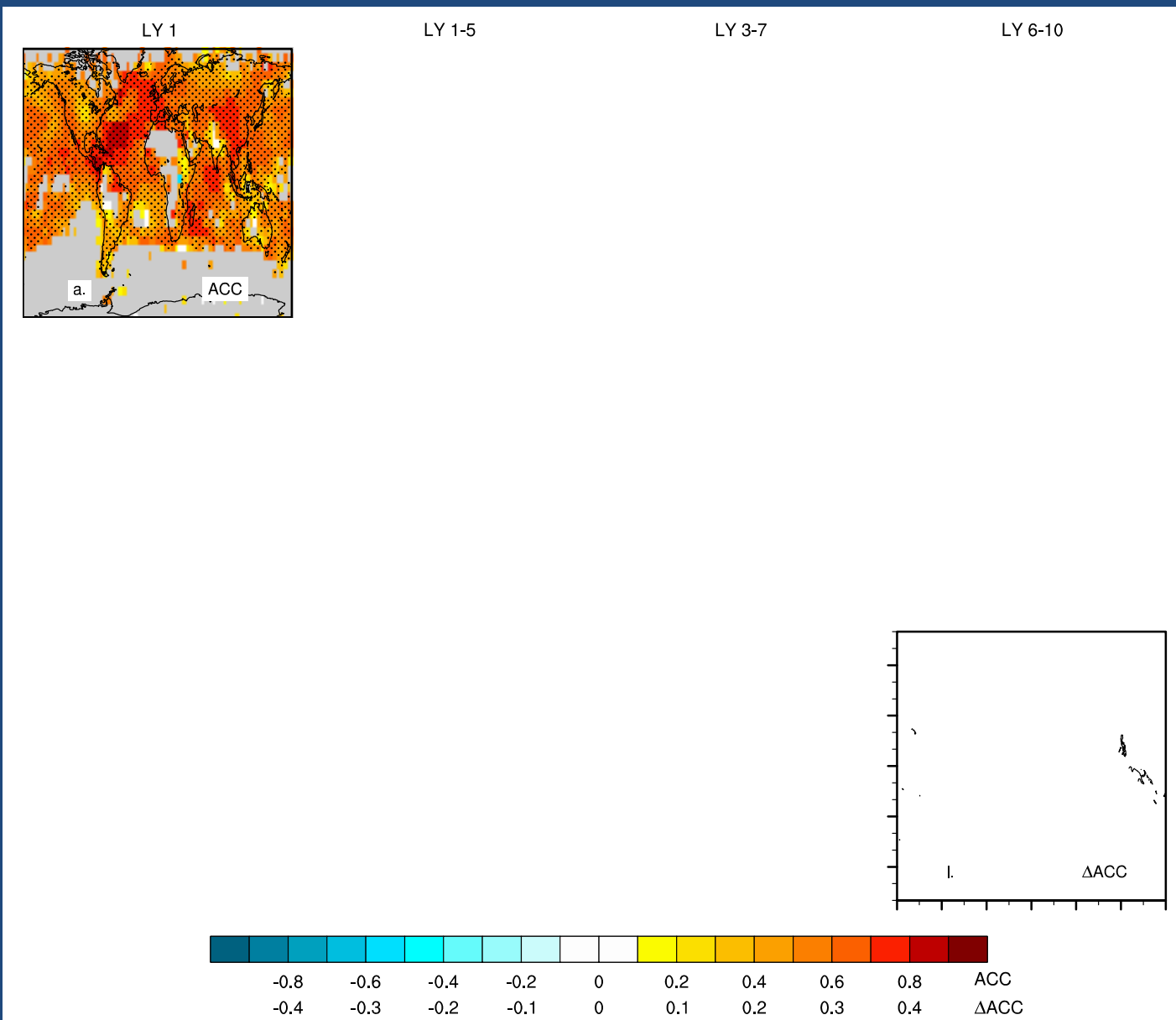
LY 6-10



→ Anomaly correlation coefficient (ACC)

→ Skill improvement over persistence

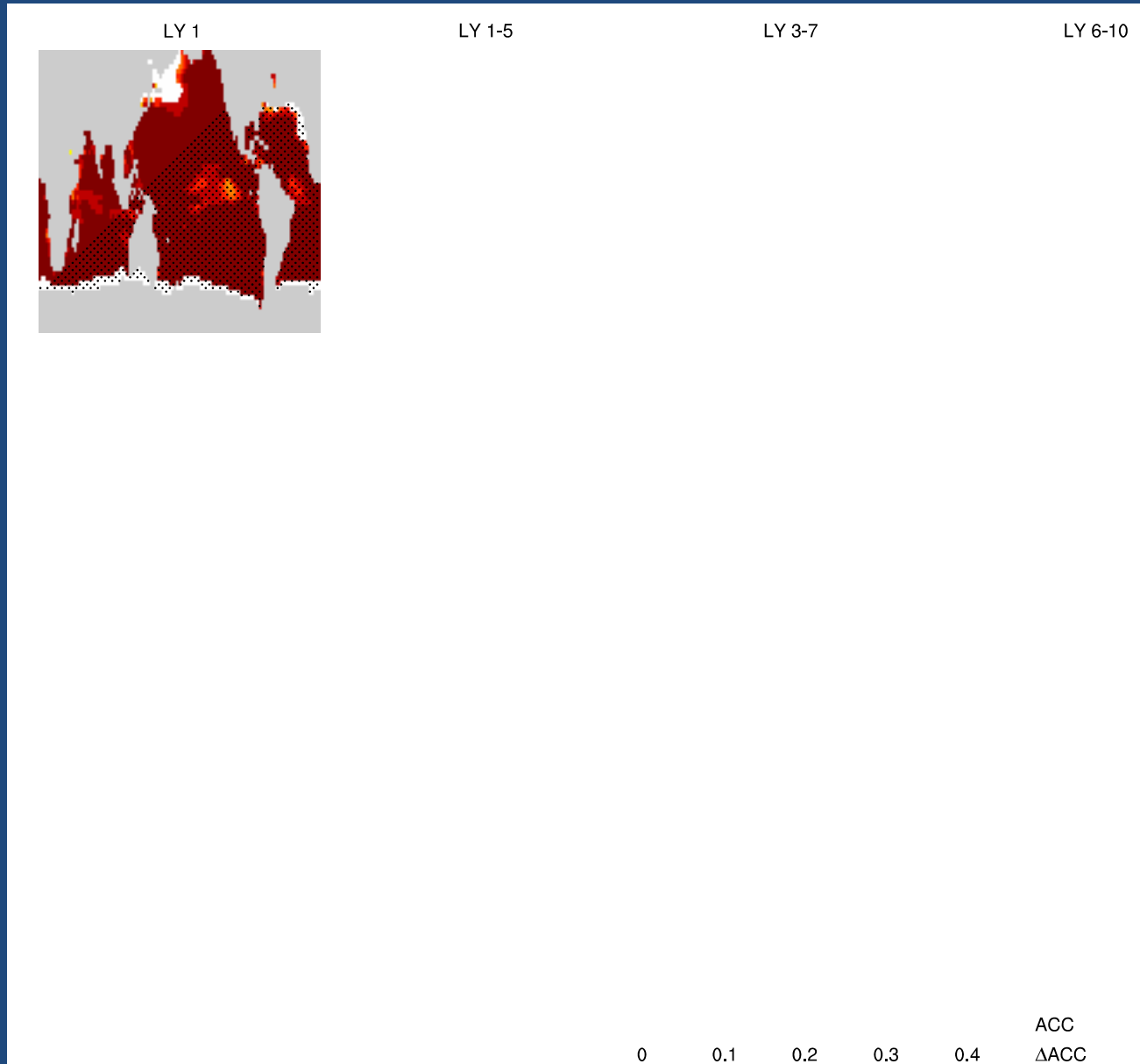
→ Skill improvement over UI



→ Anomaly correlation coefficient (ACC)

→ Skill improvement over persistence

→ Skill improvement over UI

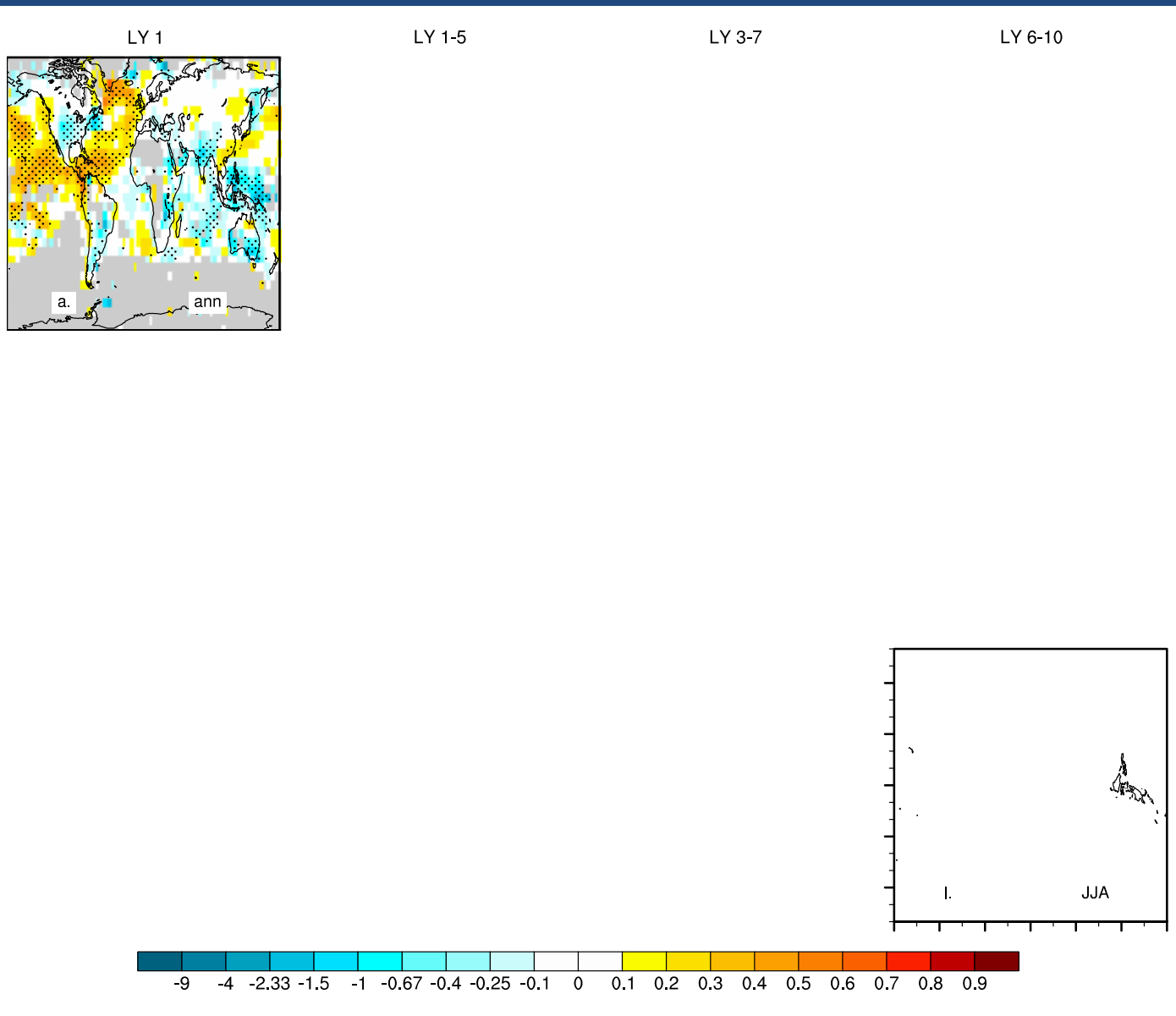


MSSS using UI as reference forecast ($N_{DP}=40$, $N_{UI}=40$)

→ Annual

→ DJF

→ JJA



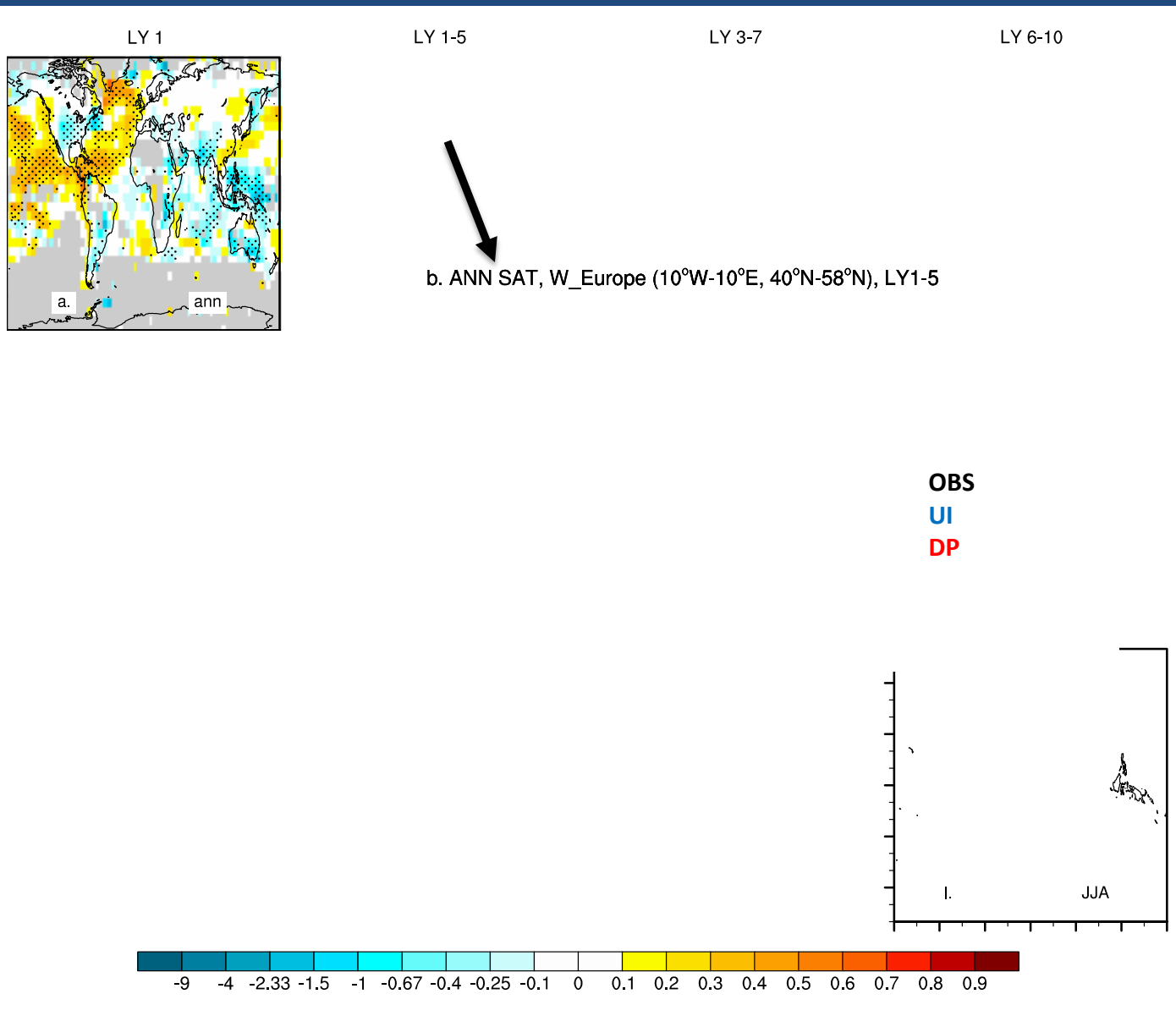
$$1 - \frac{MSE_{DP}}{MSE_{ref}}$$

MSSS using UI as reference forecast ($N_{DP}=40$, $N_{UI}=40$)

→ Annual

→ DJF

→ JJA

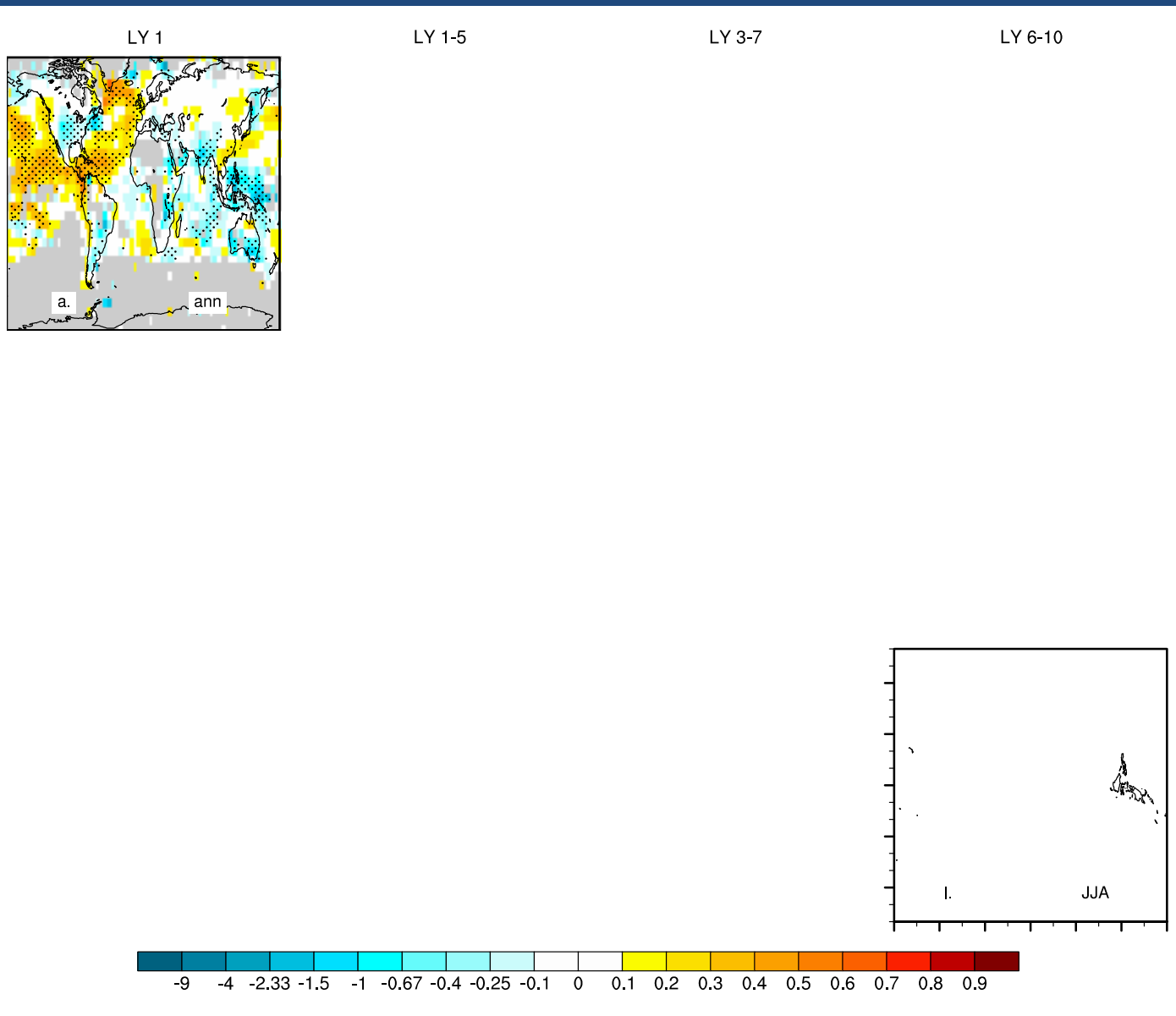


MSSS using UI as reference forecast ($N_{DP}=40$, $N_{UI}=40$)

→ Annual

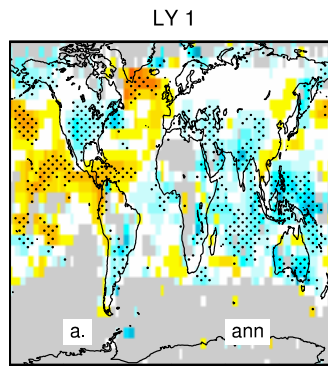
→ DJF

→ JJA



MSSS using UI as reference forecast ($N_{DP}=10$, $N_{UI}=40$)

→ Annual



LY 1-5

LY 3-7

LY 6-10

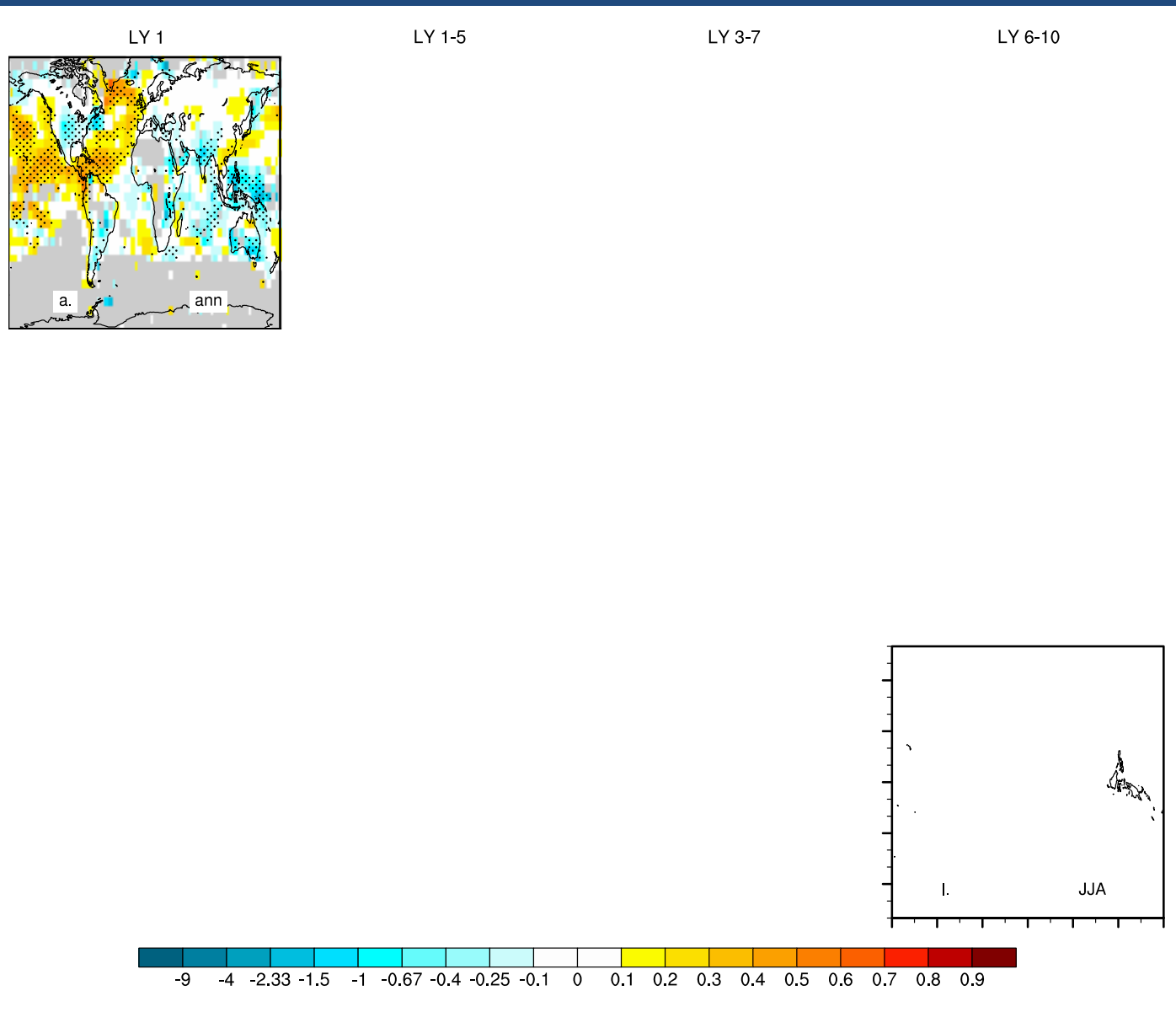
→ DJF

→ JJA

5 -1 -0.67 -0.4 -0.25 -0.1 0 0.1 0.2 0.3 0.4 0.5 0.6 0.7 0.8 0.9

MSSS using UI as reference forecast ($N_{DP}=40$, $N_{UI}=40$)

→ Annual

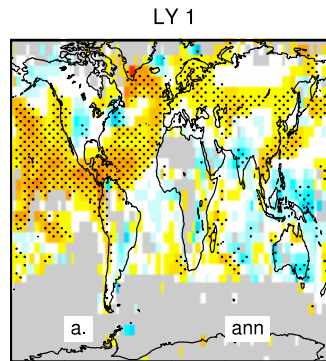


→ DJF

→ JJA

MSSS using UI as reference forecast ($N_{DP}=40$, $N_{UI}=10$)

→ Annual



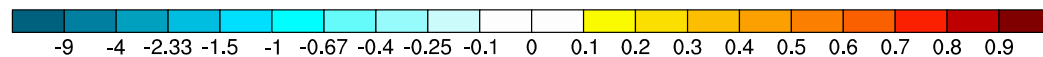
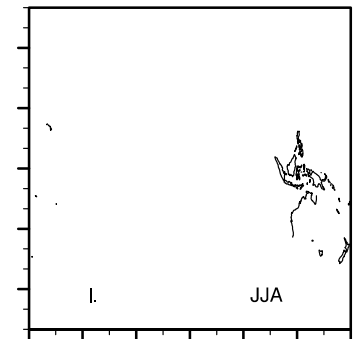
LY 1-5

LY 3-7

LY 6-10

→ DJF

→ JJA

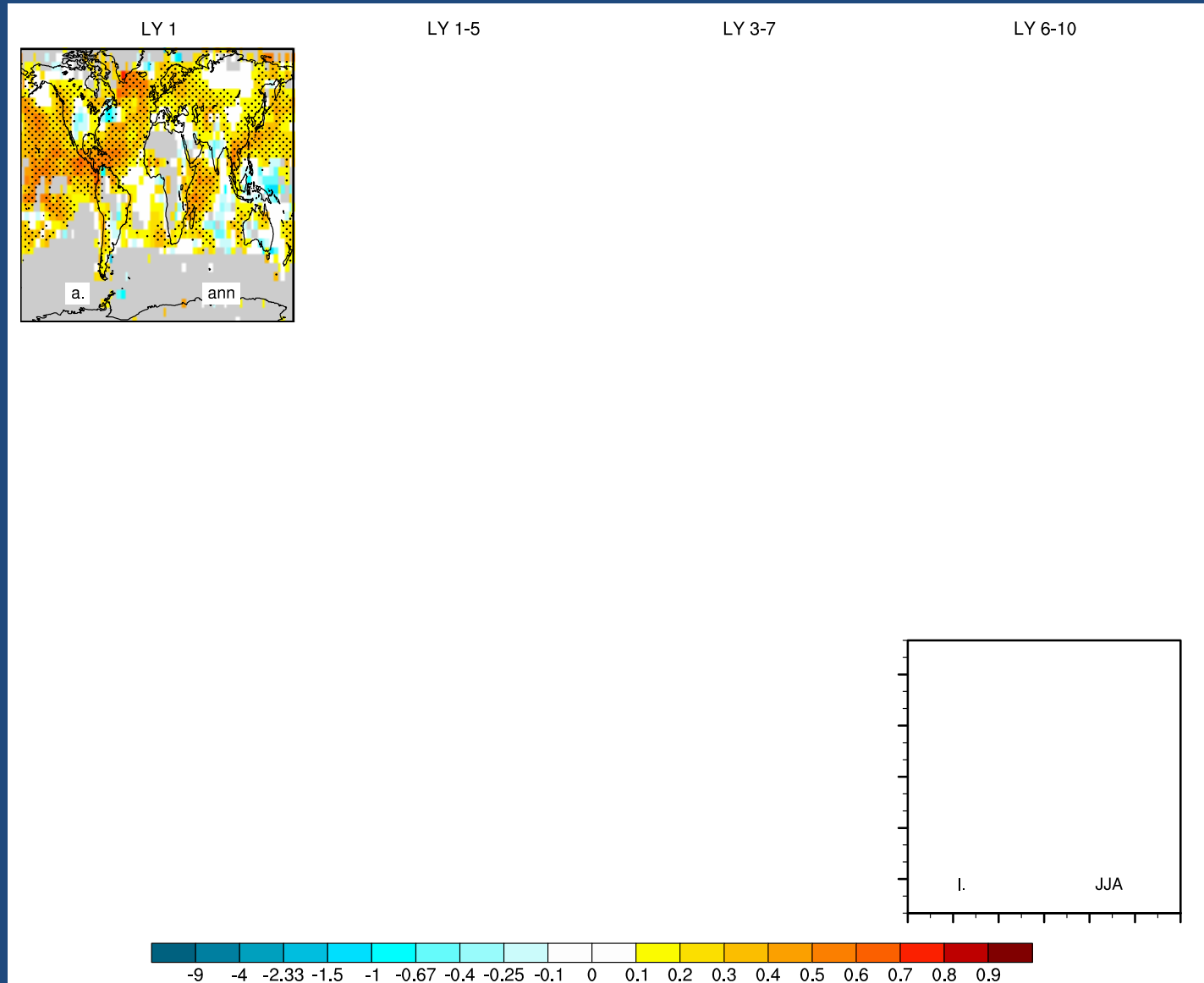


MSSS using UI as reference forecast ($N_{DP}=40$, $N_{UI}=5$)

→ Annual

→ DJF

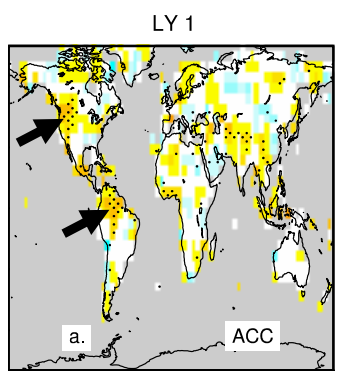
→ JJA



Seasonal Precipitation (JAS)

(verified against CRU-TS 3.24)

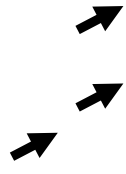
ACC



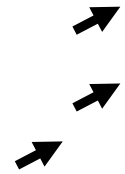
LY 1-5



LY 3-7

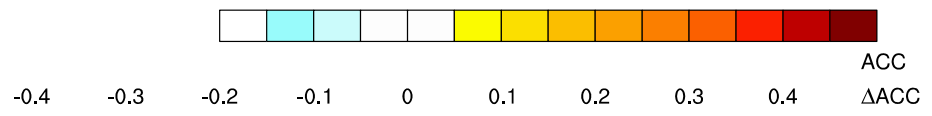


LY 6-10



Δ ACC
(relative to persistence)

Δ ACC
(relative to uninitialized)



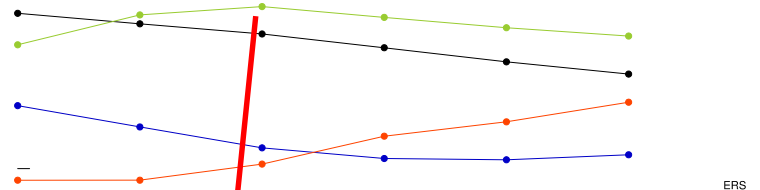
Sahel Precipitation (JAS)

(verified against CRU-TS 3.24)



b. JAS PRE, Sahel (20°W-10°E, 10°N-20°N), LY3-7

JAS PREC, Sahel (20°W-10°E, 10°N-20°N)

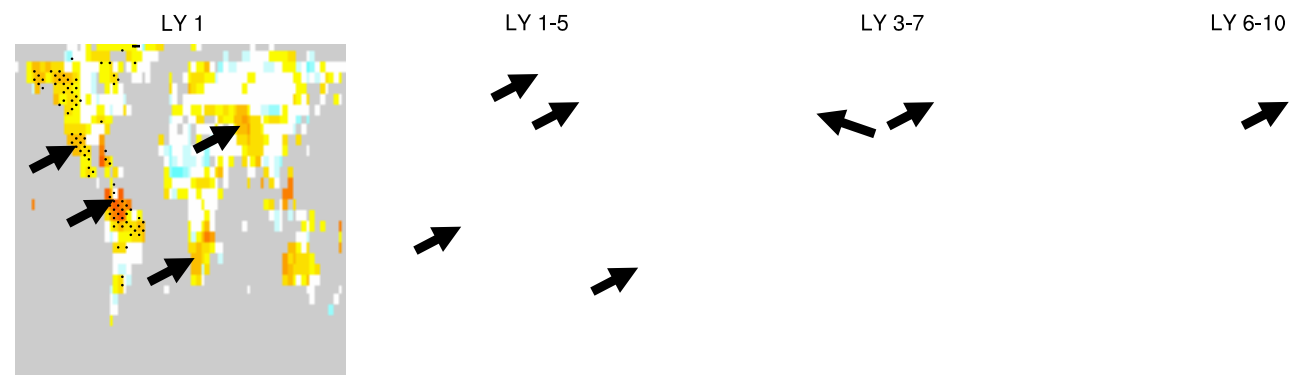


LY 3-7

Seasonal Precipitation (JFM)

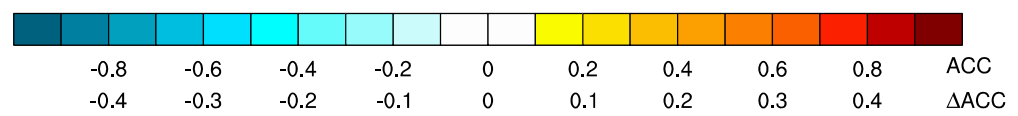
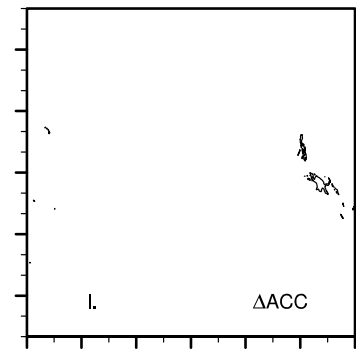
(verified against CRU-TS 3.24)

ACC

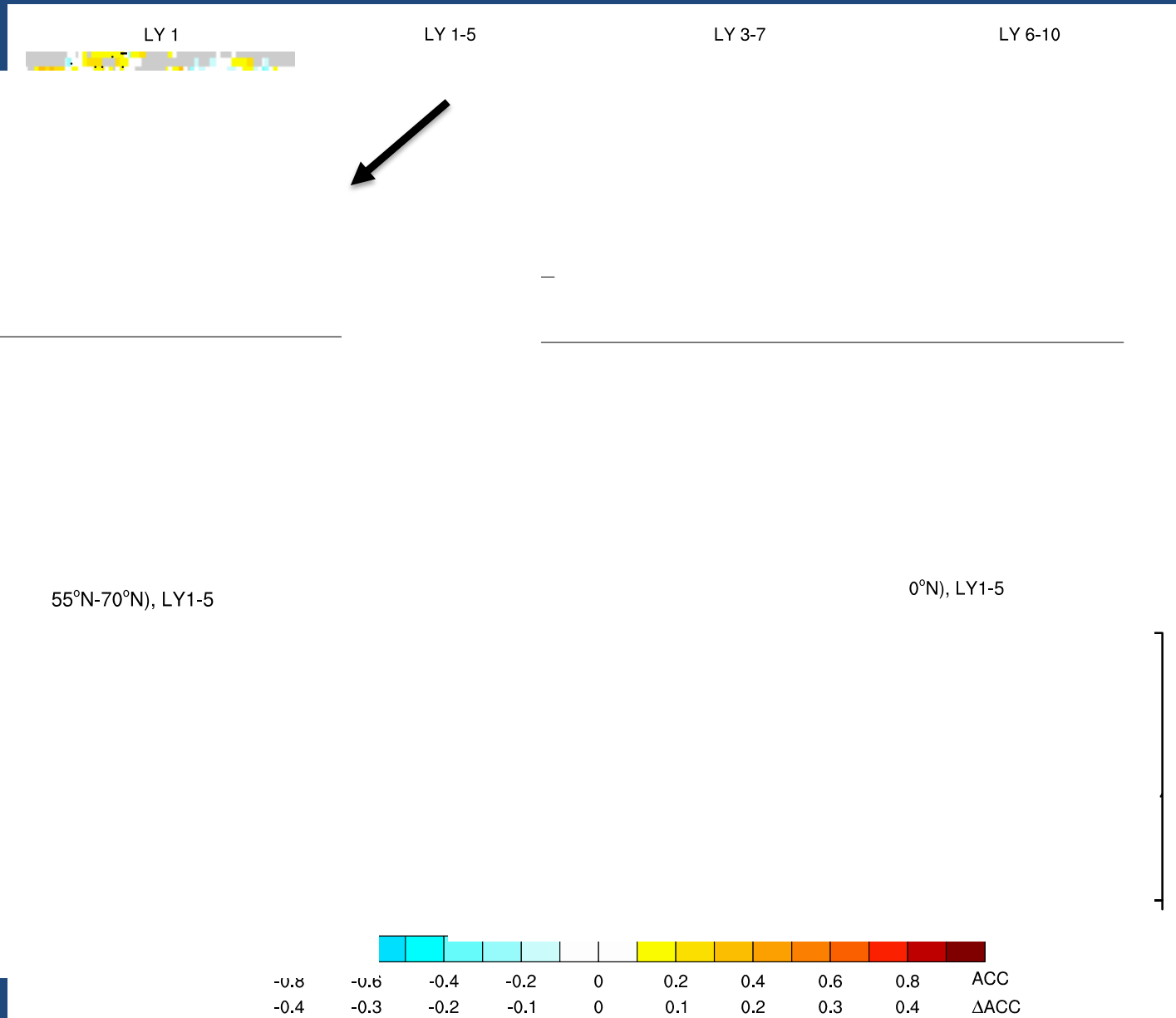


Δ ACC
(relative to persistence)

Δ ACC
(relative to uninitialized)



(N_DP=40, N_UI=40)

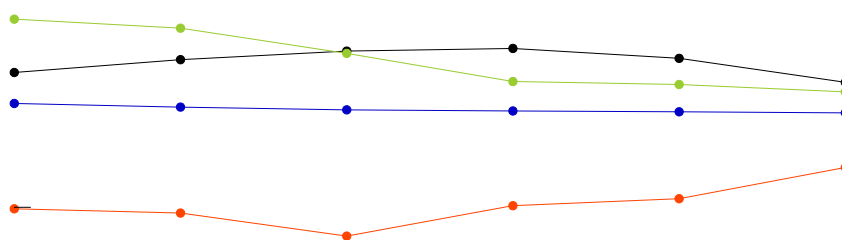


(N_DP=40, N_UI=40)

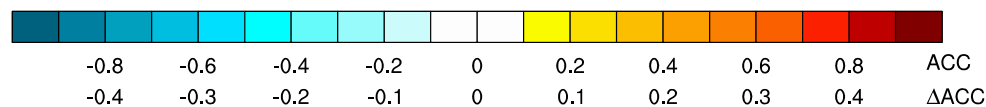
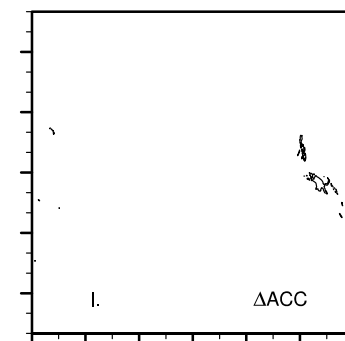
→ Anomaly correlation coefficient (ACC)



JFM PREC, Scandinavia (0°W-30°E, 55°N-70°N)



ERS



over OI

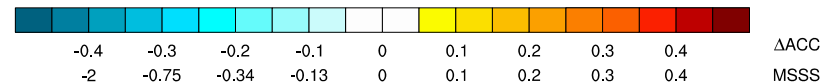
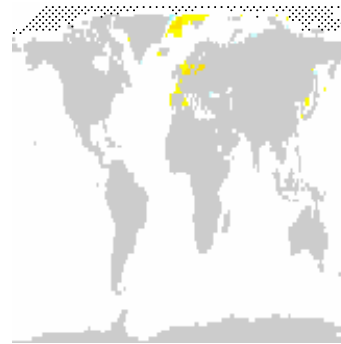
What influences JFM PRECIP skill over Scandinavia?

Scandinavia

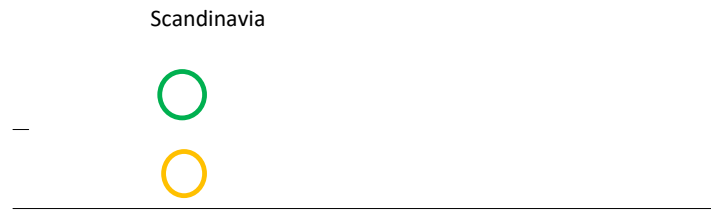


LY1-5 skill conditioned on JFM Scandinavia PRECIP
(ensemble size = 1) : GREEN - ORANGE

Hindcasts skillful at JFM PRECIP over Scandinavia tend to show improved NAO-like winter SLP, but no clear improvement in SST skill.

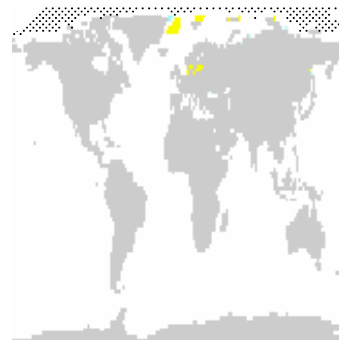


What influences JFM PRECIP skill over Scandinavia?



LY1-5 skill conditioned on JFM Scandinavia PRECIP
(ensemble size = 10) : GREEN - ORANGE

Hindcasts skillful at JFM PRECIP over Scandinavia tend to show improved NAO-like winter SLP, but no clear improvement in SST skill.



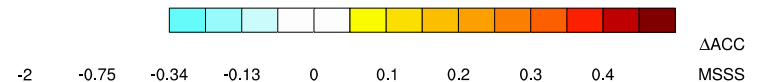
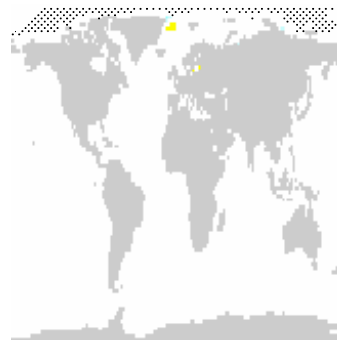
What influences JFM PRECIP skill over Scandinavia?

Scandinavia



LY1-5 skill conditioned on JFM Scandinavia PRECIP
(ensemble size = 30) : GREEN - ORANGE

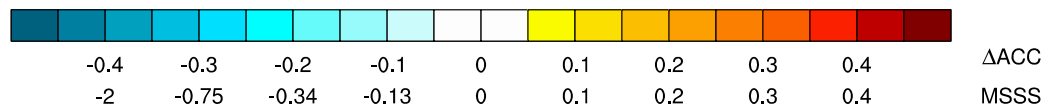
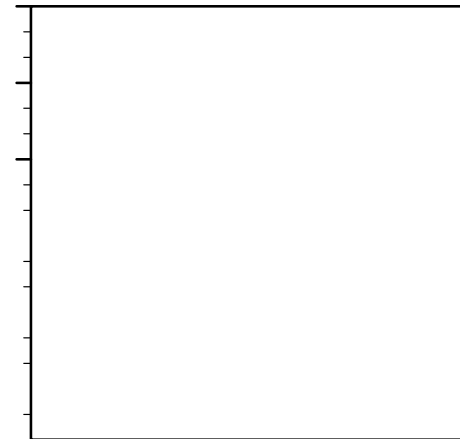
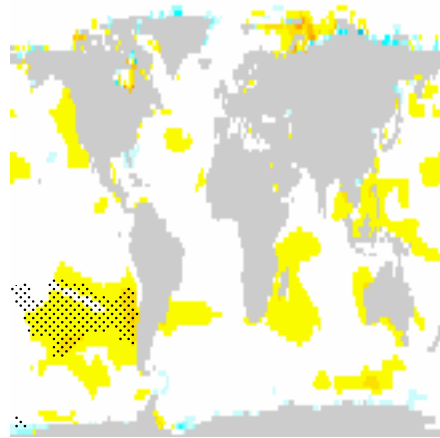
Hindcasts skillful at JFM PRECIP over Scandinavia tend to show improved NAO-like winter SLP, but no clear improvement in SST skill.



How does JFM skill change with ensemble size?

JFM LY1-5 skill difference for different DP ensemble sizes: (N=40) - (N=5)

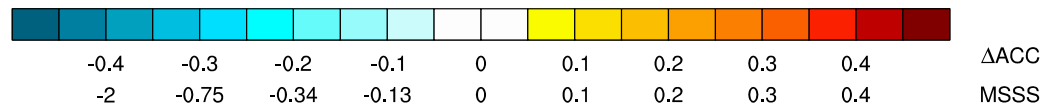
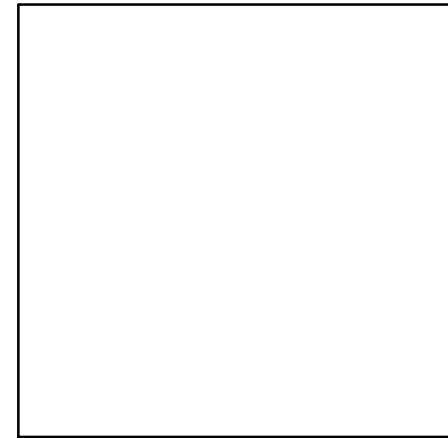
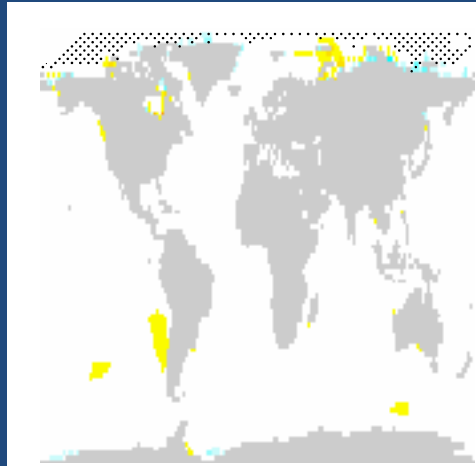
Winter SLP over Nordic Seas appears particularly amenable to improvement through increased ensemble size.



How does JFM skill change with ensemble size?

JFM LY1-5 skill difference for different DP ensemble sizes: (N=40) - (N=10)

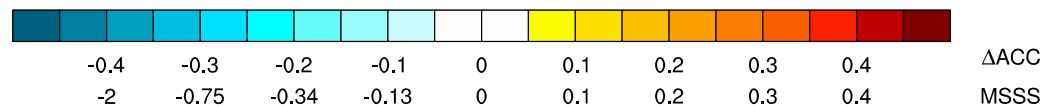
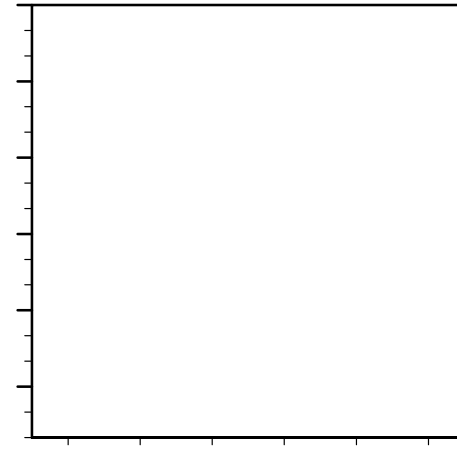
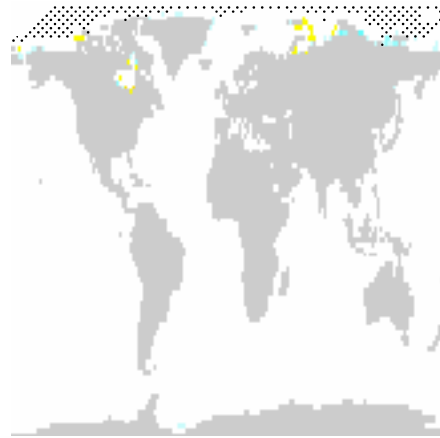
Winter SLP over Nordic Seas appears particularly amenable to improvement through increased ensemble size.



How does JFM skill change with ensemble size?

JFM LY1-5 skill difference for different DP ensemble sizes: (N=40) - (N=15)

Winter SLP over Nordic Seas appears particularly amenable to improvement through increased ensemble size.



Summary

- CESM-DP-LE is a rich community data resource in support of near-term Earth System prediction research. Public release with web/journal¹ documentation coming soon (Check <http://www.cesm.ucar.edu/projects/community-projects/>).
- Significant skill improvements over NCAR's previous (CMIP5-era) decadal prediction system, particularly over land.
- Ocean biogeochemistry fields permit exploration of new frontiers in DP science.
- Complementary large ensembles for both initialized and uninitialized² sets offer unprecedented statistical power for disentangling the relative roles of external forcing & internal dynamics in recent climate variability & predictability.

¹Yeager et al., 2018: Predicting near-term changes in the Earth System: A large ensemble of initialized decadal prediction simulations using the Community Earth System Mode, *BAMS*, in revision.

²Kay et al., 2015: The Community Earth System Model (CESM) Large Ensemble Project: A Community Resource for Studying Climate Change in the Presence of Internal Climate Variability, *BAMS*, doi:10.1175/BAMS-D-13-00255.1.

Is skill for winter
precip over
Scandinavia related
to prediction of low-
frequency winter
NAO?

—

b. DJF NAO (station-based), LY2-6