

# Using empirical-statistical downscaling to quantify climate change impacts

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# Main message

*Empirical-statistical downscaling* (**ESD**) can be used to estimate change in *any* variable that is affected by large-scale conditions.

For climate change projections, downscale “climate” rather than “weather”.

**ESD** is suitable for probabilistic information and large multi-model ensembles.

# What is “downscaling”?

Utilise inter-scale dependency to predict local outcomes.



# **Scales**

**Scales  $\neq$  sample size.**

**E.g. the scale for seasonal statistics  
of hourly rainfall is ...**

# Why downscaling?

Models have a minimum skillful scale.

Use predictors that are **skillfully simulated by GCMs**.

A shift in statistics is due to changed physical conditions/phenomena

# Different types of downscaling

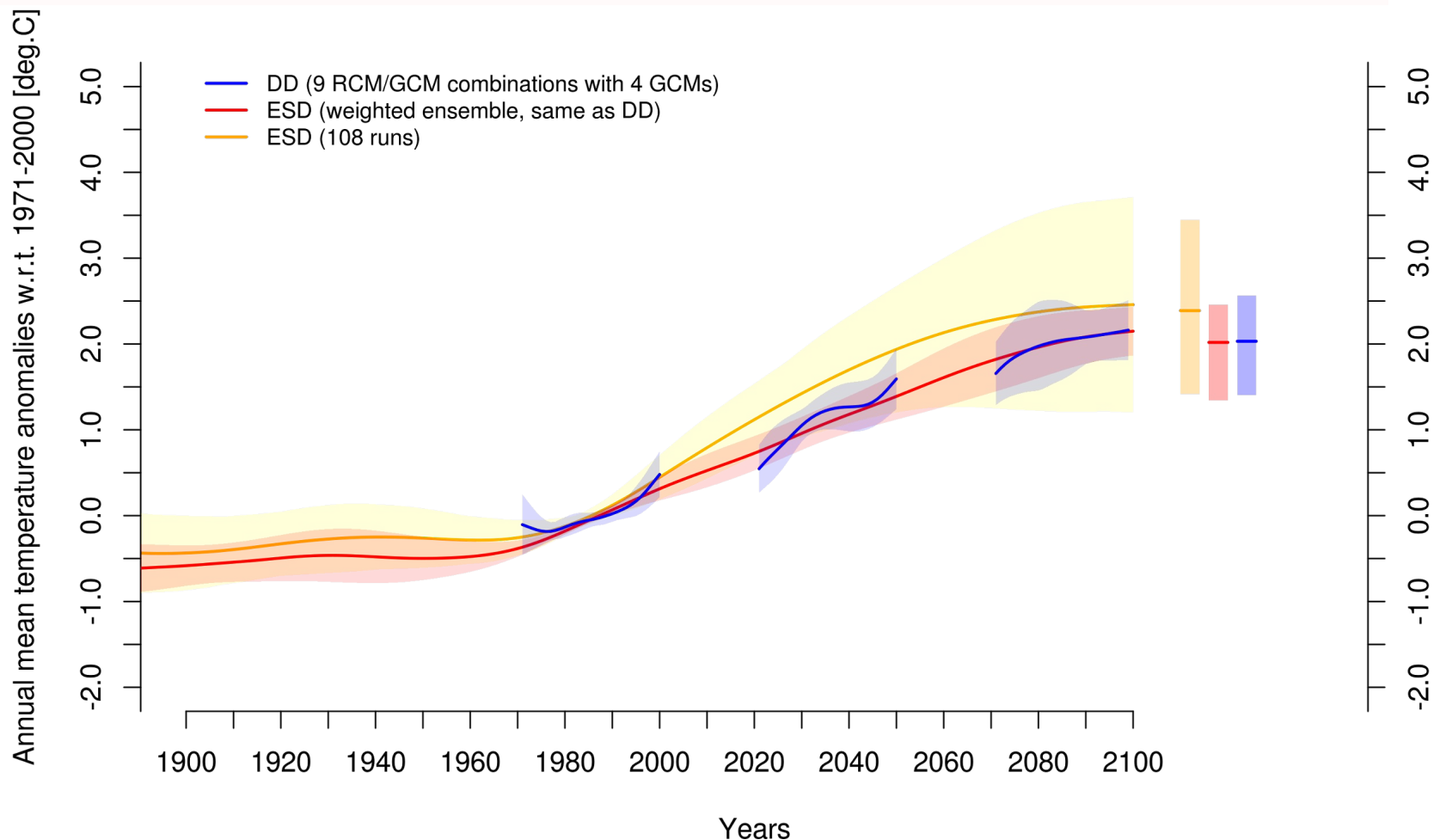
**RCMs:** source=primitive physical equations + parameterisation

**ESD:** source=empirical + statistical theory.

# Robust downscaling

RCM & ESD make use of independent information

ESD can be used to downscale different information to RCMs.



# Physical consistency?

Strictly **not** in either RCMs nor ESD.

RCMs: different energy and mass fluxes to GCM.

ESD: PCA-based predictands can conserve inter-variable covariance.



# Statistical model in ESD

Make linear through transformations:  $\mathbf{y} = \mathbf{f}(\mathbf{X})$

Multiple regression? Analog? Weather generator?

$\mathbf{X}$  = common EOFs (bias corrected)

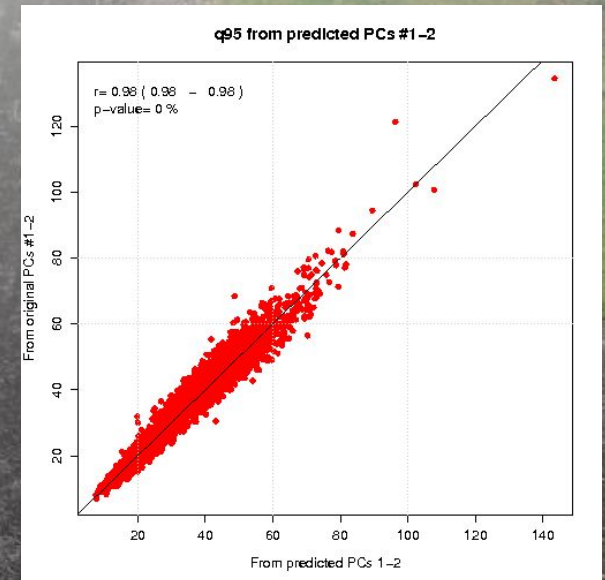
Suitable for both **statistical parameters** and **LARGE ensembles**.

# The “rain equation”

$$\Pr(X > x) = f_w e^{-x/\mu}$$

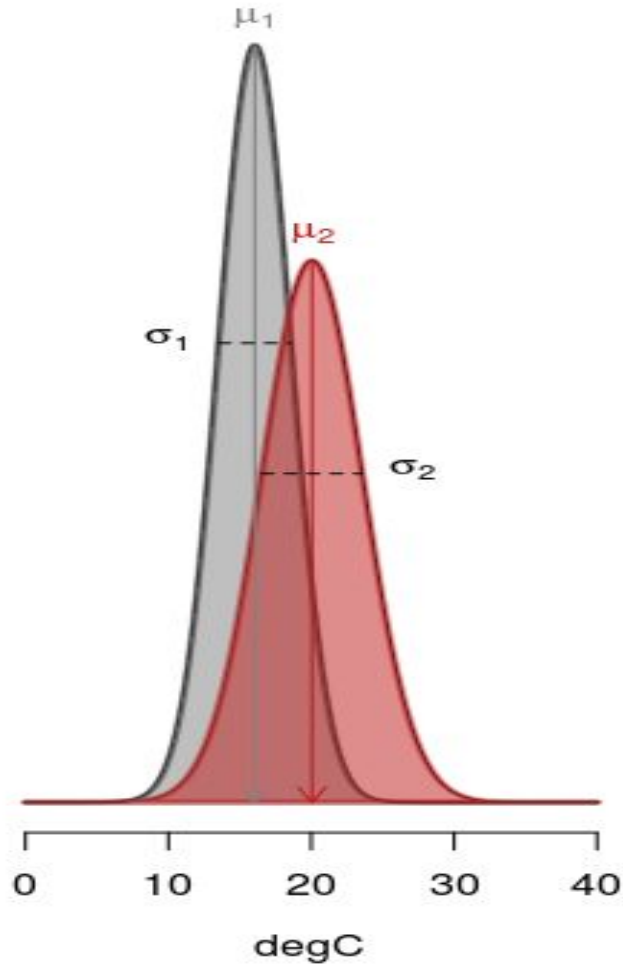
$f_w$  = wet-day frequency

$\mu$  = wet-day mean

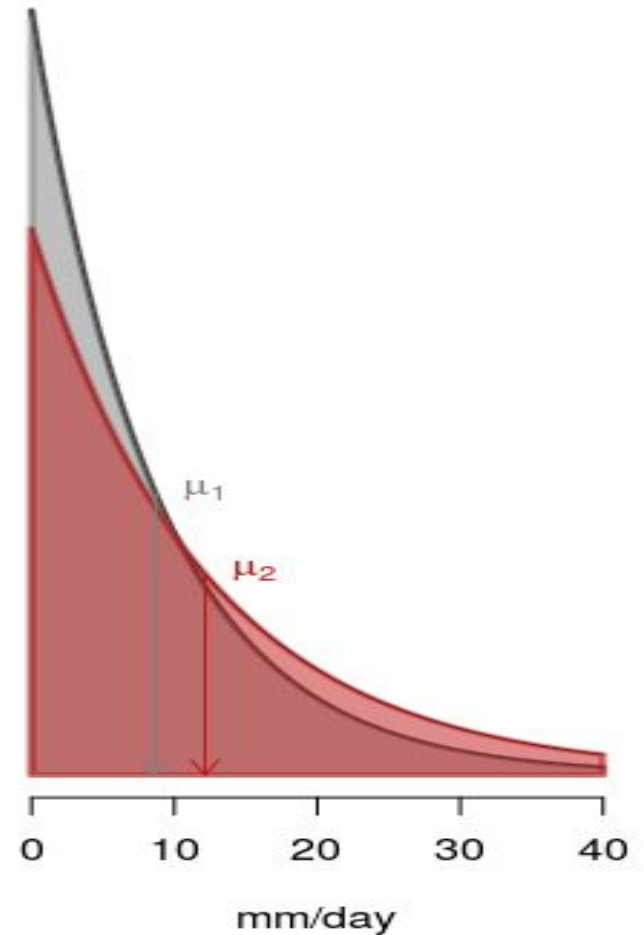


# Statistics is remarkably predictable

Temperature statistics

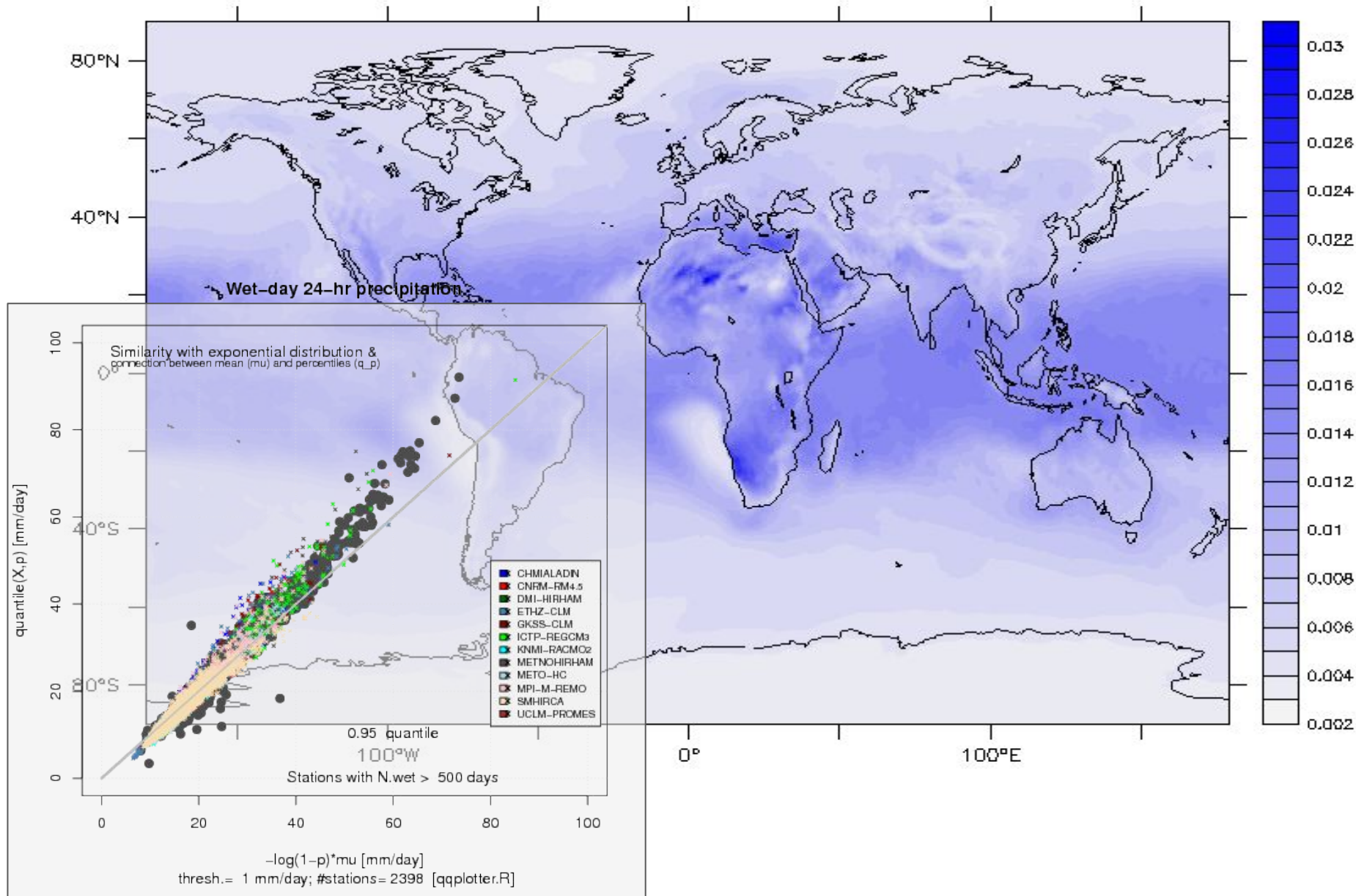


Precipitation statistics



**“Climate” = weather statistics**

# “Climate” = “weather statistics”



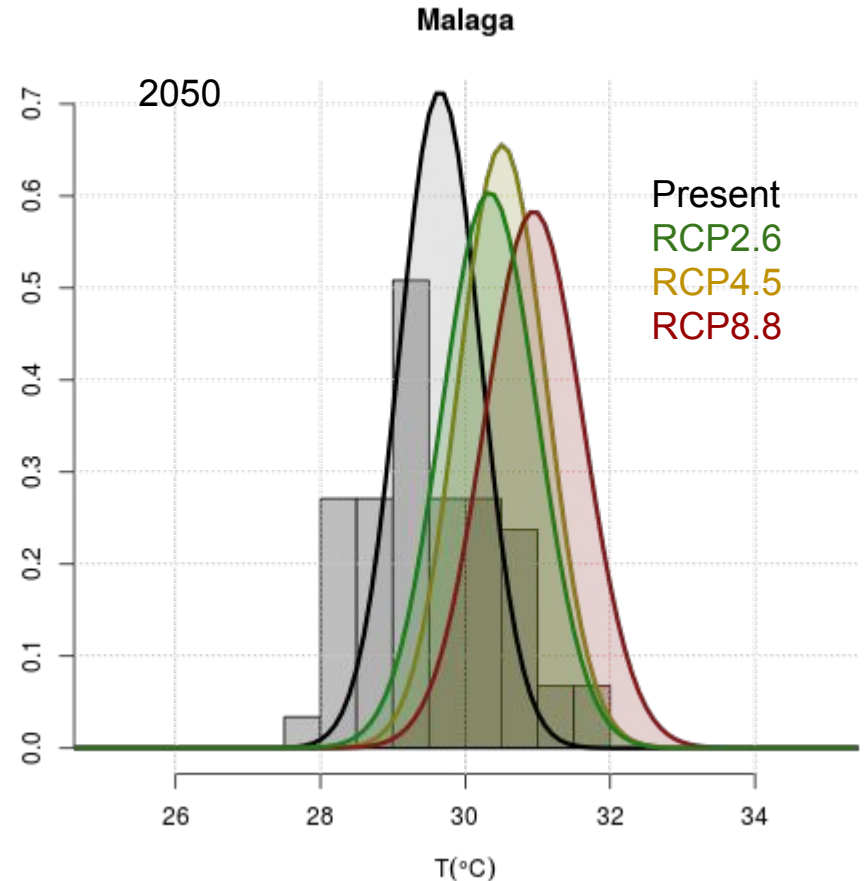
# Downscaling statistical parameters

## Parameters of pdf

[mean,sd, autocorrelation, ...]

Influenced by physical conditions

More predictable than individual outcome



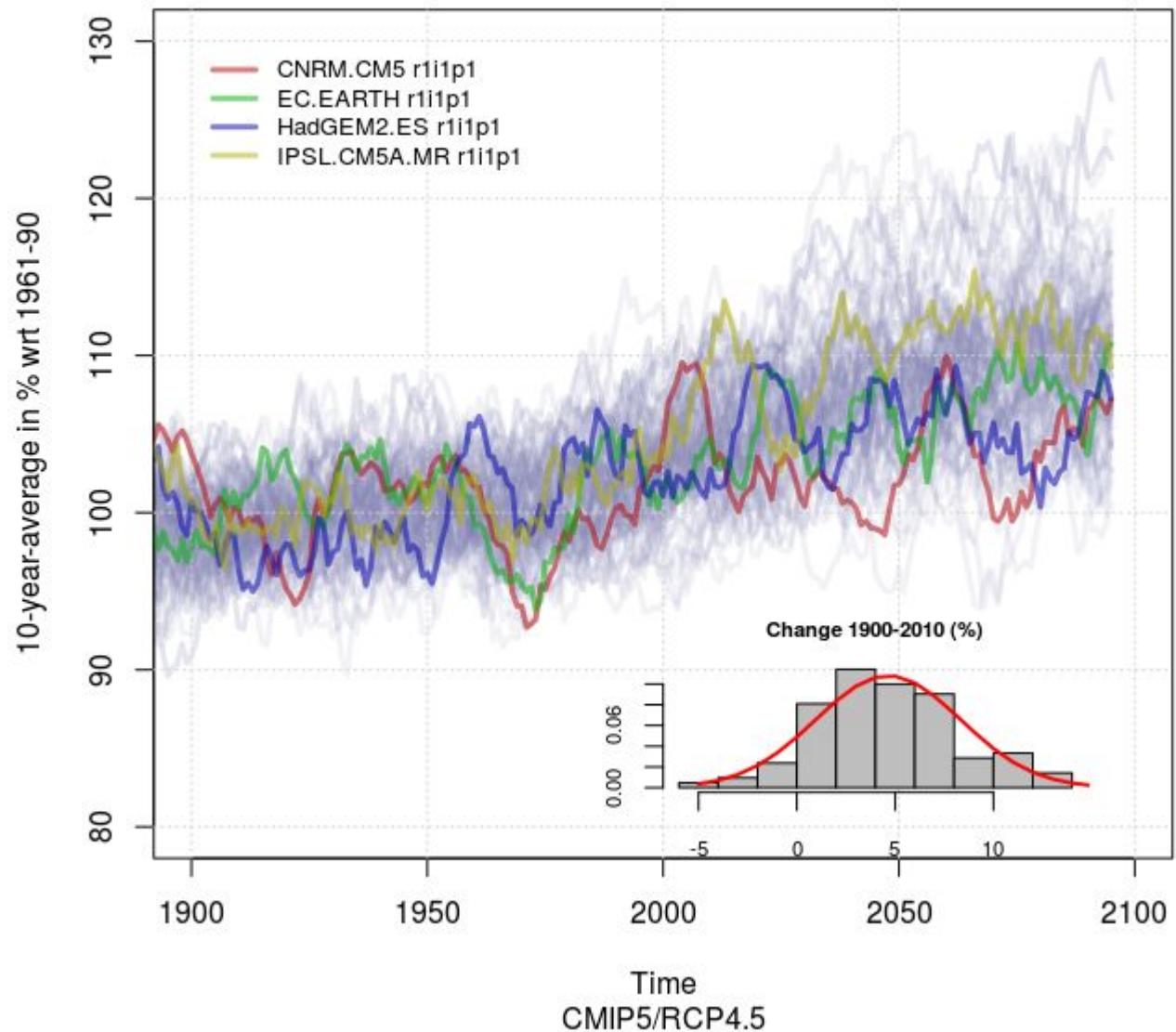
RCM ~ “weather-approach” - ESD ~ “climate-approach”



# Non-deterministic natural variations

Area mean precipitation: 0E-15E/57N-65N

Ensembles!



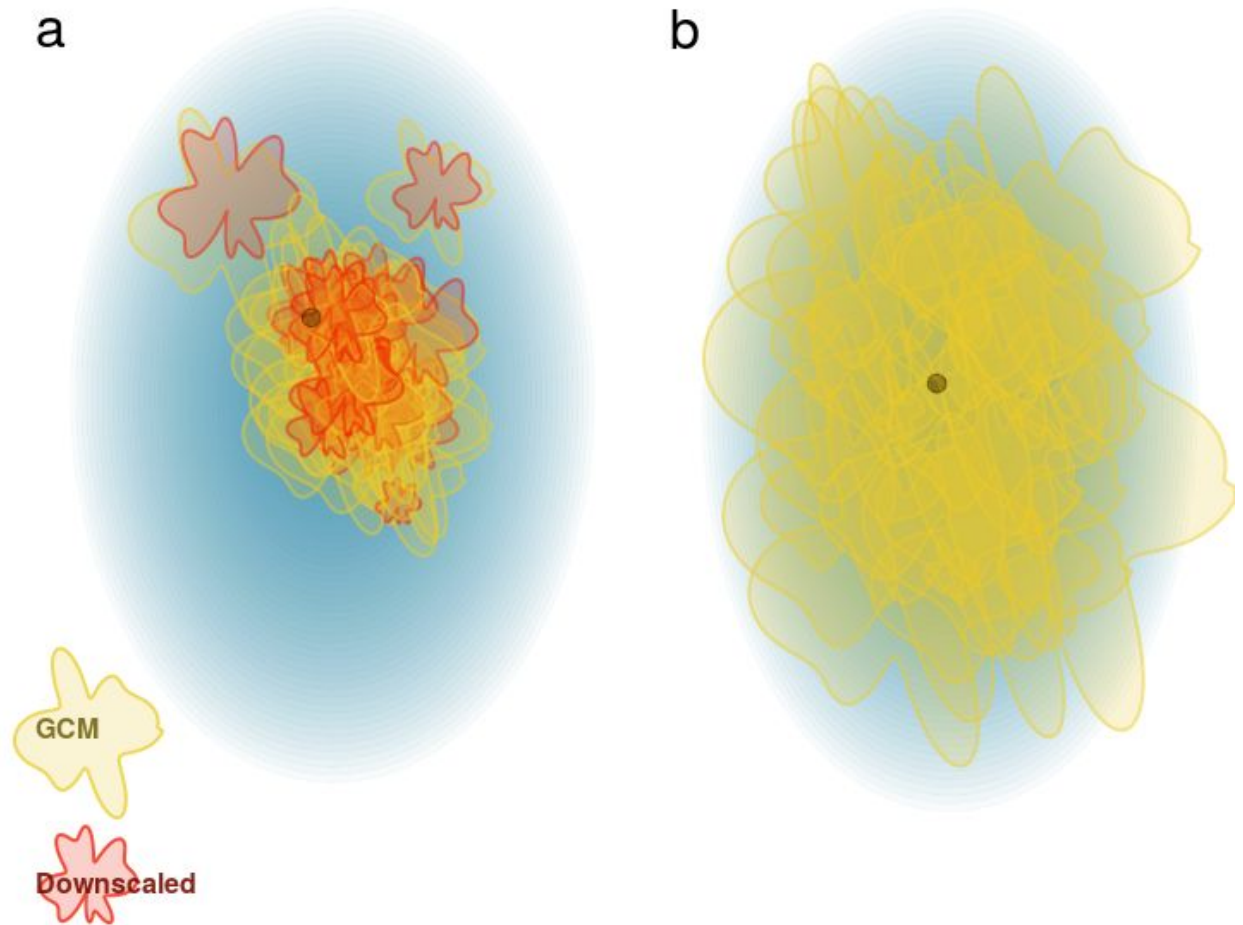




Useful climate information can only be synthesised from large multi-model GCM ensembles. We need to move away from single-model results

# Multi-model ensembles

Problem: not a  
statistical  
sample

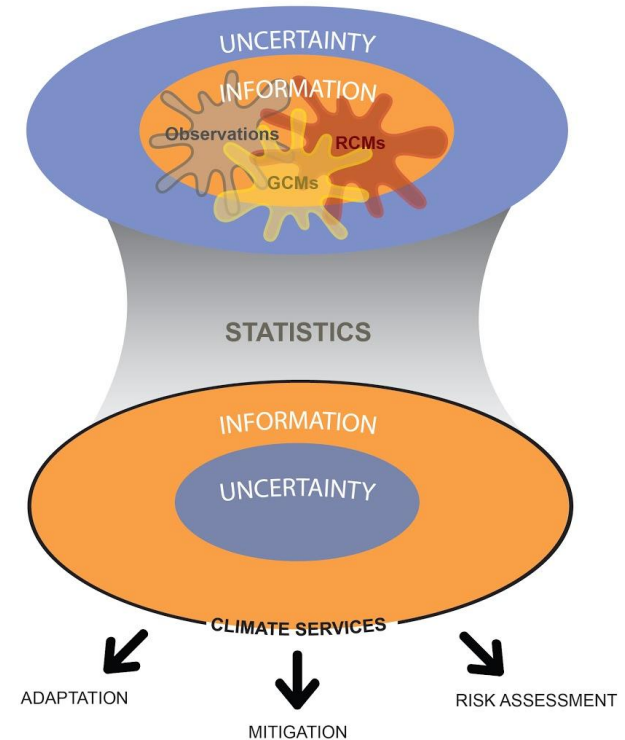


# Distillation of robust information

Multiple independent sources of information.

ESD & Statistics apply constraints and makes use of redundancies.

The range of uncertainty is also useful information about sensitivities.

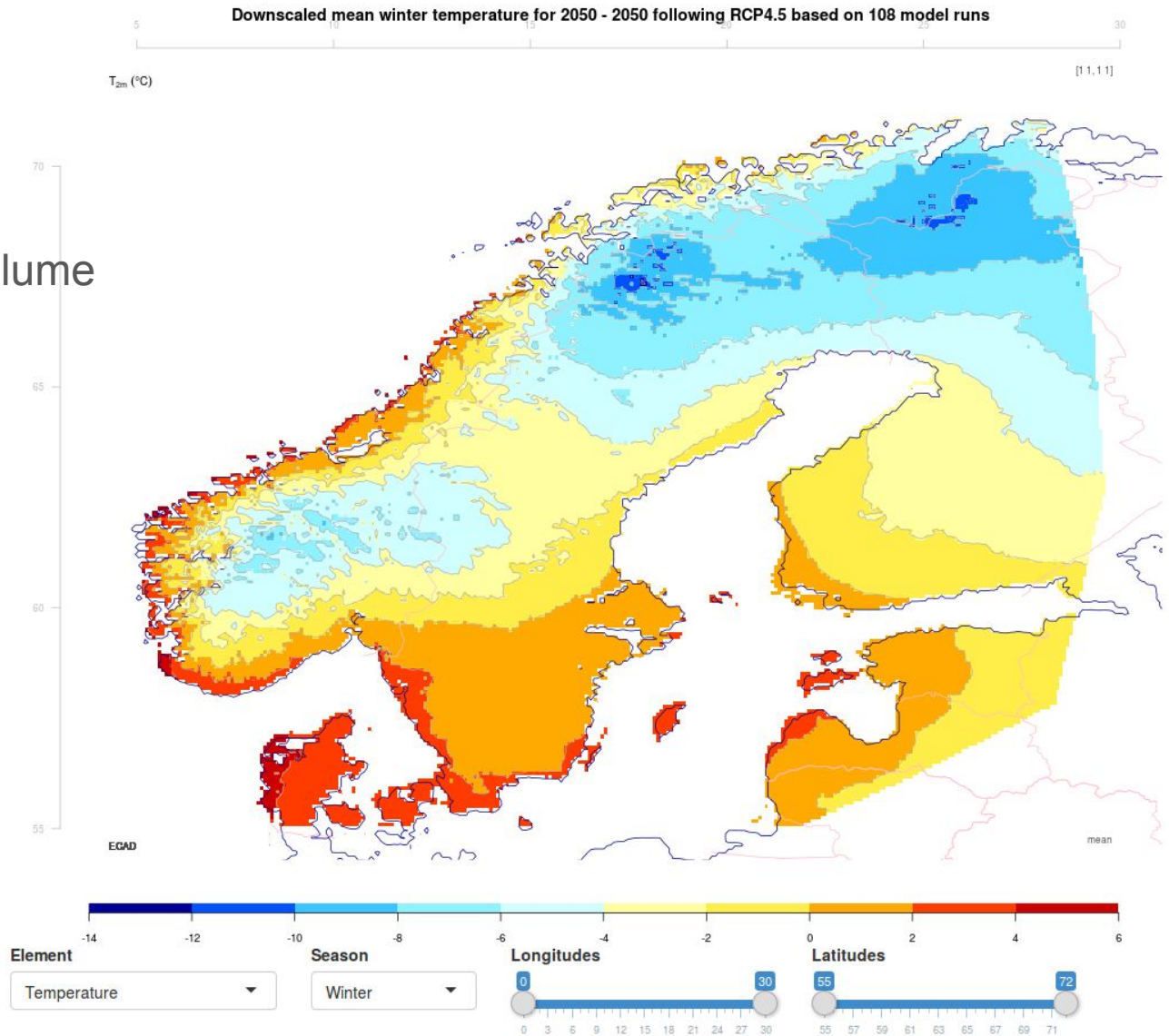


# Observations + model results

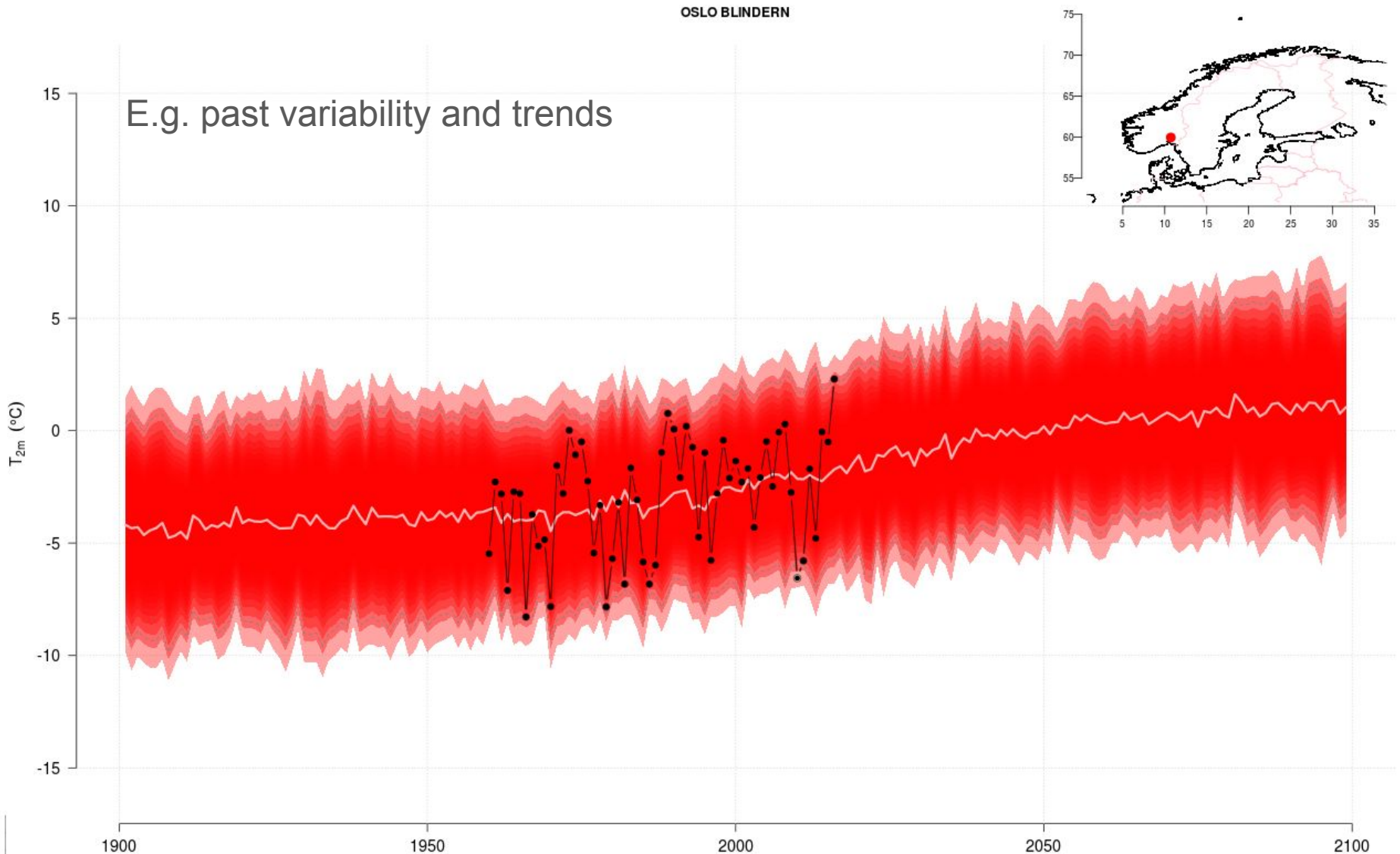
Gridded results

Complicated objects

Compression of data volume



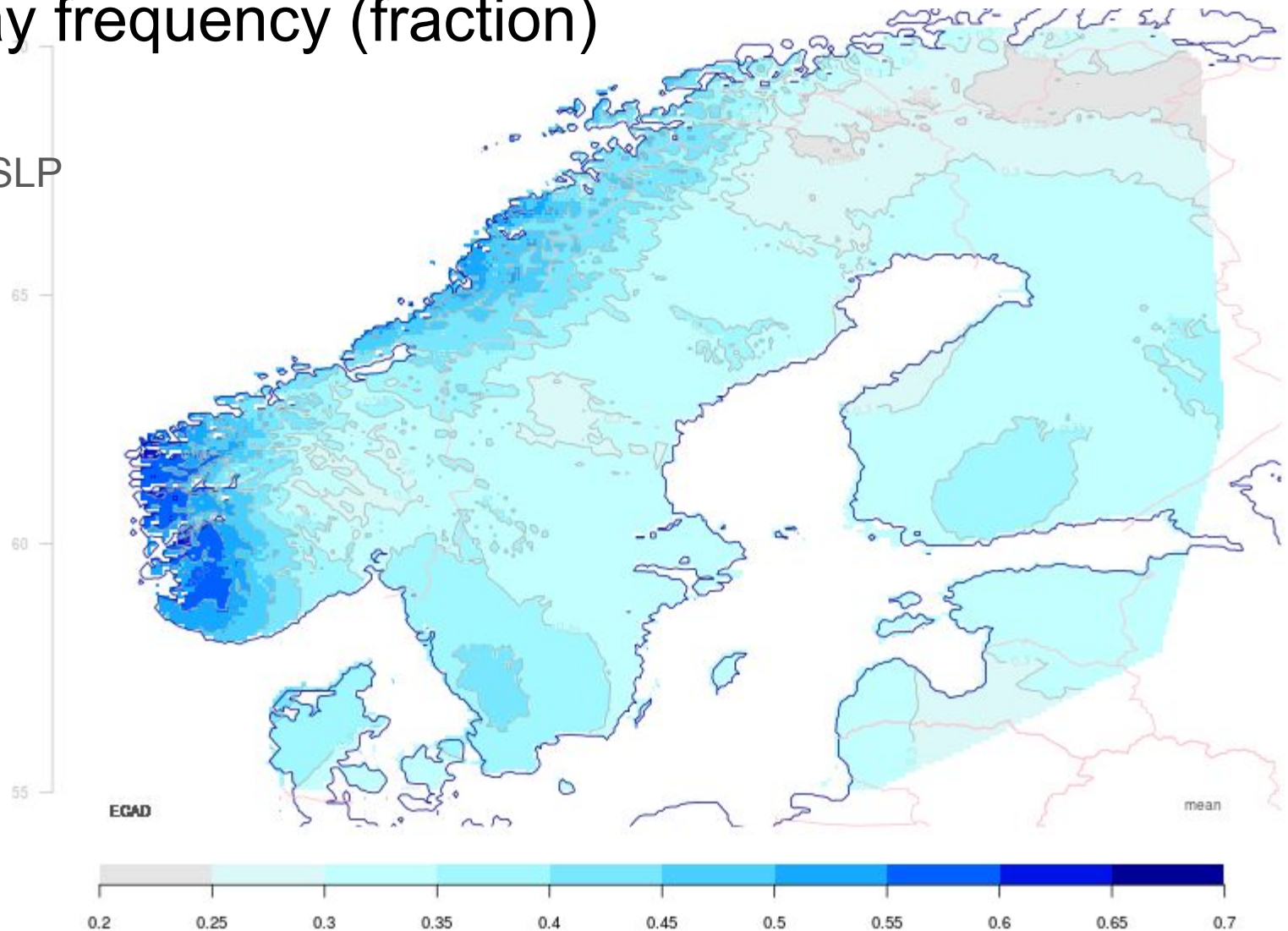
# Validation of multi-model ensemble projections





# Wet-day frequency (fraction)

Predictor: SLP



Element

Wet-day freq.

Season

Winter

Longitudes

0

30

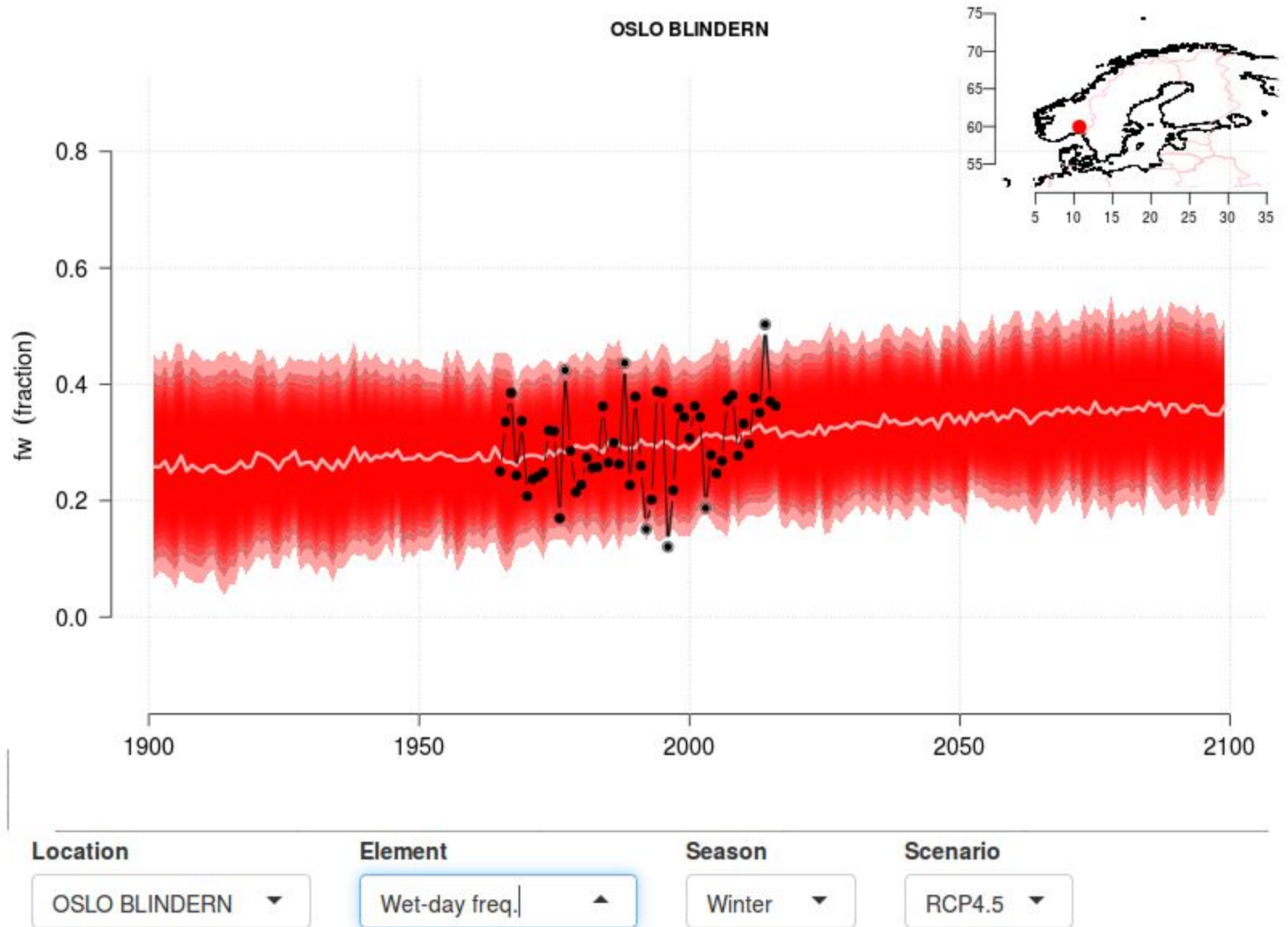
Latitudes

55

72

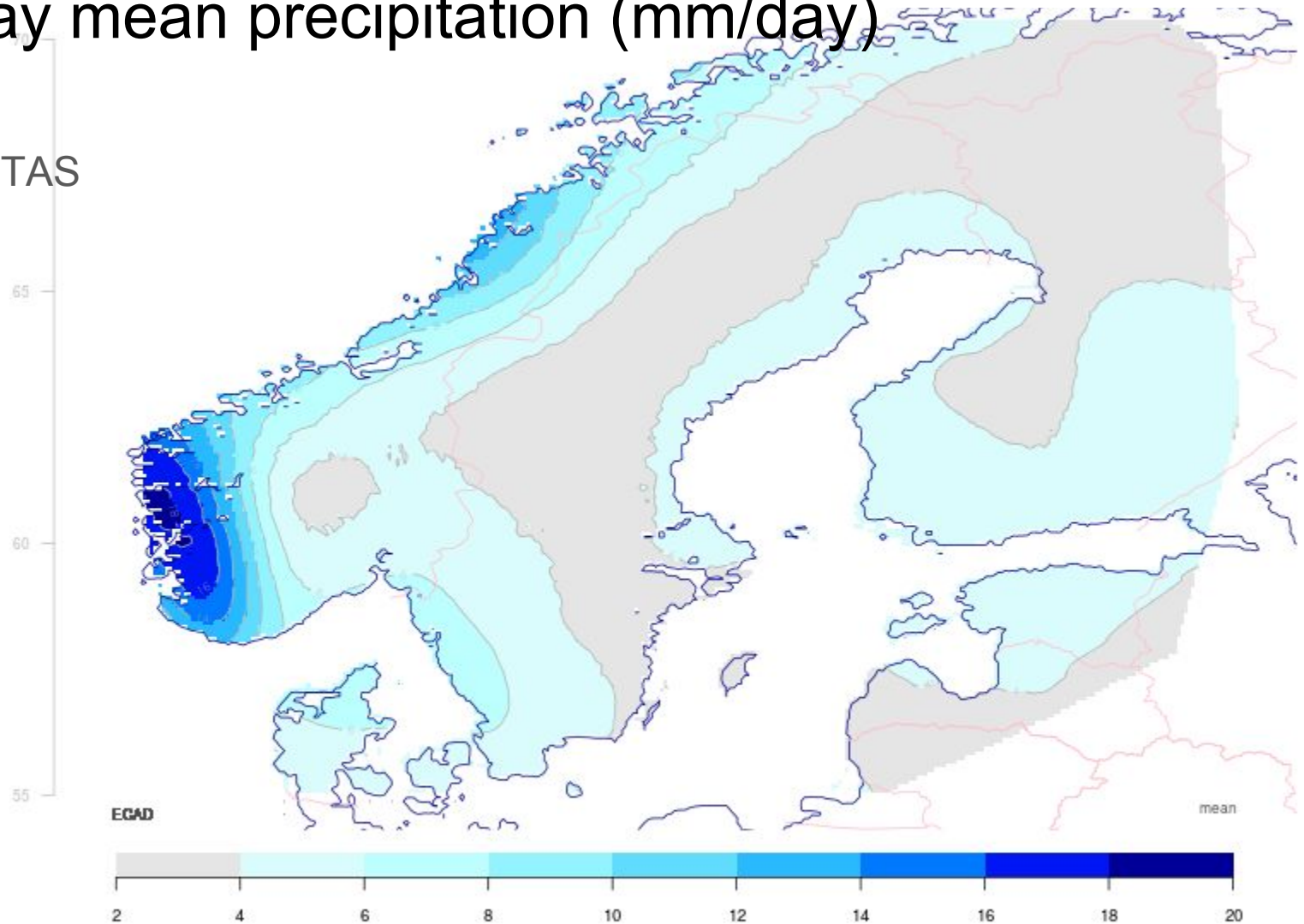


# Wet-day frequency



# Wet-day mean precipitation (mm/day)

Predictor: TAS



Element

Precip. intensity

Season

Winter

Longitudes

0

30

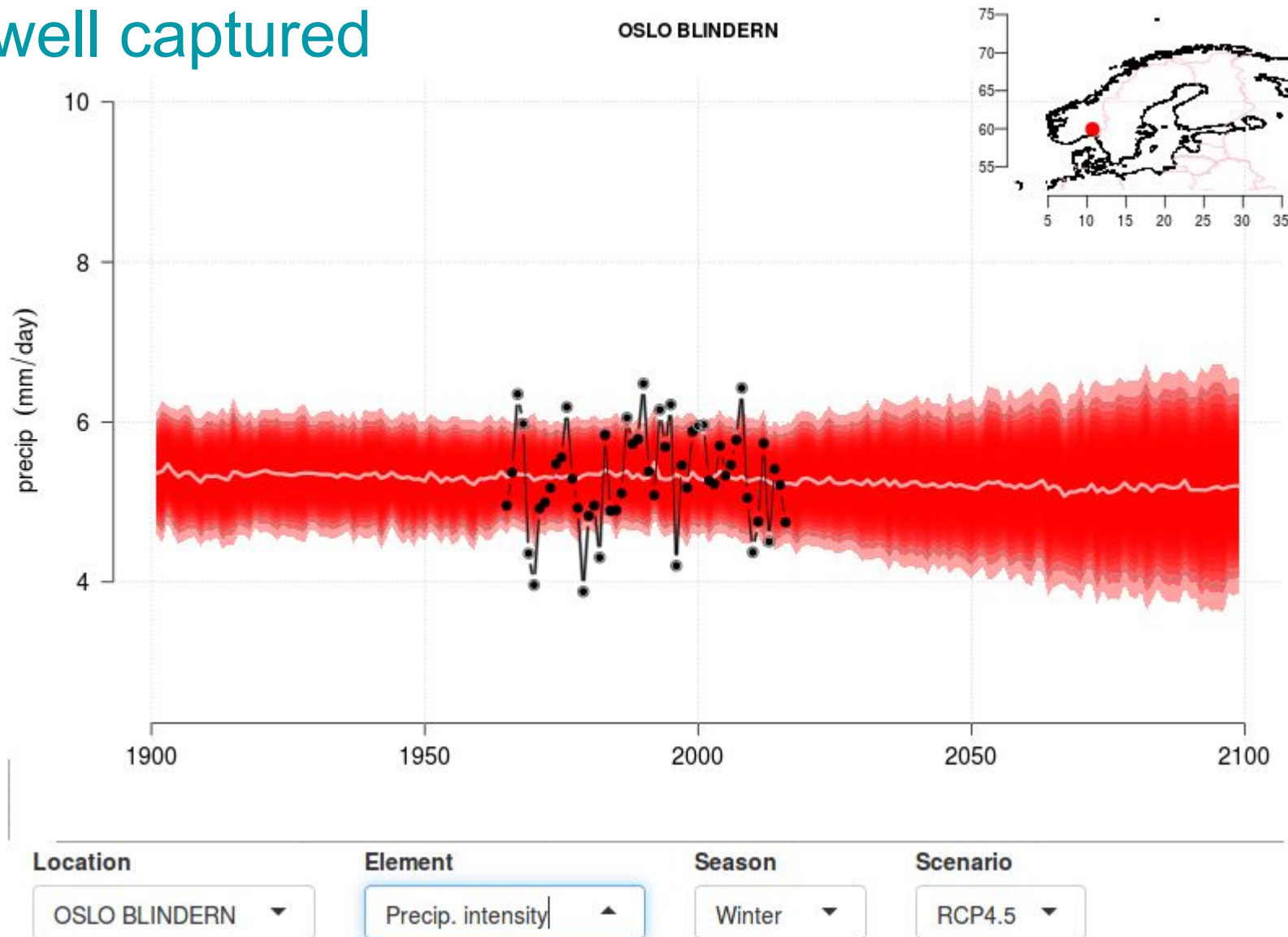
Latitudes

55

72

# Wet-day mean precipitation

Not well captured



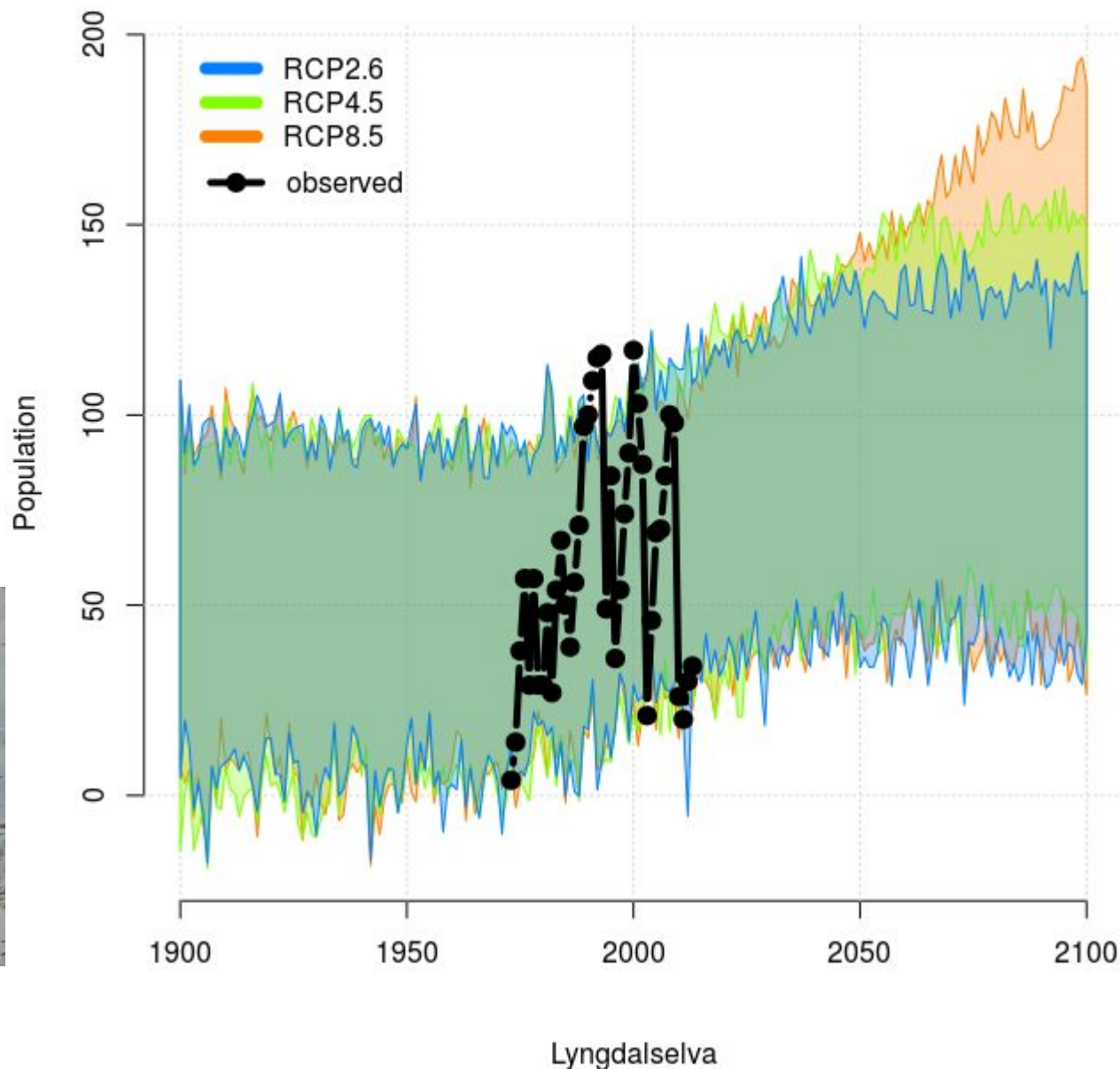
# Dipper population

Affected by  
winter  
temperature.

Poisson  
distribusjon



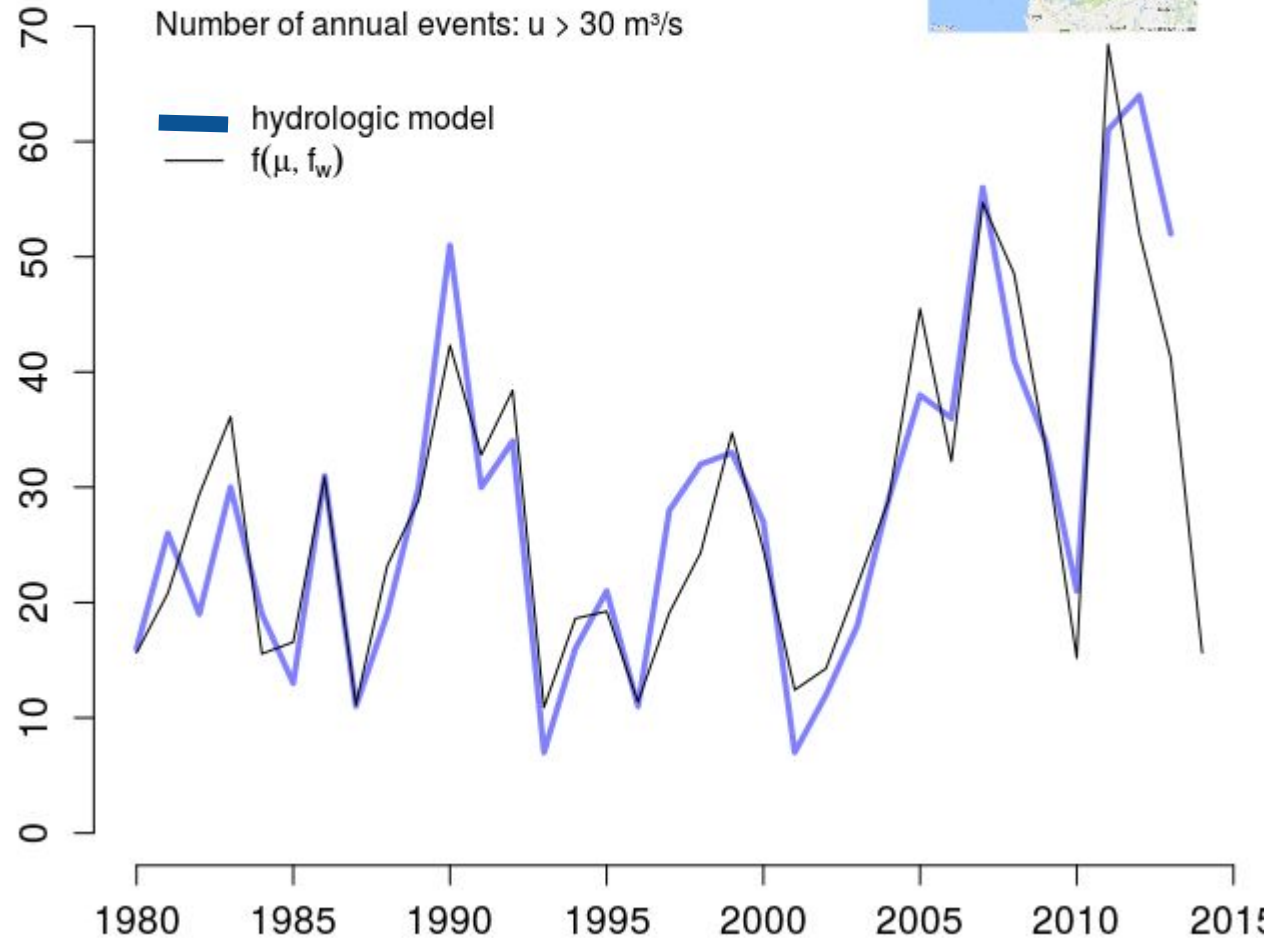
Photo: <https://no.wikipedia.org/wiki/Fossekal>



# River run-off

Small catchment.

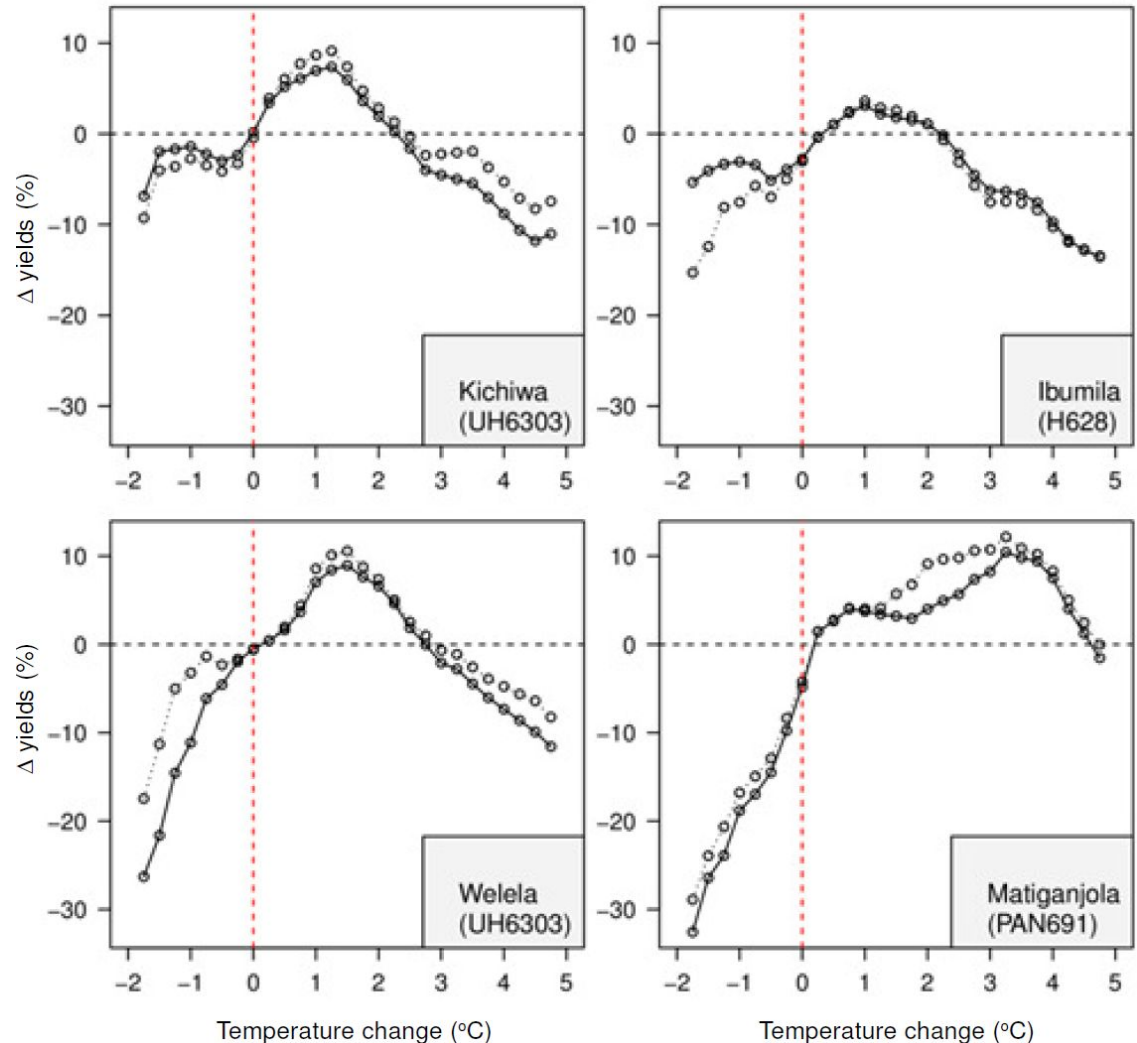
Responds to number of wet days and the rain intensity.





# Maize crops have an optimum temperature

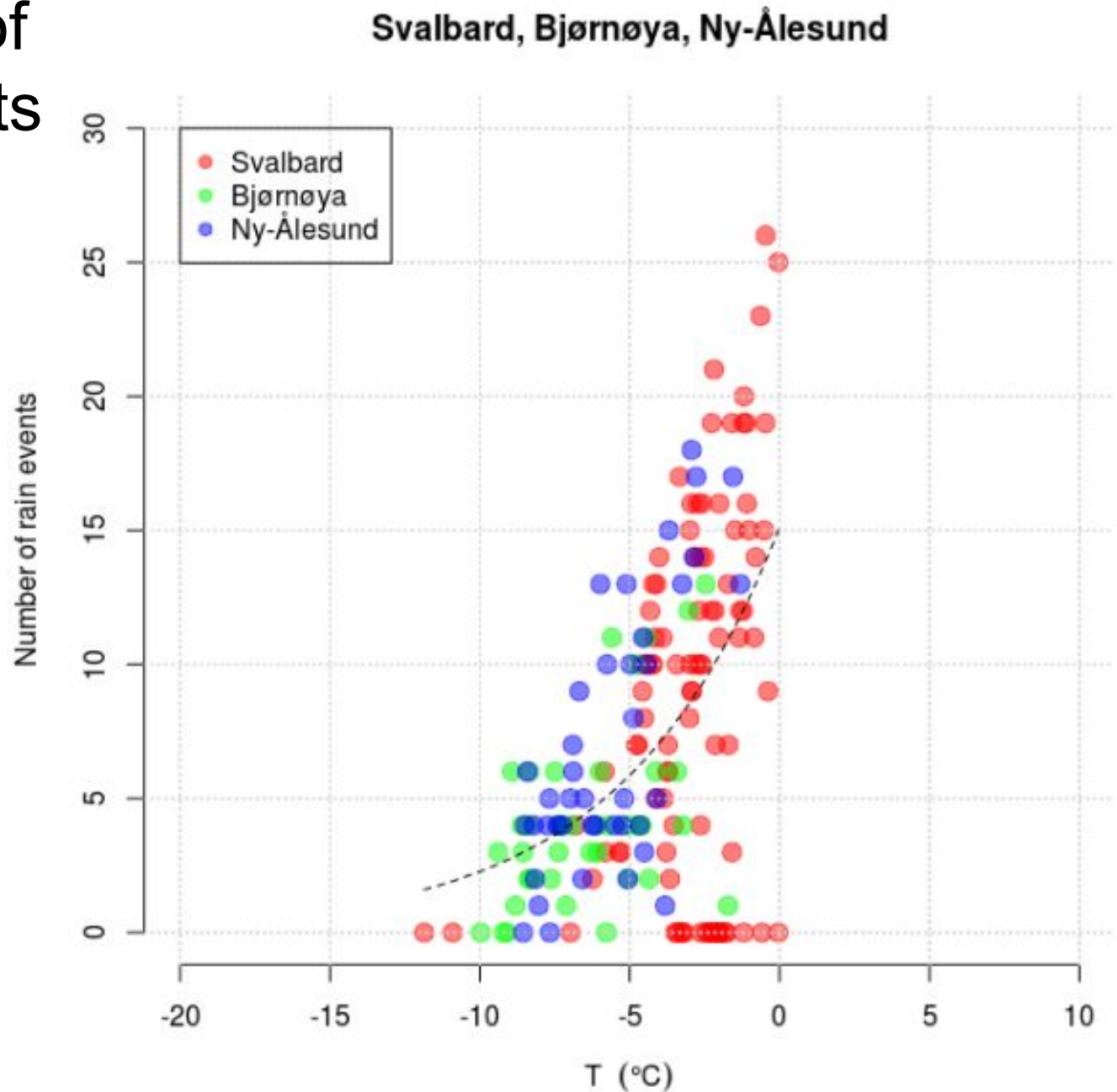
Monte-Carlo type  
experiment with a  
crop model for Maize  
crops in Tanzania



Mtongori, et al. (2015), African Crop Science Journal 23 (4), 399-417,  
<http://dx.doi.org/10.4314/acsj.v23i4.9>

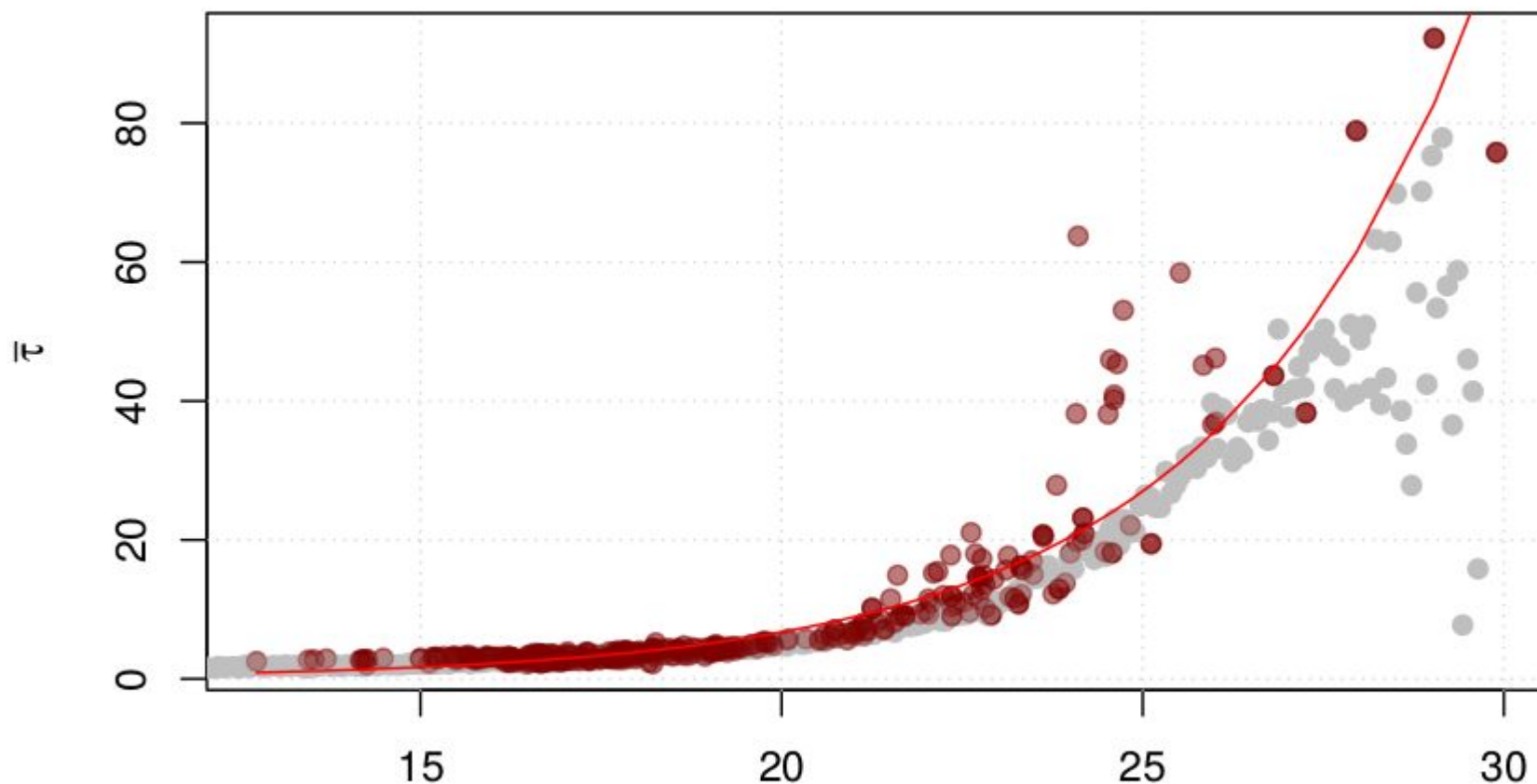


# Number of rain events in winter



# Duration of heat waves

Mean jja temperature & mean length of intervals above 20 C

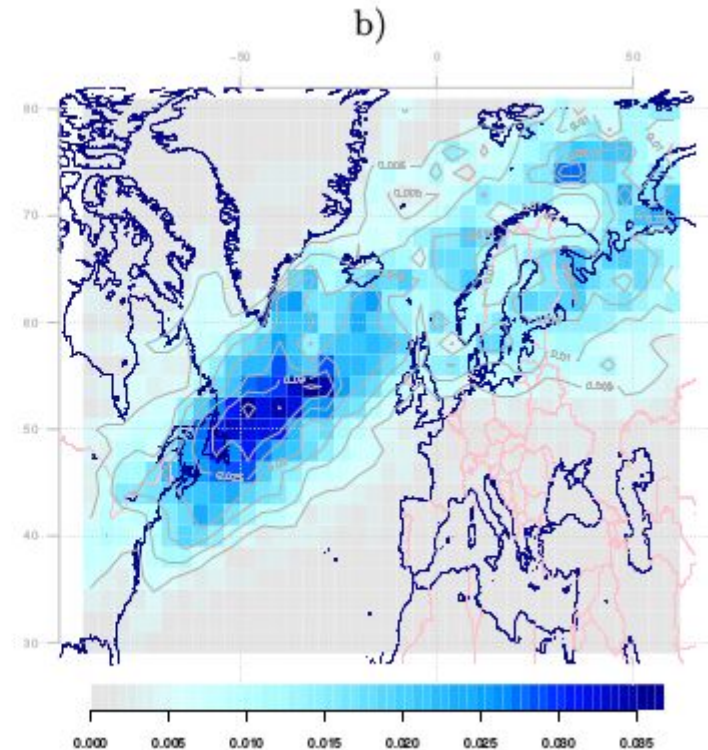
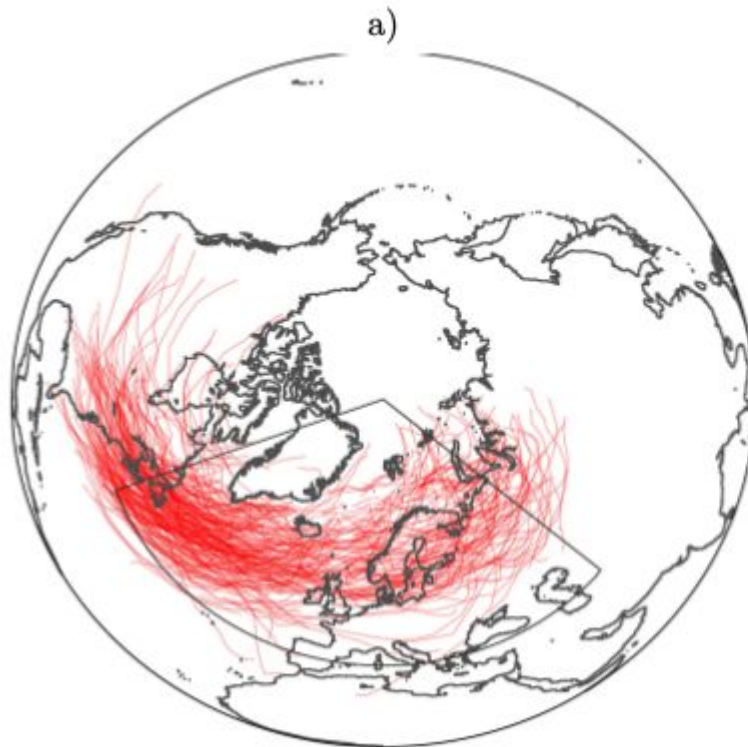


Related to the mean

$\bar{T}$   
source: ECA&D

# Storm tracks

Storm climate is sensitive to large-scale environment



# Type of information

Traditional: temperature, precipitation, indices.

Storm tracks, parameters describing curves

Events: number, duration.

# Objective

Provide answers concerning local climate

Risk picture

Analysis for improved understanding - why are there changes?

# Main message

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