



**METEOROLOGICAL  
SERVICE  
SINGAPORE**  
Centre for Climate Research Singapore

# **GENERATING CLIMATE CHANGE PROJECTIONS FOR SINGAPORE: A TALE OF SCALE**

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With contributions from many in CCRS

**Is it useful ?**



# Relevance of the Climate Science

Centre for Climate Research Singapore (CCRS) work supports

- the Inter-Ministerial Committee on Climate Change (IMCCC)
- & its Resilience Working Group (RWG)

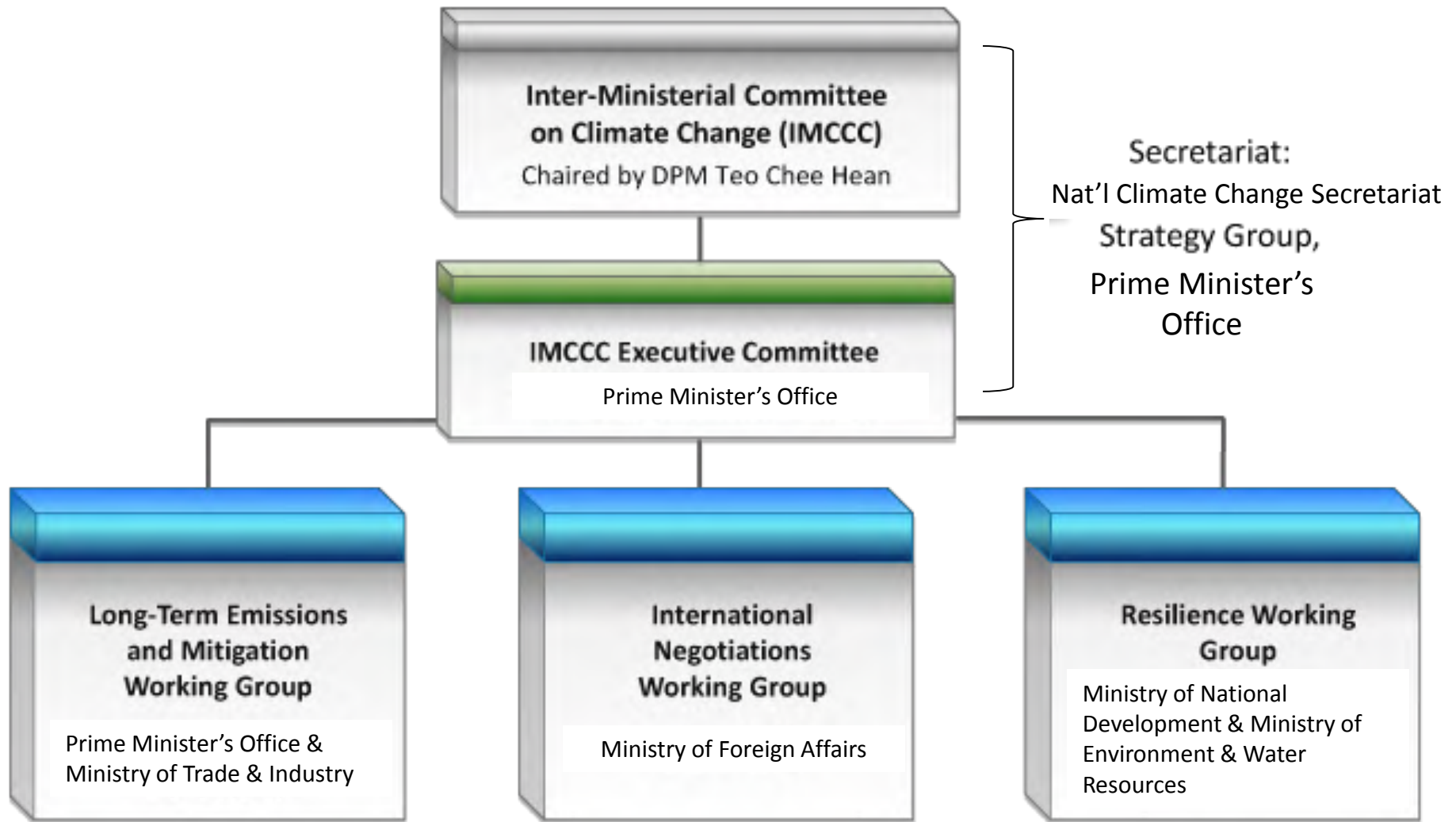
RWG is tasked to develop a risk assessment framework & long-term plans for infrastructure adaptation

Singapore 2<sup>nd</sup> National Climate Change Study was released in 2015

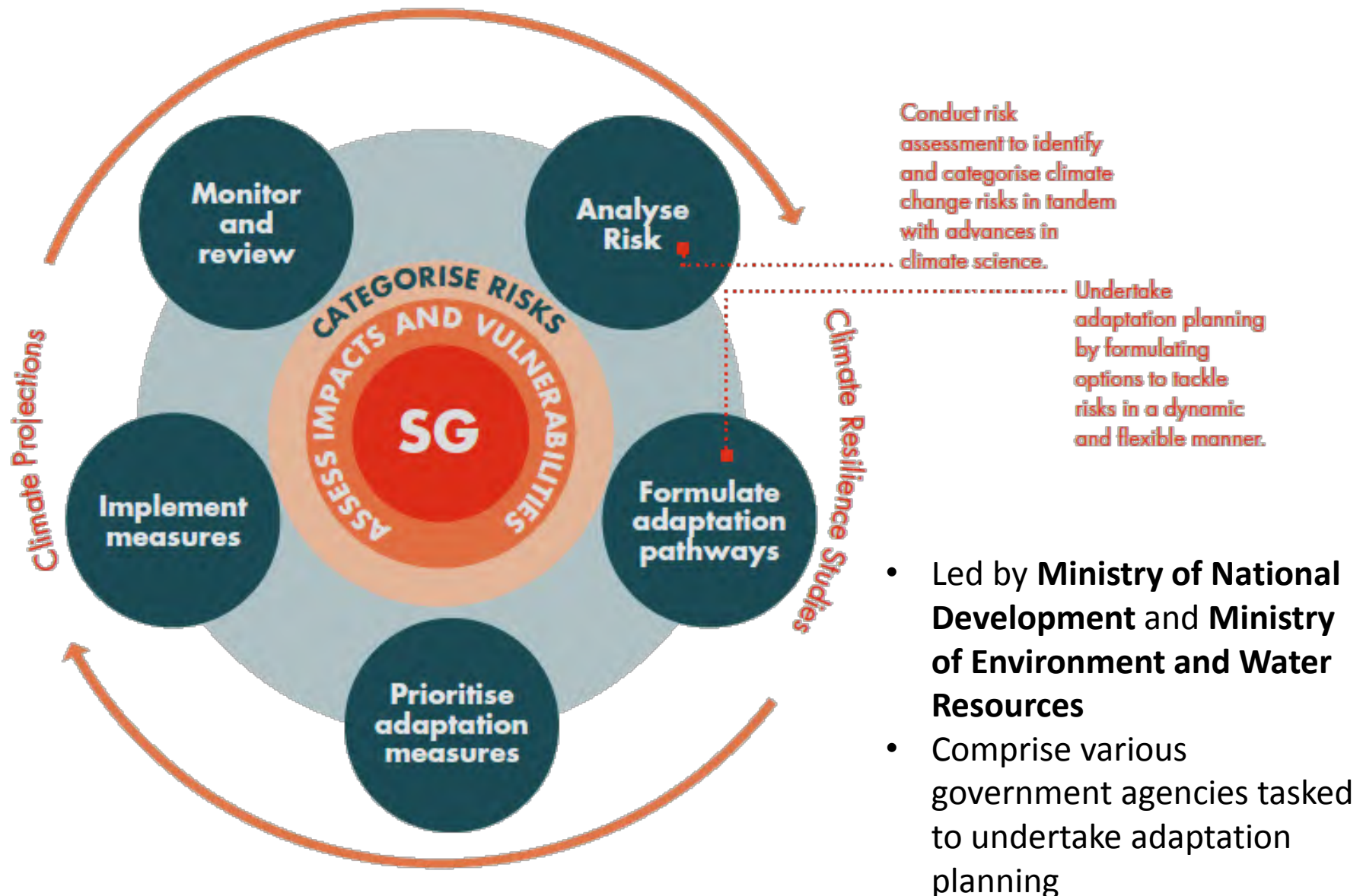
Learning about future climate change helps us to prepare for and respond to future change (**adaptation**) as well as understand the benefits of reducing climate change (**mitigation**)



# Inter-Ministerial Committee on Climate Change



# Singapore's Climate Resilience Framework



**Is it easy ?**



Regional  
Key  
Processes  
Evaluated

Southwest  
(summer)  
monsoon

Northeast  
(winter)  
monsoon

Inter tropical  
convergence  
zone (ITCZ)

Downscaling  
& regional  
features

Cold tongue  
biases

Diurnal cycle  
of  
convection

El Nino  
Southern  
Oscillation  
(ENSO)

Pacific-  
Indian  
Ocean  
interplay

Madden-  
Julian  
Oscillation  
(MJO)

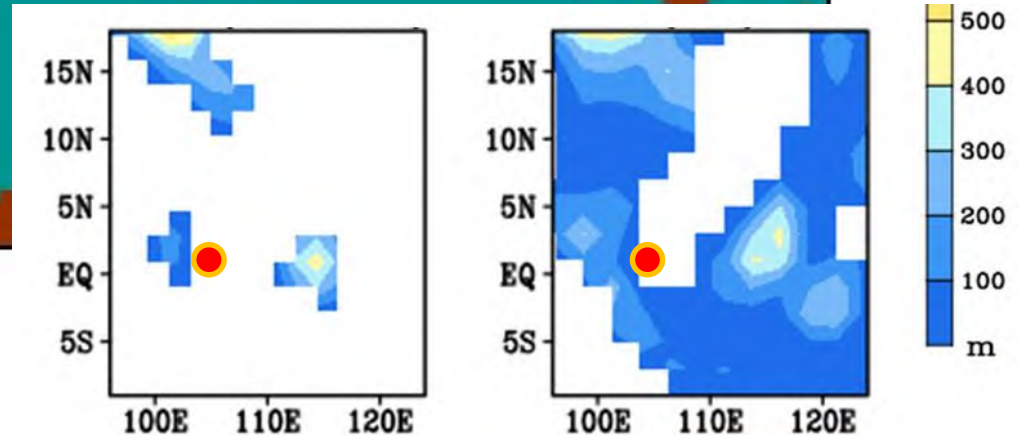
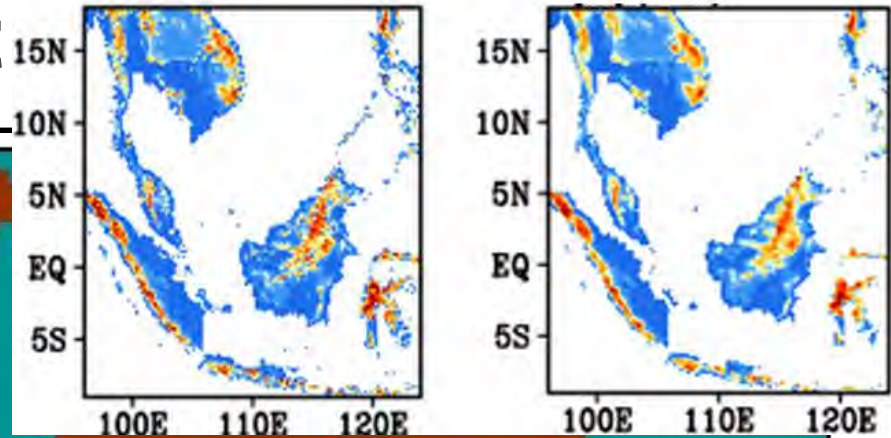
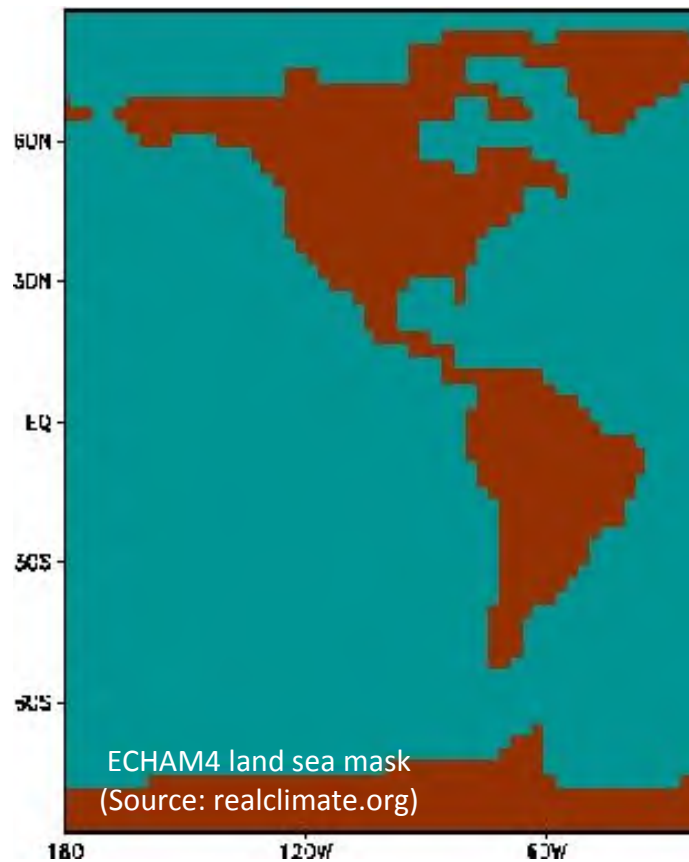
Tropical  
Cyclone

Surface  
temperature

Urbanisation



# GCMs cannot



GCM's views of the **continents**

South-East Asia is not realistic:

Red dot (**Singapore**) is not on the map (examples from @ state-of-the-art GCMs)



## Numerical Modelling Tools

Full CMIP5 archive from the international community (4 RCPs & 40+ GCMs)

“Illustrative” scenarios selected  
(RCP 4.5 & 8.5)

9 GCMs selected: “suitable”  
for Singapore climate

RCM Downscaling:  
century-long simulations  
12km resolution

Convection  
Permitting RCM  
10 years  
“time-slices”

Bias corrected  
local  
projections

## Uncertainties Considered

- **Anthropogenic forcing:**  
Plausible future paths of socio-economic development
- **Global Climate System:**  
Different modelled responses to the anthropogenic forcing
- **Downscaling linkage:**  
Response of the regional climate to global climate change(s)
- **Convective Process resolved:**  
Response of localized weather systems to regional climate change
- **Local Information:**  
Statistical adjustments to provide local information for quantities of relevance to users

# **Singapore 2<sup>nd</sup> National Climate Change study**

A stylized, low-poly graphic of a hand holding a globe. The hand is rendered in light blue and grey tones, with the fingers gently cupping the globe. The globe itself is a pale yellow color. The background is white, and the overall style is clean and modern.

# 2<sup>nd</sup> Singapore Climate Change Study

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CCRS has completed the **2<sup>nd</sup> National Climate Change Study** (2015)

- Based on the latest models used in the IPCC 5<sup>th</sup> Assessment Report (AR5)
- Undertaken as a joint project between CCRS and the UK Met Office

Provides climate projections for key variables:

- **Temperature, Rainfall, Humidity, Wind and Sea-level**
- Change in **mean** and **extremes**
- Trajectories of changes **up to 2100** and beyond

Climate Projections jointly by  
CCRS & UK Met Office

Climate Impacts Assessment  
by Infrastructure Agencies

# Model evaluation & Downscaling



**CMIP5: 38 models x 150yrs x 2 RCPs**  
**Results reported in IPCC AR5**



*Strategic sub-sampling:*

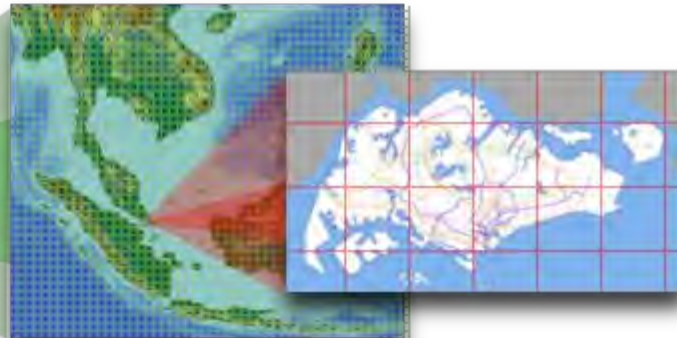
- Span uncertainty
- Use most skilful models
- Most efficient use of resources



**V2: 9 models x 150yrs x 2 RCPs at 12km**



RCM 10~12 km Resolution



Bias correction



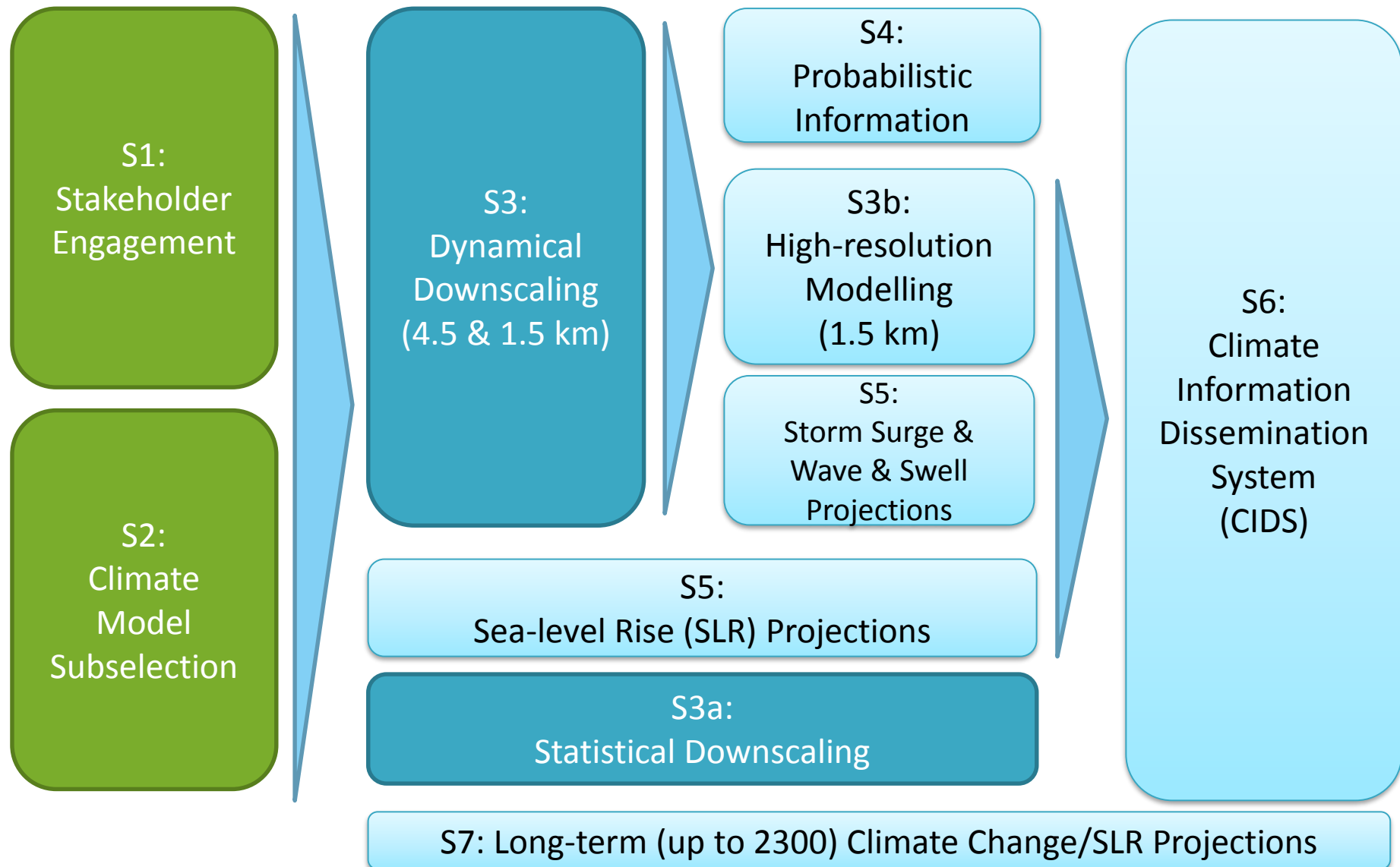
**CIDS**

**V2: extension**

**3 x 10yrs**  
**time-slices**  
**@ 1.5km**

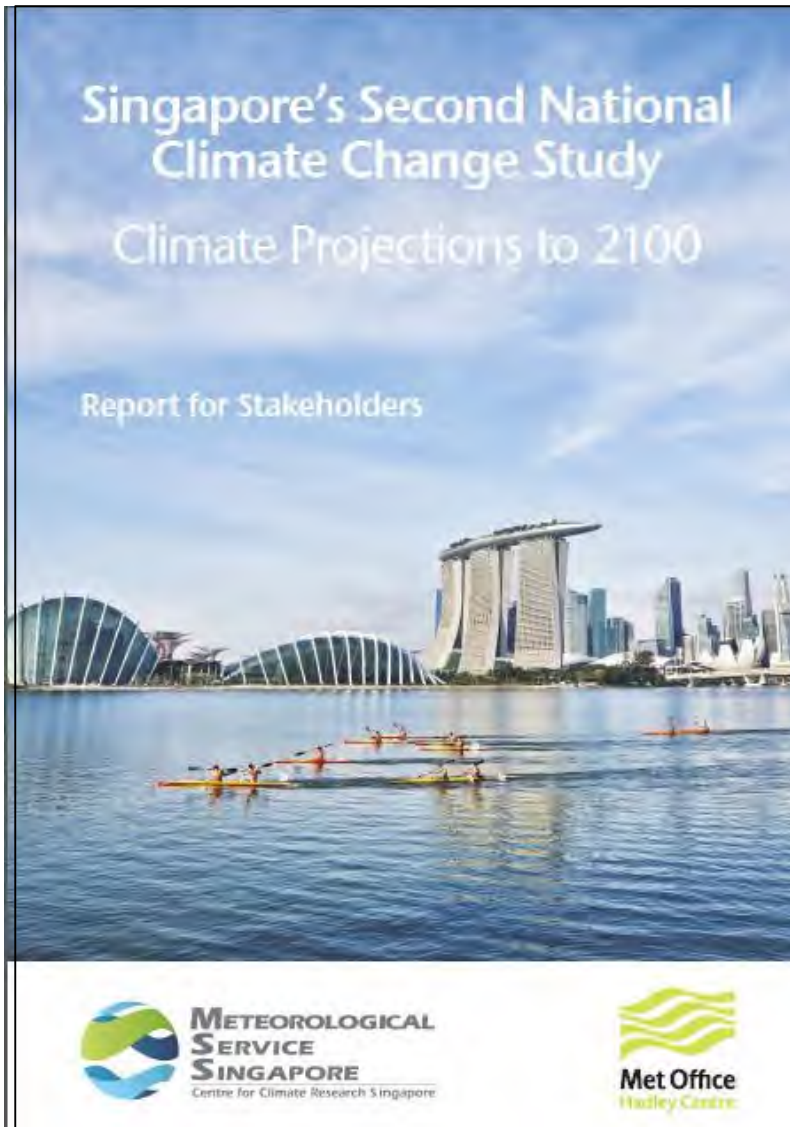


# Project Stages



# 2<sup>nd</sup> National Climate Change Study

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Two reports have been produced:

**The Stakeholder Report**  
(Summary of key results)

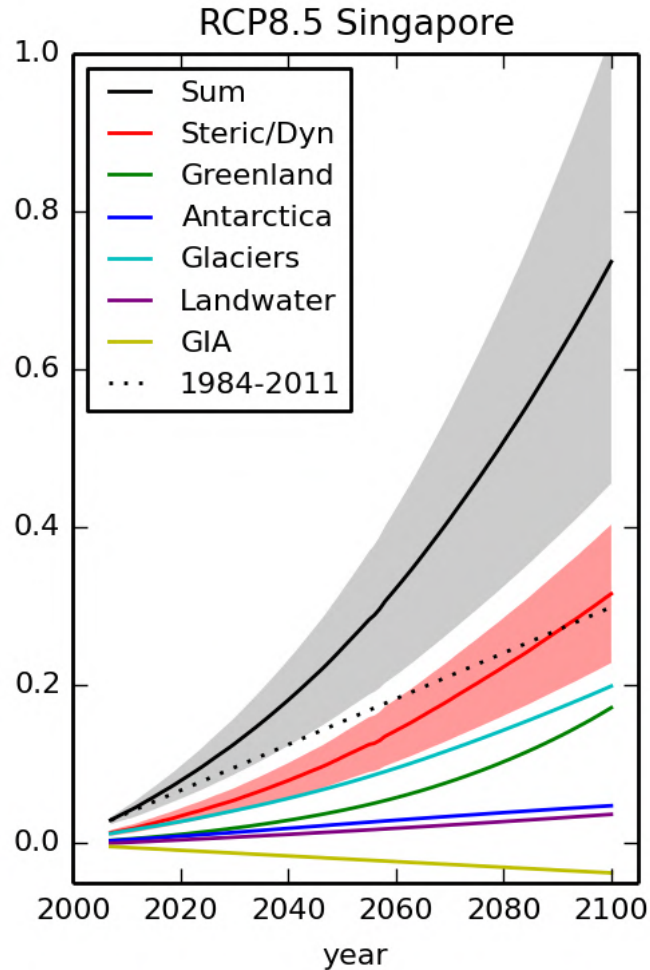
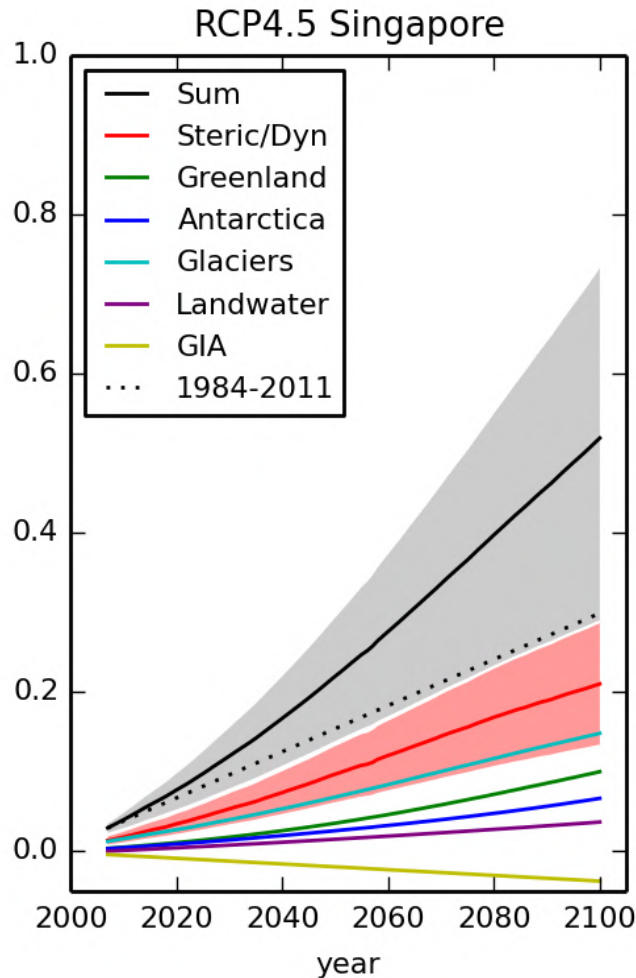
**The Science Report**

Both available at:

<http://ccrs.weather.gov.sg/publications-listing-page/>



# 2<sup>nd</sup> National Climate Change Study

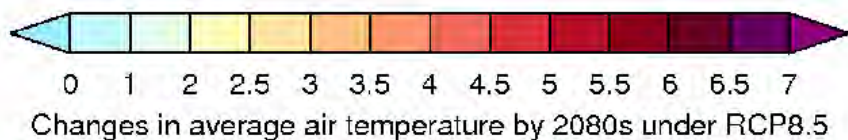
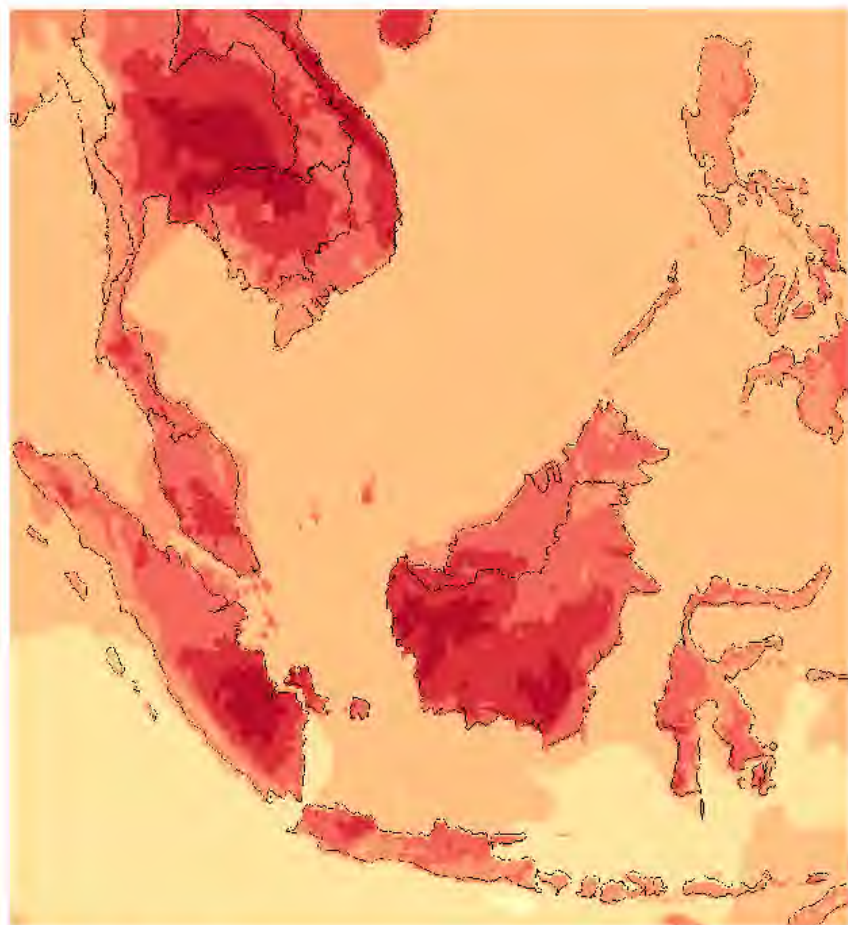


## Projections of sea level rise

- Scenario dependent
- No significant positive change for storm surge and waves
- Large uncertainties for GSLR
- Critical issue for adaptation planning in Singapore

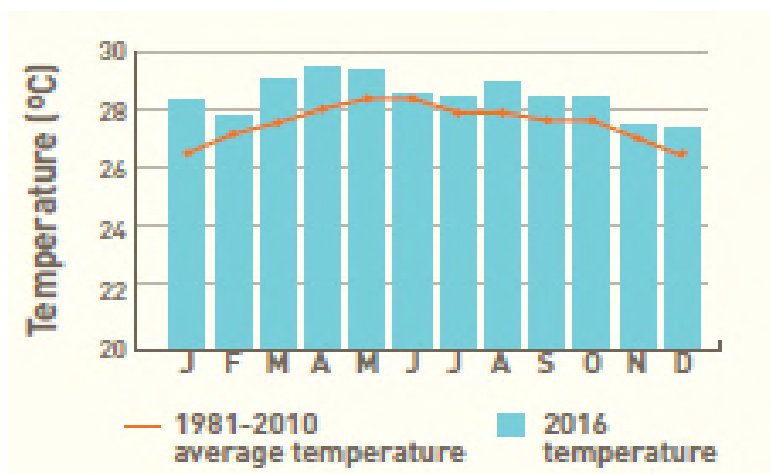
Sea level rise from various sources (e.g. glaciers) with the total rise in black

# 2<sup>nd</sup> Singapore Climate Change Study



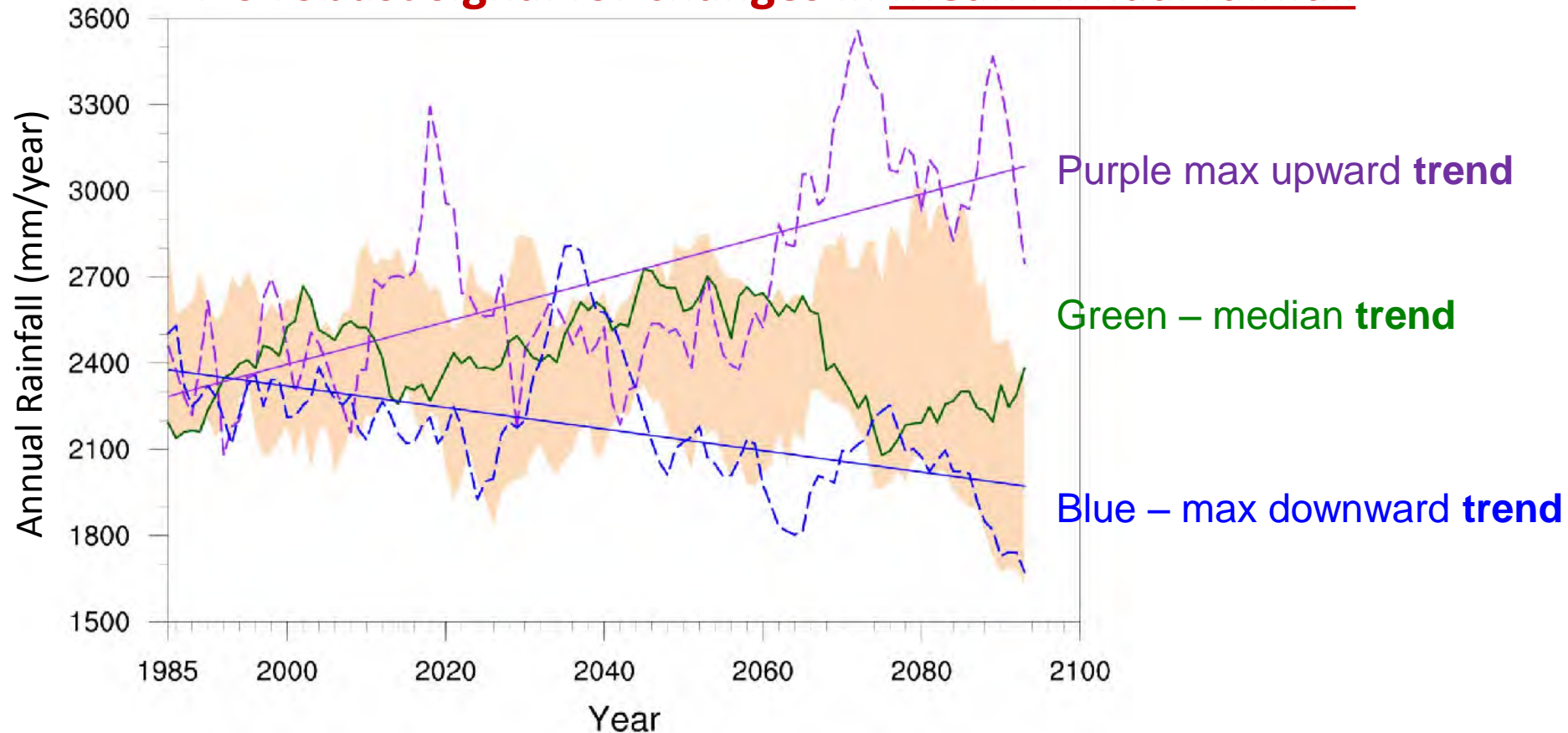
SE Asian mean temperature (T) rise during SW Monsoon (°C):

- June-August 2m T for 2070-2099 vs. 1980-2009 under RCP8.5
- More warming over land than ocean (3 – 5°C across the region)
- Much larger than annual cycle of T in Singapore, or recent anomalies



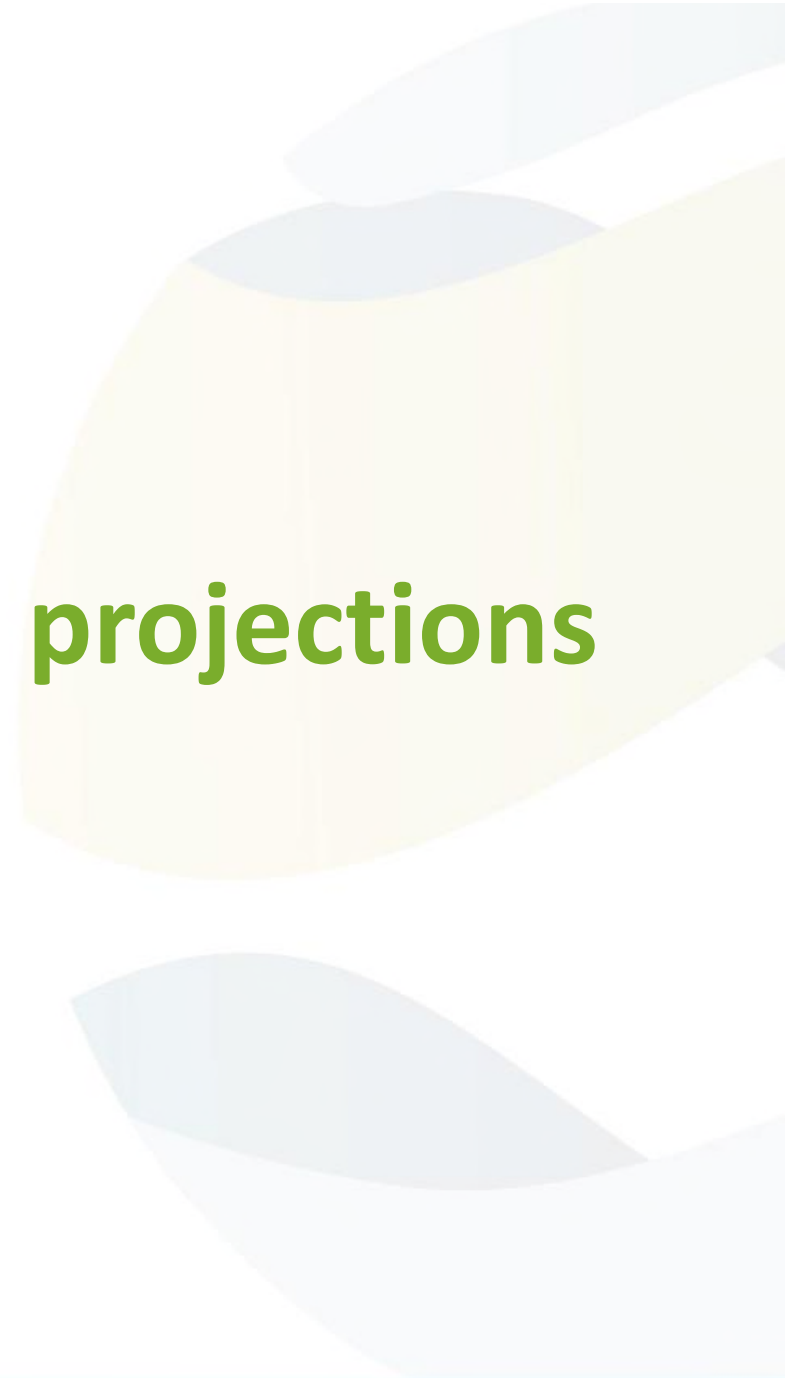
# 2<sup>nd</sup> Singapore Climate Change Study

**No robust signal for changes in Mean Annual rainfall**

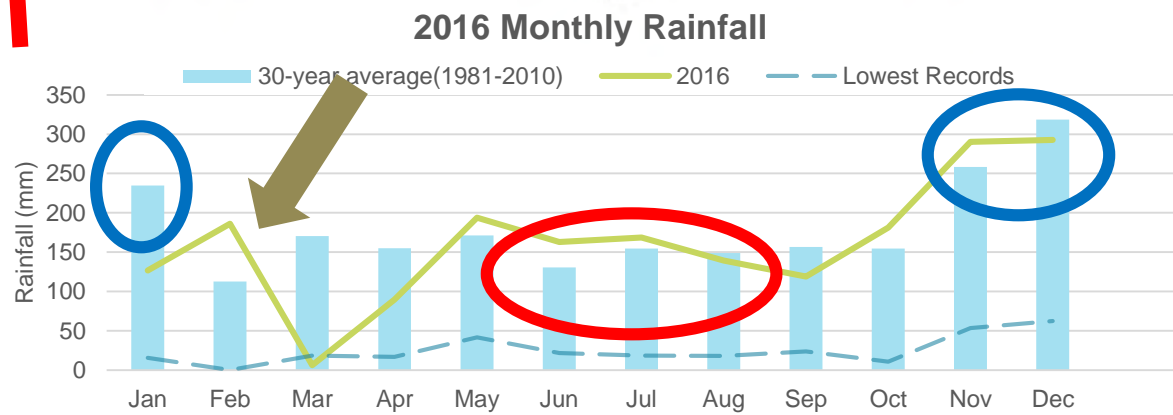
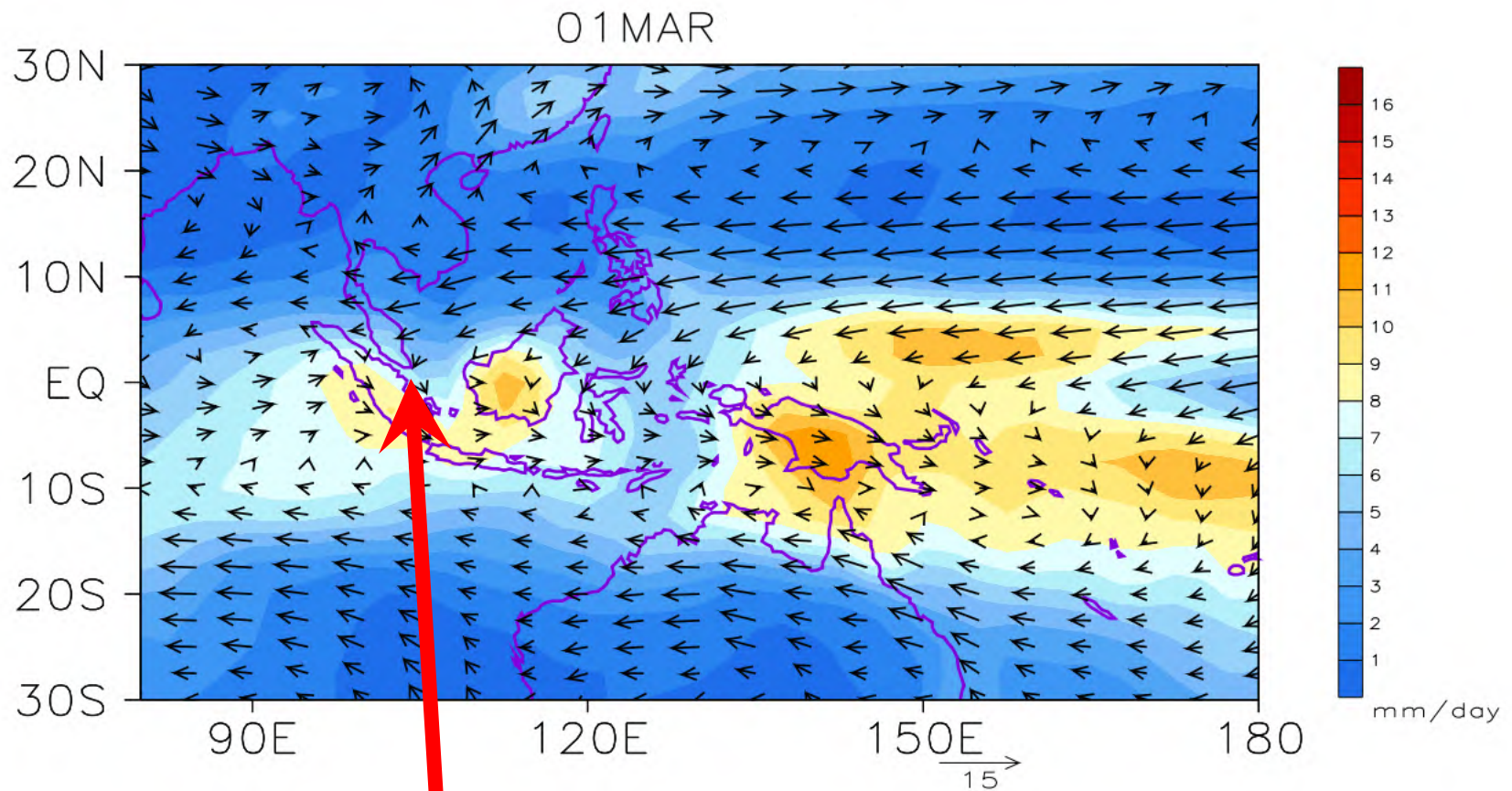


At any particular time in the future, the projections are a **combination** of **natural climate variability** and **anthropogenic climate change**

# Understanding the projections



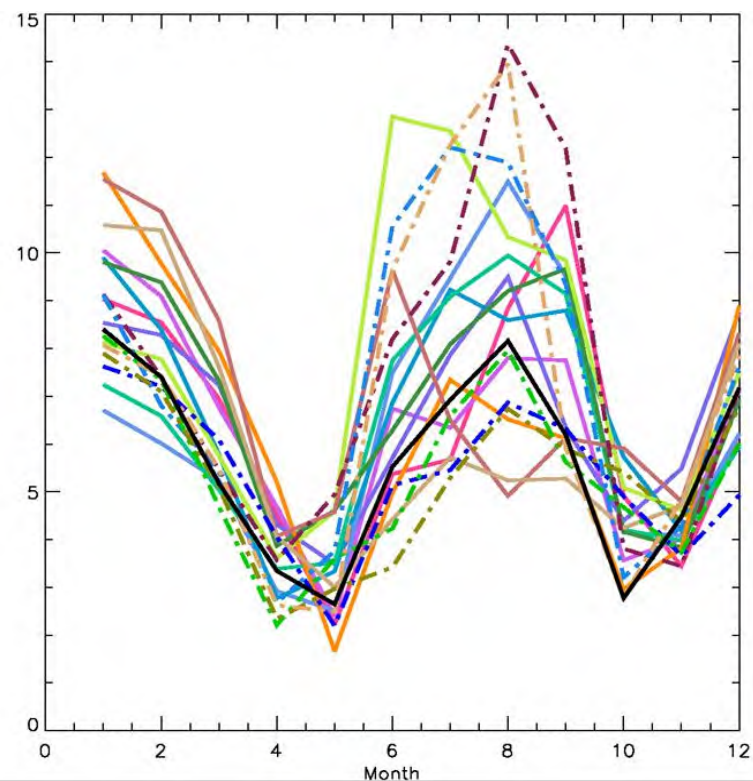




# Circulation vs. Precipitation

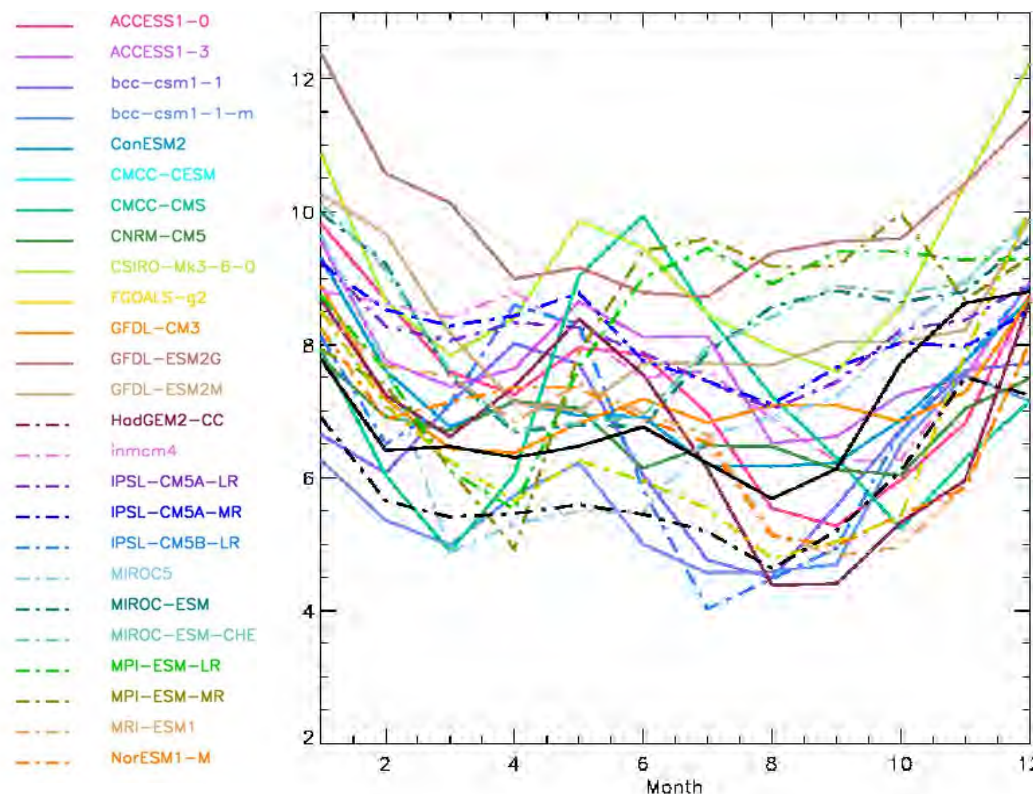
5-10N, 107-115E

Wind Speed (850 hPa)



Estimate of the truth: ERA-I

Precipitation

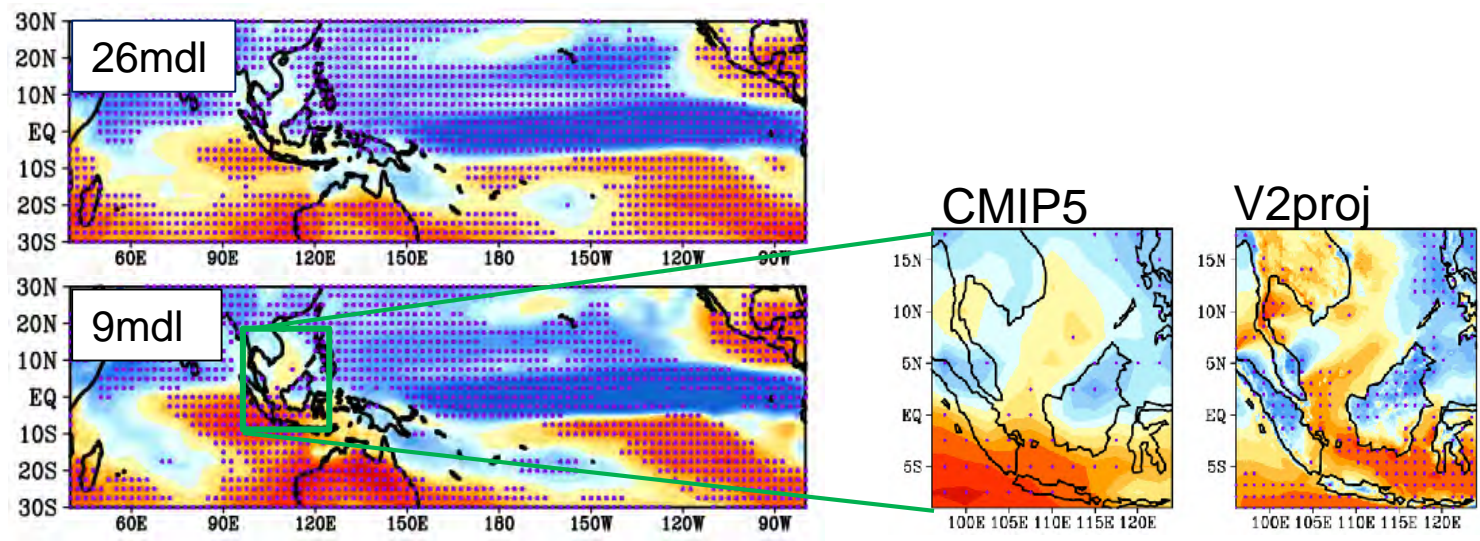


Estimate of the truth: GPCP & TRMM

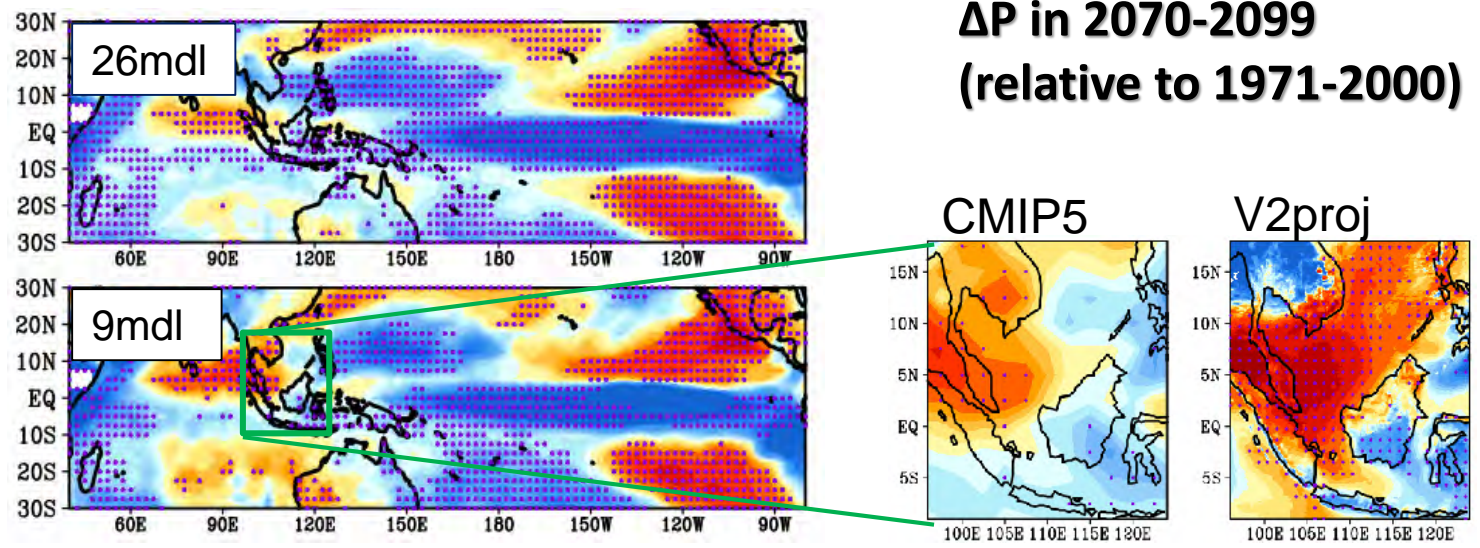


# Seasonal rainfall projected changes

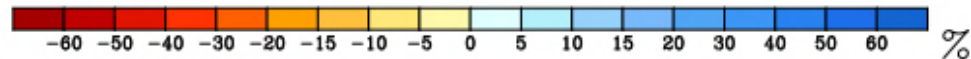
JJAS



FEB

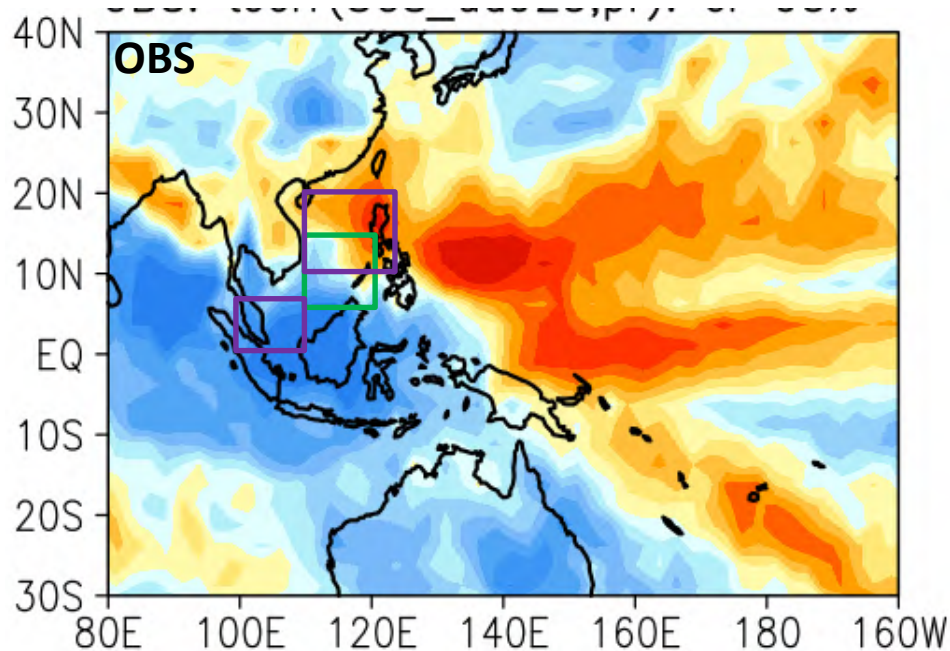


*c*l=90%



# SW Monsoon rainfall: mechanism

Corr (low level wind, precip)

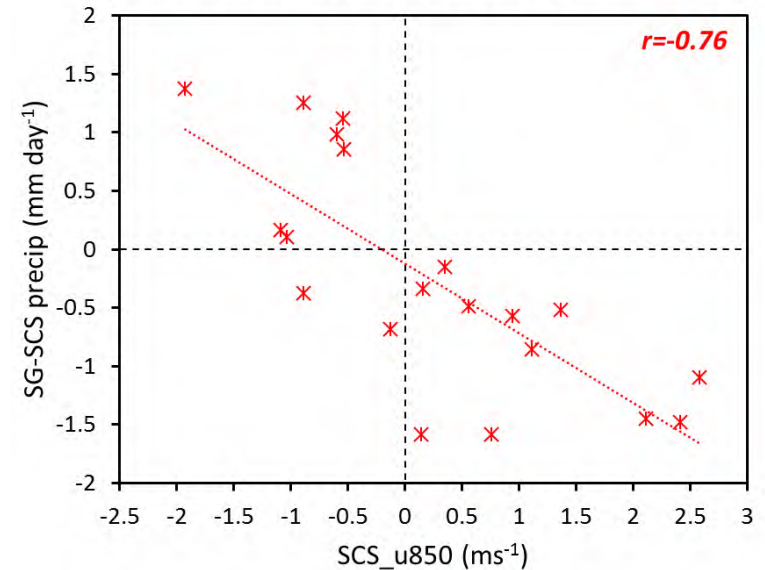


SCS\_u850 : 5-15N, 110-120E (Wang et al 2004)

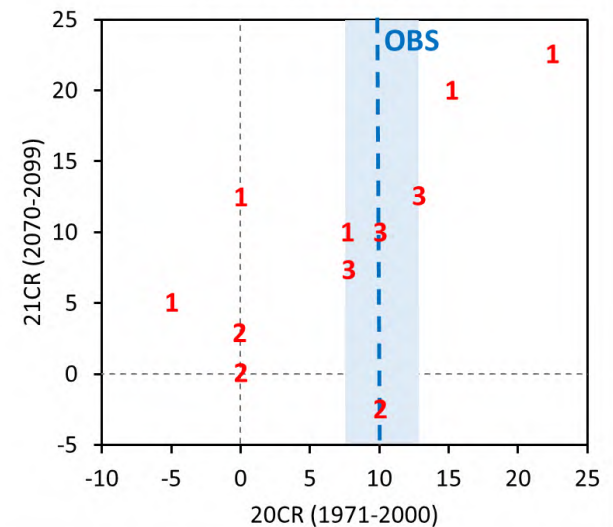
SG\_pr : 1.5S-7N, 100-113E

SCS\_pr : 10-20N, 110-125

CMIP5: SCS\_u850 v.s. SG-SCS precip



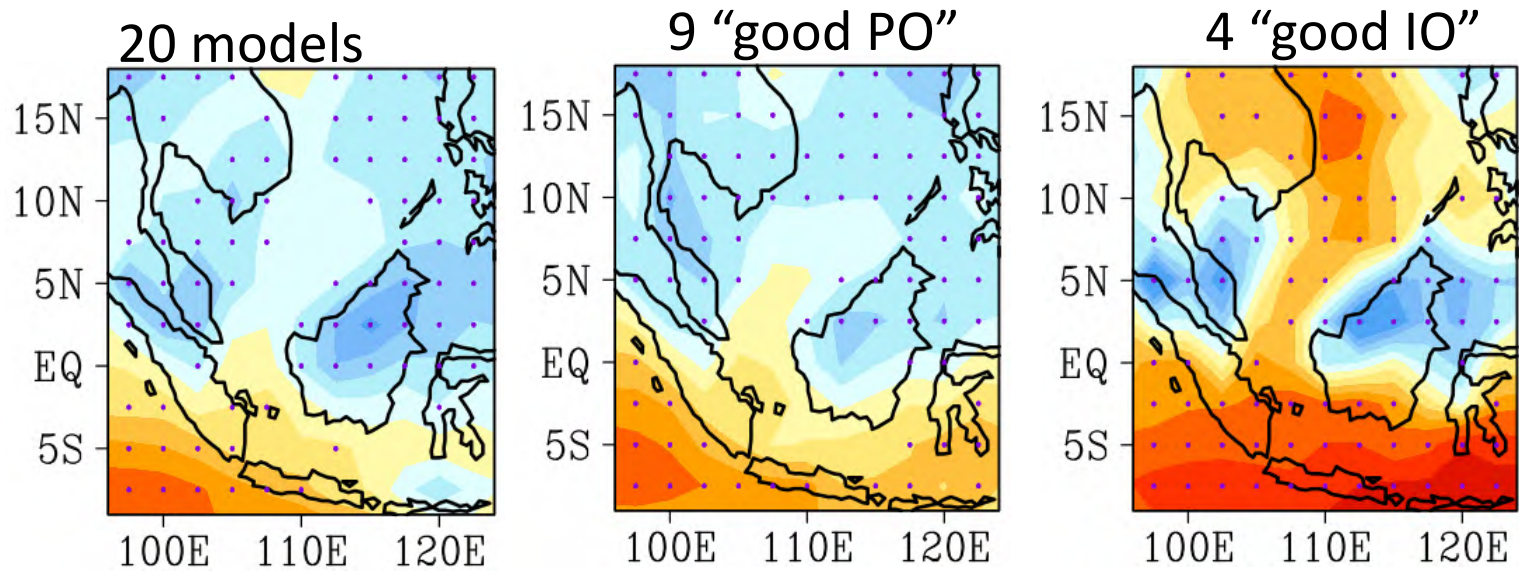
JJAS: Latitudinal position of max precip averaged over (100E-113E)



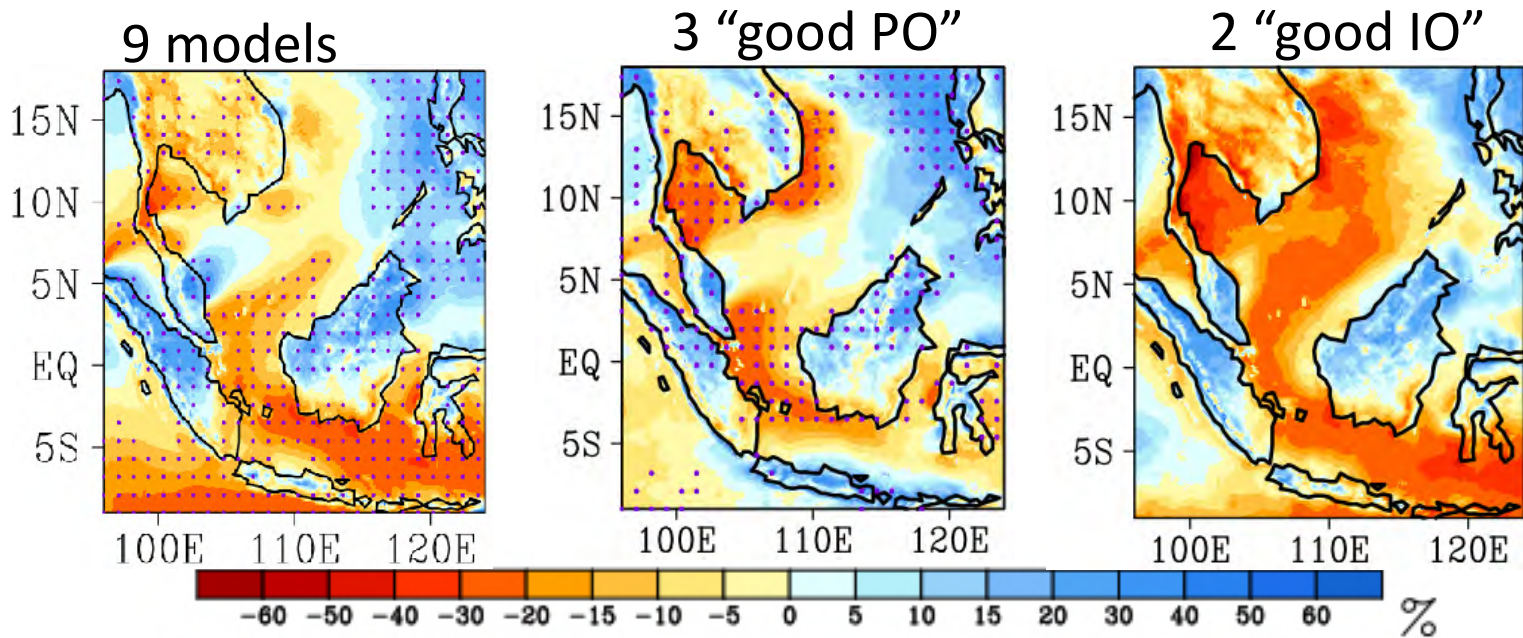


# SW Monsoon rainfall: increase robustness

CMIP5

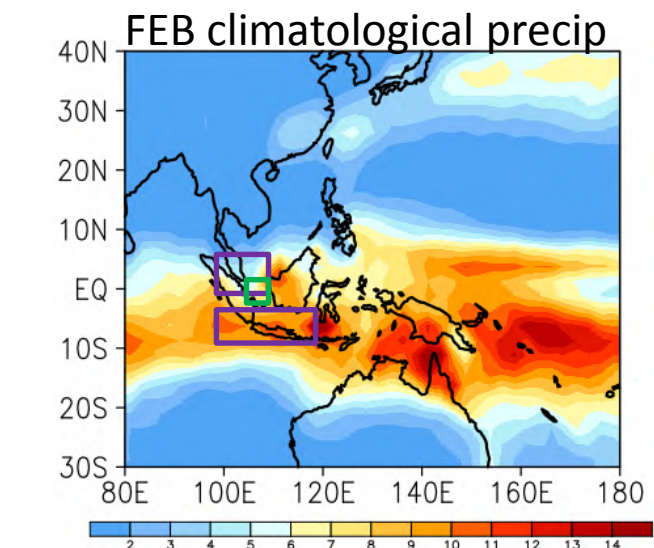


V2proj

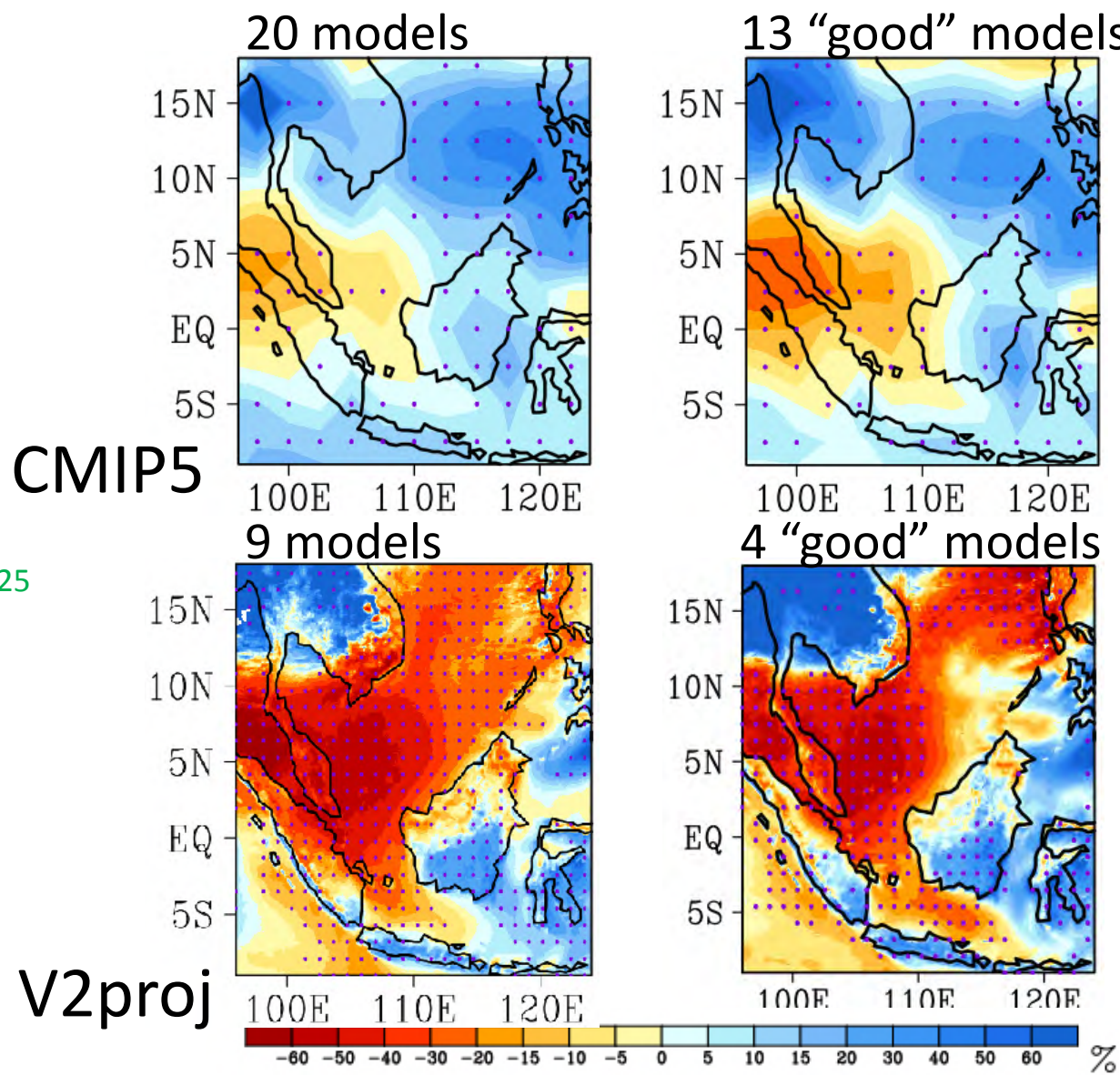


$cl=0.70$

# NE Monsoon dry-spell: mechanism

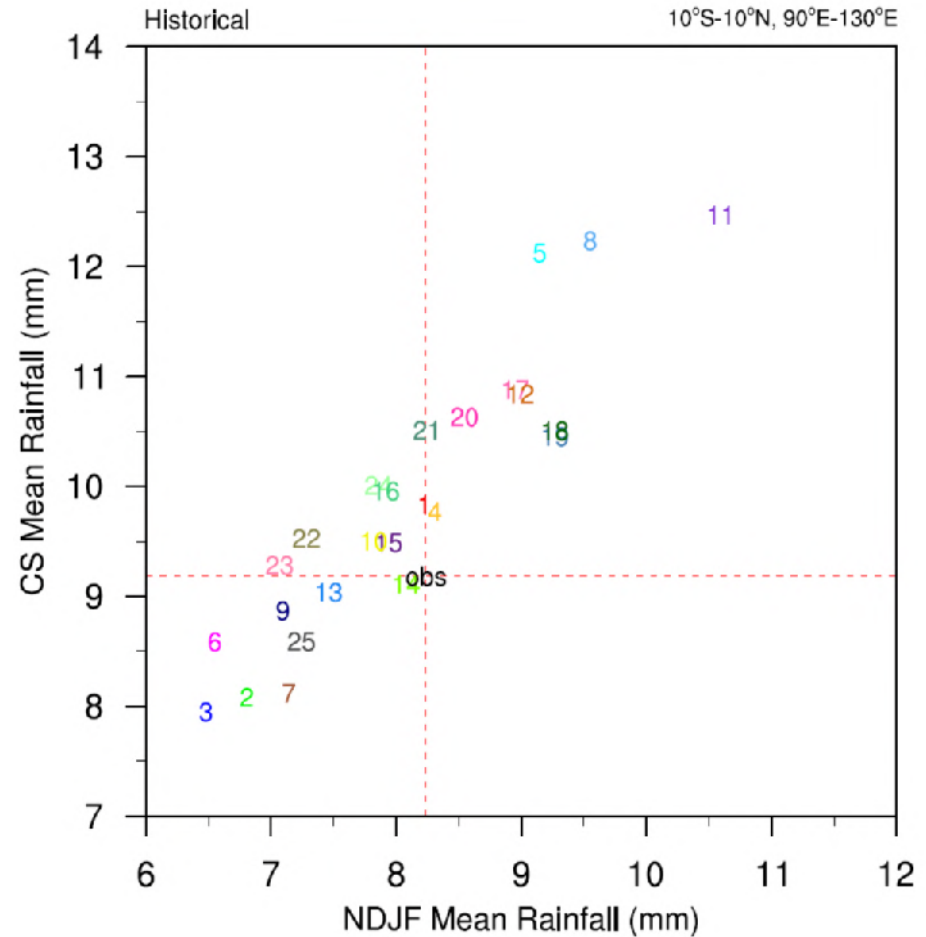
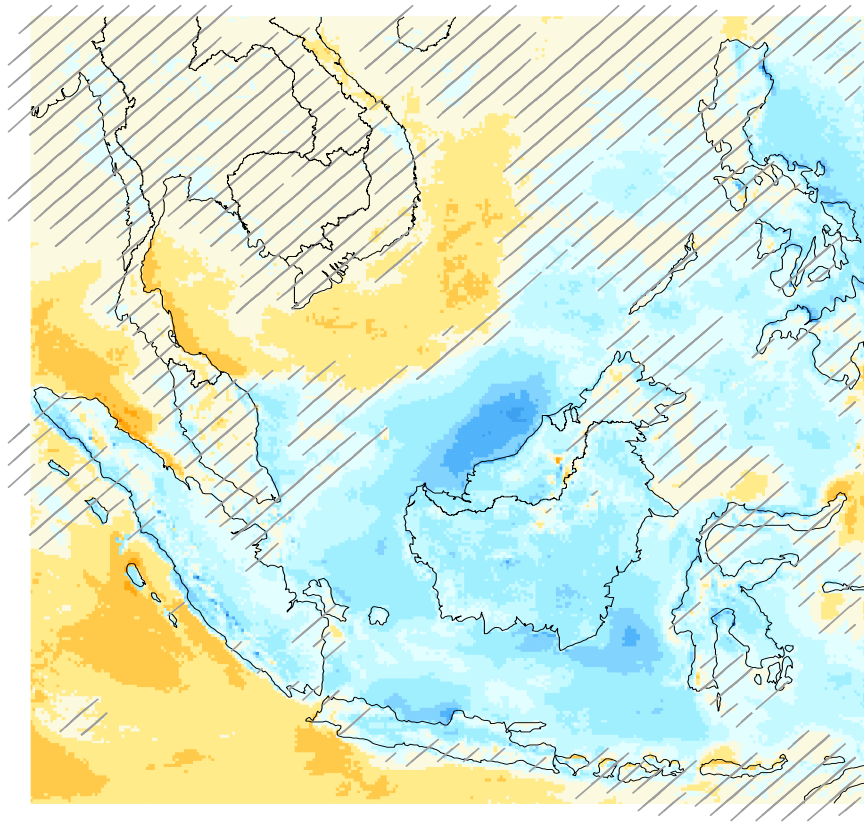


Cross-Equatorial Northerly Surge, CENS : v925  
over 5S-EQ, 105-115E (Hattori et al 2011)  
SG\_pr: 1.5S-7N, 100-113E  
Java\_pr : 5-12S, 100-120E





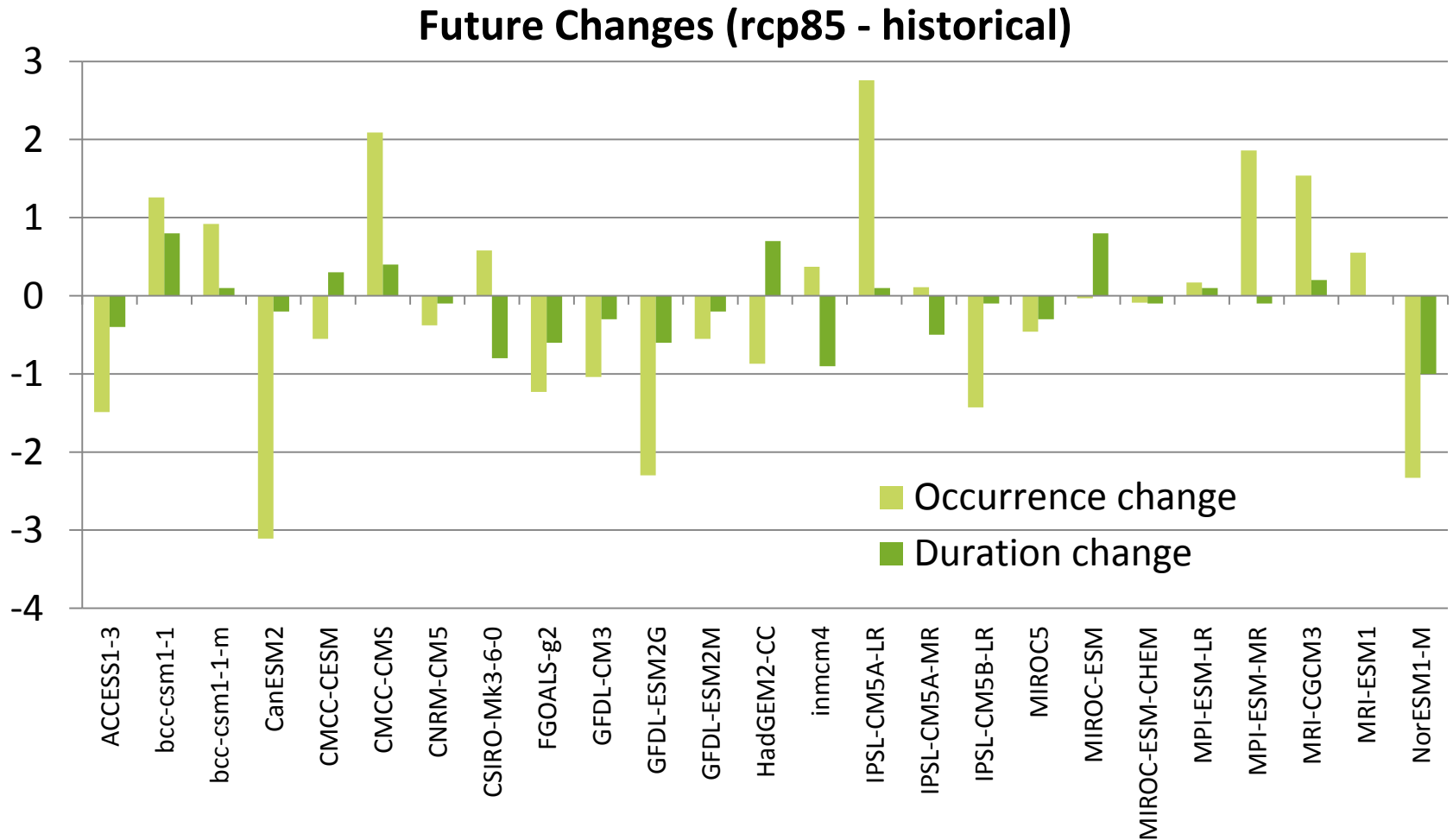
# NE Winter Monsoon: Cold Surges



**Cold Surge Index:**

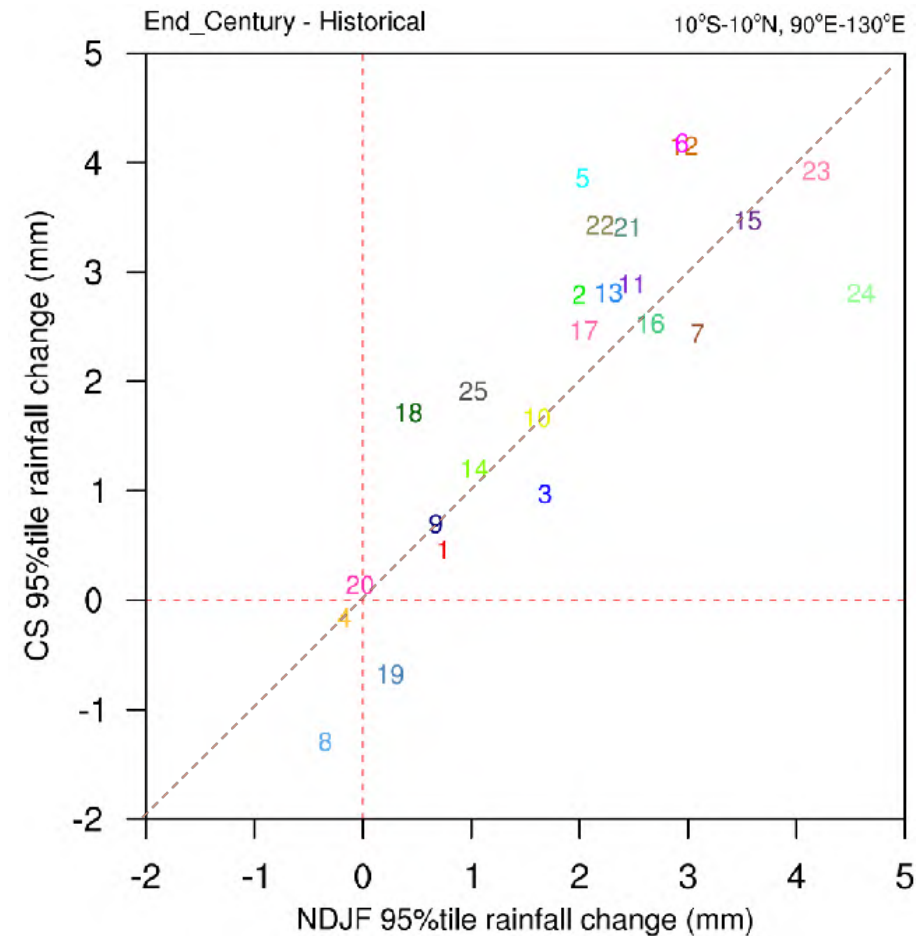
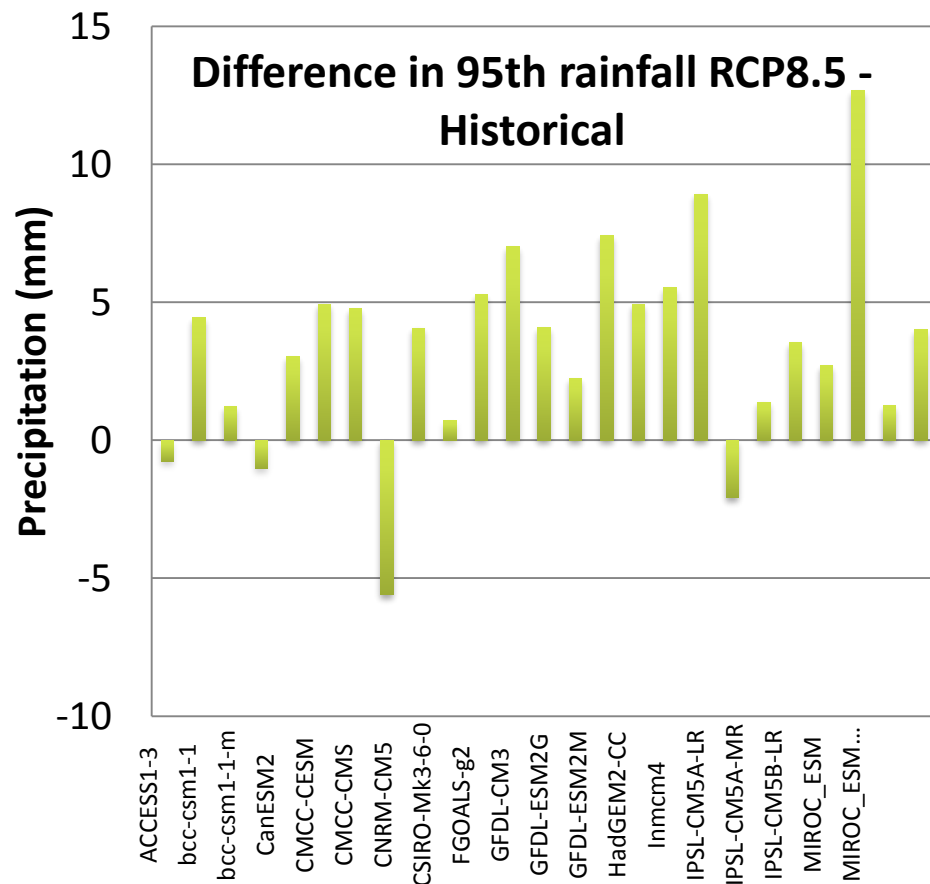
**Lim et al., 2017, *J. of Clim.***

# NE Winter Monsoon: Cold Surges changes





# NE Winter Monsoon: Extreme Rainfall

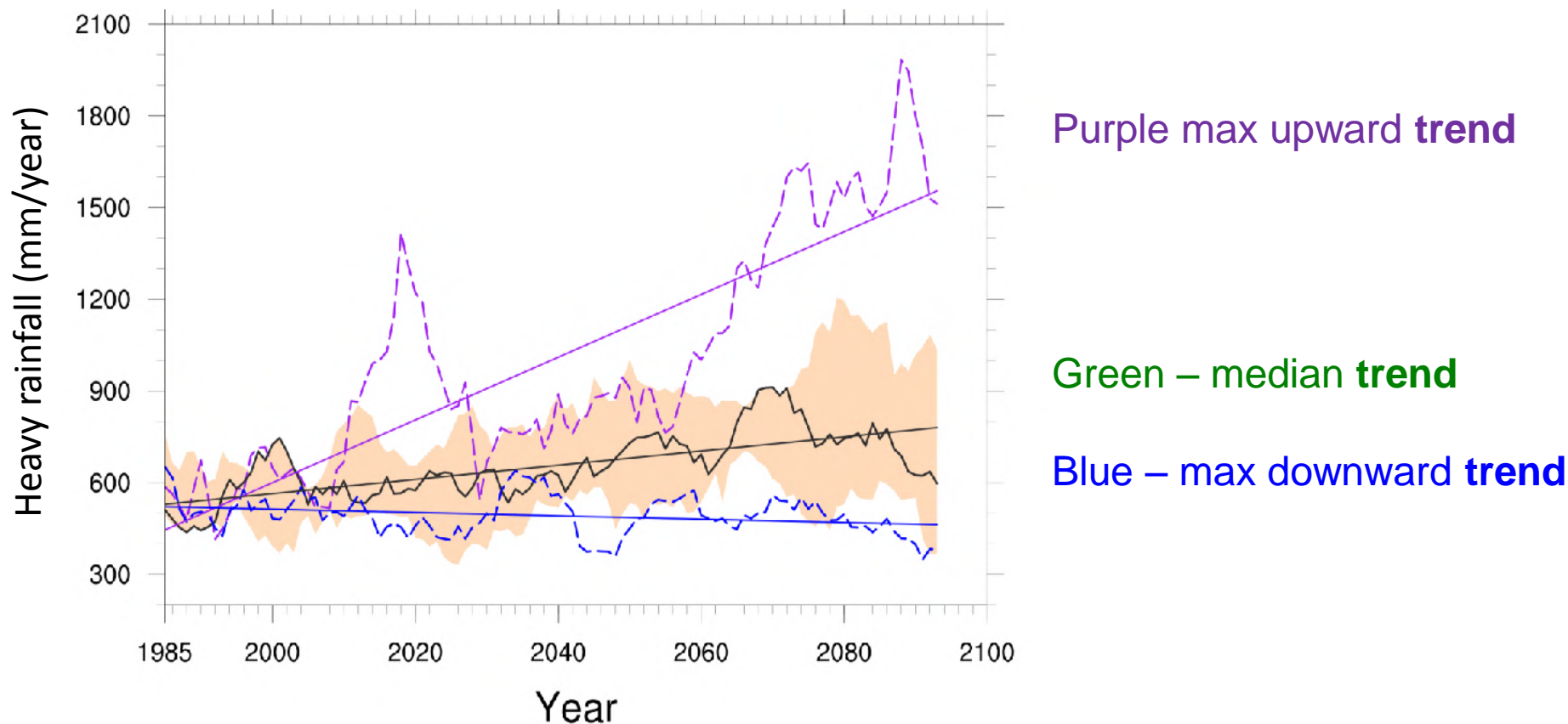


# Extreme rainfall



# 2<sup>nd</sup> Singapore Climate Change Study

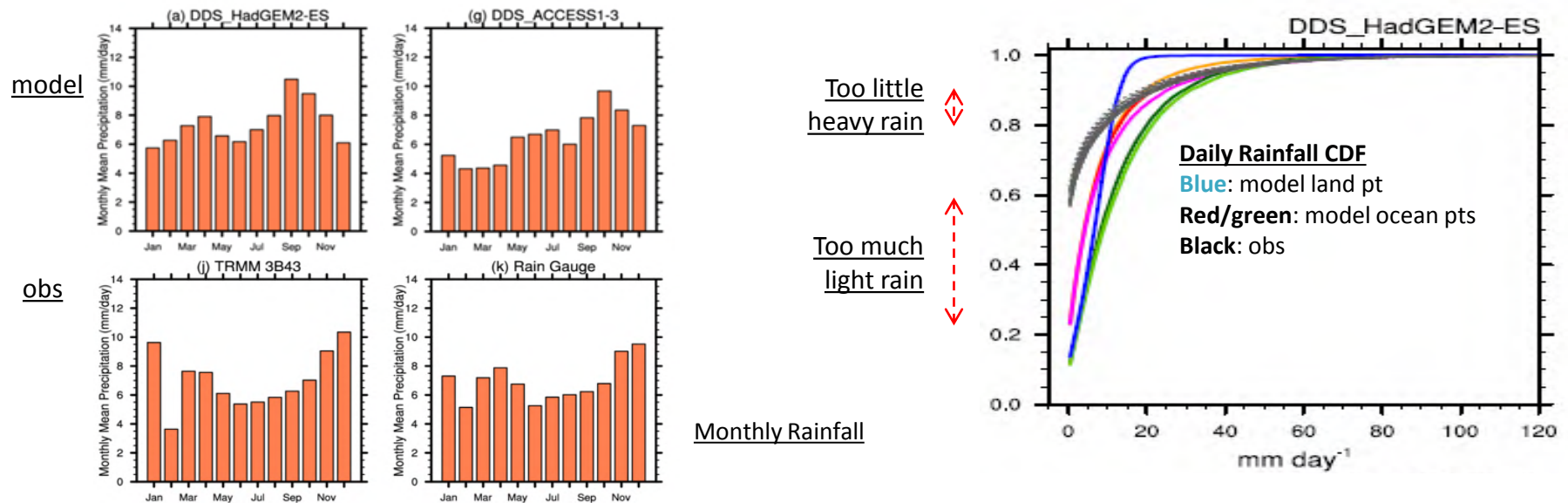
## Projected increase in heavy rainfall



Contribution to annual rainfall total from very wet days (rainfall >95<sup>th</sup> percentile in the current climate: 56 mm/day).

# Issues: Realism of key characteristics

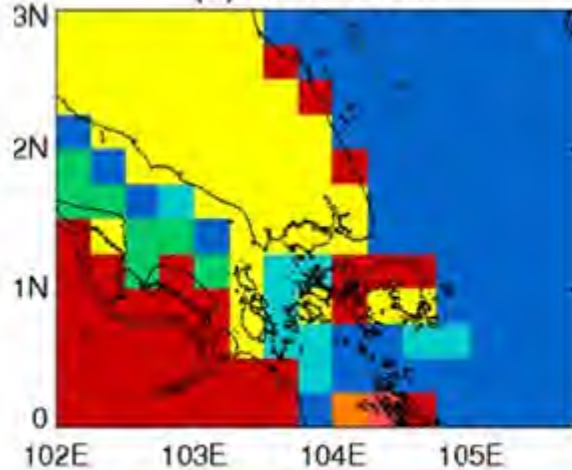
- V2 RCM over land regions covering Singapore struggle with:
  - The seasonal cycle
  - Extreme rainfall



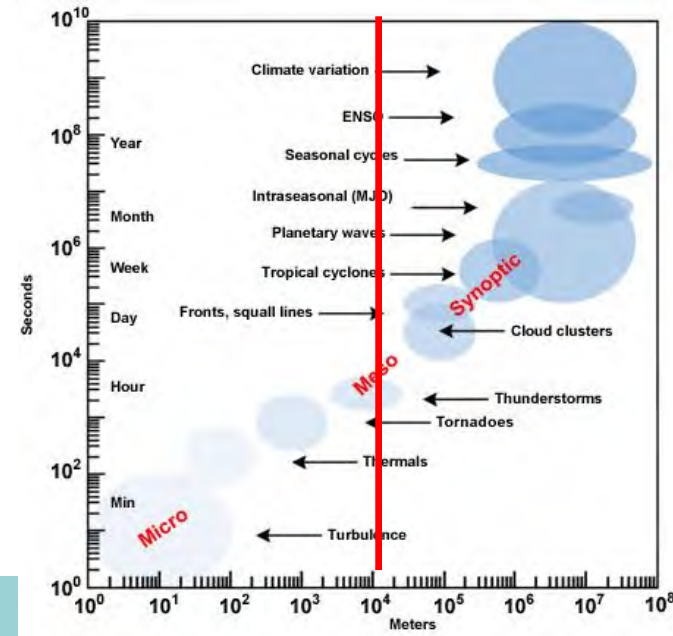
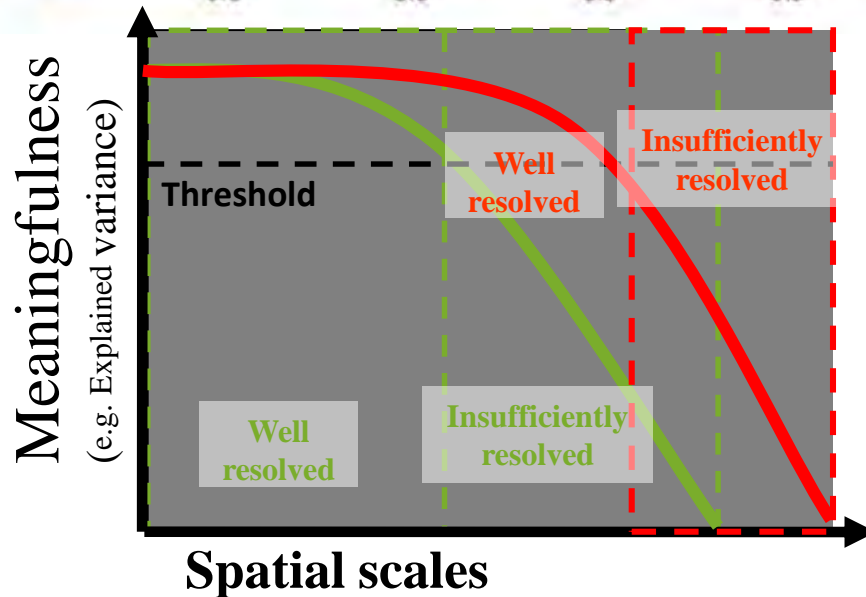
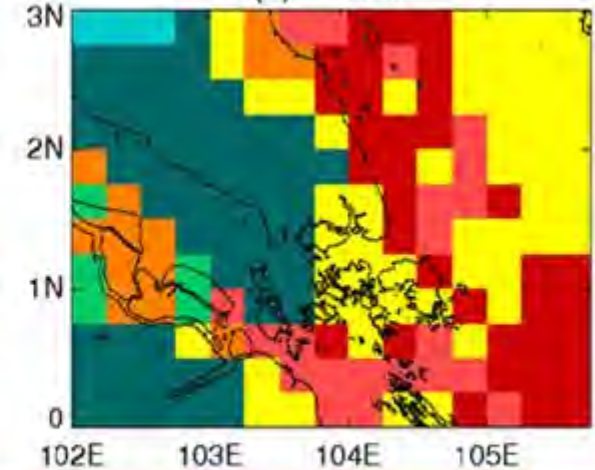
- Poor simulation of precipitation over land & sharp land-sea contrast → Scale of weather processes
- For 12 km simulations – bias-correction performed

# Issues: Diurnal cycle of convection

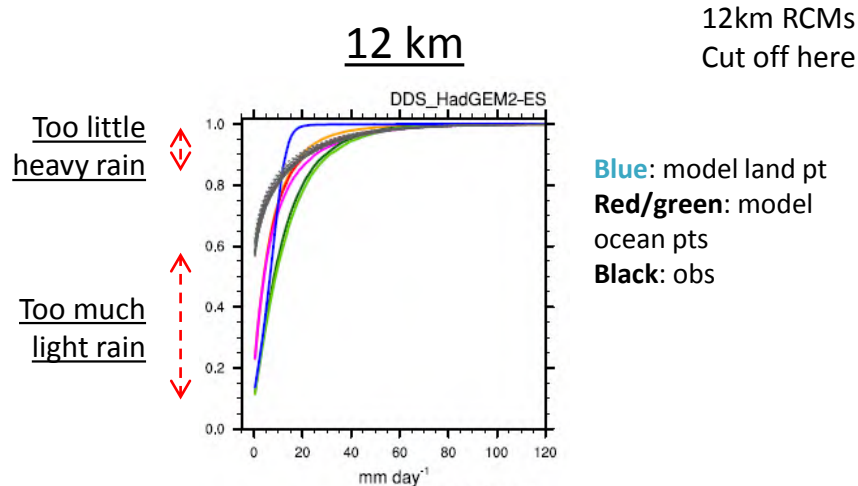
(a) 12-km RCM



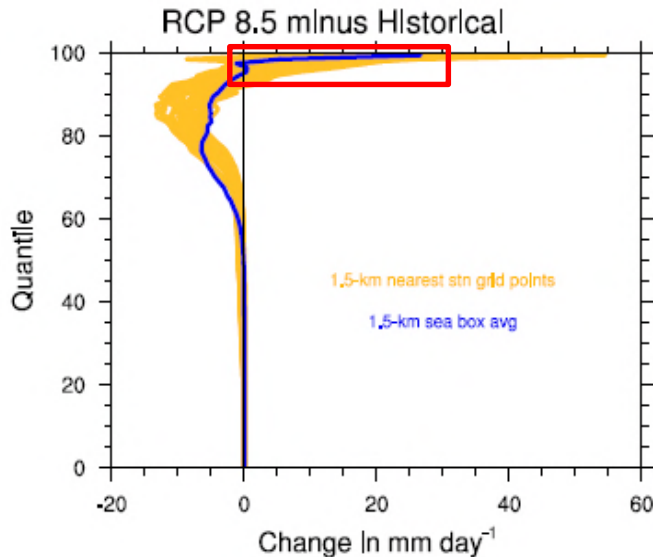
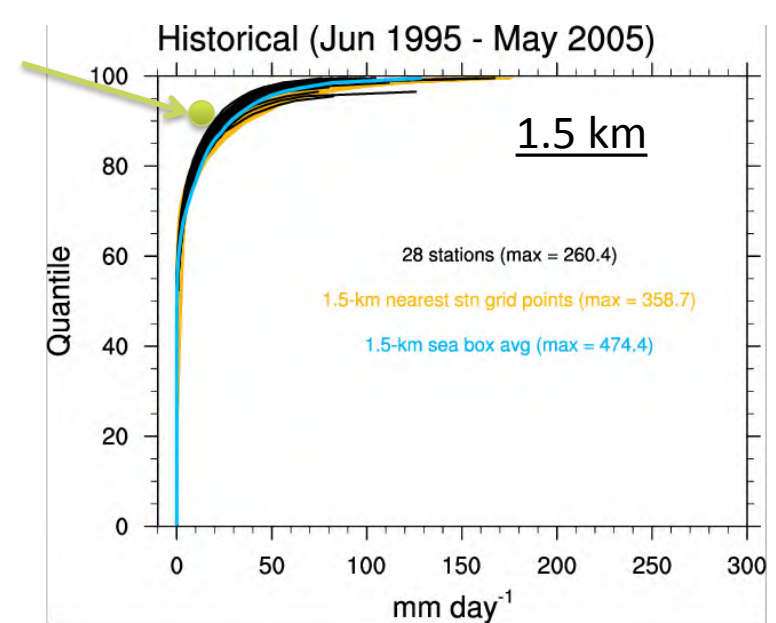
(c) TRMM



# Improved simulation of rainfall extremes




1. Results demonstrate **better agreement** between obs and the 1.5 km simulations



2. The projected changes in rainfall extremes from this simulation are broadly in agreement with those from the 12 km bias-corrected results (i.e. increase in extreme rainfall projections)

*Decadal variability in the simulations (which were for 10 years) prevents precise comparisons.*



A stylized illustration of a hand holding a yellow, cone-shaped object. The hand is rendered in light blue and grey tones, with the fingers wrapped around the object. The yellow object has a textured, segmented appearance. The background is white, and the overall style is clean and modern.

**What we would like to improve  
upon?**

# Issues arising from the projections:

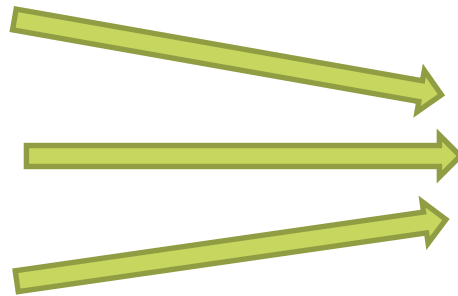
- 1) Better modelling of extreme rainfall (will build on the weather prediction work)
- 2) Treatment of the urban environment (with NUS)
- 3) Inclusion of man made (e.g. greenhouse gas and urban) climate changes and natural climate variability
- 4) Updated projections on sea level rise

## Improved models

**Global** – natural variability

**Regional** – better treatment of aerosols and air sea interaction

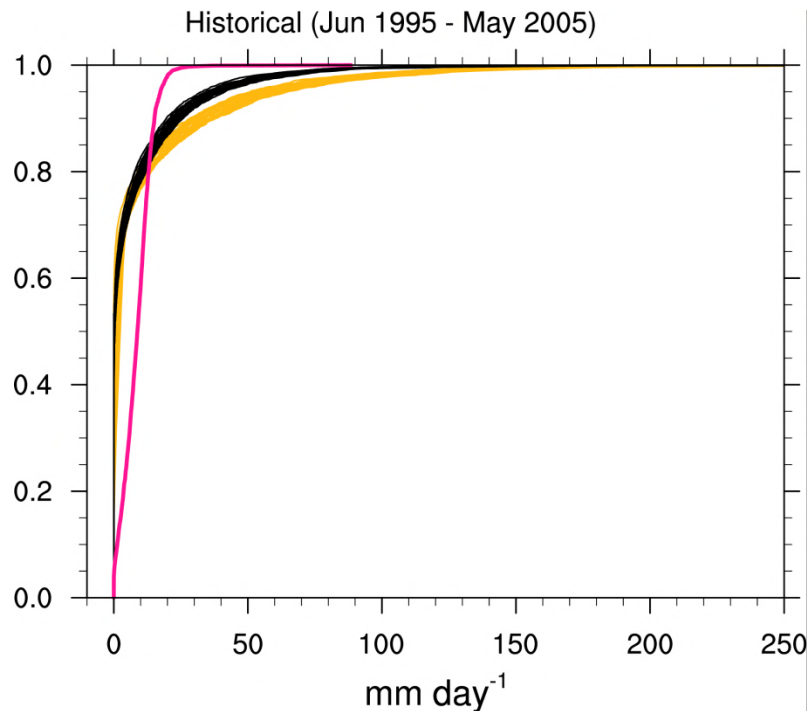
**Local** – inclusion of urban effects



More reliable climate projections to underpin adaptation planning

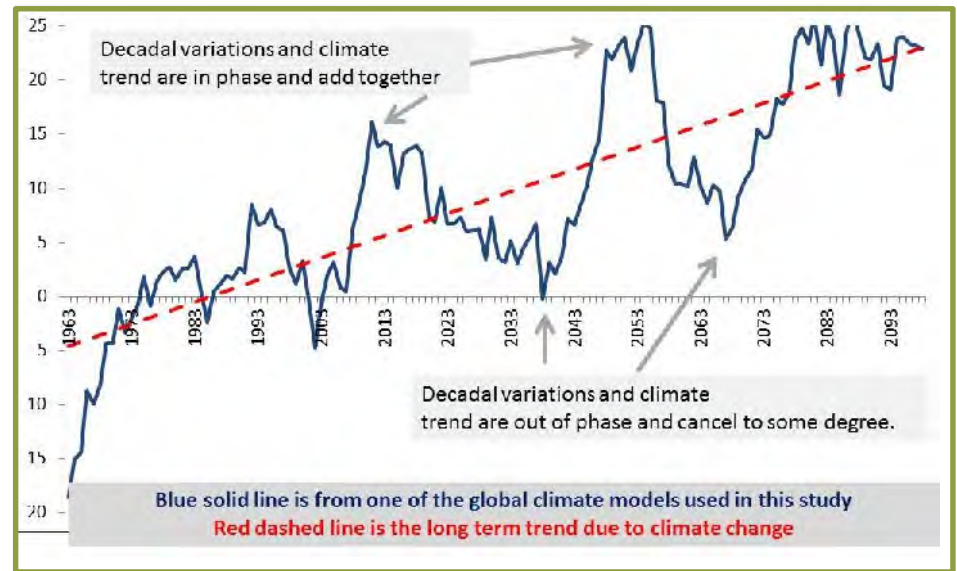
# Two high priority issues for CCRS

## The Cumulative distribution function of daily rainfall



Improved representation  
of convective rainfall

## Annual daily maximum rainfall time series as a percentage change from current values

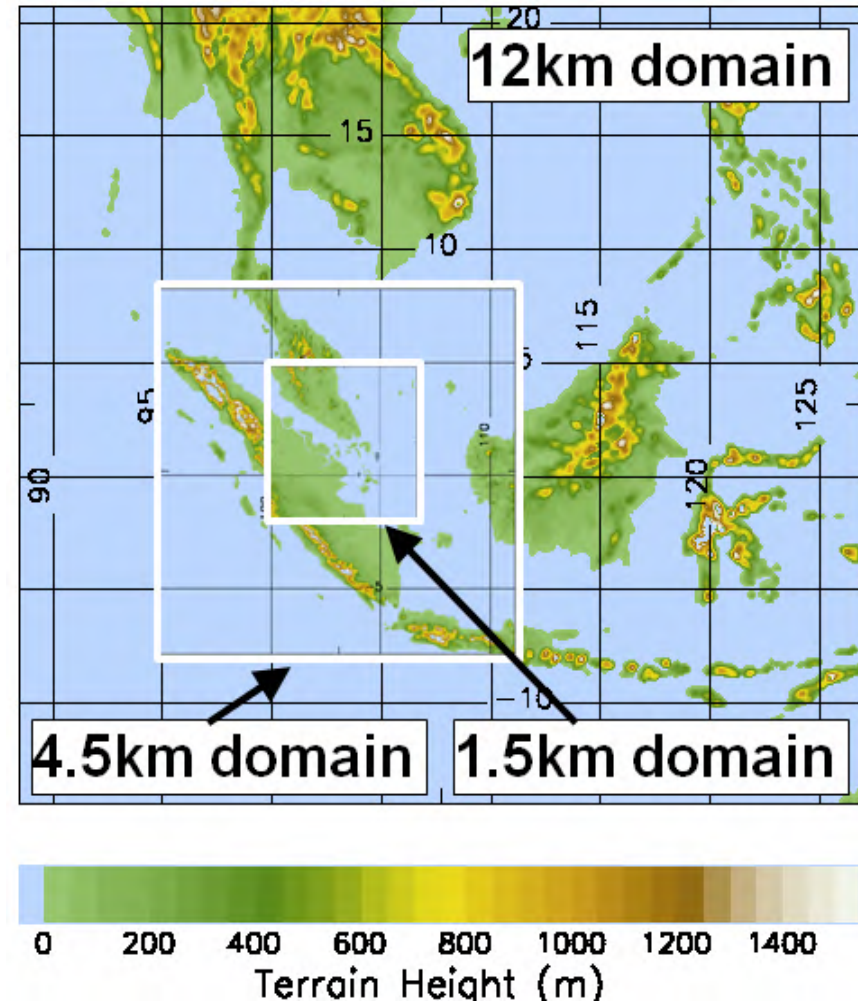
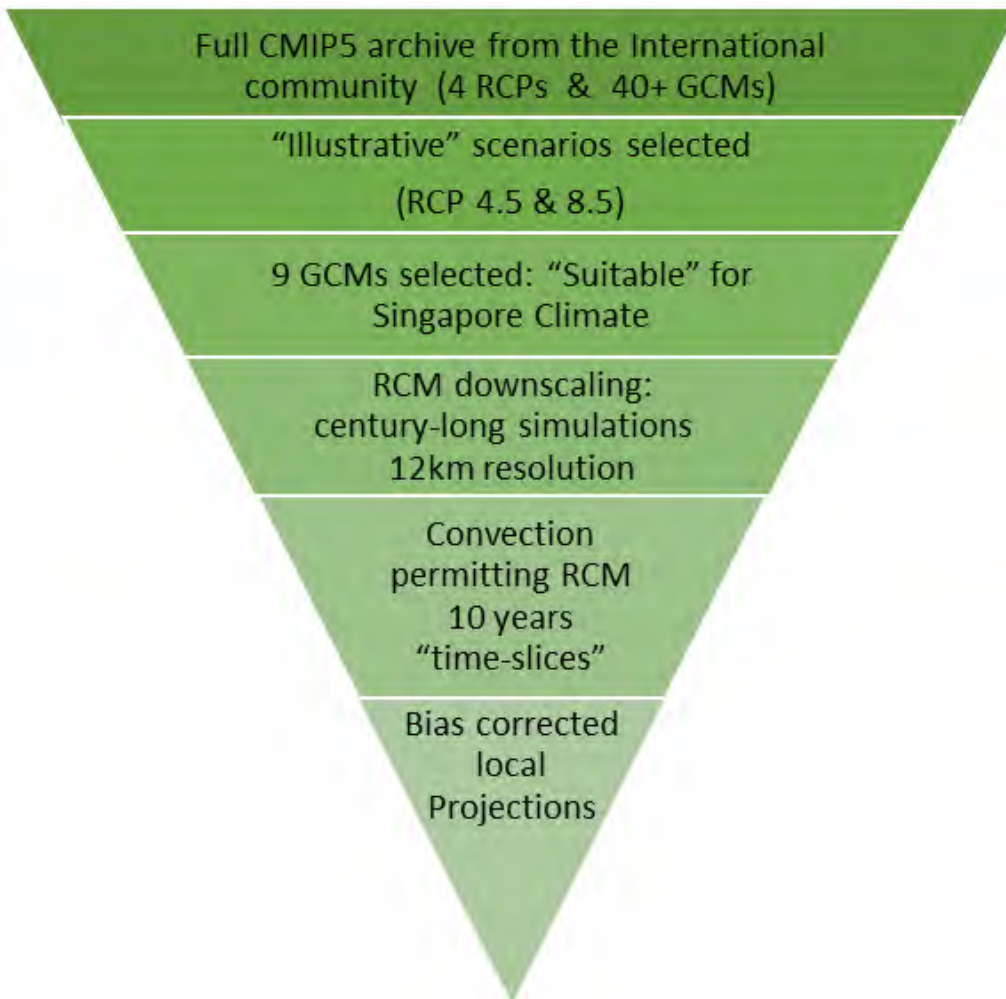


Improved understanding  
and modelling of natural decadal  
variability

# Next Frontier in RCM: km-scale modelling

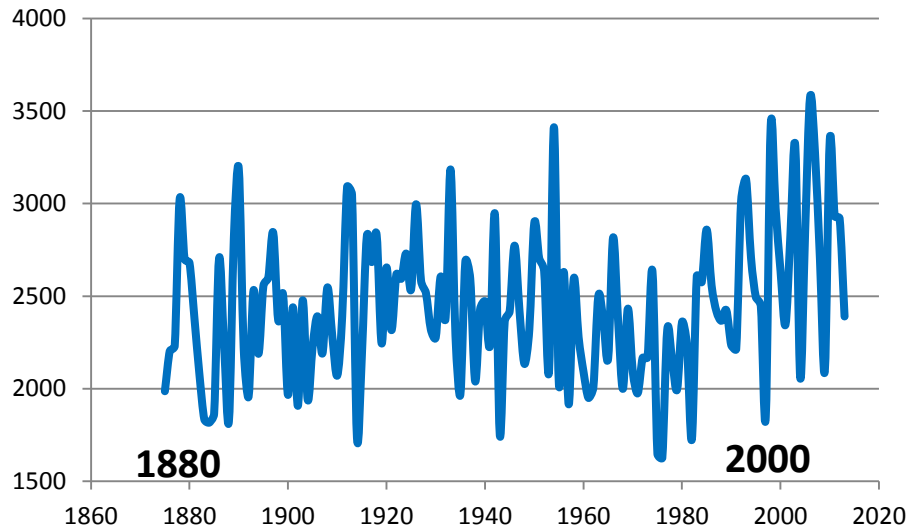
Convective-scale modelling:

- Relevant for high impact weather?
- Evaluate 12 km bias correction



# Man-made climate change and natural variability

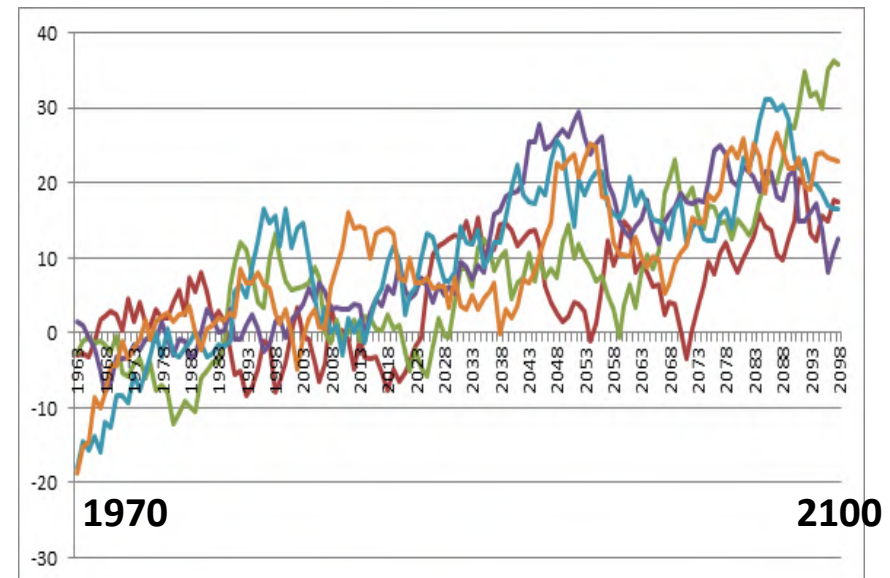
## MacRitchie Reservoir observations Annual rainfall: May to April



**There are clear and large amplitude decadal variations**

## Why this matters for climate change projections:

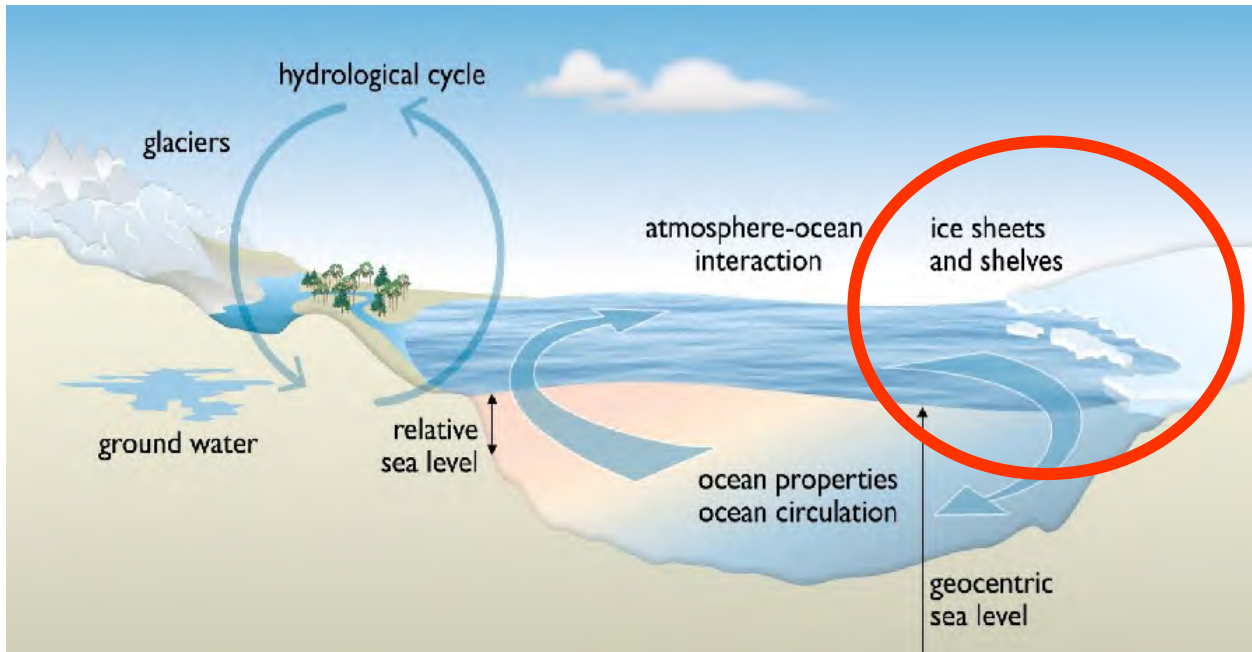
**Region near Singapore, one climate model and 5 realizations with a 'butterfly' in 1850**



**For mid-century adaptation to changing rainfall, man made climate change and natural variability are both important**



# Global Sea Level Rise Science



## Projections of **sea level rise**

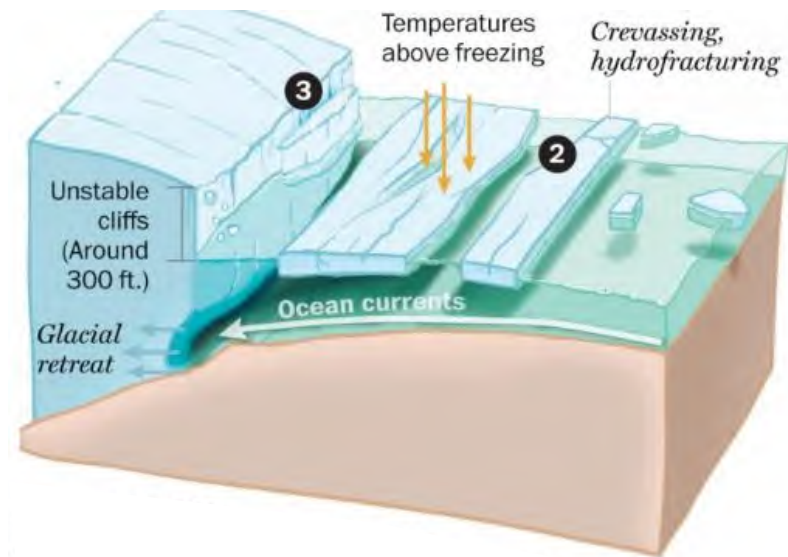
- Possibility of much higher GSLR
- Special treatment in V2 **H++ scenario**
- Rapidly evolving science: **ice sheets dynamic**

Singapore Sea Level rise using various methods:

	2100		2200		2300	
	Lower	Upper	Lower	Upper	Lower	Upper
RCP4.5 IPCC AR5 Method	0.29	0.73 m	-	-	-	-
RCP8.5 IPCC AR5 Method	0.46	1.02 m	-	-	-	-
RCP4.5 "low sensitivity"	0.19	0.65 m	0.30	1.42 m	0.36	2.10 m
RCP8.5 "high sensitivity"	0.47	1.29 m	0.88	3.57 m	0.94	5.48m
Hi-end "H++" scenario	1.00	2.00 m	2.00	4.00 m	3.00	6.00m

# Evolving Scientific Consensus & New Science

- IPCC **AR4** (2007): uncertainty in **ice sheet dynamics** not addressed
- IPCC **AR5** (2015): “collapse of marine-based sectors of Antarctic ice-sheet... cause global mean sea-level to rise substantially...”
- Rapidly advancing science since AR5:
  - Better representation:
    - Ice-shelves break-up
    - Collapse of ice-cliff
  - Increased risk for *upper-end* of SLR
    - By 2100 to be *over 1 m*
    - Additional 1 m from Antarctic
  - E.g. study giving indication of 1/1000 chance of SLR > 2.45 m

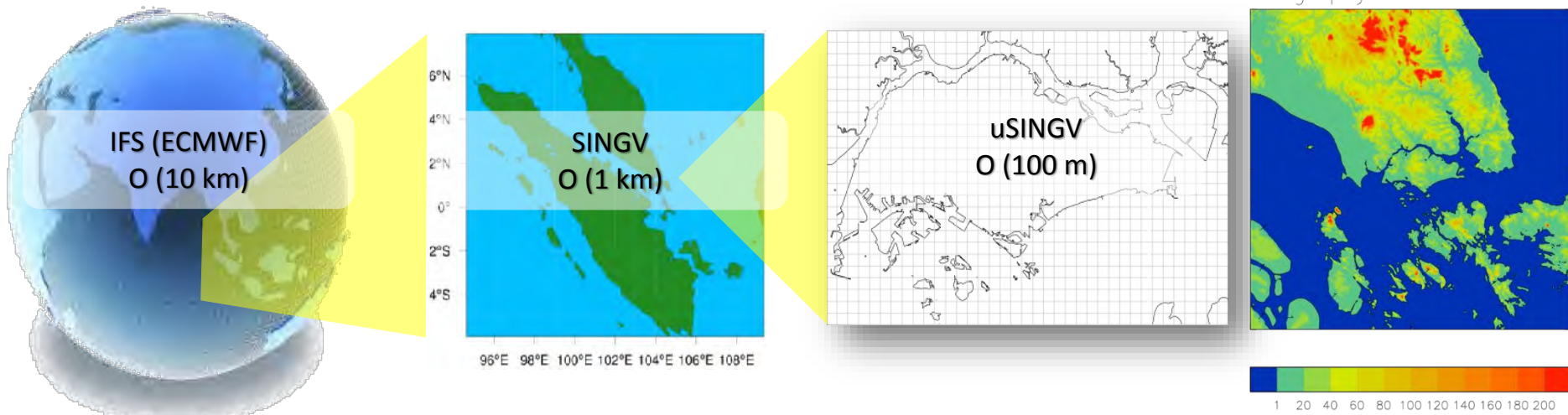


De Conto & Pollard (2016)



# MSS (CCRS) – NUS (Geography Dept.)

## Urban Modelling Projects



- Robust and reliable urban modelling system *uSINGV*
- Model domain is 200 km x 200 km in horizontal and extends up to 40 km up in the atmosphere. Grid resolution is 300 m in horizontal and 5 m in vertical near the surface
- Urban morphology from high resolution building database from SLA
- High resolution (300m) in-house landuse generated using ESA-CCI landuse product

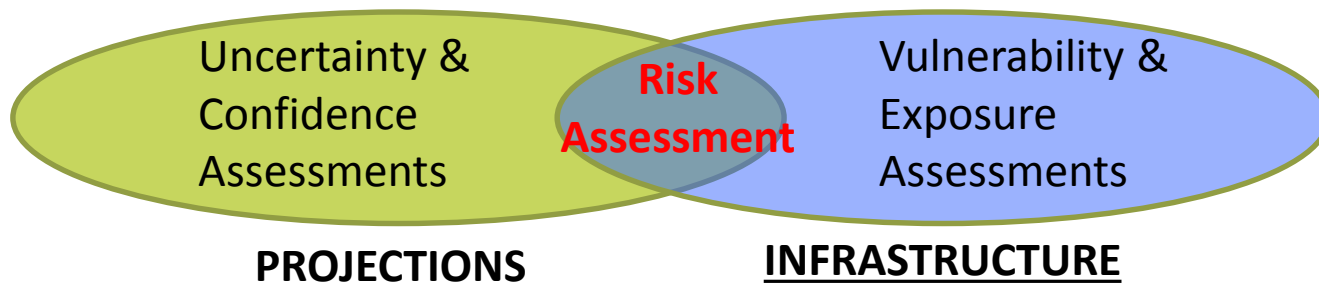
# Communication



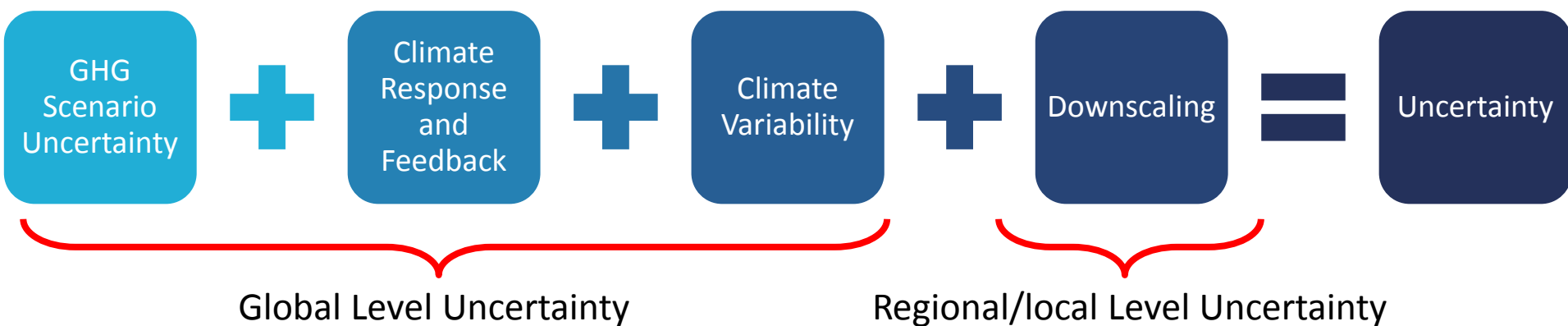
# Purpose of Confidence Information

Provide guidance on the confidence that can be placed arising from the uncertainties in the key findings of V2

- Science: Informs future studies by **identifying gaps**. Mark as research priority to improve understanding.
  - E.g. Mechanisms for projected drying, latest science for ice-sheet melt
- Applications: allows agencies to factor in uncertainty in decision-making and planning. E.g. focus on **highly-vulnerable areas** with reasonable levels of confidence



# Sources of Uncertainty



Uncertainty and confidence information:

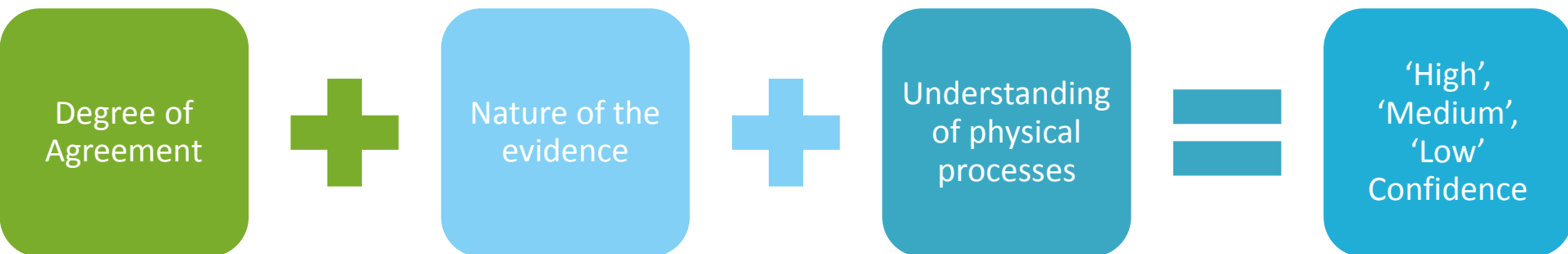
- Provides measure of validity of climate change findings
- Communicated during stakeholder engagement sessions
- Avoids quantitative models results being regarded too literally (e.g. level of precision  $\neq$  better certainty), and being reduced to a single number

# Use of Confidence Information

Current projections represents 'best estimate' based on **modelling evidence** and **current scientific understanding**

- As the science develops, possible for future projections may challenge the current range
- Therefore, important for the climate science community not to reduce the estimation of the range
- Hence, information on assessment of confidence is **as important** as the projection itself

Following IPCC





- Projected range in **extreme** rainfall
- Increase in NE Monsoon Wind Speed
- Projected upper limit in mean SLR

- Projected range in temperature
- Annual **average** rainfall not expected to change significantly
- Feb, SW Monsoon getting drier
- No significant change in **extreme** sea-level
- Upper limit of mean sea-level at least 0.76m, lower limit at least 0.35m

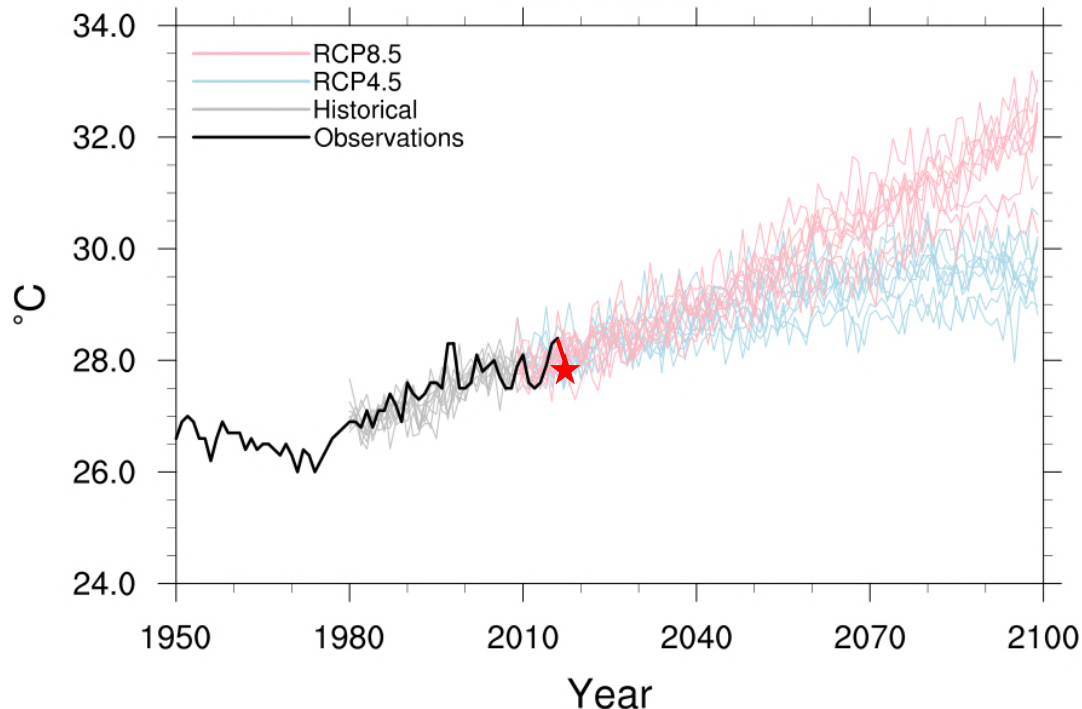
- Increase in temperature
- Increase in heavy rain frequency/intensity
- Increase in **mean** sea-level



# Dashboard: Singapore temperature

## 2<sup>nd</sup> Singapore Climate Change Study

Observed and Projected Singapore Temperatures  
Annual Means



What scenario are we tracking?

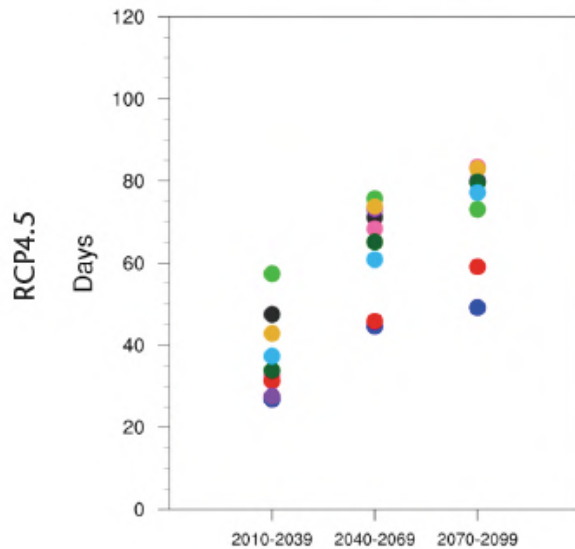
- No significant difference between RCP 4.5 & 8.5 until ~2070
- Not expecting to answer this question during my life time!
- Key point: Natural variability when not spatially averaged is larger

### Possible to do more on this:

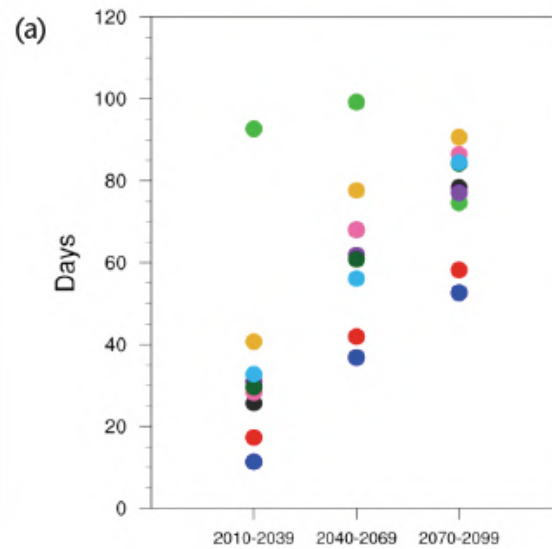
- Smooth out some of the “known” natural variability (e.g. ENSO)
- Unlikely to be meaningful for mean rainfall ....
- Extremes (rainfall, temperature) more likely to be meaningful

# Change of extreme temperature

FMAM Warm Days

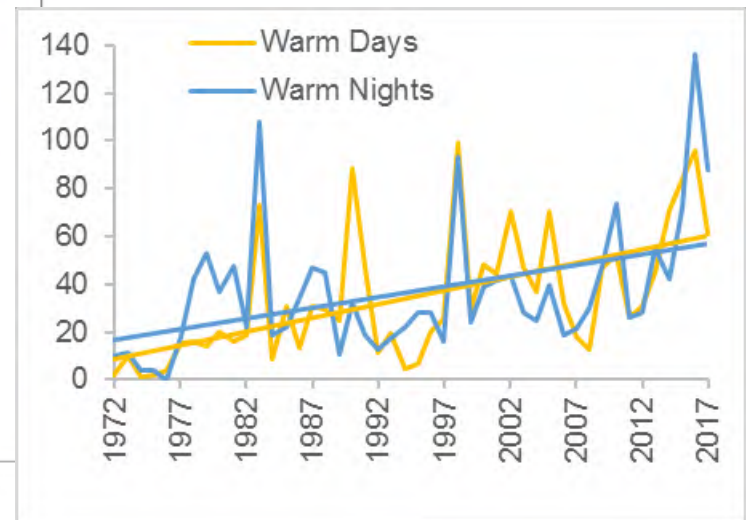
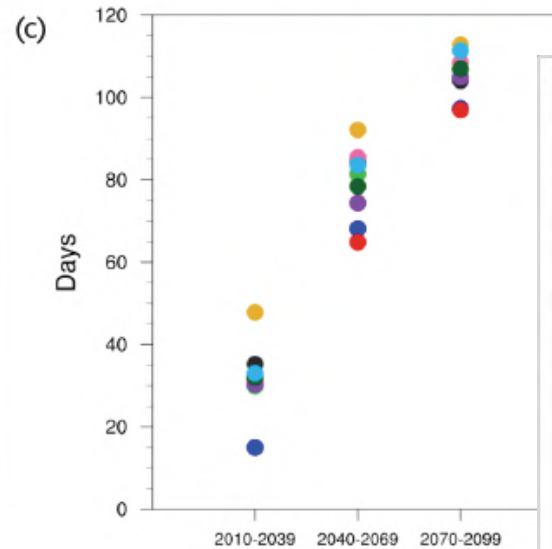
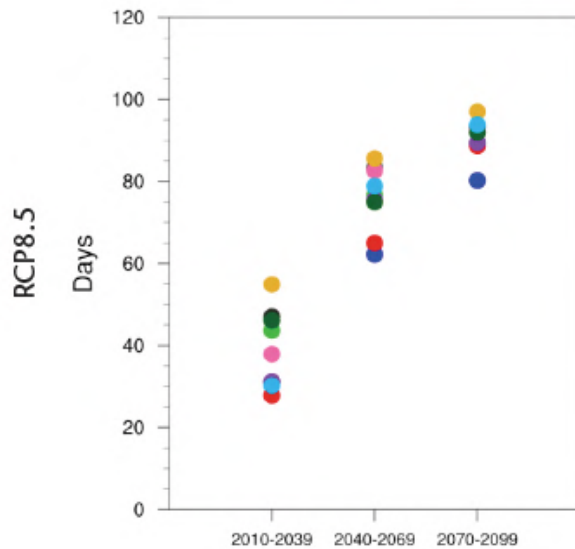


JJAS Warm Days



Extreme temperature:

- More significant to population
- More significant (risk)
- How climate change is starting to be experienced



# Heat Stress and Heat Injury

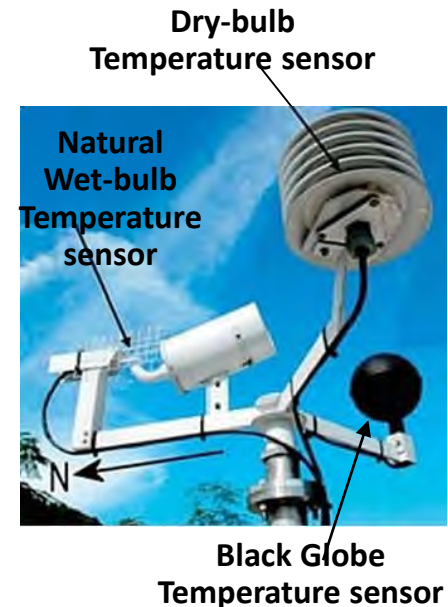
- **Heat Stress** is a measure of the effect of heat that generates discomfort on the human body
- Increasing levels of heat stress can induce spectrum of heat injuries



- One Heat Stress indicator used to measure the risk of heat injury is the Wet Bulb Globe Temperature (WBGT)

**WBGT** is a composite temperature to estimate the effect of **temperature, humidity, wind speed** and **solar radiation** on humans

- A measure of a person's perspiration rate and thus an indicator of human comfort
- Used as a guide in managing strenuous activity in hot and humid environments



# Conclusions (I)

1. Future rainfall changes across Western Maritime Continent (including Singapore) will be a consequence of changes in Monsoonal circulation
2. Mean rainfall projected changes is uncertain and innocuous (no trend)
3. Devils are in the details:
  - Possible increase in decadal variability
  - Dry spells (SW monsoon JJAS and NE monsoon Feb) likely to become drier
  - Extreme rainfall event during the wettest part of the year (Cold surges during NE monsoon) likely to increase
  - Implications for adaptation planning in Singapore
4. Extreme rainfall:
  - Confidence in the physical understanding
  - But limited confidence in climate model results
  - Pushing into CRM simulations

# Conclusions (II)

1. Real uptake of the climate change science and projections by the WOG approach of the Singaporean government
2. Mean Sea Level Rise is critical issue for Singapore – National SL Program
3. Natural Variability and Climate Change:
  - Endless communication issue: “Is it due to climate Change?”
  - How to monitor climate change?
  - Multi decadal naturally occurring climate variability
4. Importance of communication:
  - Relevance of the science
  - Integrity of the science
  - Communication of uncertainties



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