



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



# Convective-scale NWP for Singapore

**Hans Huang** and the weather modelling and prediction section  
MSS, Singapore

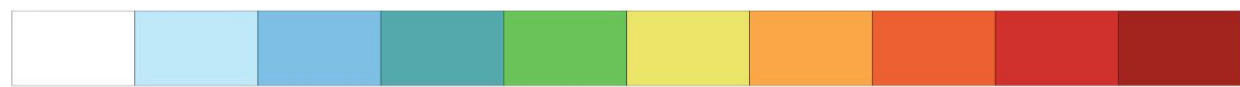
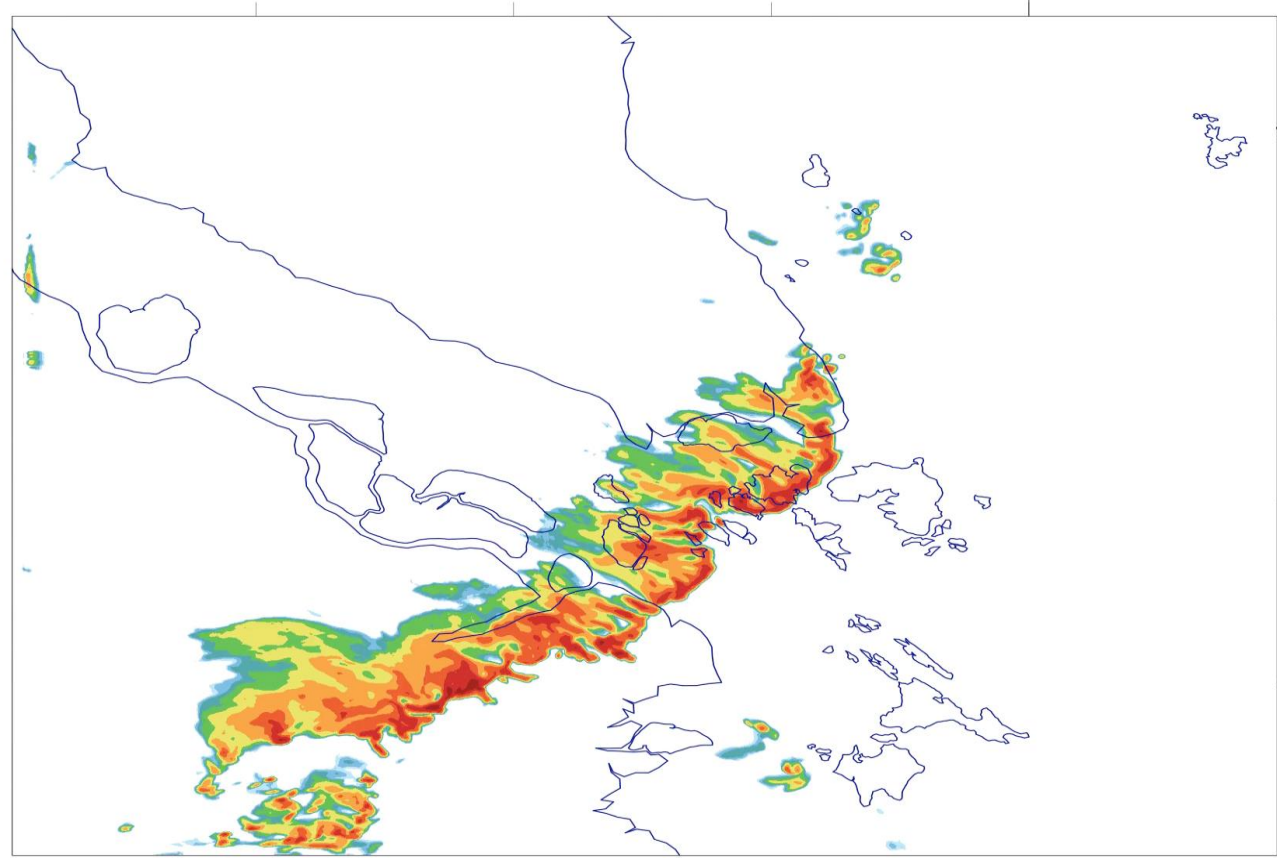
**Dale Barker** and the SINGV team  
Met Office, Exeter, UK

# Tropical weather systems are complex

- Convective rain clouds develop rapidly and have short-life span
- Largely driven by winds, which tend to be weaker and more variable in direction in the tropics
- Difficult to give precise forecasts of onset, location and intensity
- “Off-the-shelf” Numerical Weather Prediction (NWP) models - Low skill in predicting convective-scale systems (rain showers, localised thunderstorms)

Rain rate

mm/hr



0.1

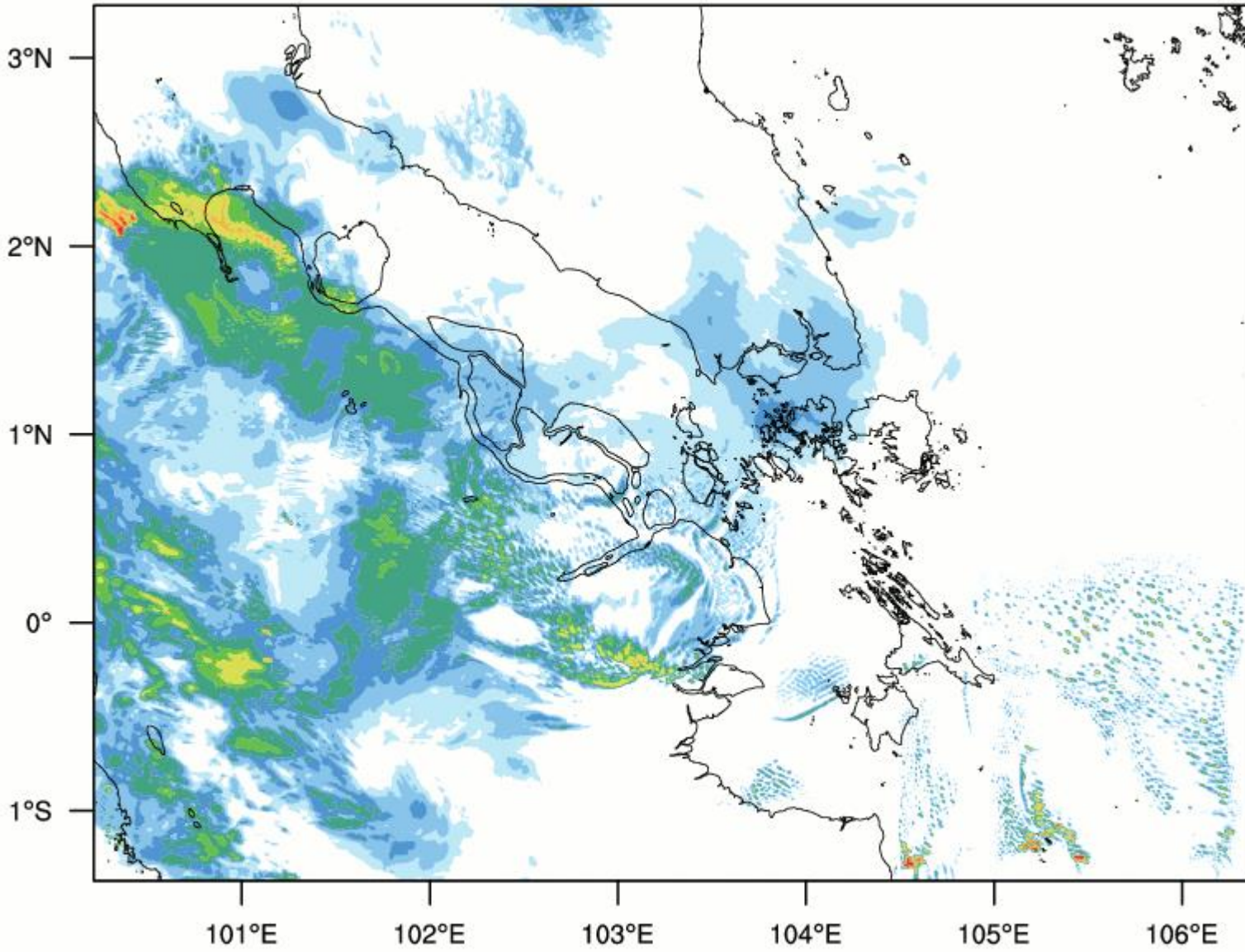
0.62

3.87

24.1

150

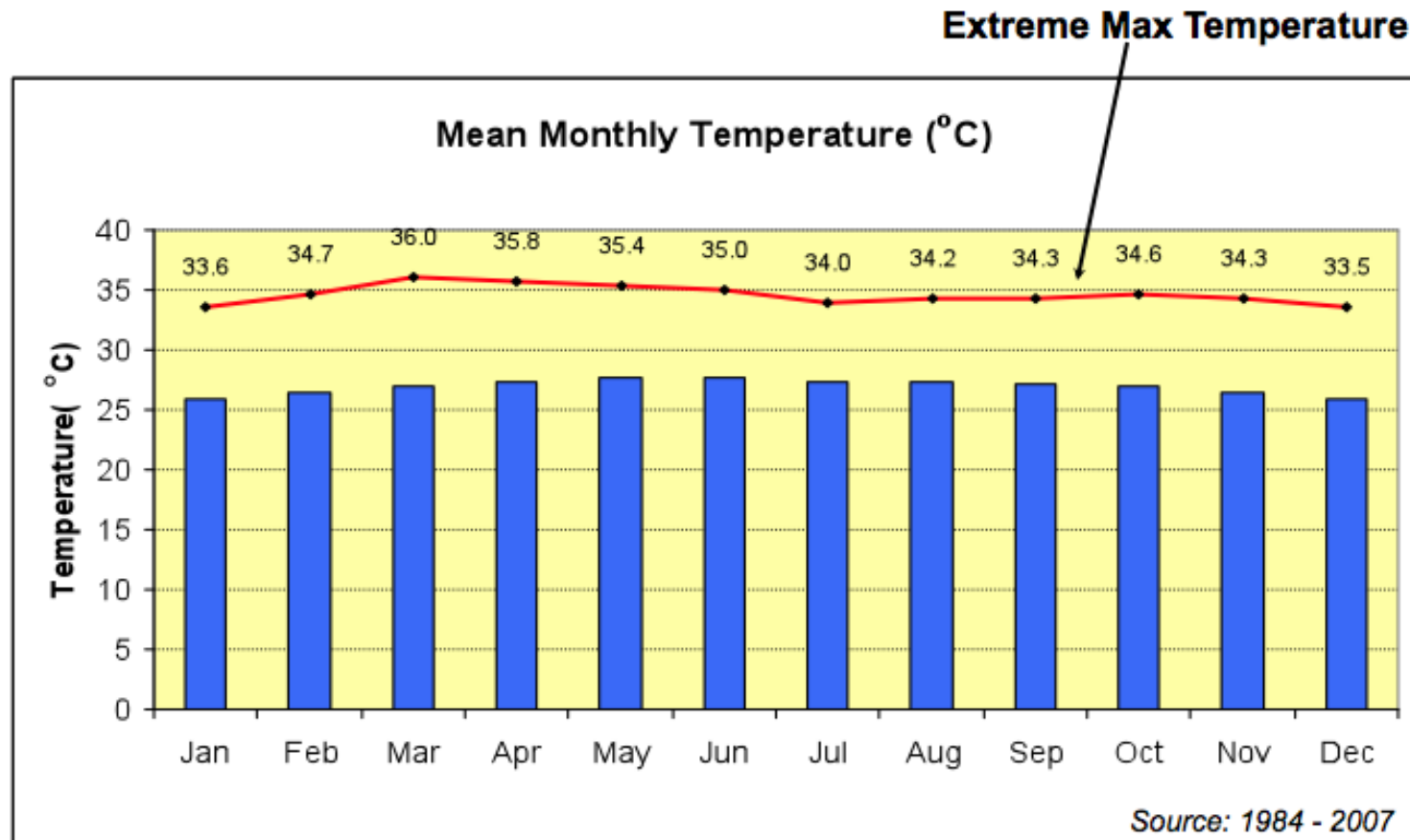
WRF, 500m



# Singapore Weather: Surface Temperature

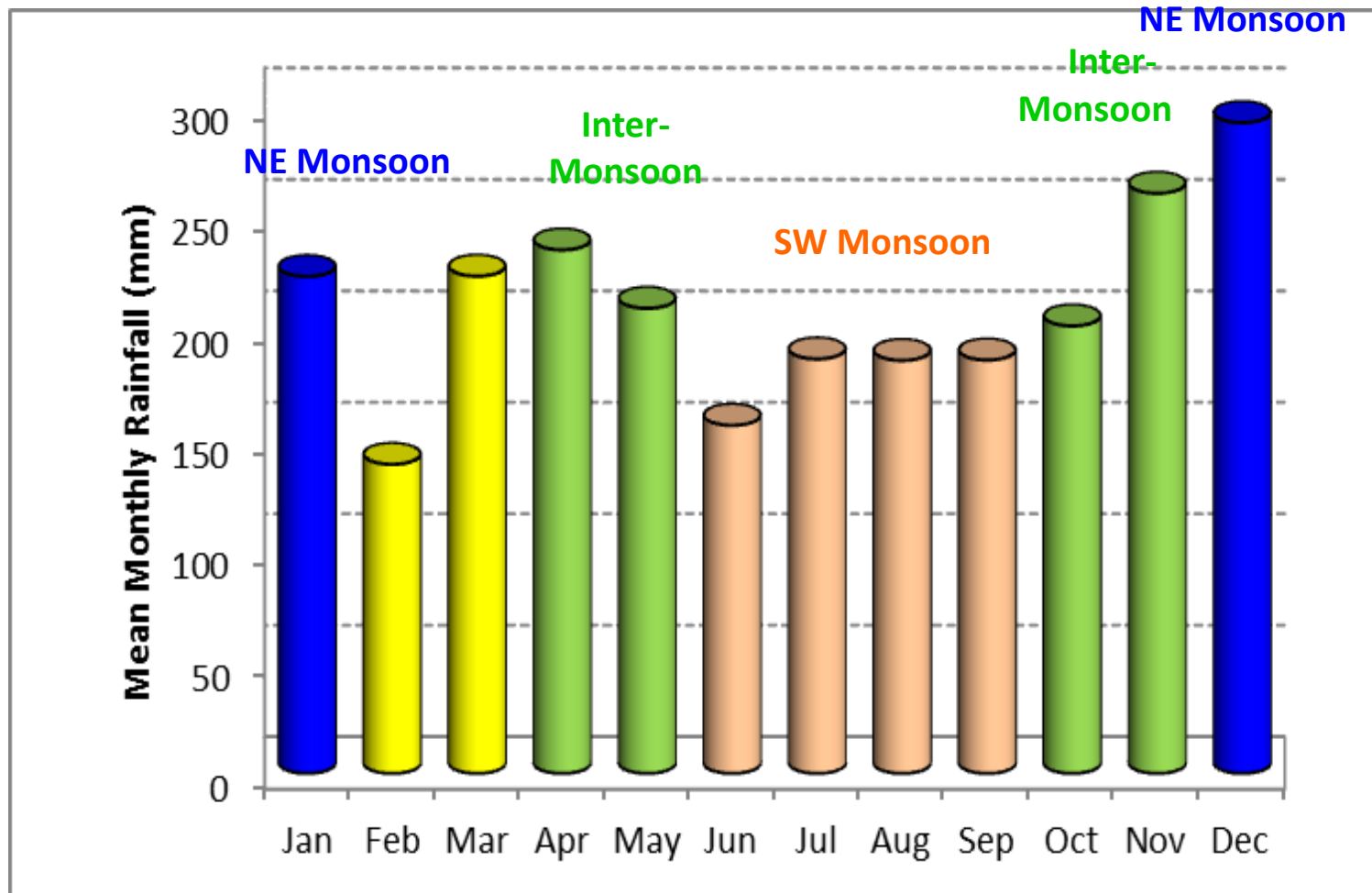
Raizan, MSS

- Little variability through year....

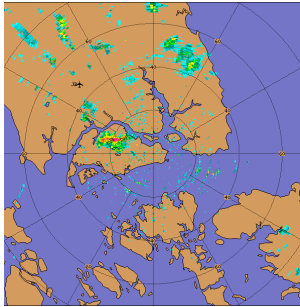


# Monsoon Seasons in Singapore

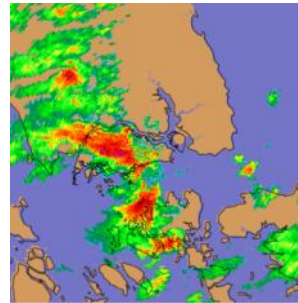
Cheong Wee Kiong, MSS



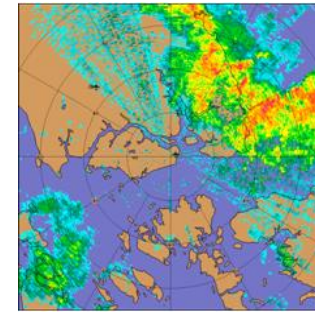
# Main weather systems which bring heavy rainfall:



**Localized convective  
thunderstorms**

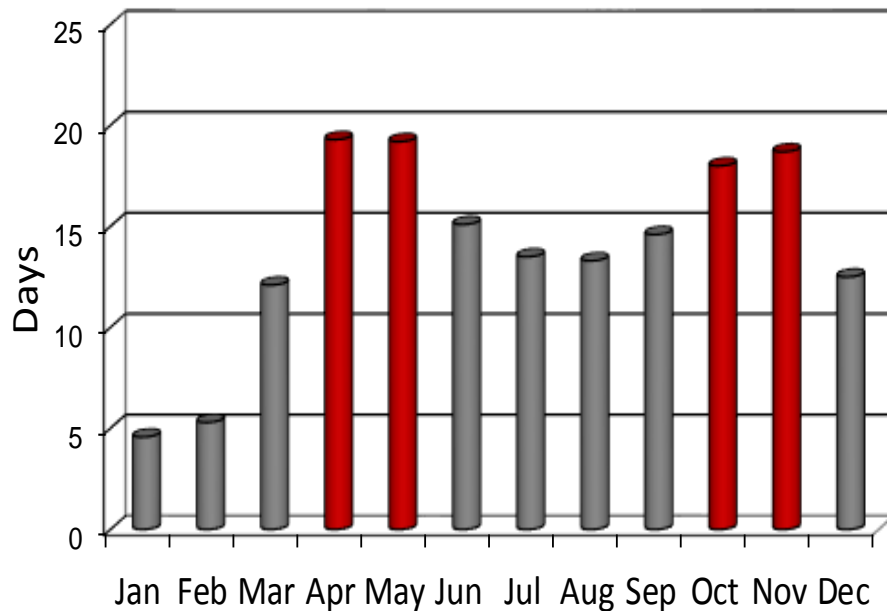


**"Sumatra"  
squalls**

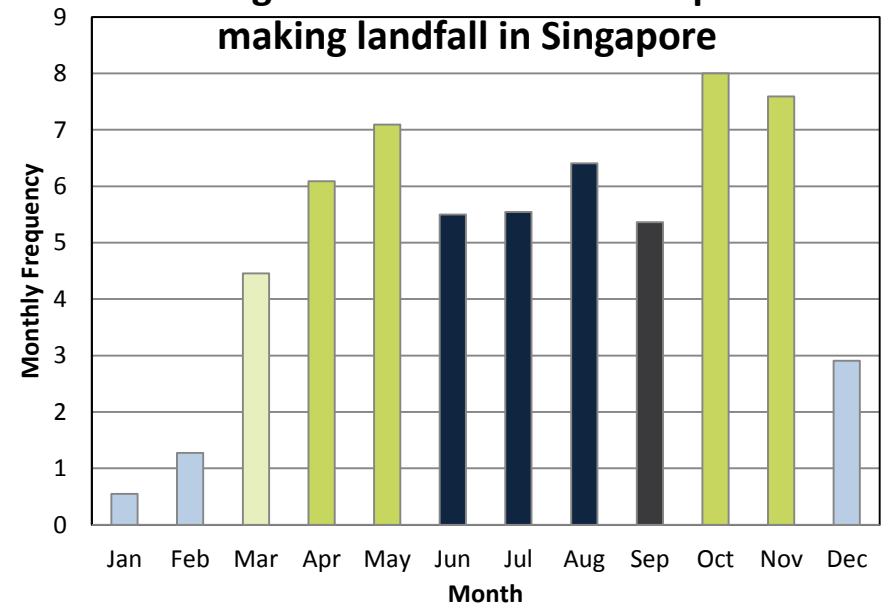


**Monsoon  
surges**

**Average Number of Thunderstorm Days**



**Average Number of Sumatra squalls  
making landfall in Singapore**



# SINGV

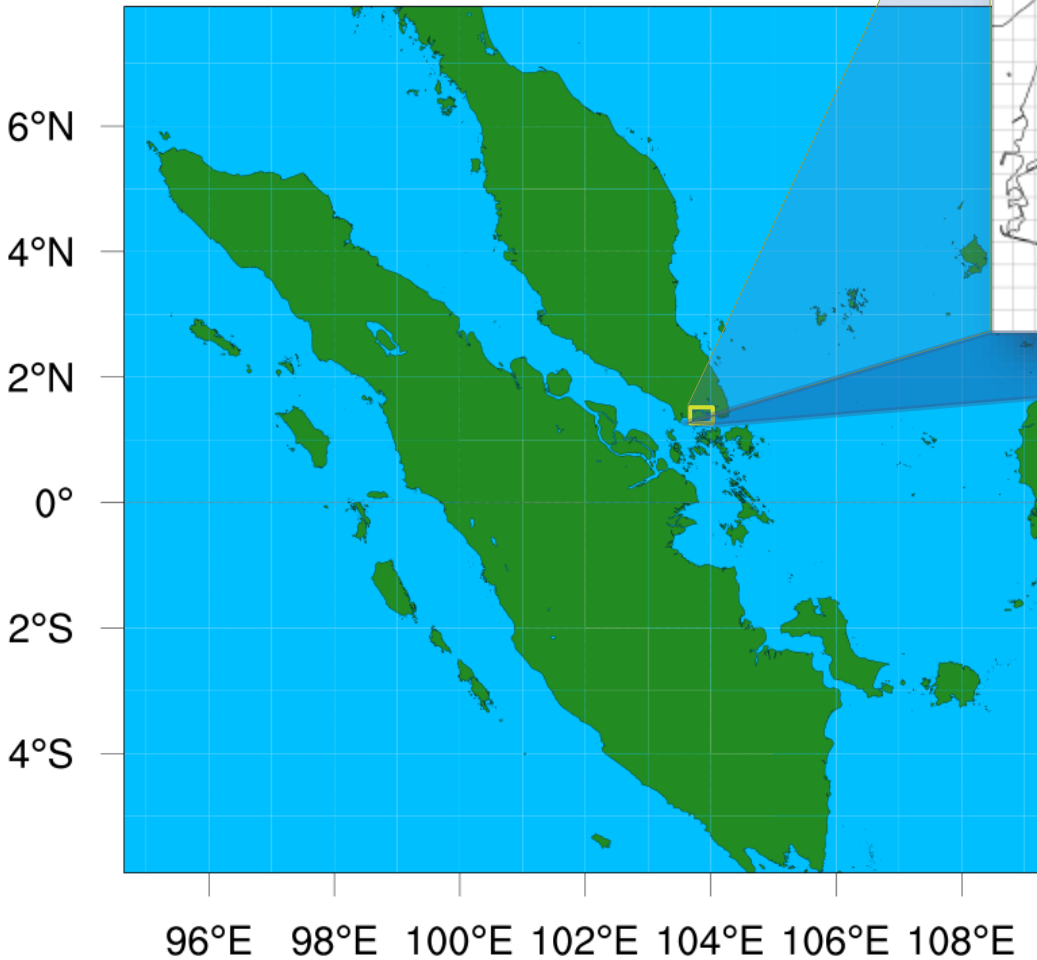
## – the convective-scale NWP system for Meteorological Service Singapore

- Collaboration: Met Office and Meteorological Service Singapore.
- ~4FTE/yr from each partner.
- Tropical, km-scale NWP R&D plus operational implementation target.
- Core Model R&D -> Evaluation -> DA -> Ensemble + Tech Infrastructure



# SINGV

DownScaler (DS)  
Data Assimilation (DA)  
Ensemble System (ENS)



- Downscaler uses a 1.5 km mesh, runs 2 times per day and produces 36h forecasts.
- Data assimilation system uses a 4.5 mesh, runs in full cycling with 3h assimilation windows and produces 12h forecasts from each analysis.
- Ensemble system uses 12 4.5km DS members, runs 4 times a day and produces 36h forecasts.

# **SINGV (DownScaler) started in real time at MSS in Feb 2015!**

## **Version 2.0:**

- Based on PS35 UKV ENDGame
  - No MURK aerosol
  - But L80 rather than L70
- Changes from Version 1
  1. P2A blended BL scheme
  2. Single 1.5 km domain
    - As opposed to version 1 = double nest
    - 1092 x 1026 x L80, dt=50s
    - Fixed not variable resolution
    - ~5 times cost of Version 1 configuration

# Model (vn 2.0)

Radar  
Estimated Rainfall

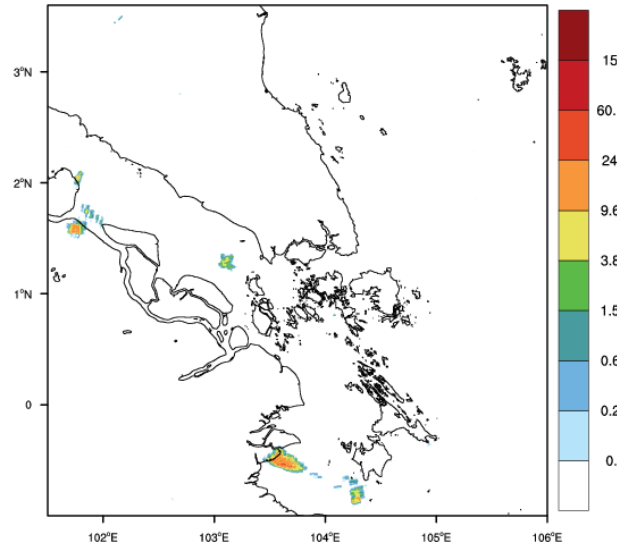
and

Precipitation  
Forecasts from  
SINGV (UM),  
WRF-GFS, and  
WRF-ECM

SINGV – clumpiness  
(blobbiness)

Radar valid at 2015-05-05\_02:00:00

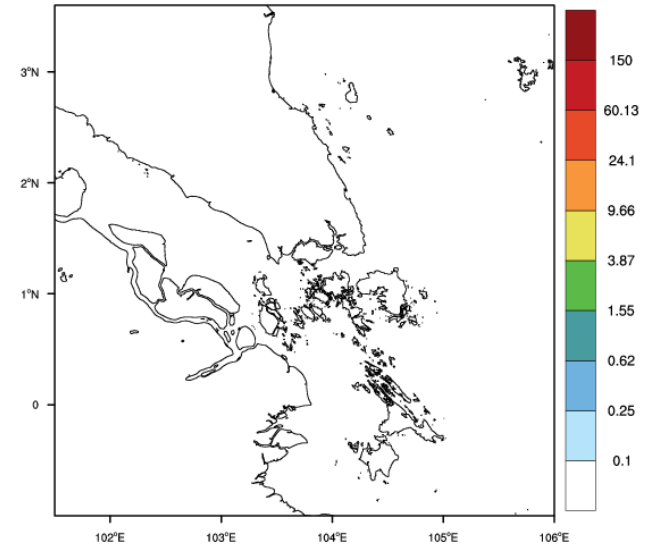
Radar estimated rainfall (mm/h)



Radar

T+01z Valid at 2015-05-05\_01:00:00

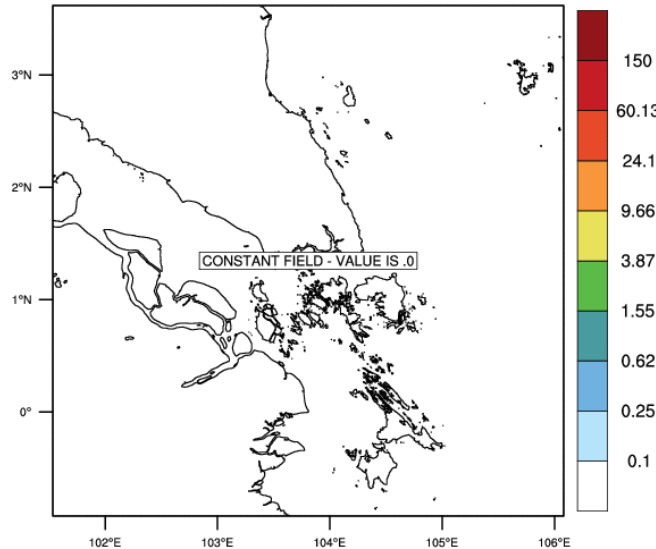
Total Precipitation (mm/h)



UM

T+00z Valid at 2015-05-05\_00:00:00

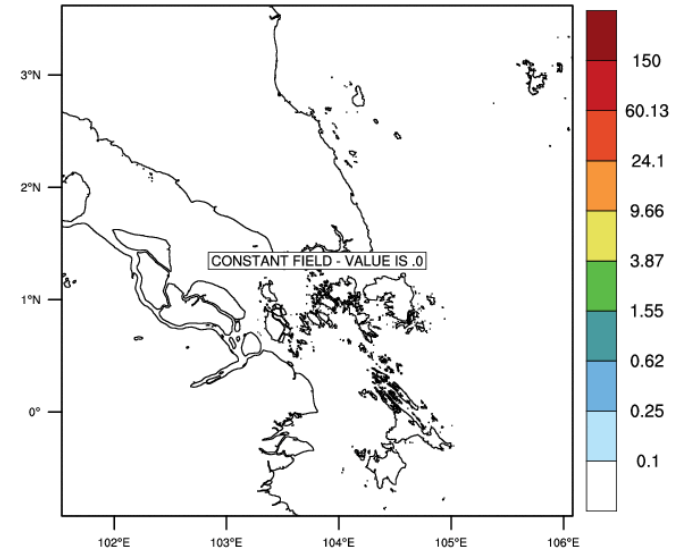
Total Precipitation (mm/h)



WRF-EC

T+00z Valid at 2015-05-05\_00:00:00

Total Precipitation (mm/h)



WRF-GFS

# Known Model Issues

- Cloud-scale biases
  - Too much heavy rain and too high peak rainfall rates.
  - Too strong and deep updrafts.
  - Not enough light rain.
  - Too many small cells, too few large if convection is well resolved.
  - Too few cells if under-resolved
- Organisation biases
  - Cells too circular if under-resolved, too elongated if well resolved and orientation tends to be too much along wind.
  - Lack of propagation of squall lines (noted particularly in Singapore).
- Biases in response to large-scale / boundary layer / diurnal forcing
  - Timing of initiation of convection.
  - Other timing issues.
  - Land-sea contrast issues - in particular excessive convective rainfall over land and light rain over the ocean.
- Biases in response to driving model
  - Spin up effects at edge of domain
  - Errors passed from larger scale driving models.

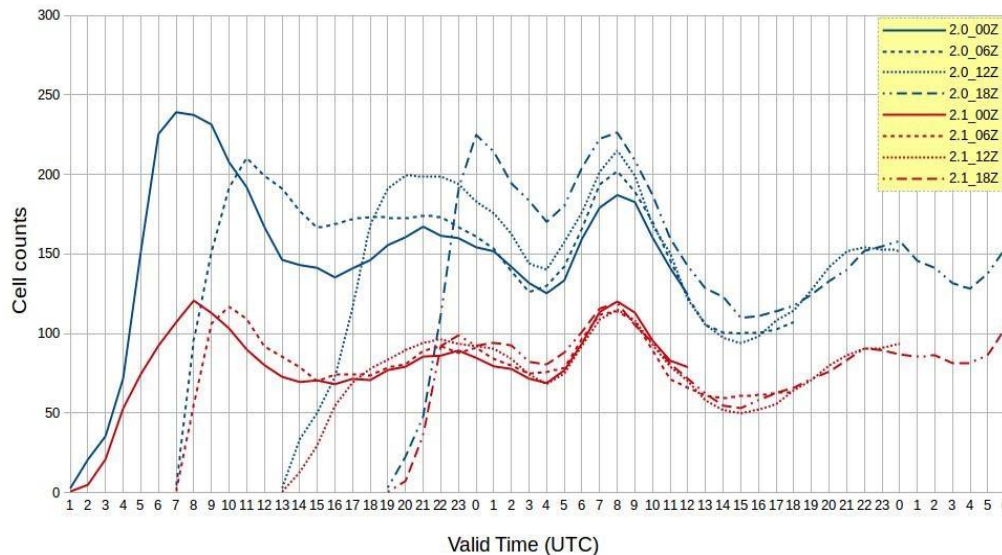
(from convection WG)

# SINGV configuration vn2.0 → vn2.1

- Fixed the reconfiguration coding error
- Treatment of the convective boundary layers
  1. Applied the blended boundary layer approach
  2. Introduced stochastic temperature perturbations
- Increase of the mixing length in 3D Smagorinsky scheme
- Switched off the excessive graupel production

## Improvements:

- Excessive rainfall reduced;
- Less intensive storm cells;
- Spin-up time reduced.



## Counts of Storm Cells

(Storm cells are defined as spanning at least 12 model grid-boxes, with hourly rainfall in excess of 20 mm/hr in every grid-box)

# SINGV configuration vn2.1 → vn3.0

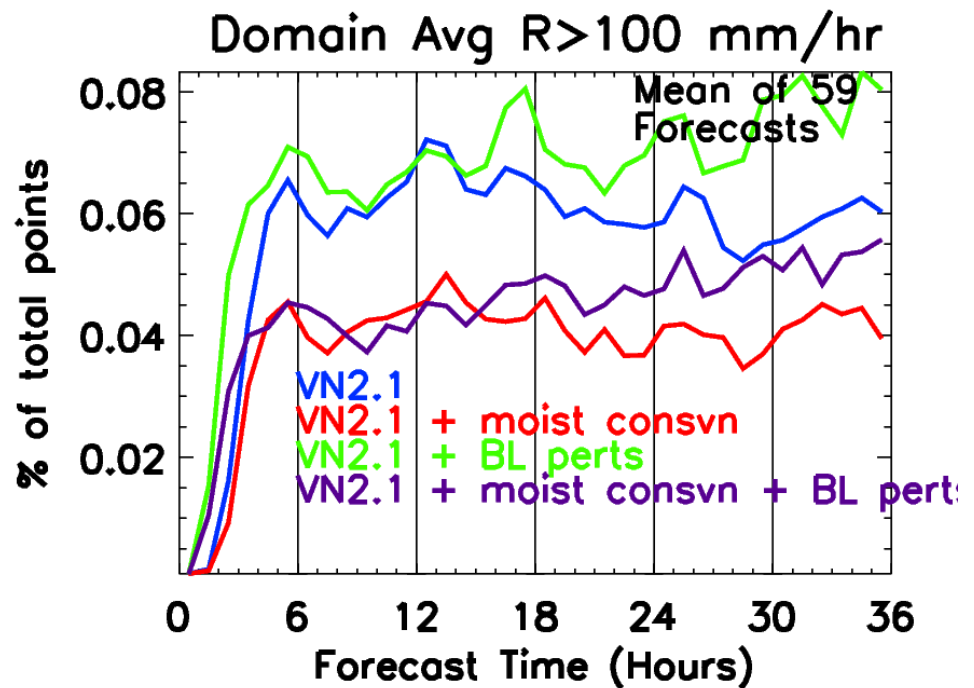
- The moisture conservation scheme
- Temporally correlated stochastic  $\theta$  perturbations
- Stochastic moisture perturbations

## Improvements:

- Rainfall patterns are more realistic compared with vn2.1;

- More rainfall is produced over the sea than vn2.1.

- Areal coverage of rainfall

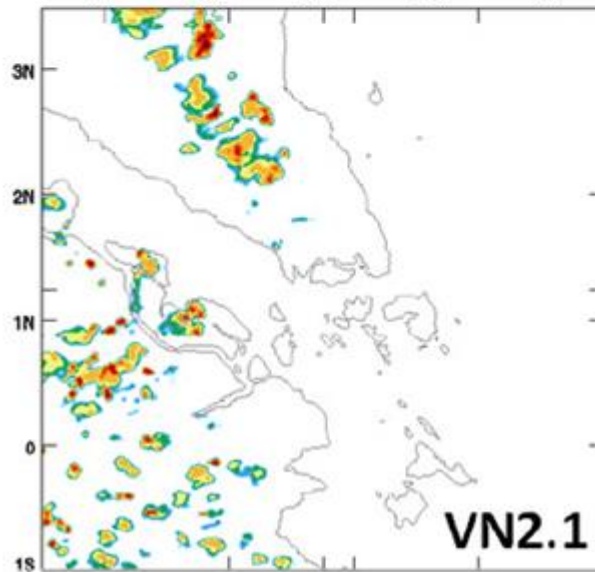
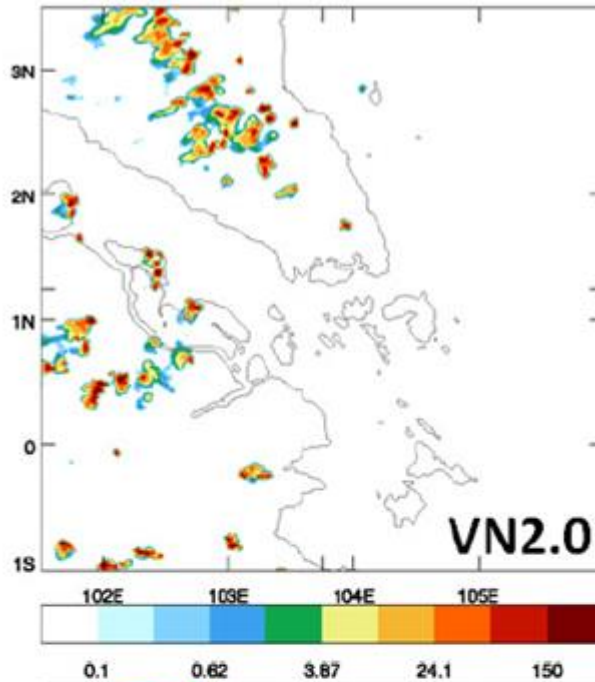


# The clumpiness was still an issue

vn2.0



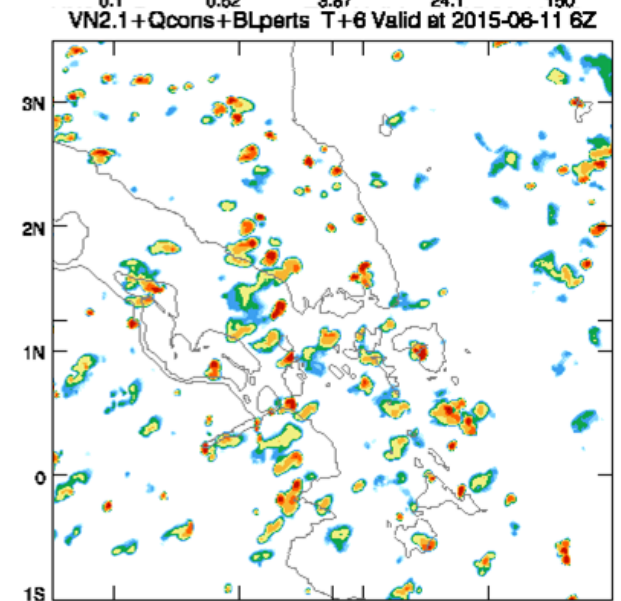
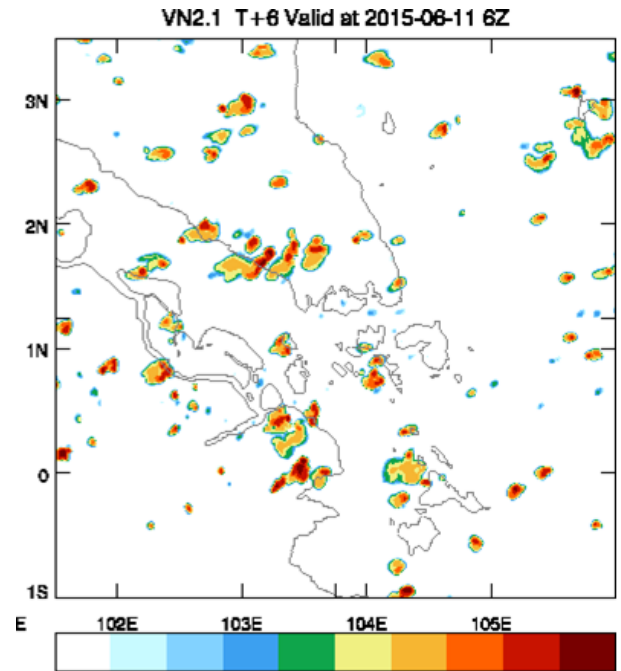
vn2.1



vn2.1



vn3.0



# SINGV configuration vn3.1 → vn4.0

- Use of prognostic cloud cover scheme (PC2) instead of Smith's scheme.
- Revised stochastic boundary layer perturbations
- Revised moisture conservation

## Remarks

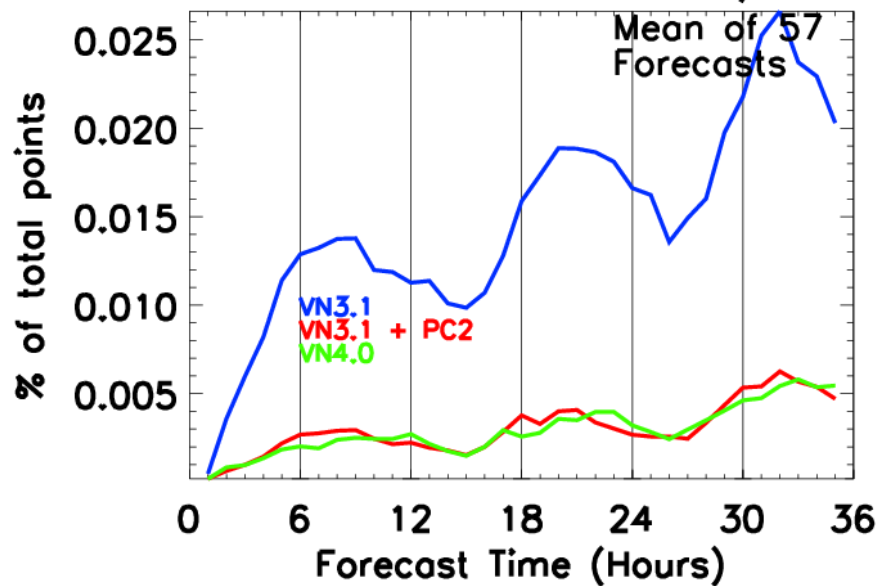
- Cloud cover is too variable over tropics.
- Switch to the prognostic cloud cover scheme (PC2) from Smith's scheme made significant impact. Reason not fully understood yet!



# Reduction in intense convection

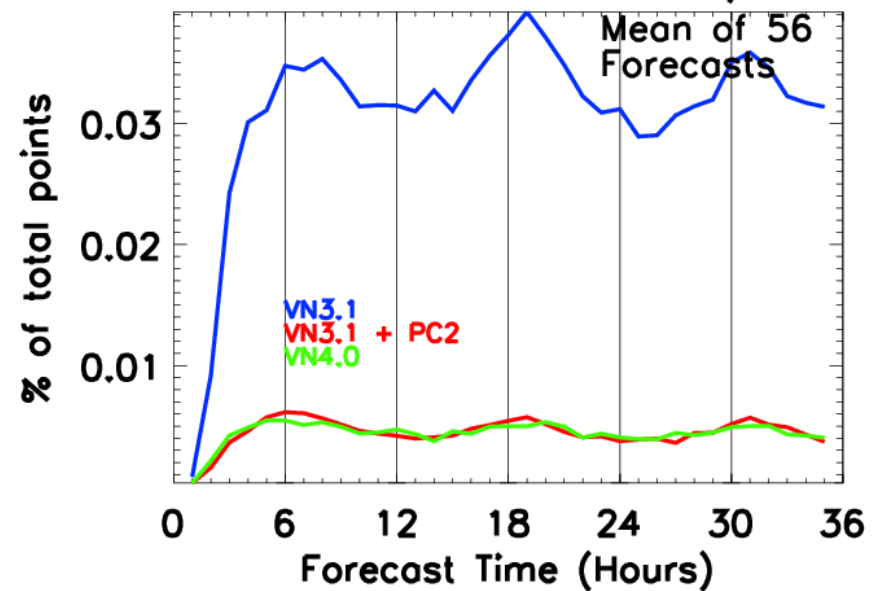
## August

Domain Wide  $W > 5$ . m/s

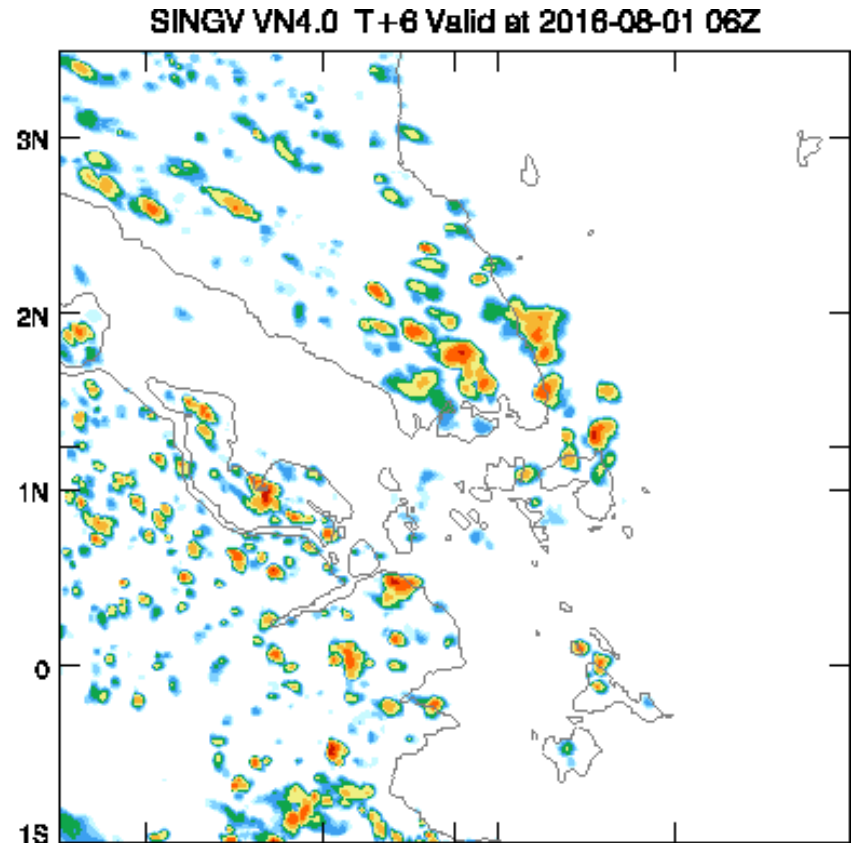
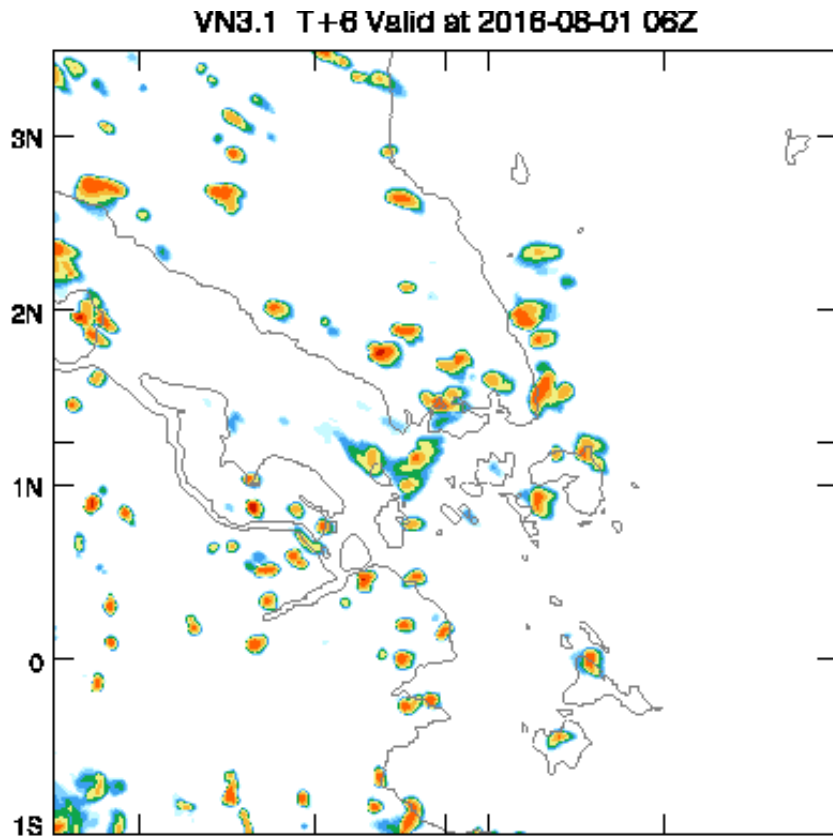


## November

Domain Wide  $W > 5$ . m/s



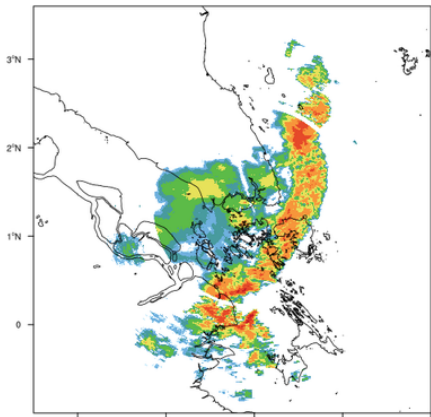
# Reduced clumpiness



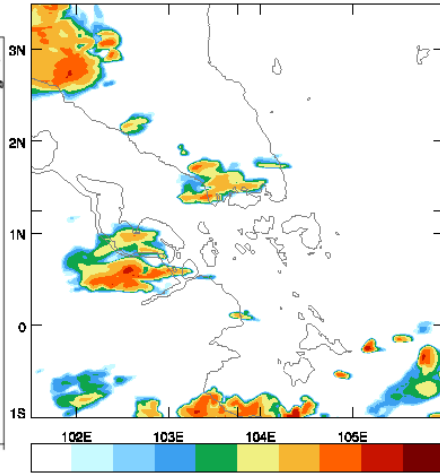
Increase in light rainfall and reduction in high rainfall intensity gives the impression of reduced clumpiness

# Improved squall lines

Radar valid at 2016-08-23\_20:00:00  
Radar estimated rainfall (mm/h)

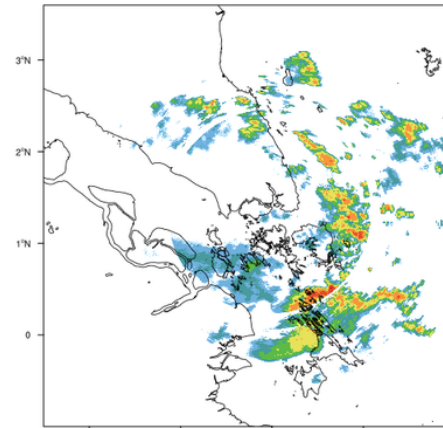


VN3.1 T+20 Valid at 2016-08-23 20Z

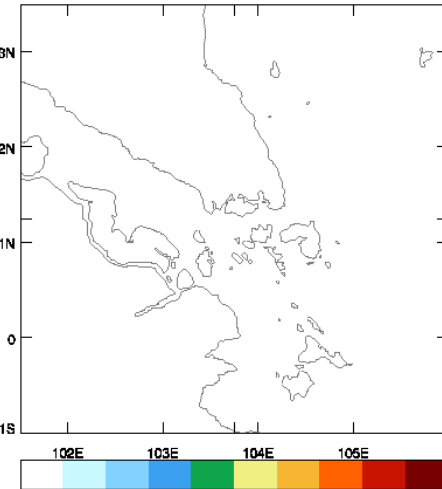


Radar valid at 2016-11-02\_00:00:00

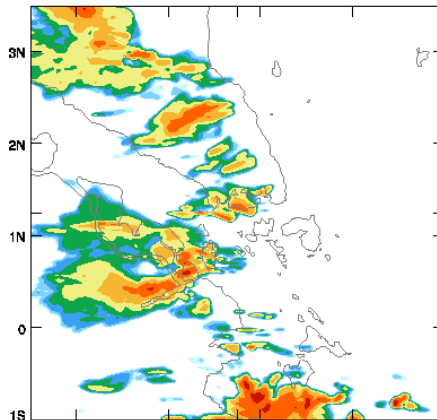
Radar estimated rainfall (mm/h)



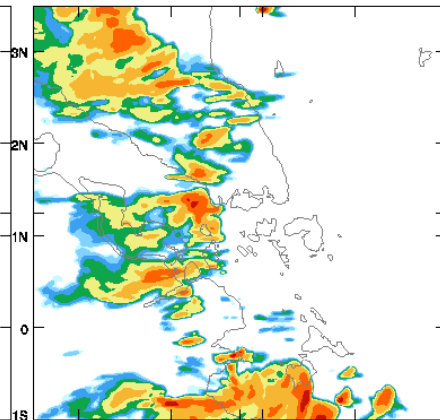
VN3.1 T+24 Valid at 2016-11-02 00Z



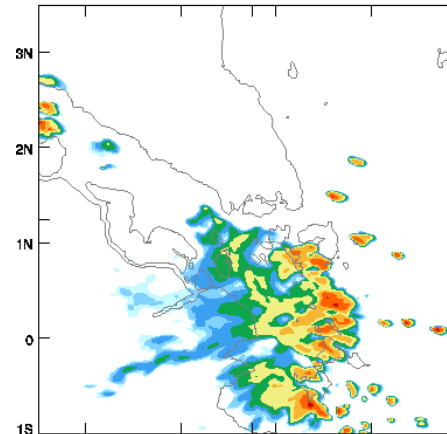
VN3.1 + PC2 T+20 Valid at 2016-08-23 20Z



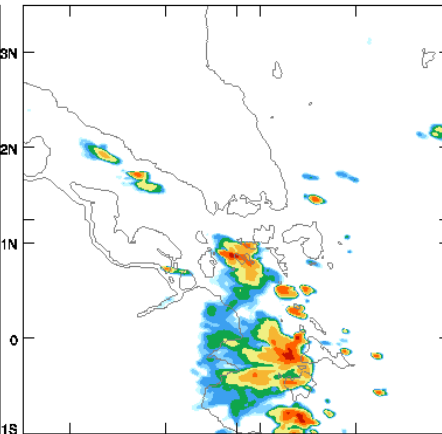
SINGV VN4.0 T+20 Valid at 2016-08-23 20Z



VN3.1 + PC2 T+24 Valid at 2016-11-02 00Z



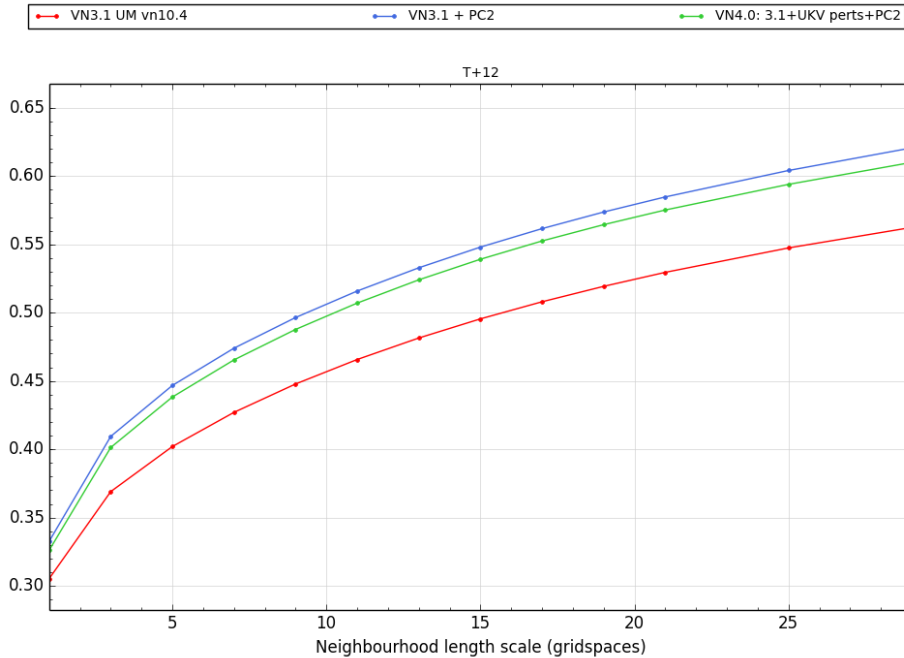
SINGV VN4.0 T+24 Valid at 2016-11-02 00Z



# FSS score August, full SINGV domain

## Light Rain

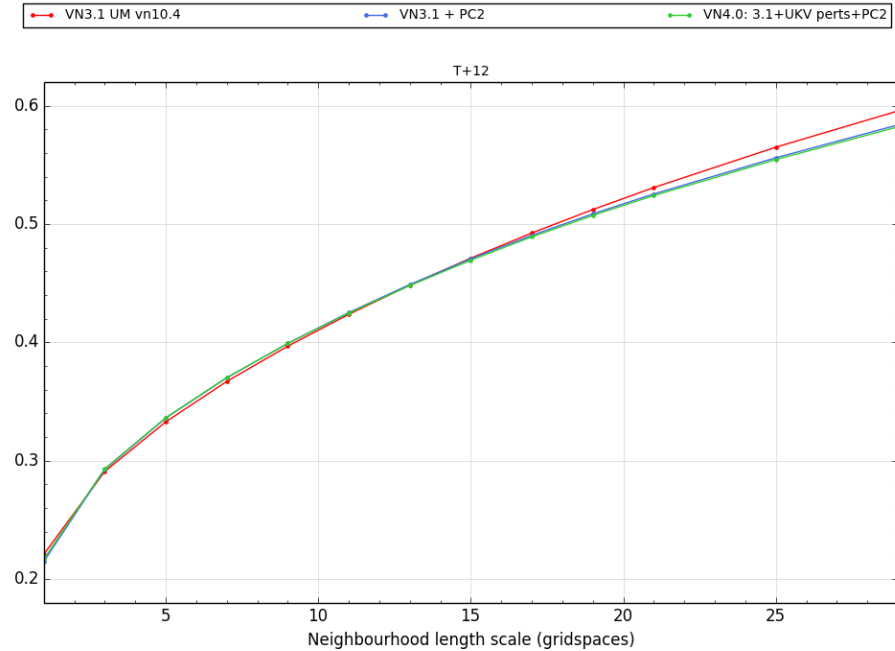
3hr Precipitation Accumulation, 1st percentile, Fractions Skill Score (Forecast - Analysis), SINGV full domain (539), Meaned between 20160801 00:00 and 20160831 18:00, Analysis (GPM ANALYSIS)



vn4.0 is more skilful than vn3.1

## Heavy Rain

3hr Precipitation Accumulation, 90th percentile, Fractions Skill Score (Forecast - Analysis), SINGV full domain (539), Meaned between 20160801 00:00 and 20160831 18:00, Analysis (GPM ANALYSIS)



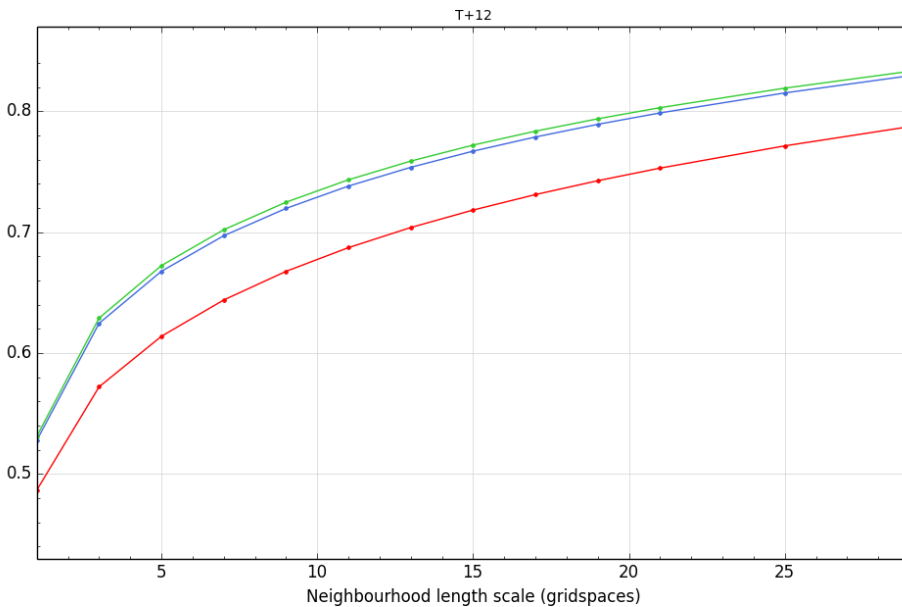
vn4.0 is of comparable skill

# FSS score for November, full SINGV domain

## Light Rain

3hr Precipitation Accumulation, 1st percentile, Fractions Skill Score (Forecast - Analysis), SINGV full domain (539), Meaned between 20161101 00:00 and 20161130 18:00, Analysis (GPM ANALYSIS)

— VN3.1 UM vn10.4      — VN3.1 + PC2      — VN4.0: 3.1+UKV perts+PC2

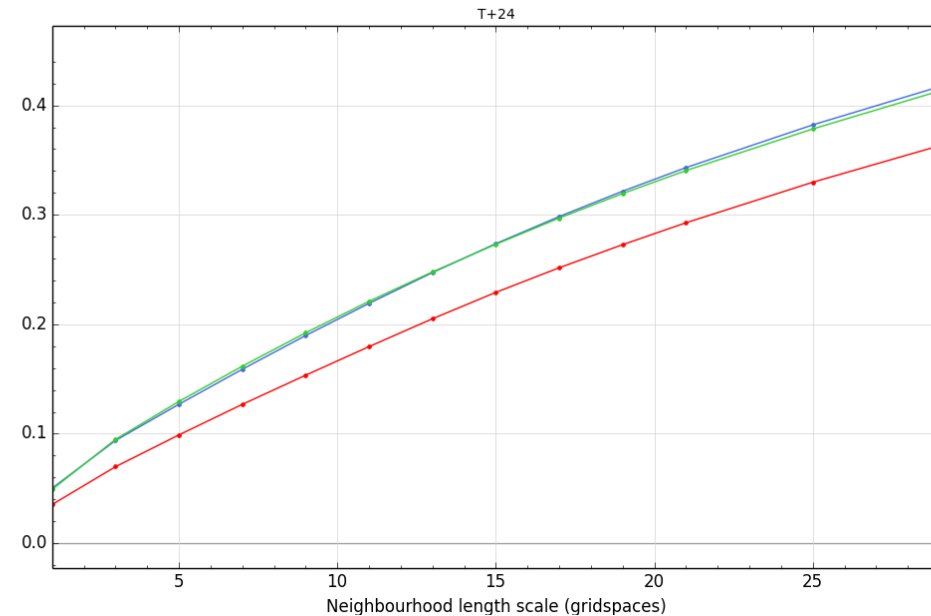


vn4.0 is more skilful than vn3.1

## Heavy Rain

3hr Precipitation Accumulation, 99th percentile, Fractions Skill Score (Forecast - Analysis), SINGV full domain (539), Meaned between 20161101 00:00 and 20161130 18:00, Analysis (GPM ANALYSIS)

— VN3.1 UM vn10.4      — VN3.1 + PC2      — VN4.0: 3.1+UKV perts+PC2



vn4.0 is more skilful than v3.1

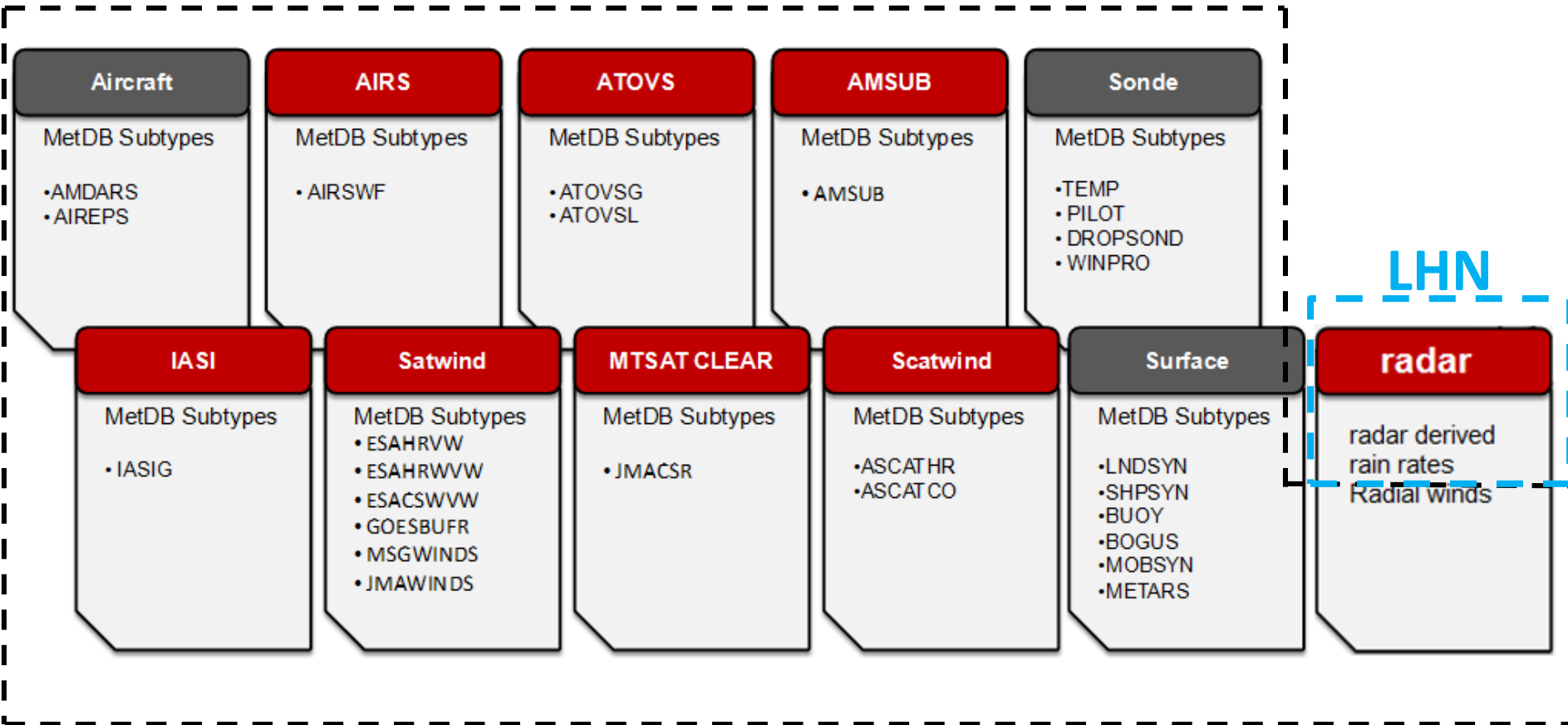
# SINGV Data Assimilation

- Initial technique: 3D-Var cycling every 3hr
- **Real time implementation: April 2016**
- Consider 4D-Var: 2016
- Adding ensemble to DA:2017

**SINGV DA Version 1:** conventional observations  
+ amsub + iasi + satwind + mtsatclear (with global bias  
configuration)

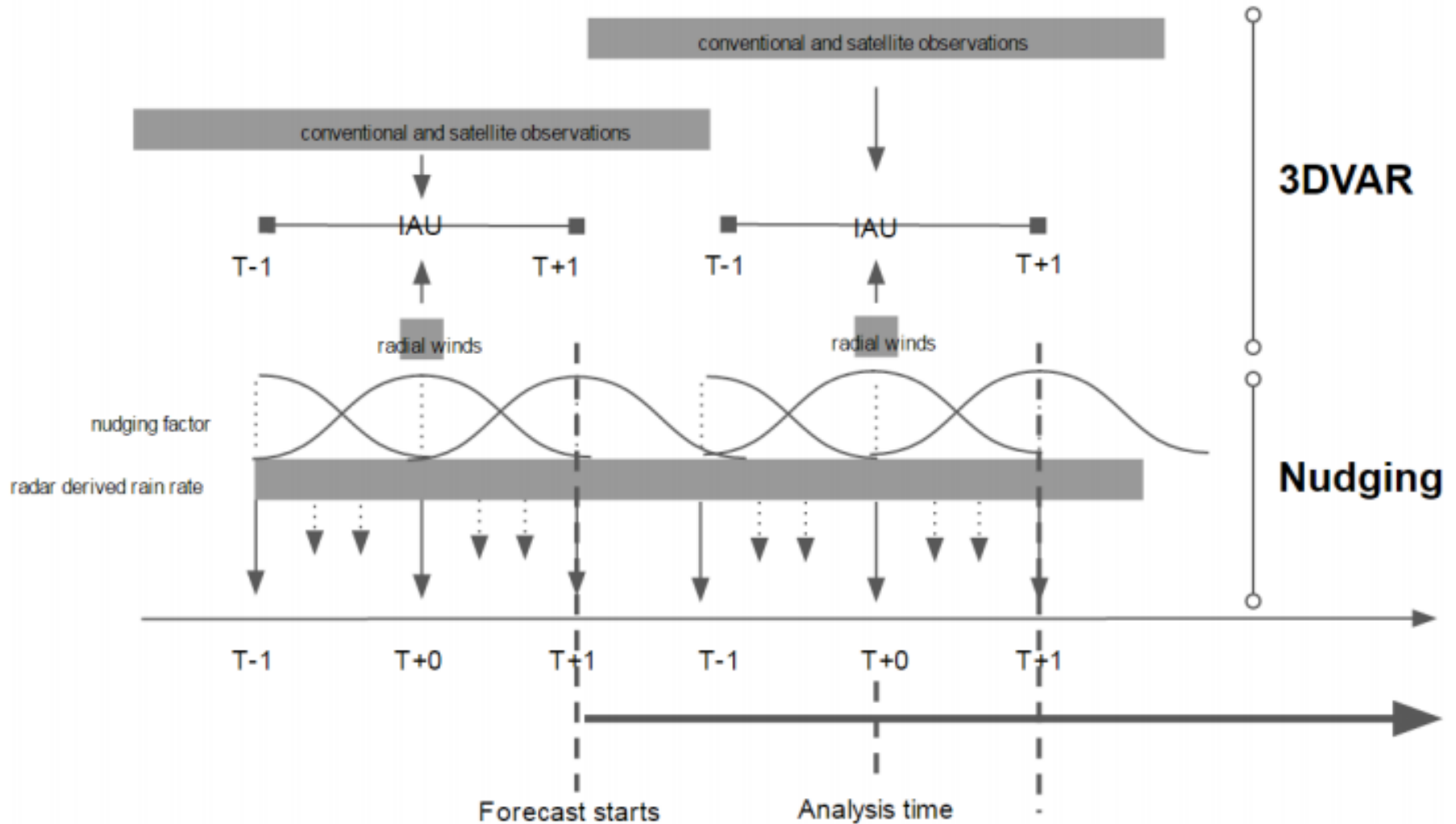
**SINGV DA Version 2:** conventional observations  
+ amsub + iasi + satwind + **scatwind** + **airs** + **saphir** (with  
SINGV specific configuration) + **Singapore radar**

# Observation for SINGV

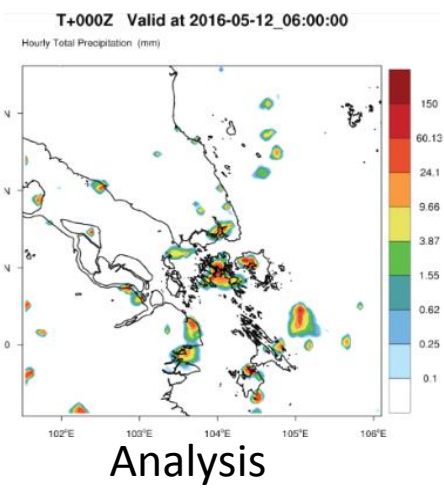
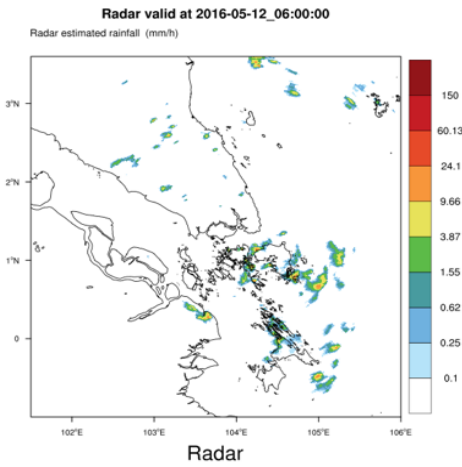


3DVAR

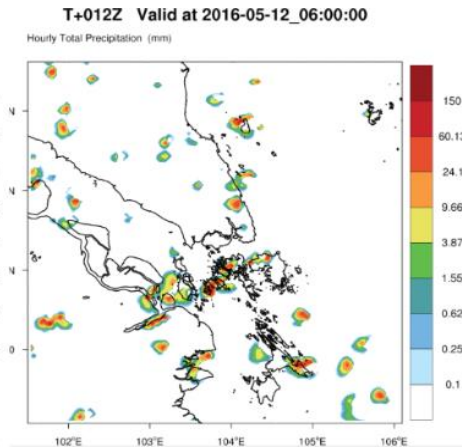
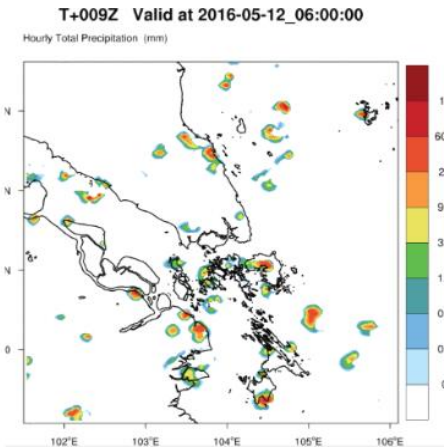
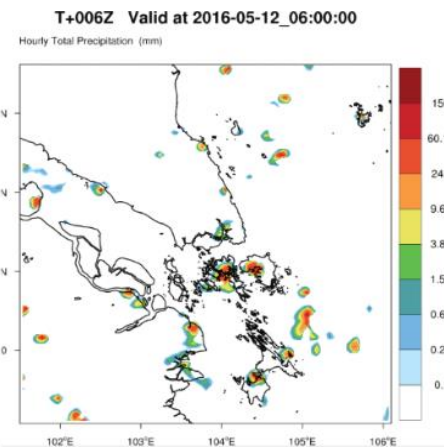
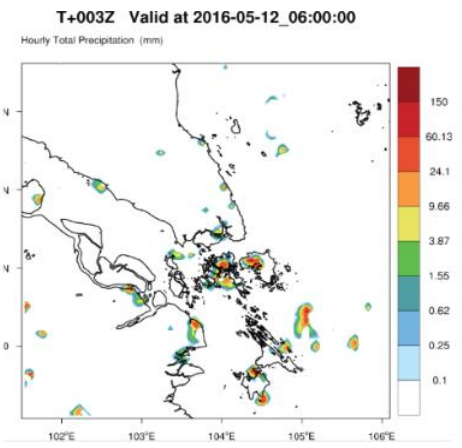
# SINGV Data Assimilation System







Cycling DA produces more forecasts at one valid time, with reasonable consistency

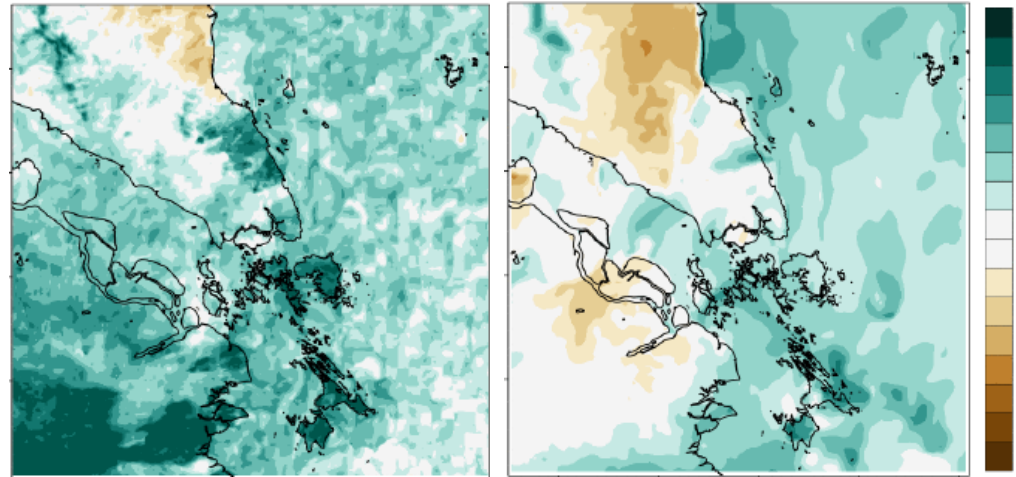


Forecasts at the same valid time (left->right: T+3h, T+6h, T+9h and T+12h)

# “Dryness” issue in the DA cycling system

DA is too dry.

Relative humidity at surface for  
(left) DS (T+3h)  
(right) DA (T+3h)  
2016-05-24 03:00:00

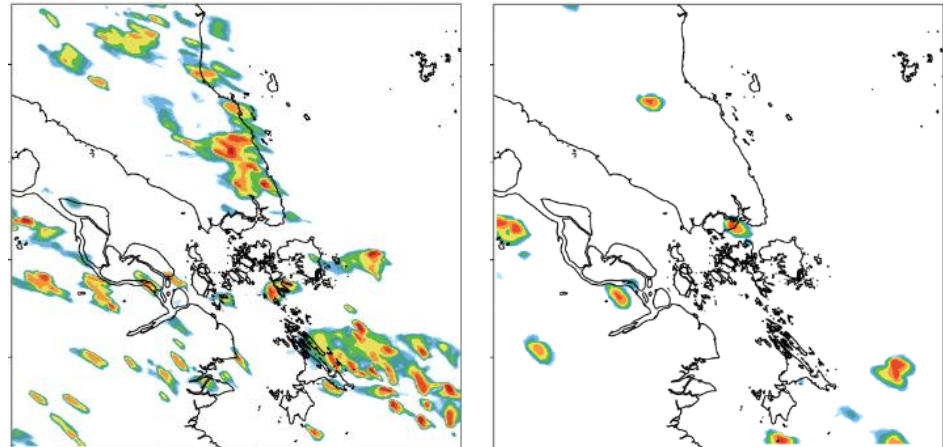


DS (downscaler)

DA (data assimilation)

DA produces much less rain.

Hourly precipitation for  
(left) DS (T+9h)  
(right) DA (T+6h)  
2016-10-25 09:00:00

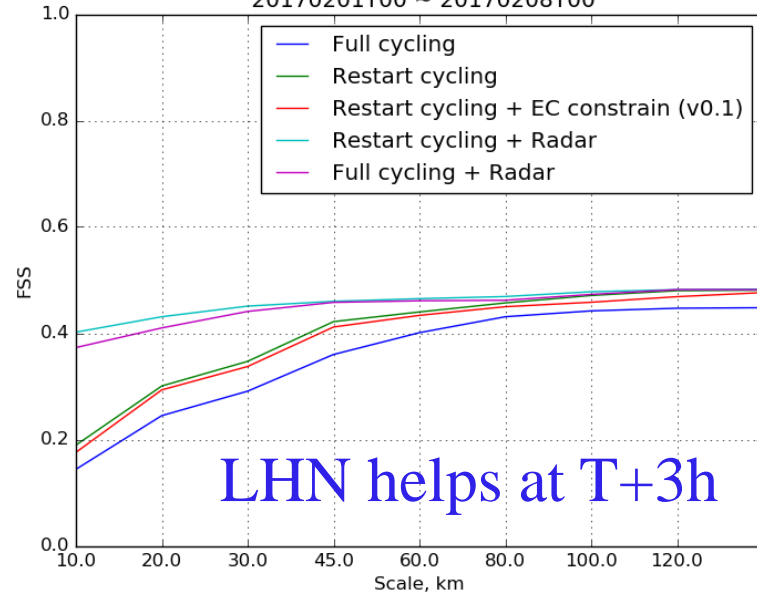


Remarks: not a DA problem ?! May be due to model and lateral boundaries.

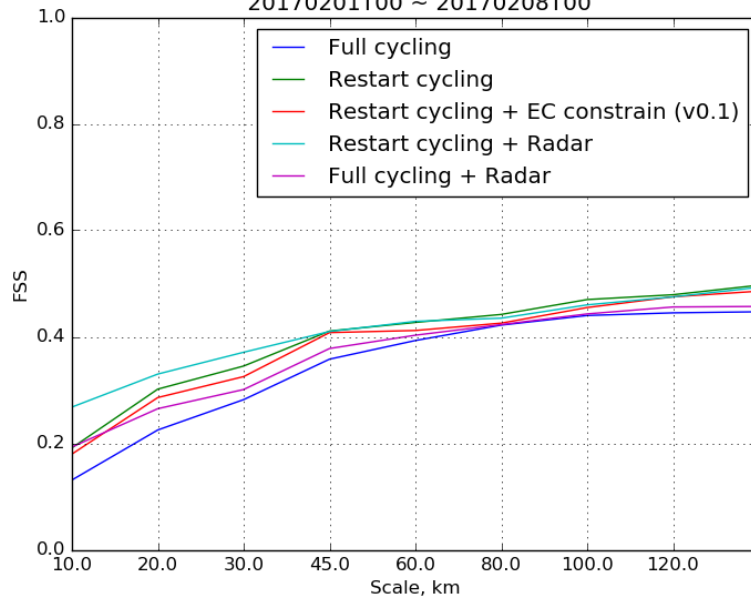
# Experiments with different DA configurations

Precipitation scores for different forecasting schemes over a week (01-08 Feb 2017)

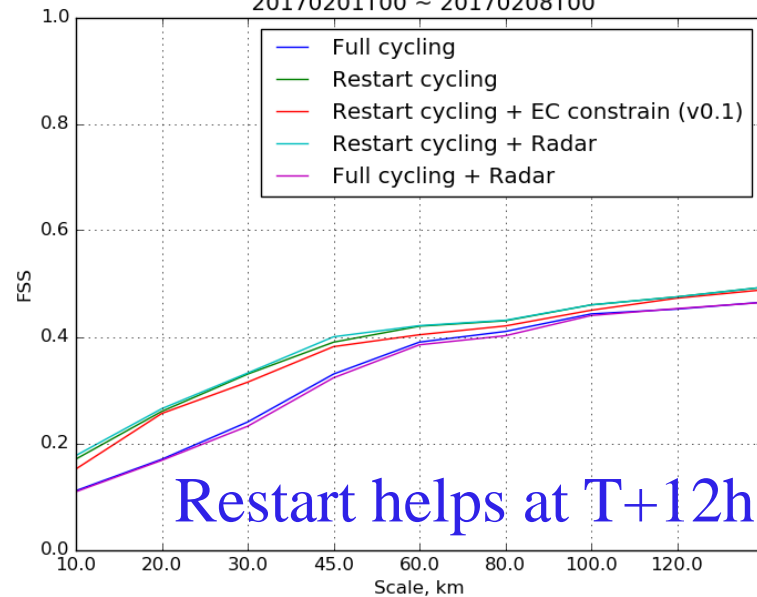
FSS, CTF-DA verification, T+3h  
20170201T00 ~ 20170208T00



FSS, CTF-DA verification, T+6h  
20170201T00 ~ 20170208T00



FSS, CTF-DA verification, T+12h  
20170201T00 ~ 20170208T00

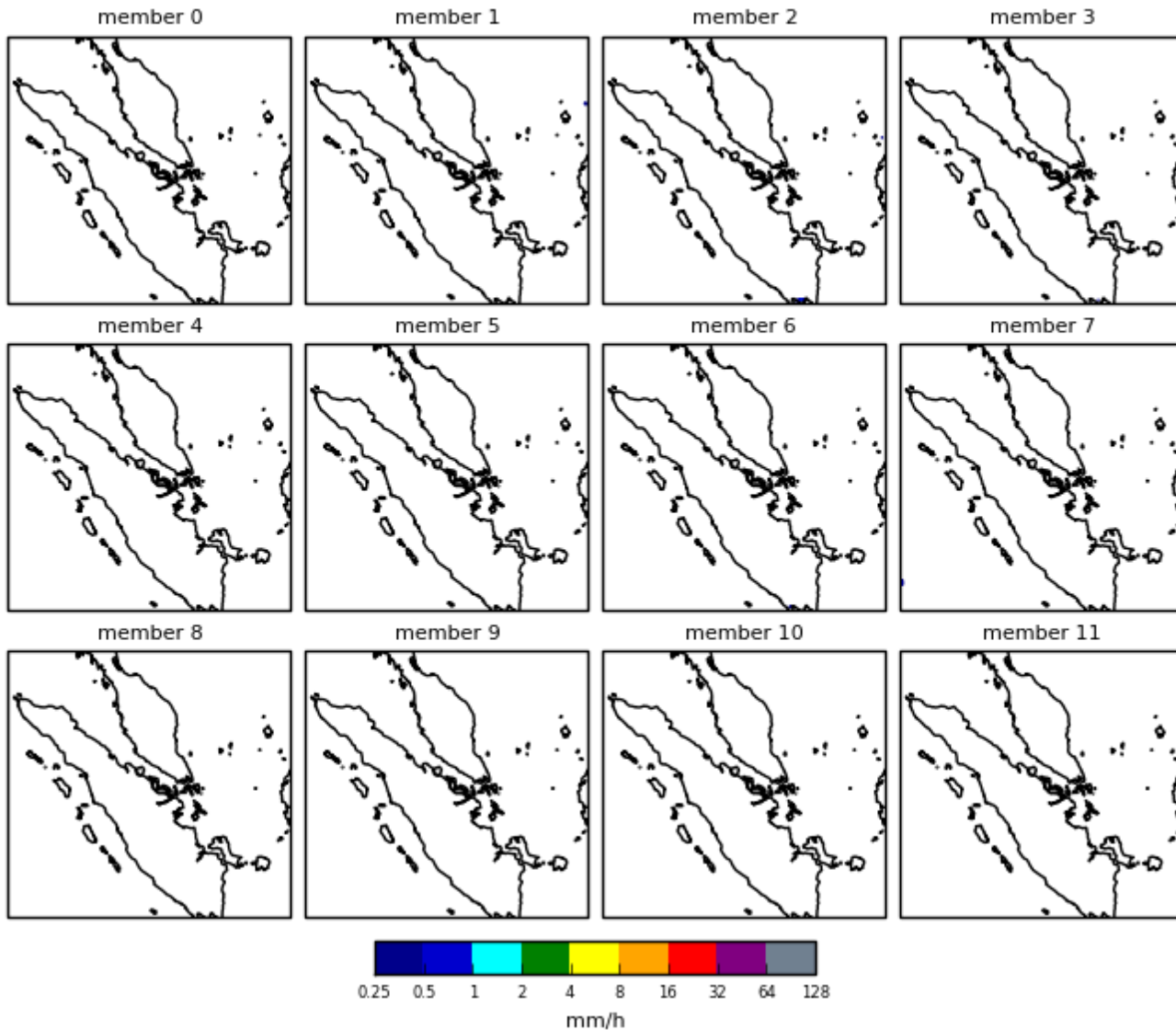


# SINGV Ensemble Configuration

- **Model settings**
  - Model: UM 10.6
  - Resolution: 4.5 km
  - Grid: 364x342 grid points
  - Vertical levels: 80 levels (model top 38.5km)
  - Forecast range: T+36
  - Time step: 100 seconds
- **Operational details**
  - Real time (planned): **by 31<sup>st</sup> March 2017**
  - Run 4 cycles per day (3, 9, 15, 21 UTC), the four cycles are driven from the T+3 dumps of 00/06/12/18z Global ensemble MOGREPS-G cycles
  - Forecast length: T+36
  - 12 ensemble members - 1 control run + 11 perturbed members
- **Initial conditions**
  - Initial conditions from global ensemble: MOGREPS-G
  - Perturbations generated by Ensemble Transform Kalman Filter (ETKF).
  - The 03 and 15 UTC cycles receive perturbations from the global ensemble members 1 to 11, whereas the 09 and 21 UTC cycles use perturbed members 12 to 22

# Postage stamp map

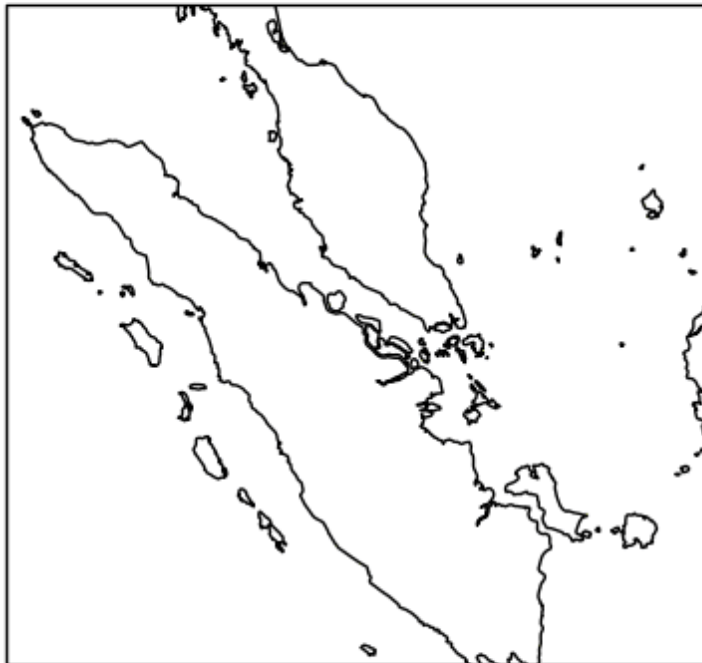
SINGV fcst valid 20170522 09 UTC



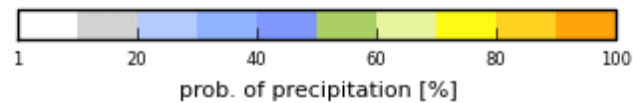
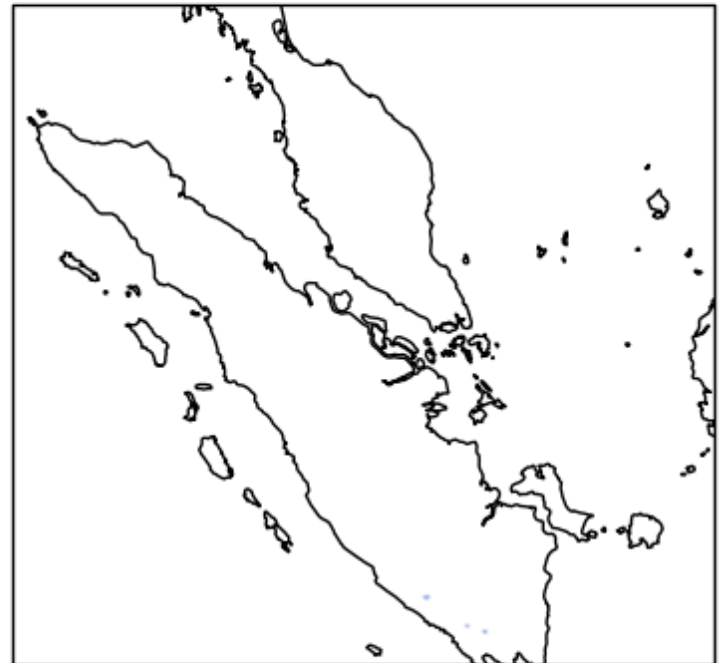
# Hourly Rainfall Probability

SINGV prob of precip valid 20170522 10 UTC

filtered

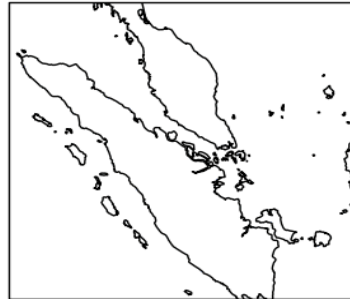


unfiltered

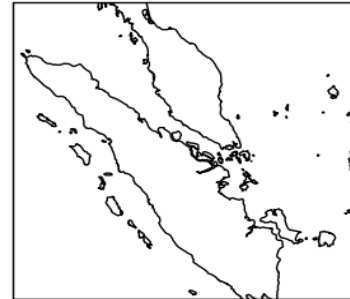


# Summary Plot

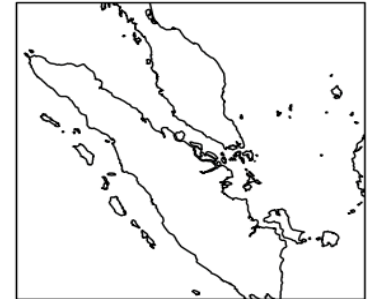
ppn>10mm/hr



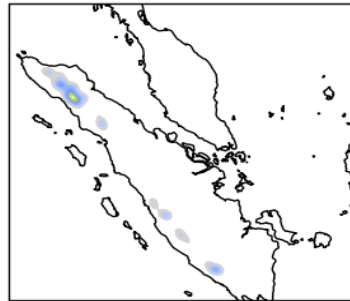
ppn>20mm/hr



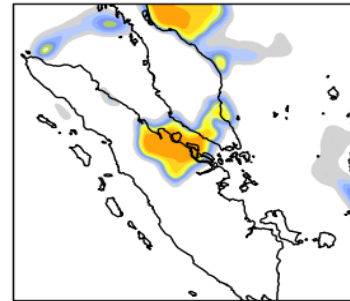
ppn>60mm/hr



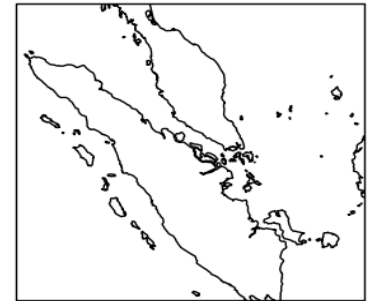
Temp<20°C



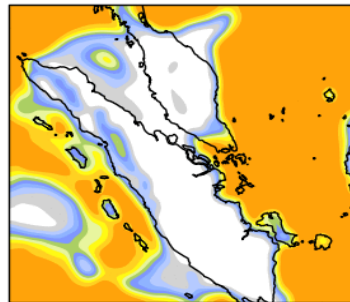
Temp>30°C



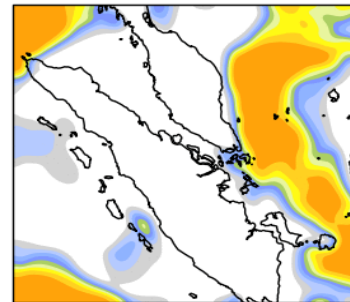
Temp>35°C



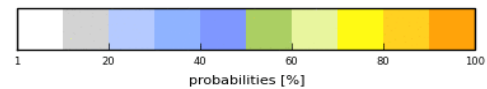
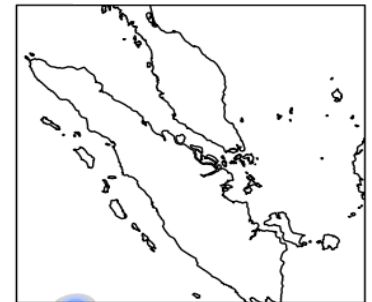
Wind>5kt



Wind>10kt



Wind>20kt





# Forecaster's Evaluation

(MSS-UKMO joint effort)

- Focused on deterministic assessment of the forecasts
- Of course, with only a downscaler, it may not be expected that the model will perform well. We may need to wait for the inclusion of ensembles before the potential can be fully assessed

## Assessment Criteria

### **Skills in rainfall prediction over Singapore and the surrounding region**

- Spatial coverage of the rainfall;
- Structure and orientation of the rain cluster;
- Rainfall intensity

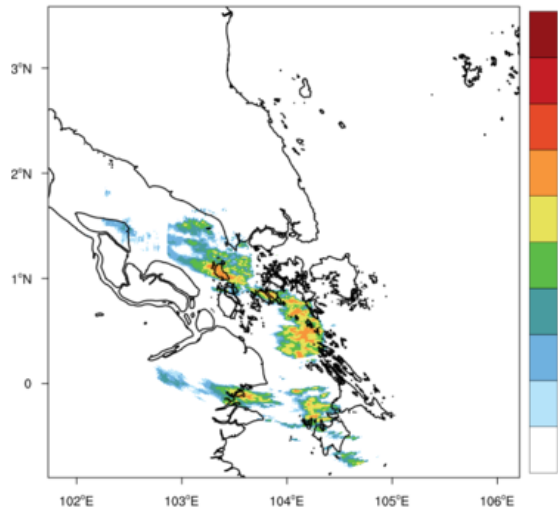
1. Does SINGV or WRF-EC provide value-added guidance in comparison with EC global model?
2. Does SINGV offer better guidance than WRF-EC?



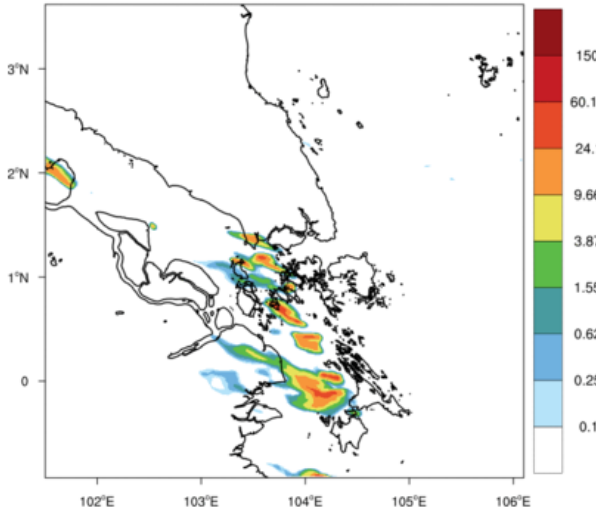
# Forecaster Evaluation

SINGV > EC Global > WRF-EC

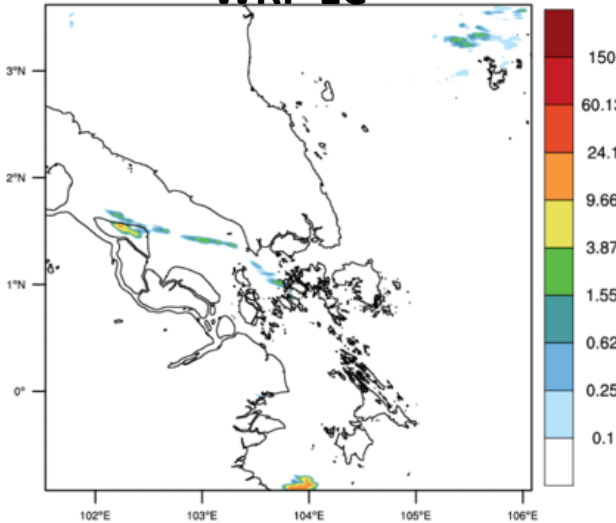
Radars  
Radars Valid at 2016-09-27\_21:00:00  
Calibrated Precipitation (mm/h) **Radars**



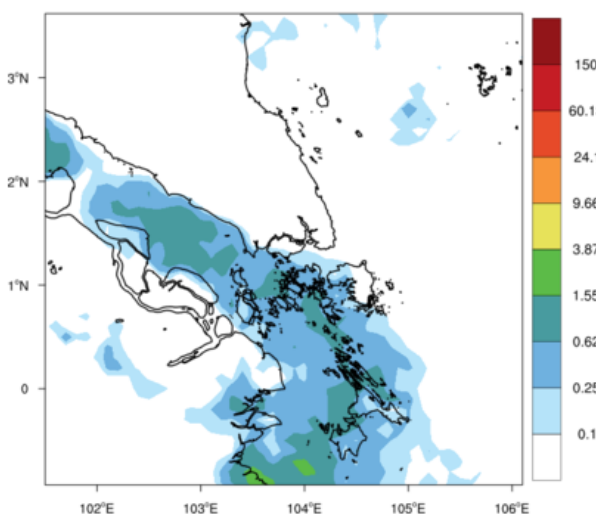
UM-SINGV  
T+021Z Valid at 2016-09-27\_21:00:00  
Precipitation (mm) **SINGV**



EC-WRF  
T+21z Valid at 2016-09-27\_21:00:00  
Total Precipitation (mm/h) **WRF-EC**



EC-Global  
T+21Z Valid at 2016-09-27\_21:00:00  
Hourly Precipitation (mm/h) **EC Global**

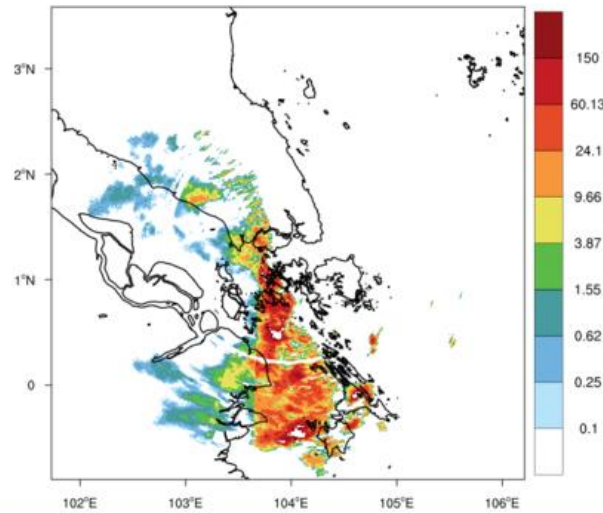


- SINGV had captured this event relatively well
- EC Global had captured this event relatively well but had under-forecast the rainfall intensity
- WRF-EC missed this event.

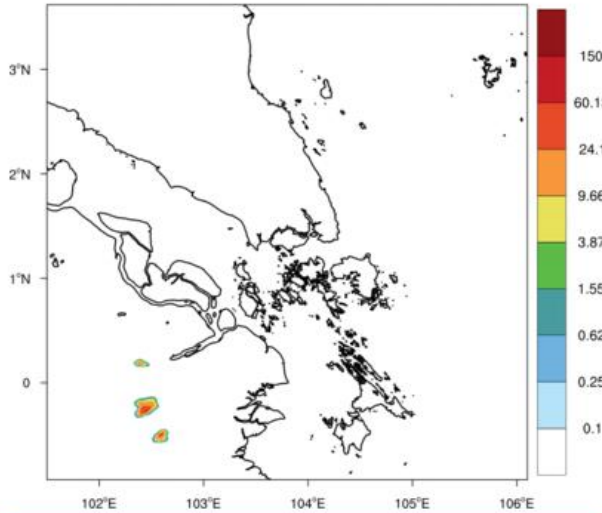
# Forecaster evaluation

WRF-EC > EC Global > SINGV

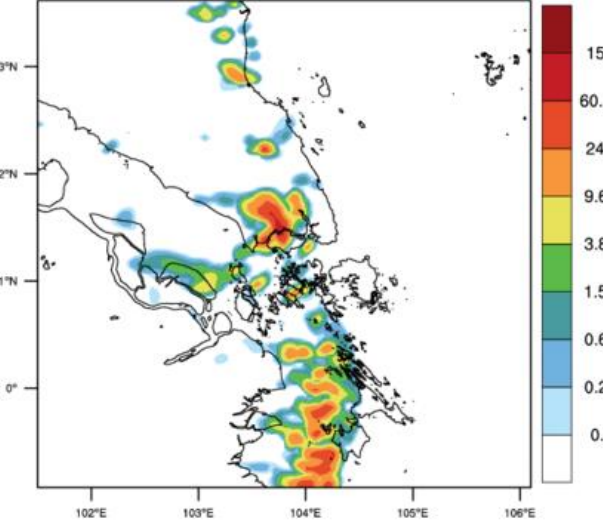
Radar  
Radar Valid at 2016-08-18\_21:00:00  
Calibrated Precipitation (mm/h)



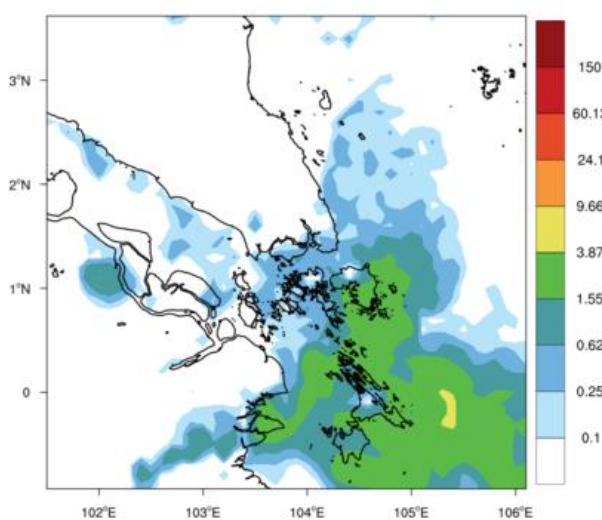
UM-SINGV  
T+021Z Valid at 2016-08-18\_21:00:00  
Total Precipitation (mm)



EC-WRF  
T+21z Valid at 2016-08-18\_21:00:00  
Total Precipitation (mm/h)



EC-Global  
T+21Z Valid at 2016-08-18\_21:00:00  
Hourly Precipitation (mm/h)



- WRF-EC had captured this event relatively well
- SINGV missed this event totally
- EC Global missed the rainfall over Singapore and Peninsular Malaysia

# Remarks and Ongoing Work

- Convective-scale NWP in tropics, especially for Singapore, is a difficult problem
- SINGV has definitely helped put forward NWP challenges in the deep tropics
- Updates have been made in model physics to tackle some of the known problems and collaborative effort is needed to understand the issues
- Improvements are only incremental due to limited resources
- The current focus in model development is to test the grey-zone convection scheme
- SINGV DA will be focussing on LHN and tackling some of the issues
- SINGV EPS will be focussing on putting it to real-time
- In objective verification, we are working on issues on using GPM and Radar as references
- We are also working with forecasters on subjective evaluation, which will assess the usefulness of SINGV in operational applications