

# SWIRLS

## Probabilistic QPF (PQPF) & Severe Weather Nowcast

WMO VCP Workshop on Nowcasting,  
Seamless Forecasting and Warning Services

3 – 6 December 2019

Hong Kong Observatory

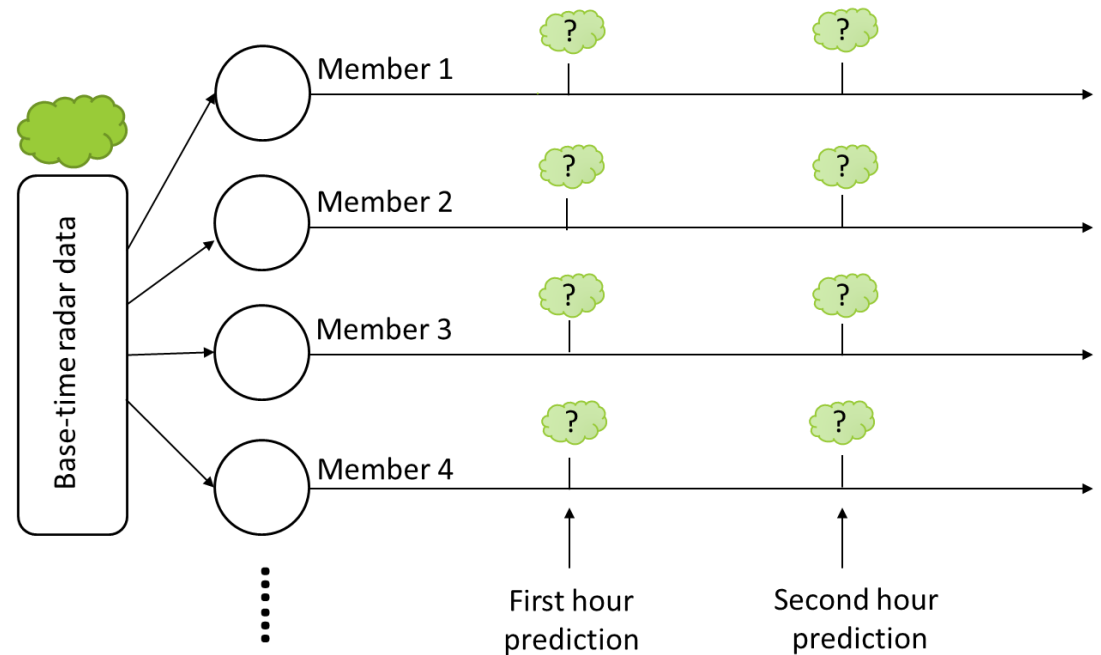
# Probabilistic QPF

# Why?

1. Better support for Rainfall Warning System
2. Facilitate cost-benefit analyses
3. More tailored to the needs of organizations under various operational constraints

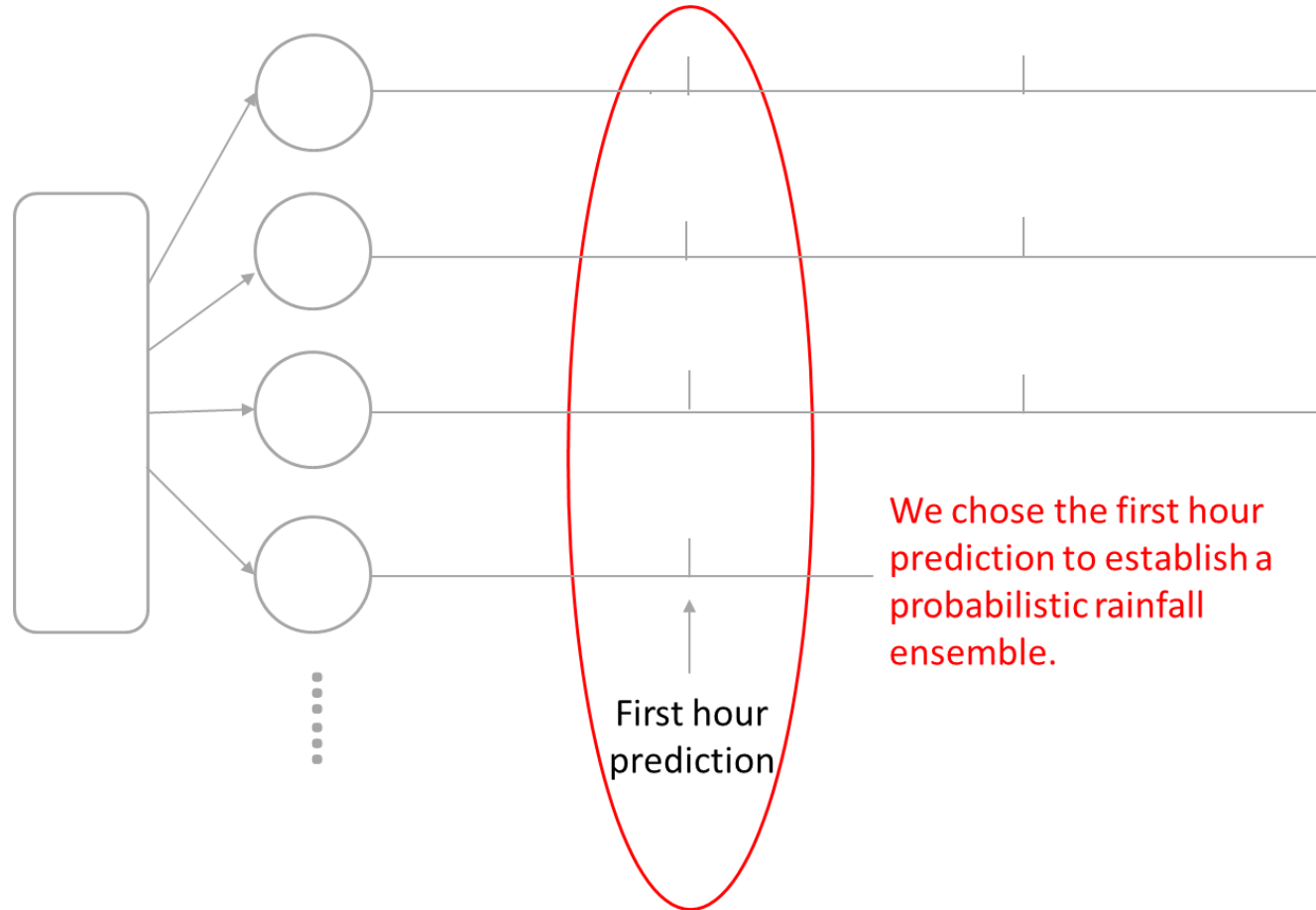
# SWIRLS Ensemble Rainfall Nowcast

- By tuning the 6 parameters, 36 sets of parameters have been experimented, i.e. ensemble of 36 members.

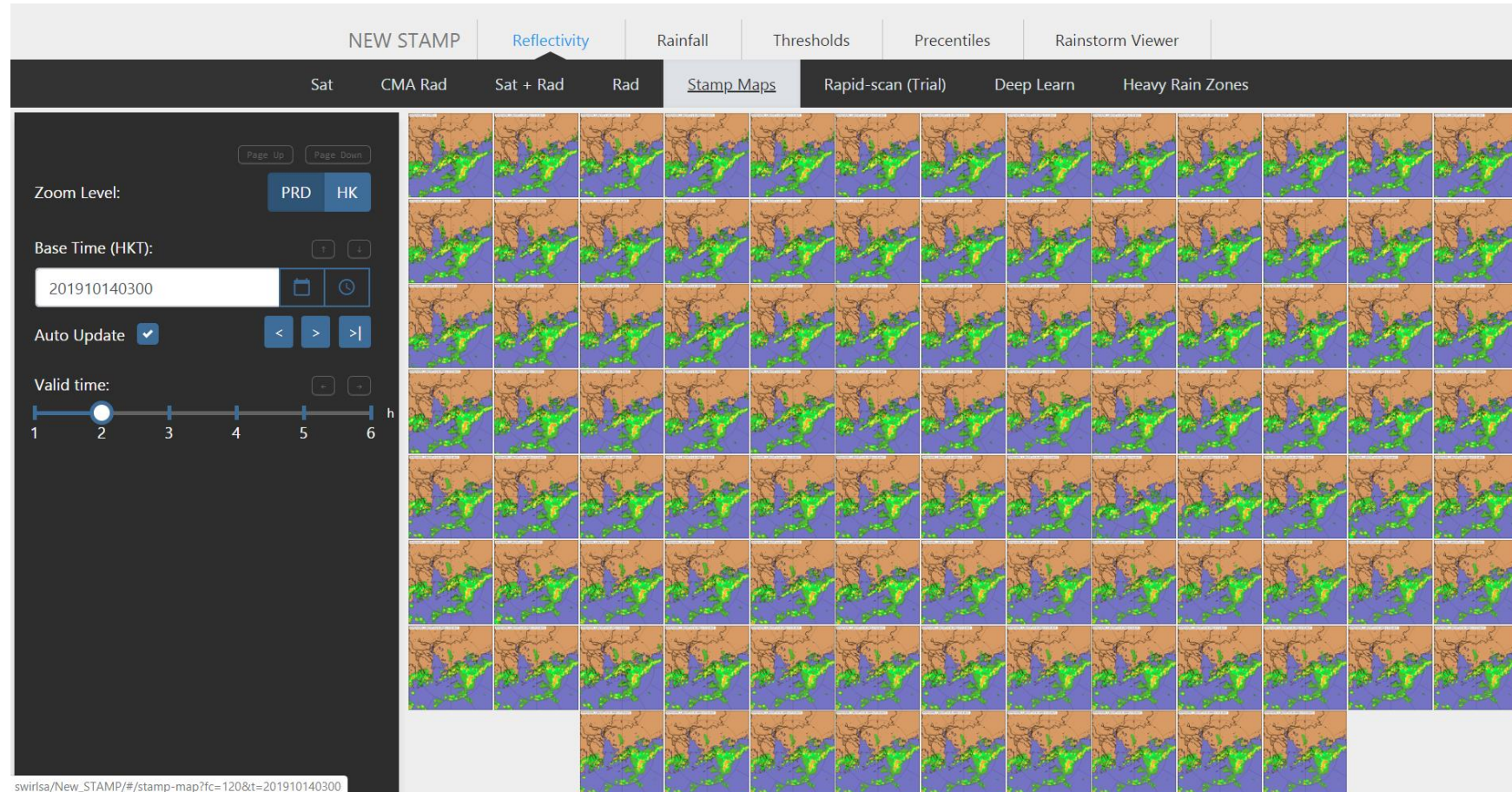




# Probabilistic QPF (PQPF)



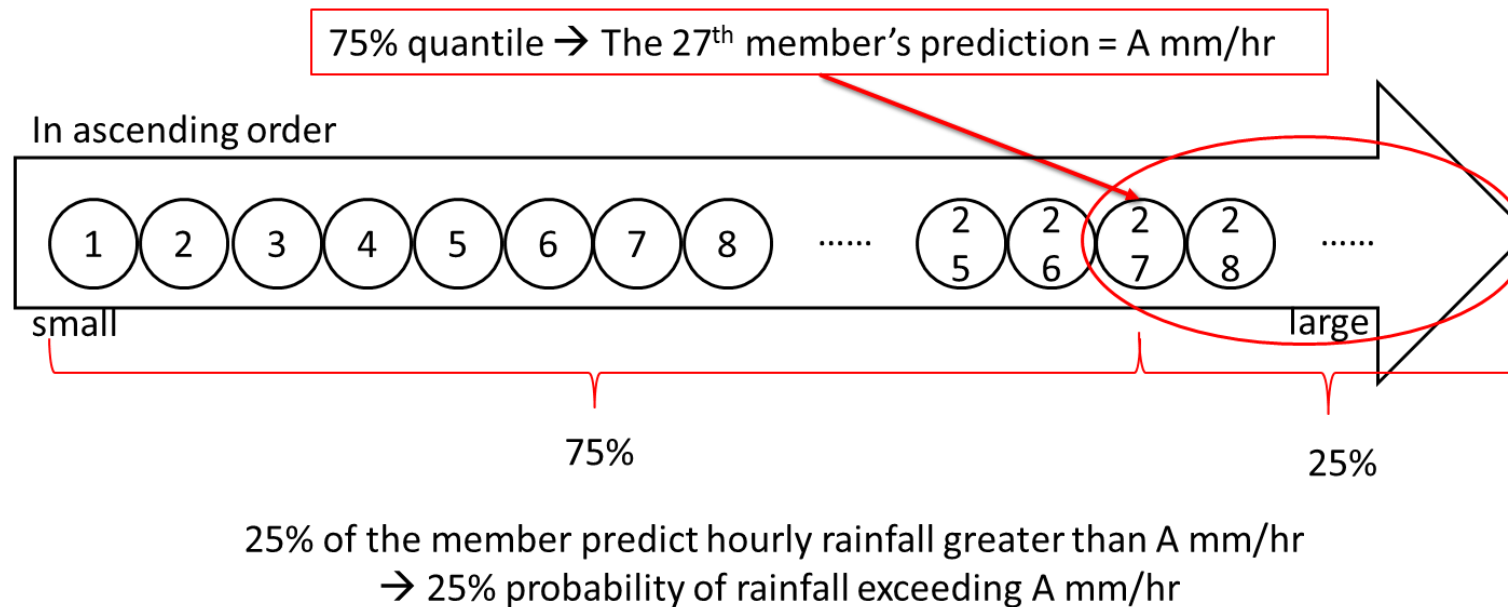
# Stamp Map



# PQPF Product 1

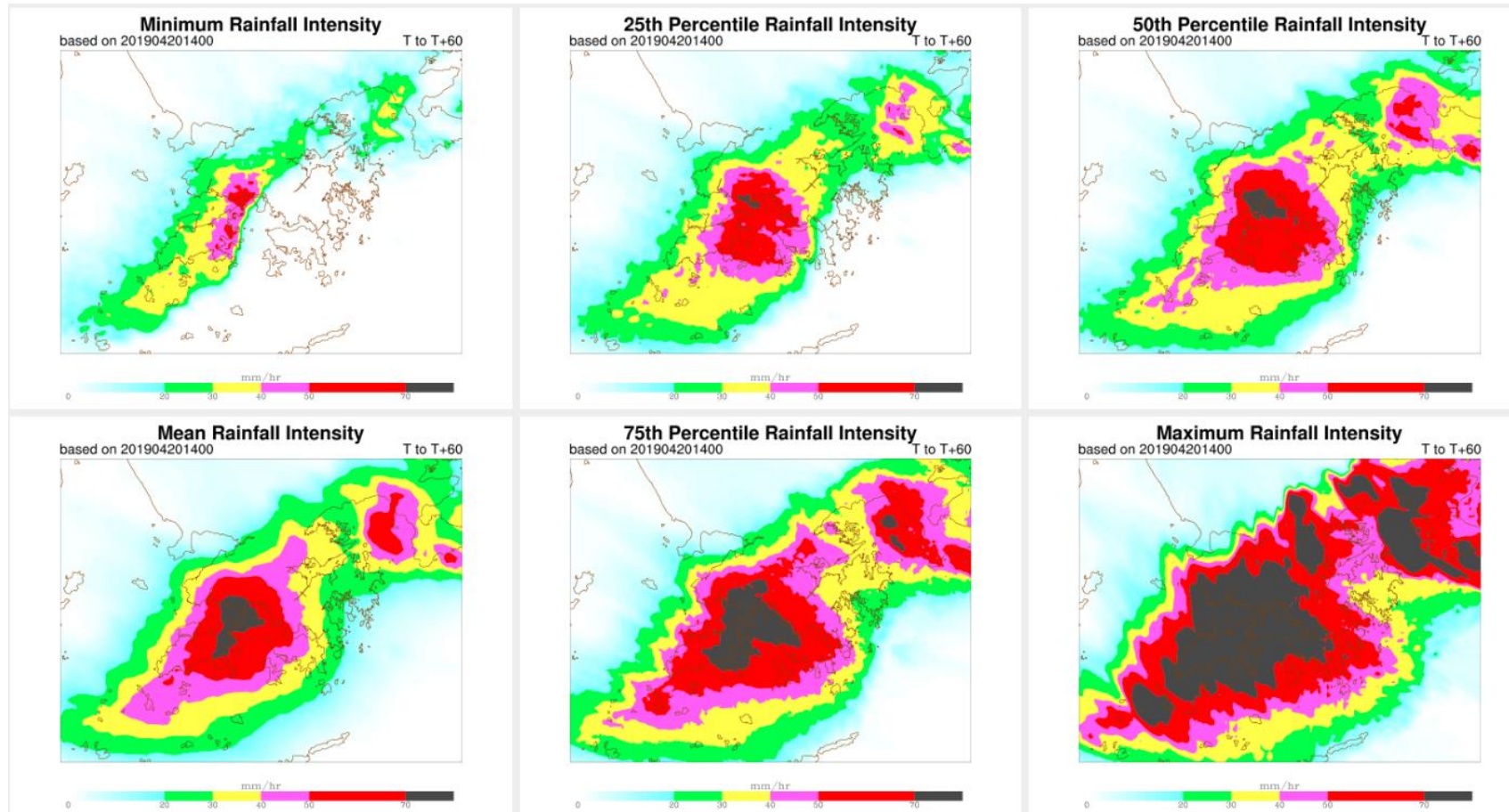
## Rainfall Intensity Contour Map

- For Specific Exceedance Probability:



The 75% quantile has a 25% exceedance probability

# Rainfall Intensity at Fixed Percentile





# PQPF Product 2

## Probability Contour Map

- For Specific Intensity Threshold

36 members produce 36 hourly rainfall predictions

Set a rainfall intensity threshold to make Yes/No decisions:  
If :

No. of Yes = Y

No. of No = N

Then probability of the hourly rainfall exceeds a certain threshold is given by

$$\text{Probability} = \frac{Y}{Y+N}$$

Selected thresholds:

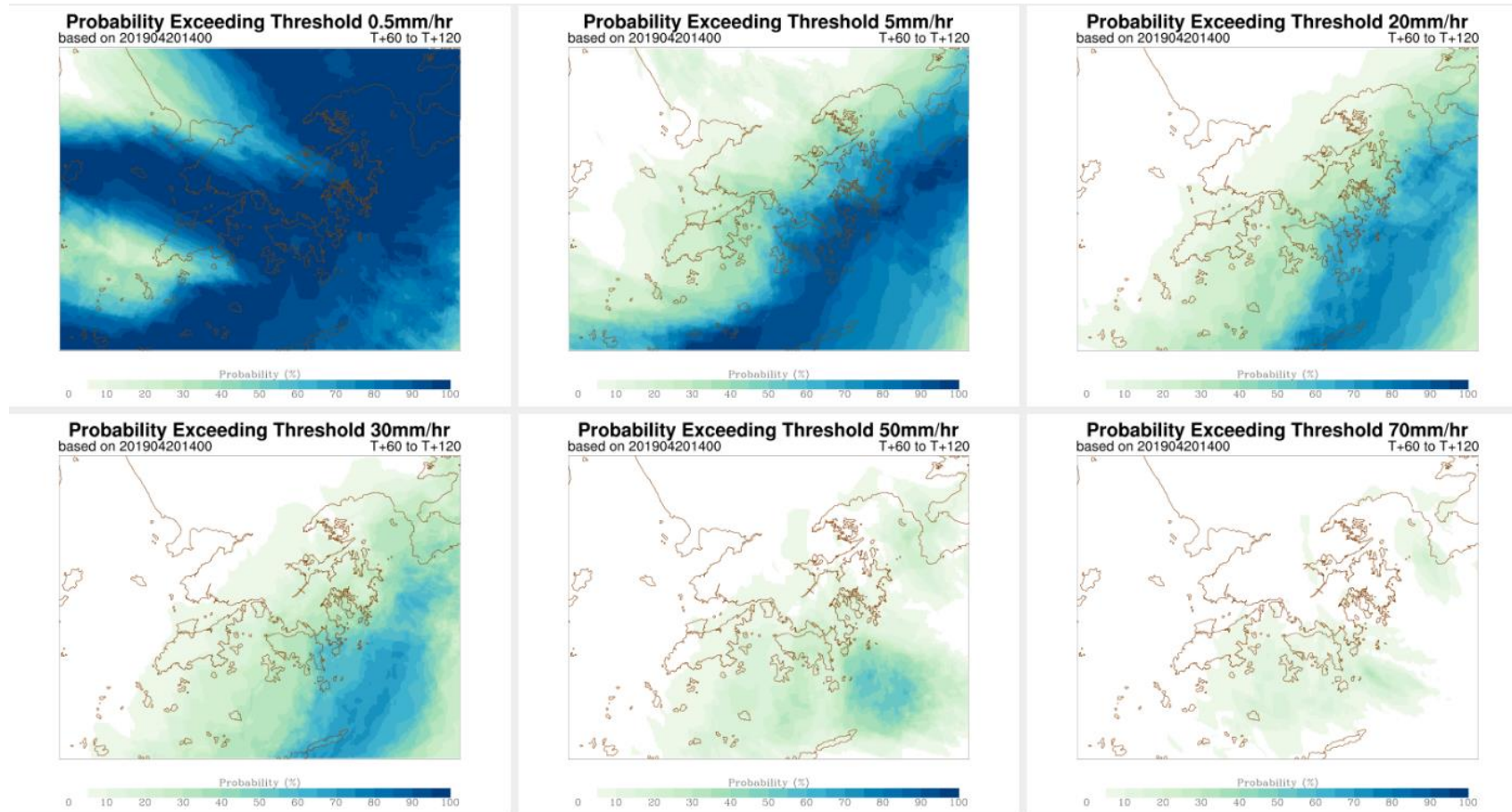
0.5mm/hr

5mm/hr

30mm/hr



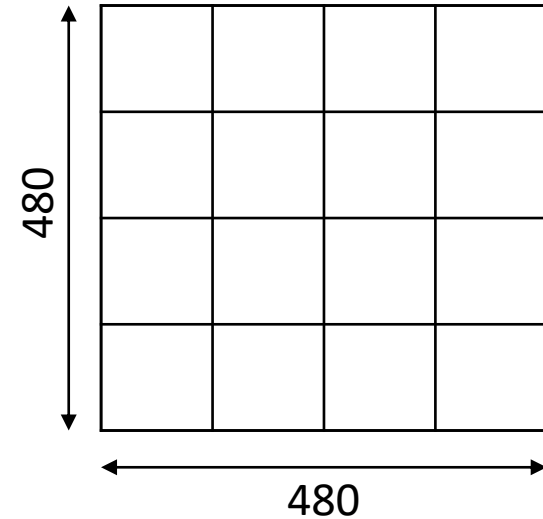
# Probability of Exceeding Fixed Intensity



# Verification and Analyses

Verified against Radar QPE data:

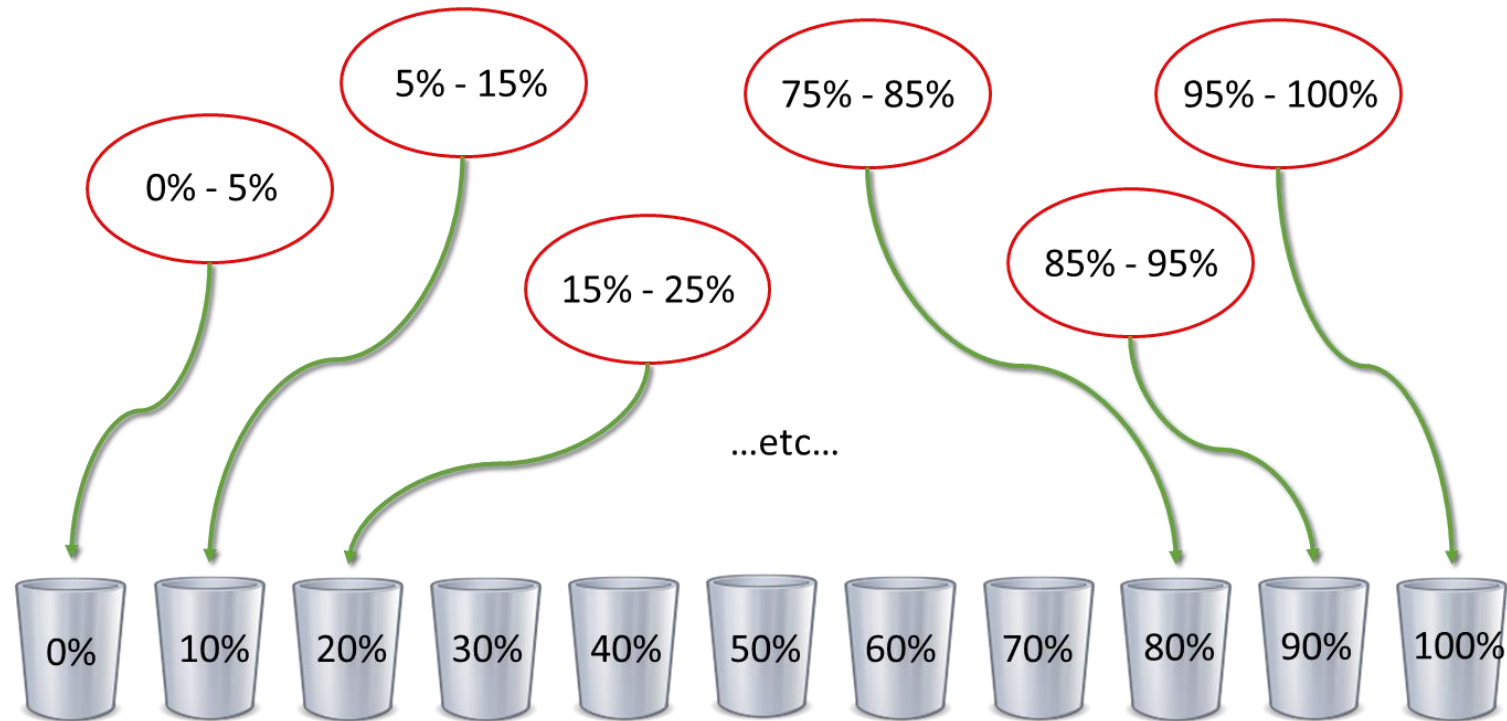
- resolution 480X480 pixels
- Generated every 6 minutes



One datum for each grid

# Verification and Analyses

Divide the range of forecast probability into 11 bins : 0% -5%, 5%-15%, etc.





# Verification and Analyses

Reliability Diagram - *degree to which the model forecast probabilities agree with the observed frequencies*

Interpretation– A 10-event example

10 events predicted prob.

10%	10%	10%	10%	10%
-----	-----	-----	-----	-----

10%	10%	10%	10%	10%
-----	-----	-----	-----	-----

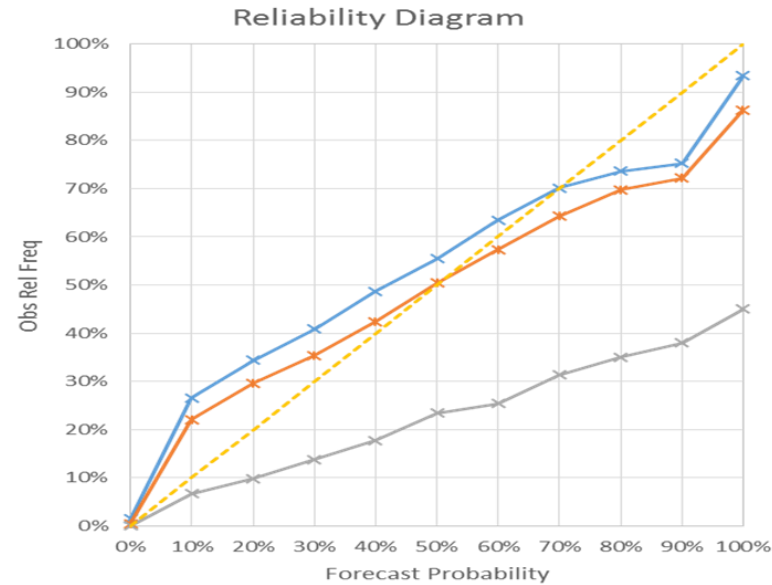
10-events actual occurrences

N	N	N	Y	N
---	---	---	---	---

N	N	N	N	N
---	---	---	---	---

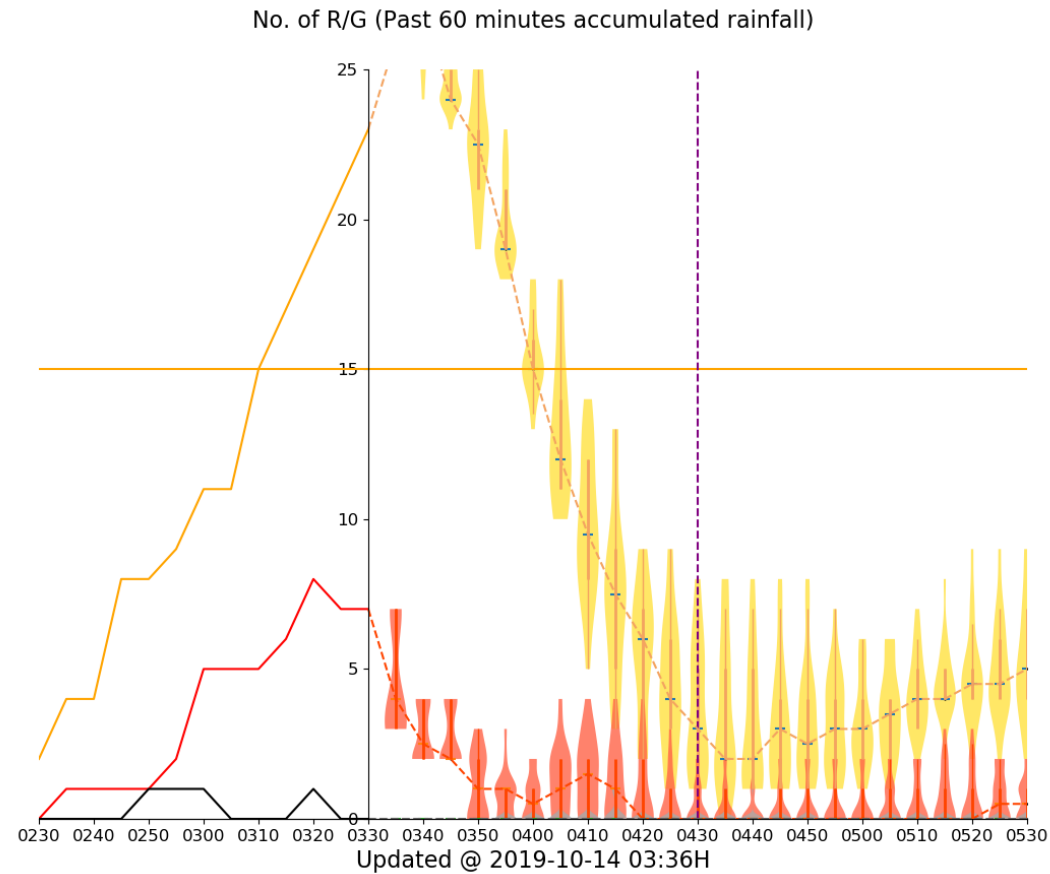
Expected to happen once out of 10 times

→ observed relative frequency =  $1/10 = 10\%$



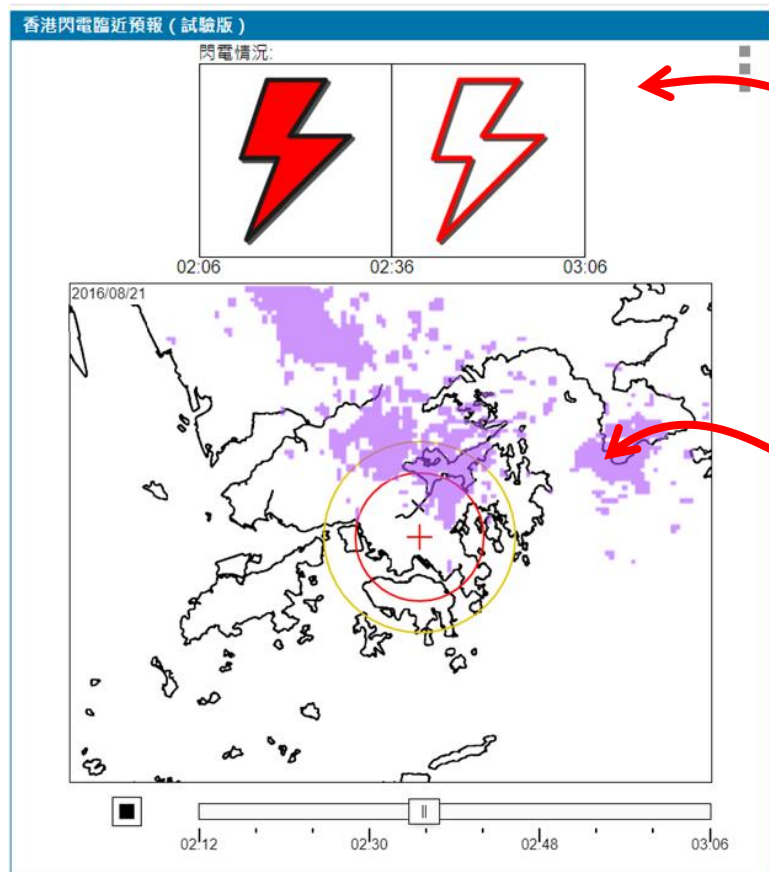
forecast probability = observed relative frequency  
→ the probability forecast is perfectly reliable

# Probability in Time Series



# Nowcast of Thunderstorms

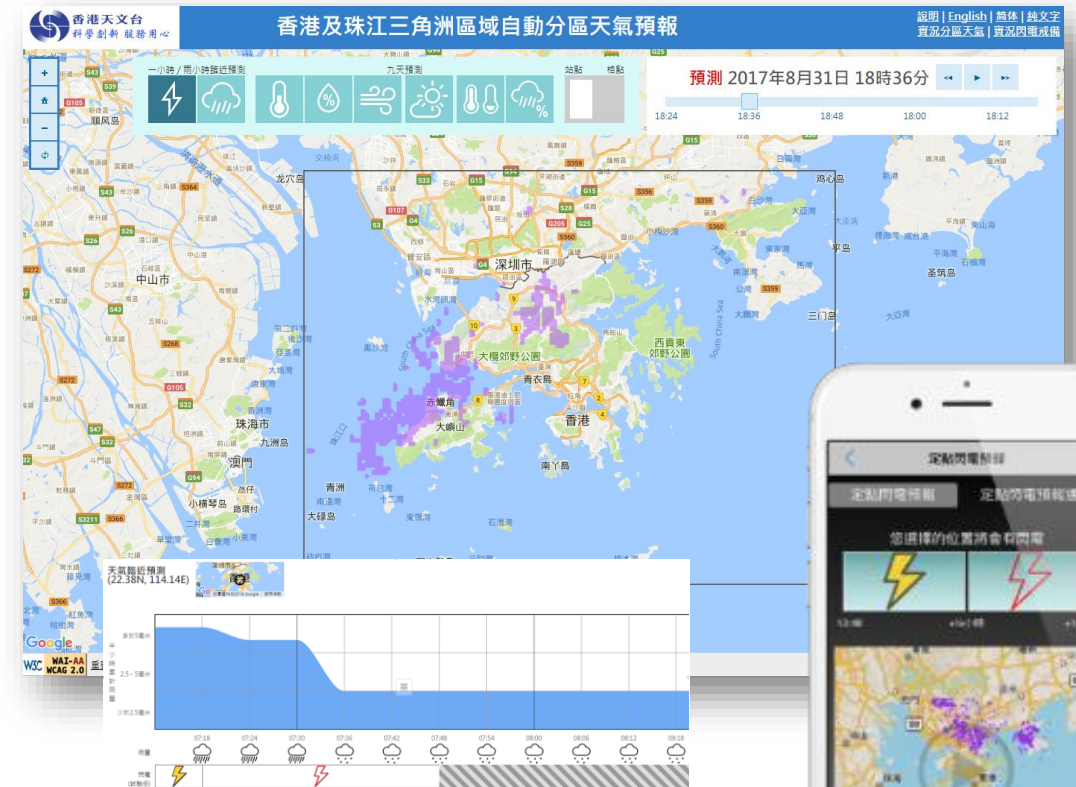
# One-Hour Lightning Nowcast of HKO



Lightning Alerts

Predicted Lightning Distribution

## Automatic Regional Weather Forecast

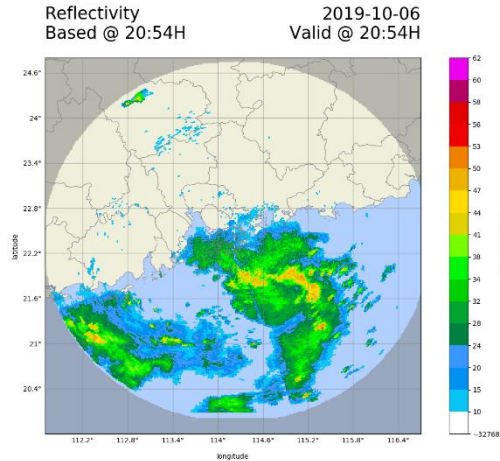


Also a feature  
of HKO's Mobile App

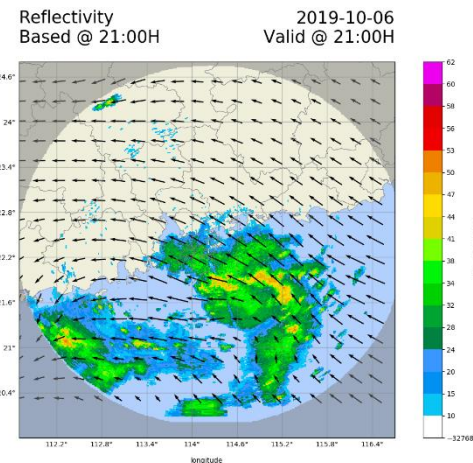
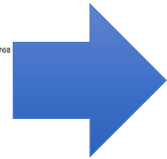
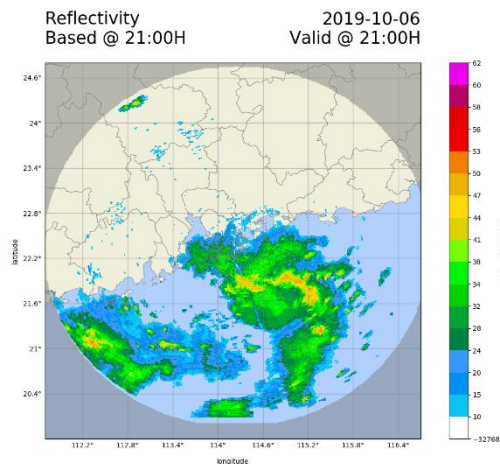


# Lightning Nowcast by Extrapolation

6 Minutes  
Earlier



Latest



Motion Field

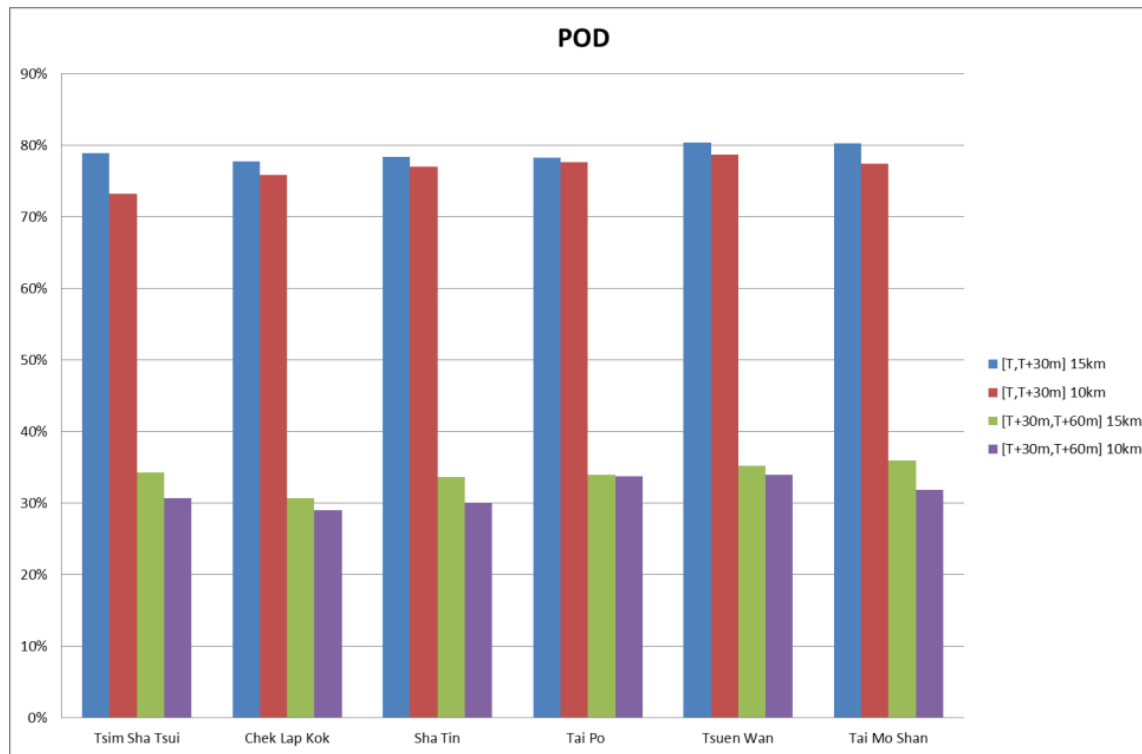
## Steps:

1. Calculate Motion Field from Recent Radar Images
2. Extrapolate Detected Lightning Locations to Produce Lightning Nowcast
3. Alert if the Predicted Lightning Locations fall within 10 / 15 km of the User

# Performance of Lightning Nowcast

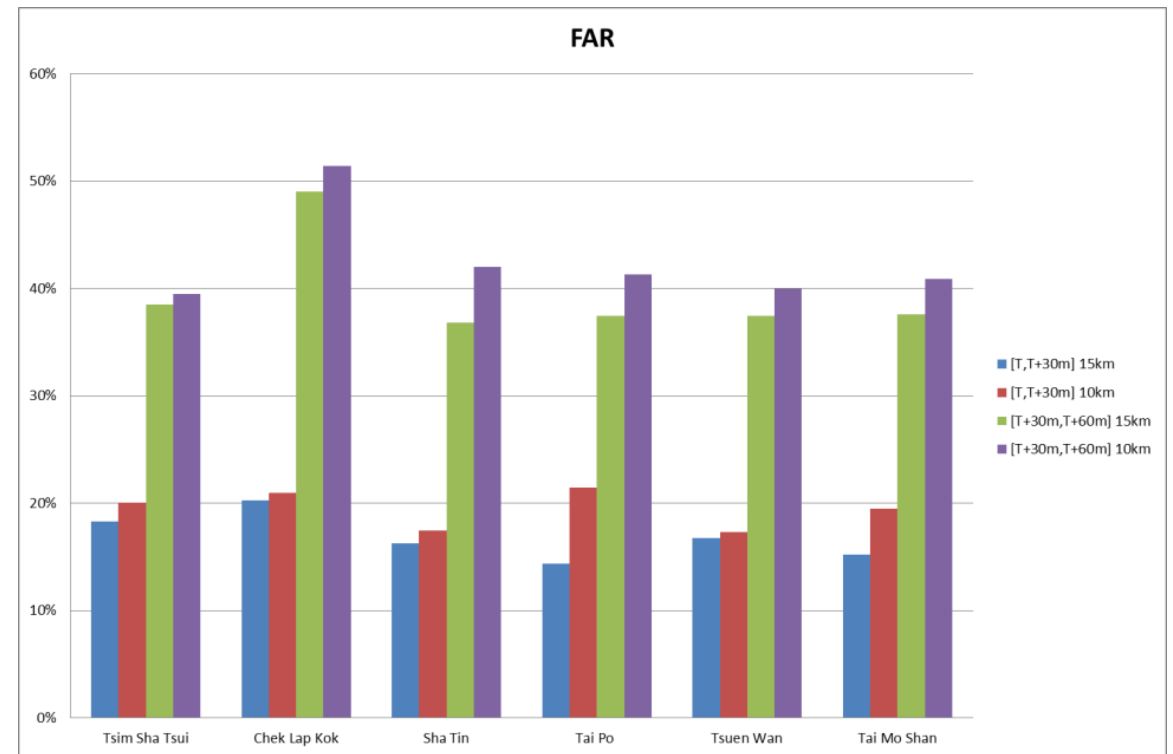
For first half-hour 15 km

POD is around **70-80%**



For first half-hour 15 km

FAR is around **15-20%**



# Lightning Initiation

# Simple Conceptual Model

- +/–ve charges carried by ice and graupel respectively
- charges separated vertically by updraft
- Important distribution in the mixed layer from 0°C to -20°C:

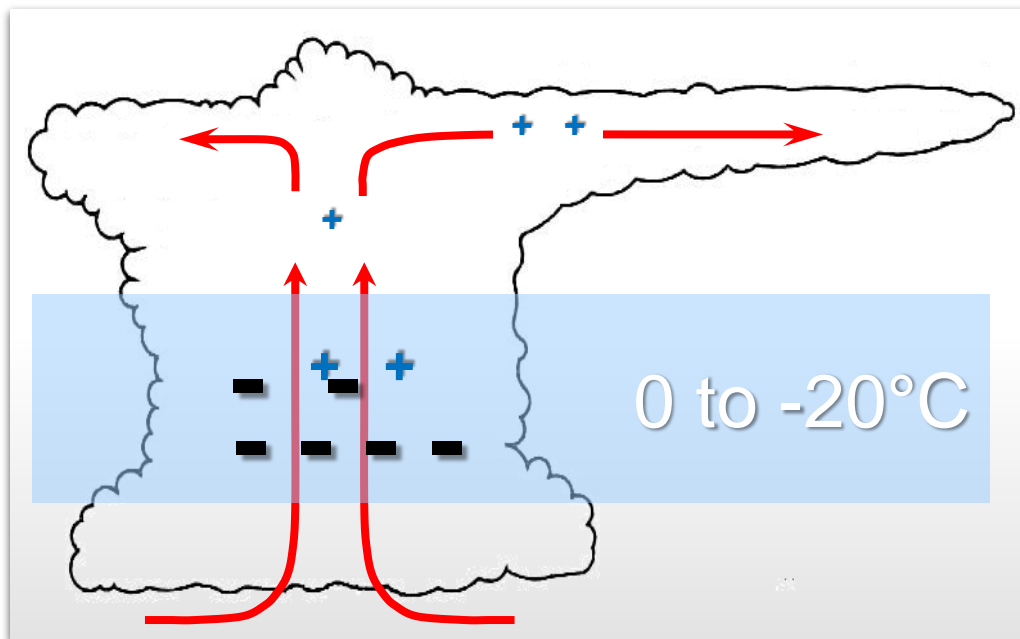


Table II – Summary of the conceptual model for lightning initiation.

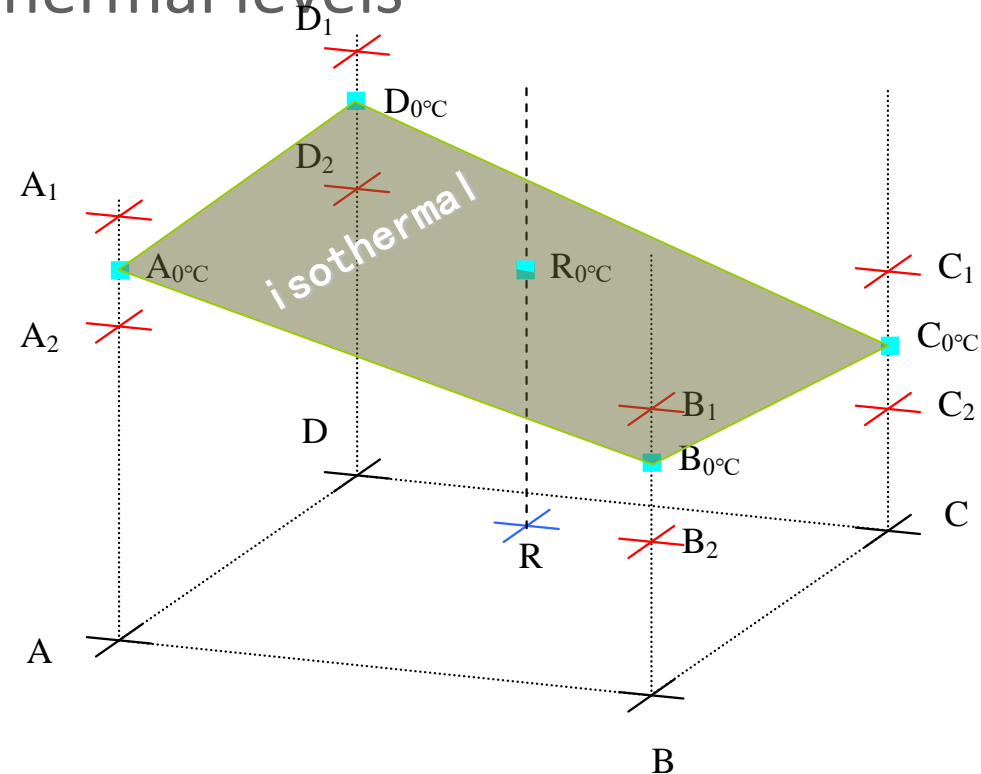
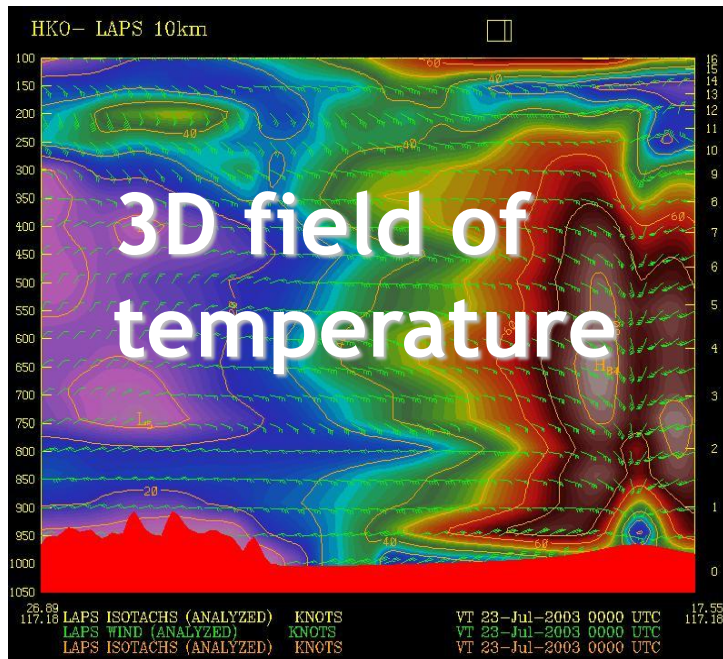
Isothermal Layers	(i) Shallow Cu			(ii) Towering Cu			(iii) mature Cb			(iv) decaying Cb		
	D	H	E	D	H	E	D	H	E	D	H	E
below -40°C							↑	*	ρ	↑	*	ρ
-20 to -40°C				↑	*	ρ	↑	*	ρ	↑	*	ρ
-10 to -20°C	↑	*		↑↓	*△	σ	↑↓	*△	σ		*	
0 to -10°C	↑	💧		↑	*💧		↑↓	*△💧	σ		*	
above 0°C	↑	💧		↑	💧		↑↓	*△💧	σ	↓	*△	
near surface	↔			↔	⚡		↔	⚡	⚡	↔	⚡	⚡

Note : Headings D, H and E stand for vertical dynamics, hydrometeors and electric charges respectively. Other symbols are explained in the main text of Section 2.



# Isothermal Reflectivity

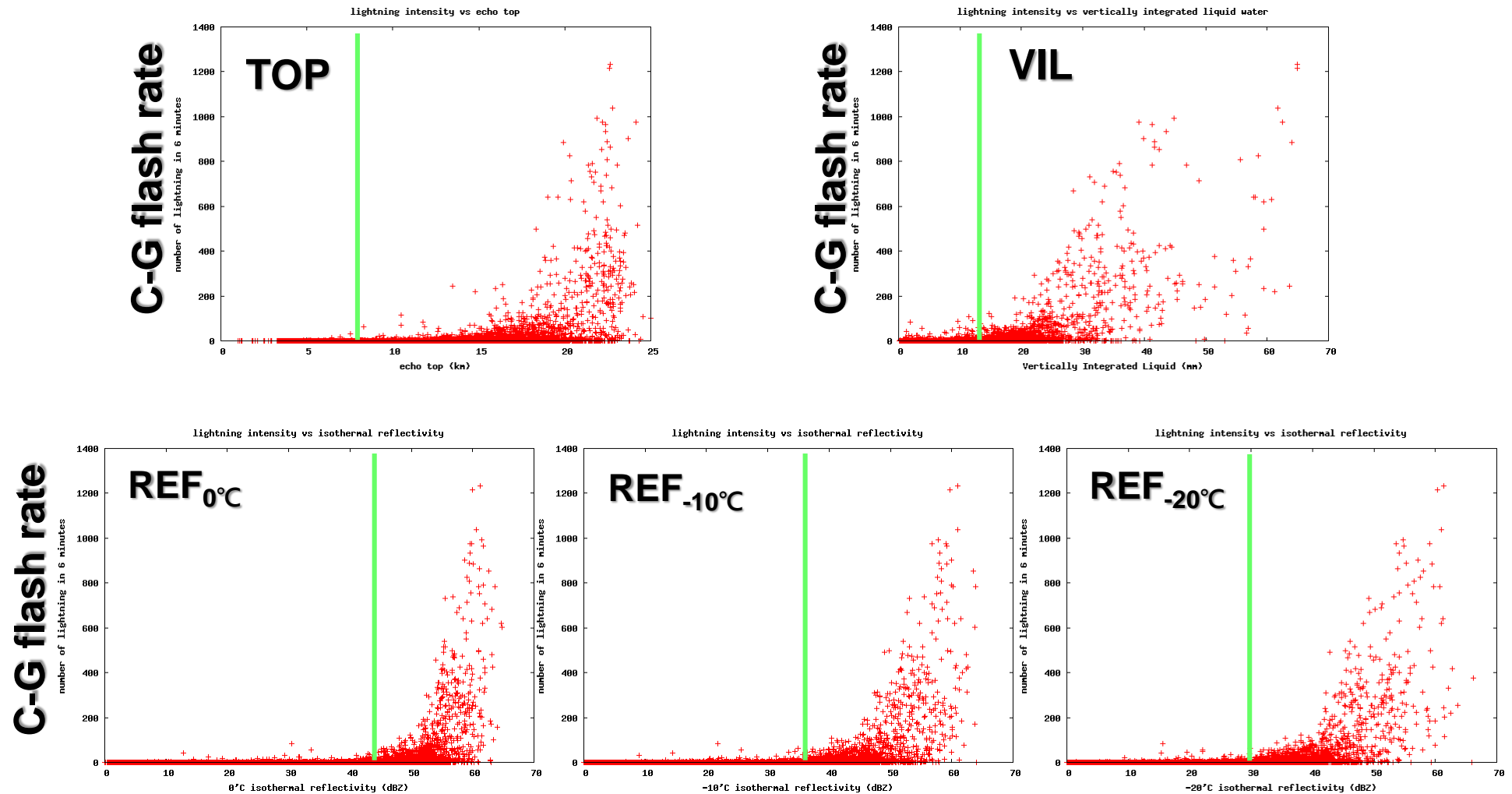
- 3D temp & height fields from rapidly-updating analysis
- interpolate to radar grid (cartesian)
- interpolate reflectivity to isothermal levels



# Lightning Predictors

- lightning physics reflected in radar observations:
  - TOP (updraft)
  - VIL (overall liquid content)
  - $REF_{0^{\circ}C}$
    - $REF_{-10^{\circ}C}$
    - $REF_{-20^{\circ}C}$
- (super-cooled liquid, water-coated graupel)
- consider lightning initiation as an on-off process
- also used in lightning severity (log flash rate) prediction

# Lightning as an On-Off Process



# Thresholds under Testing

- good indicators of the onset of C-G lightning in 15-20 minutes with high CSI:
  - TOP > 7.6 km
  - VIL > 5.9 mm
  - $\text{REF}_{0^{\circ}\text{C}} > 47 \text{ dBZ}$
  - $\text{REF}_{-10^{\circ}\text{C}} > 17 \text{ dBZ}$
  - $\text{REF}_{-20^{\circ}\text{C}} > 0 \text{ dBZ}$
- may gain a bit longer lead time by lowering the thresholds

# Lightning Intensity

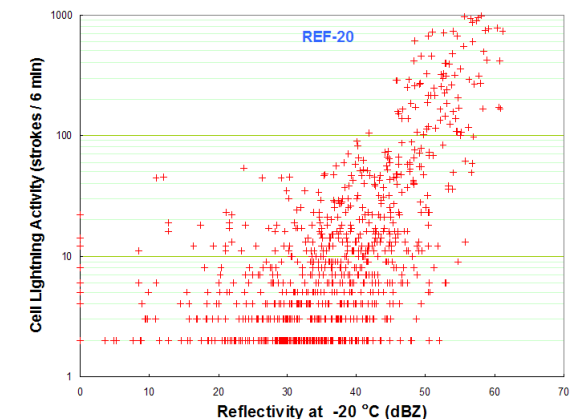
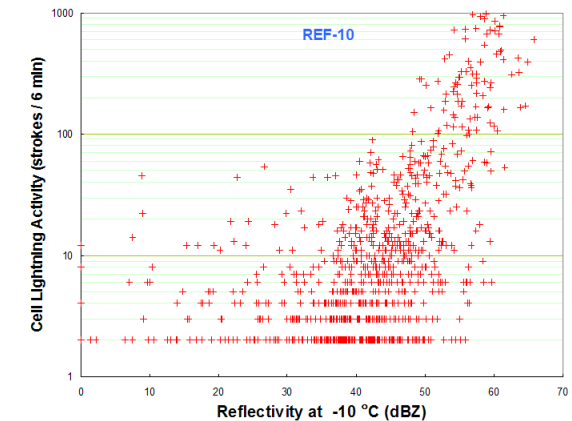
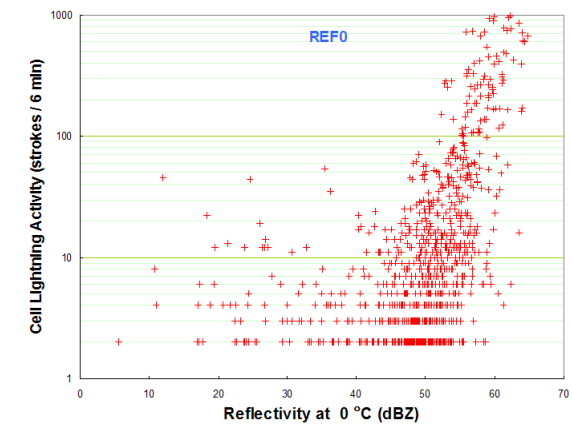
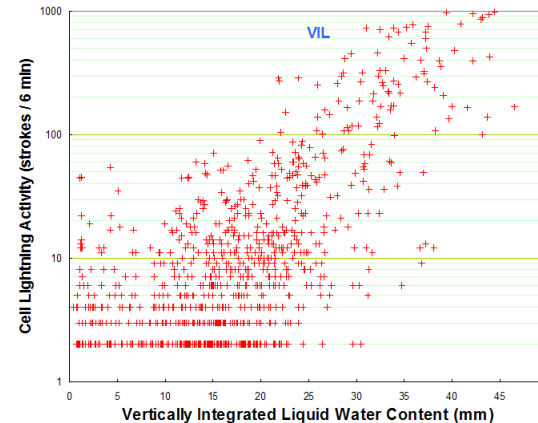
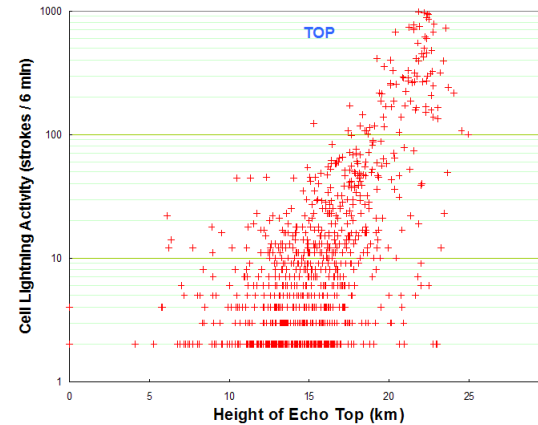
- define lightning severity:

$$\zeta = \log_{10}(\alpha)$$

- where  $\alpha$  is the number of CG lightning strokes in 6 minutes associated with a storm cell

- linear relationships:

$$\zeta = a + \sum b_i \cdot x_i$$



# Preliminary Results

- predicted severity:

$$\begin{aligned}\zeta = & -3.623 \times 10^{-01} \\ & + 6.105 \times 10^{-02} \times TOP(km) \\ & + 2.601 \times 10^{-02} \times VIL(mm) \\ & + 1.967 \times 10^{-06} \times REF_{-20^{\circ}C}(Z) \\ & + 1.146 \times 10^{-07} \times REF_{0^{\circ}C}(Z)\end{aligned}$$

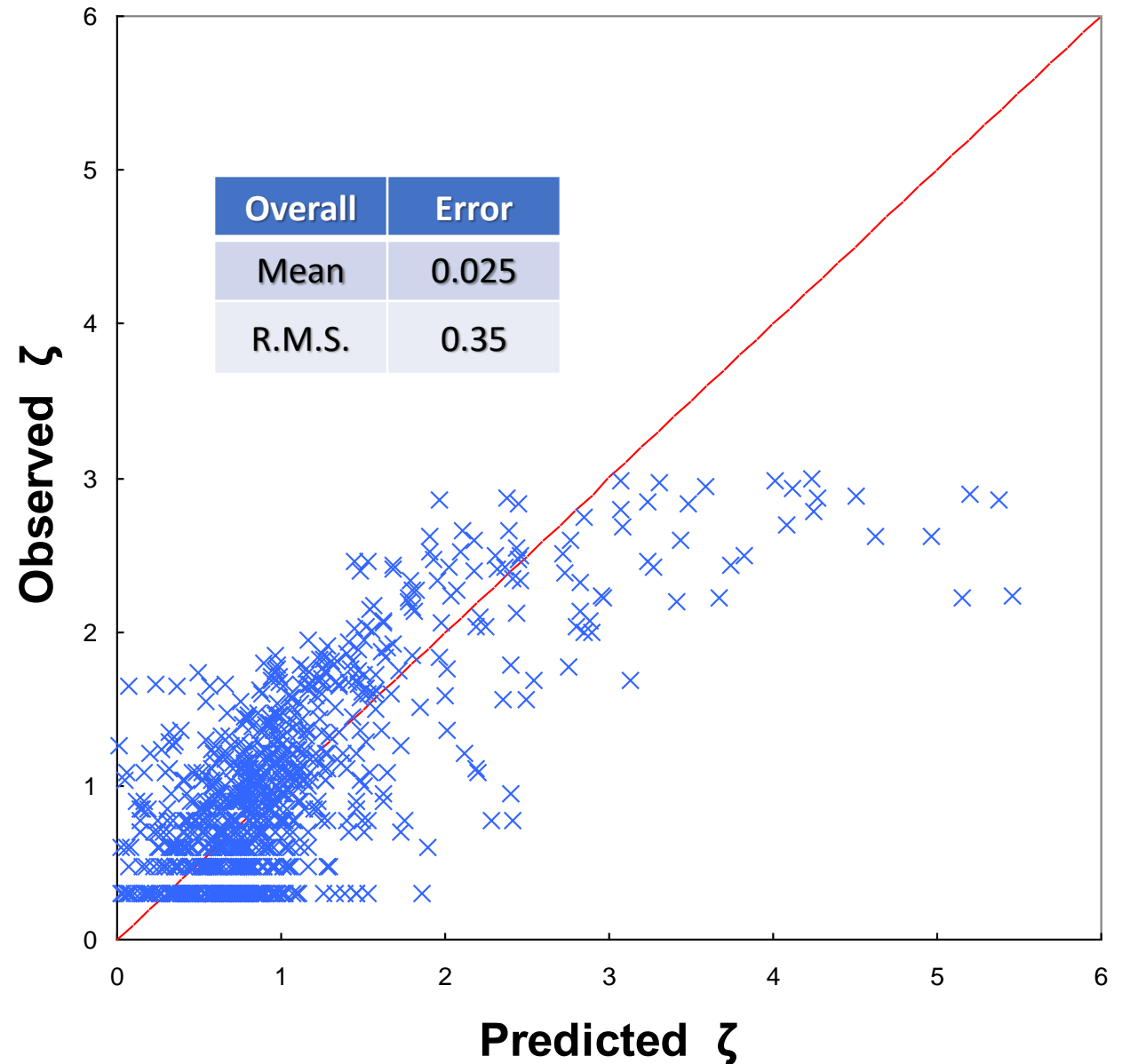
- coef. normalized:

$$\beta_{TOP} = 0.273$$

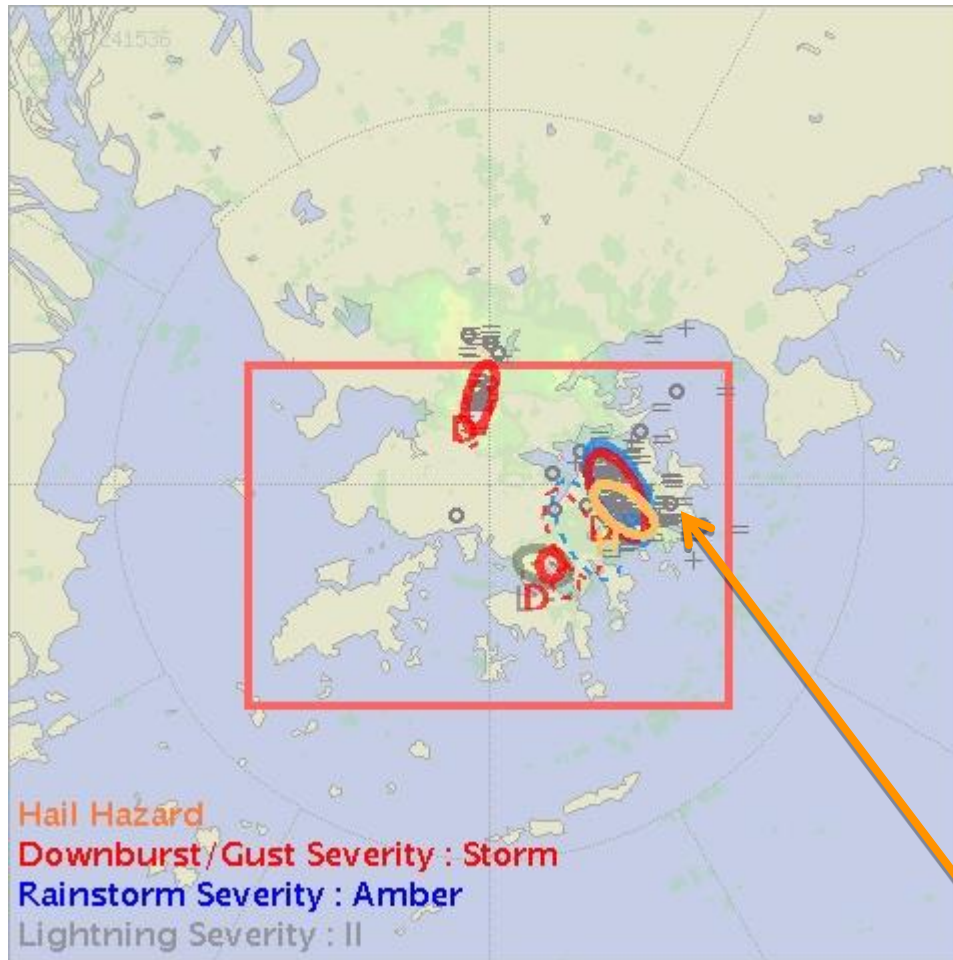
$$\beta_{VIL} = 0.387$$

$$\beta_{Z_0} = 0.037$$

$$\beta_{Z_{-20}} = 0.273$$



# Lightning Initiation Nowcast



- hailstorm in Hong Kong on 24 July 2006
- first CG lightning alert issued at 3:00 pm
  - *see gray ellipse inside the red rectangular warning zone*
- CG lightning first detected (“=” symbols) during 3:12-3:18 pm
  - *threat areas for downburst/severe gust and heavy rain are marked by red and blue ellipses respectively*

**03:00 pm**

**lead time = 12 min**

**first CG lightning**

# Lightning Nowcasts for Beijing

- isolated thunderstorm west of Beijing city on 3 August 2007
- first CG light alert issued at 5:48 pm
- CG lightning first detected (“=” symbols) during 6:18-6:24 pm

**06:24 pm**

**lead time = 30 min**

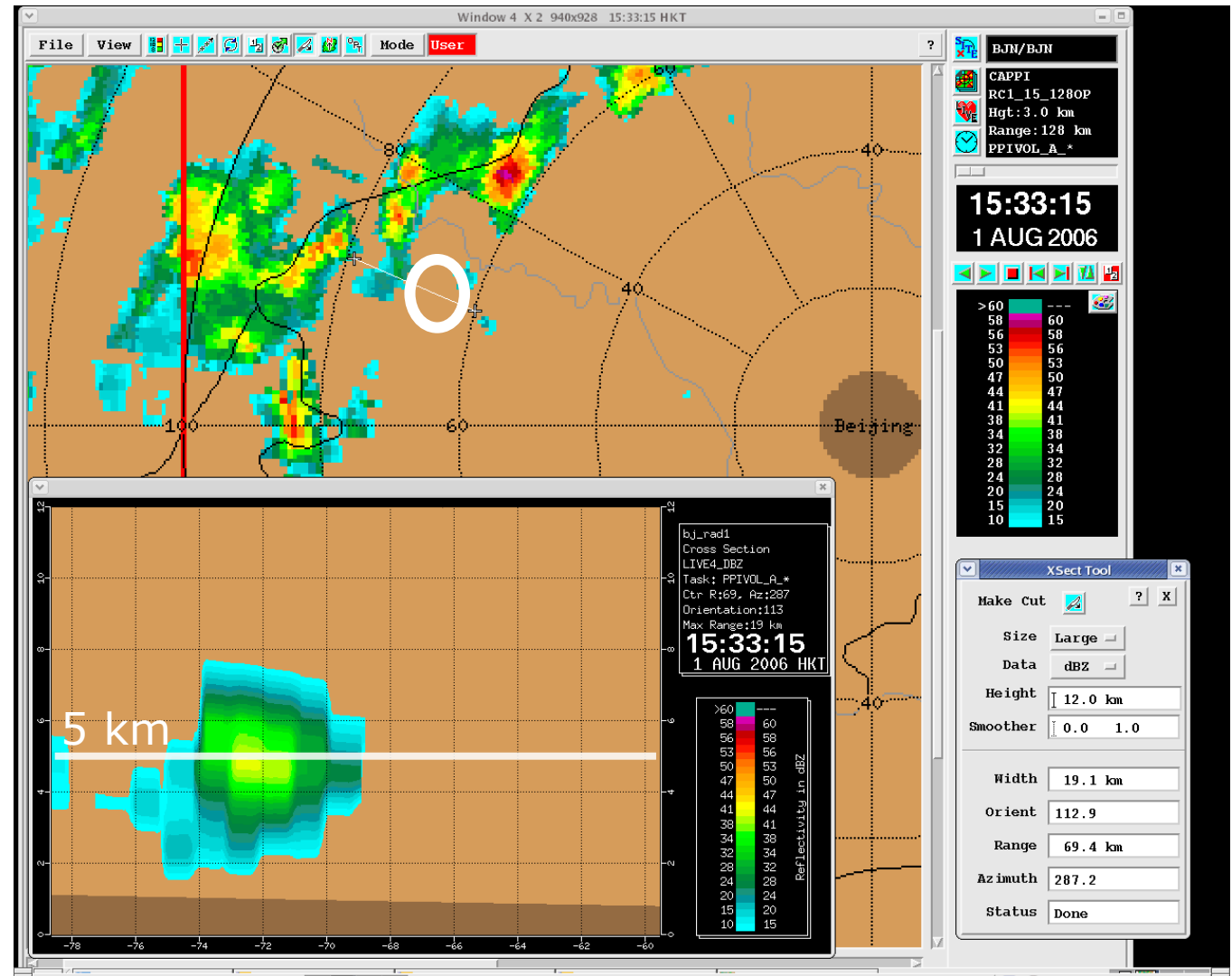




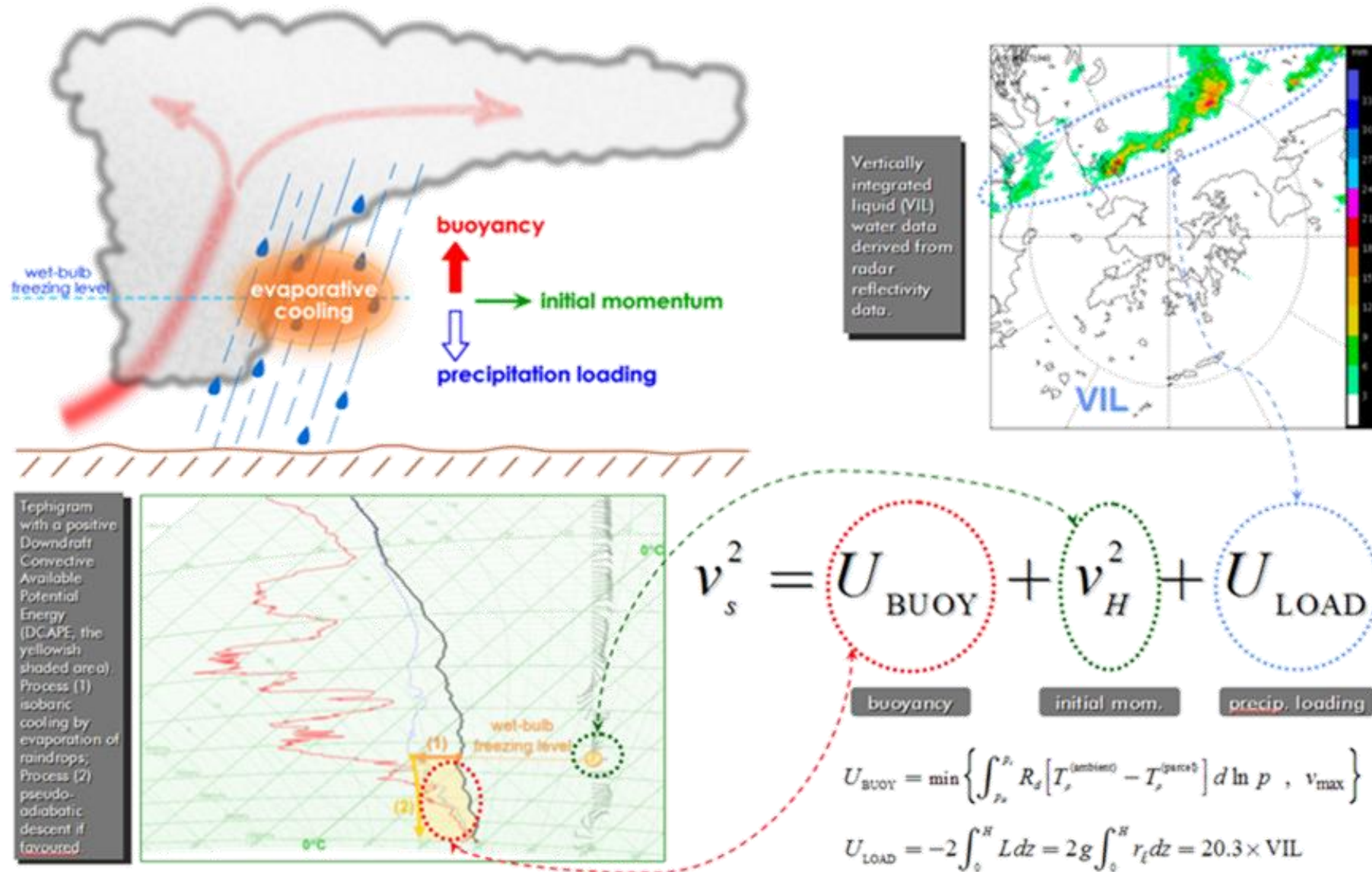
# Nowcast of Gust

# Thunderstorm Downburst as Seen from Radar

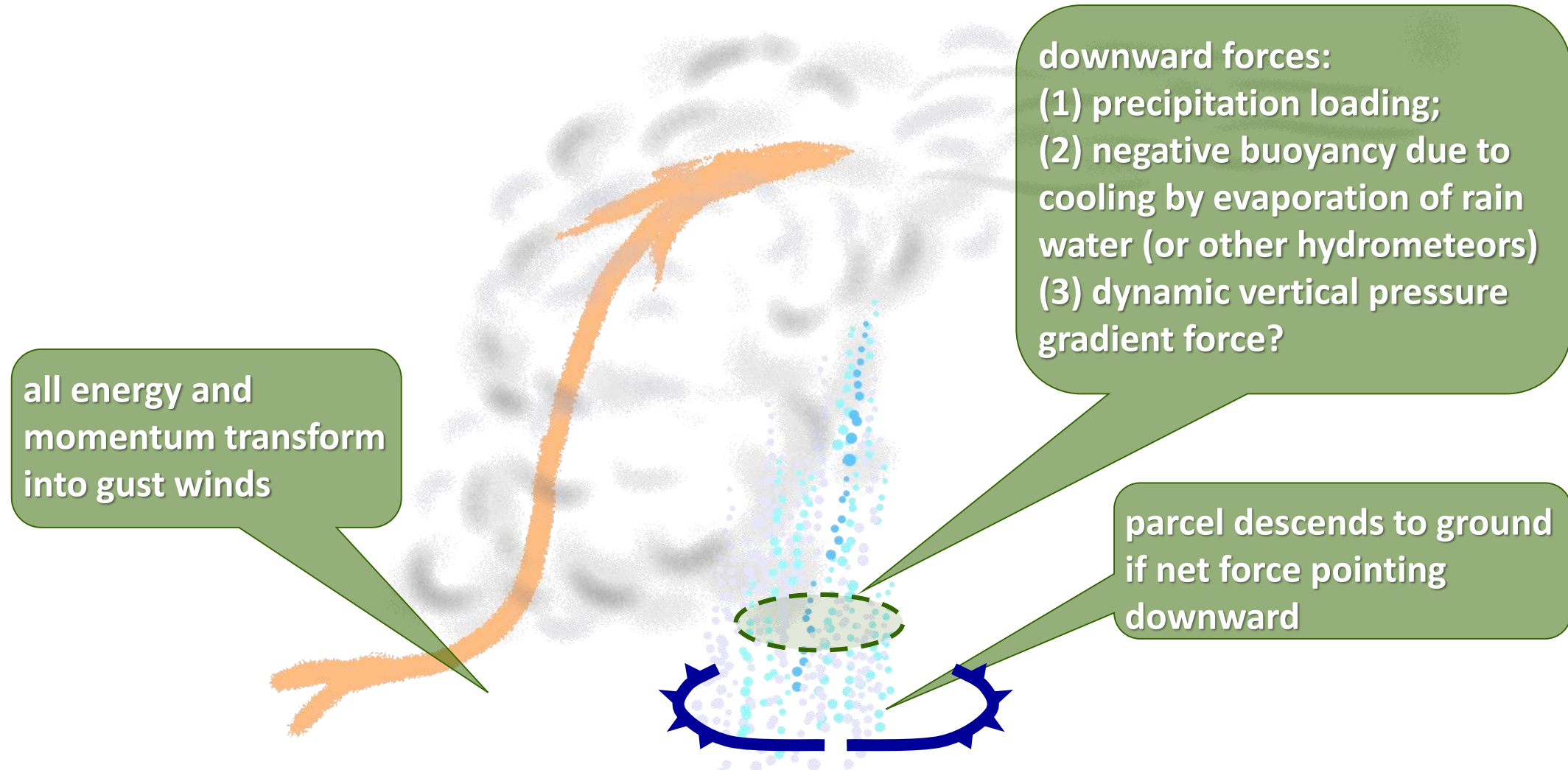
- building up of precip. core at mid levels
- precip. core descending  
→ downburst
- occurring at time scale of a few minutes
- severe wind gust on ground  
⇒ *Downburst/squalls*



# Simple Downburst Conceptual Model



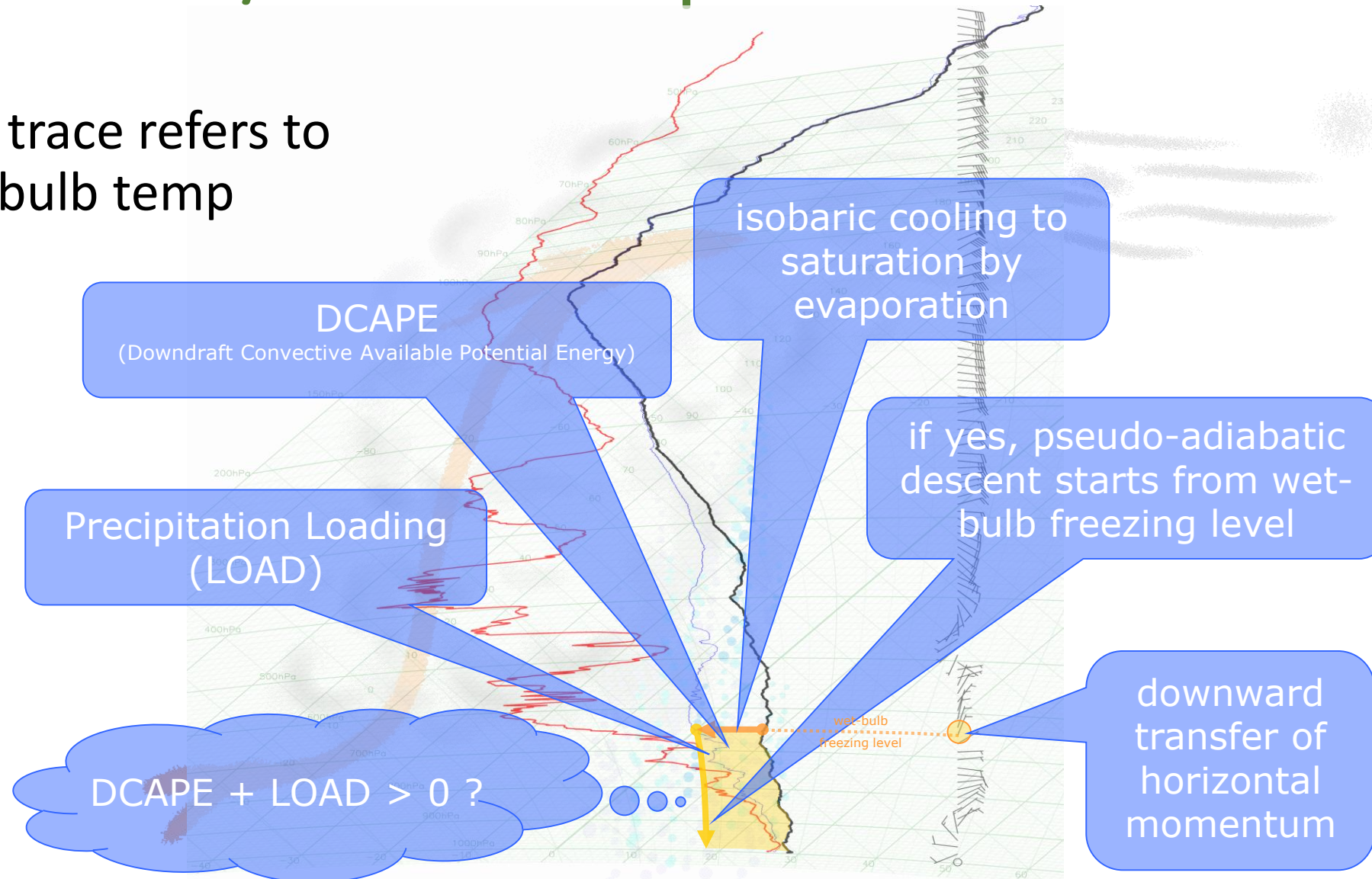
# Downburst/Gust Conceptual Model



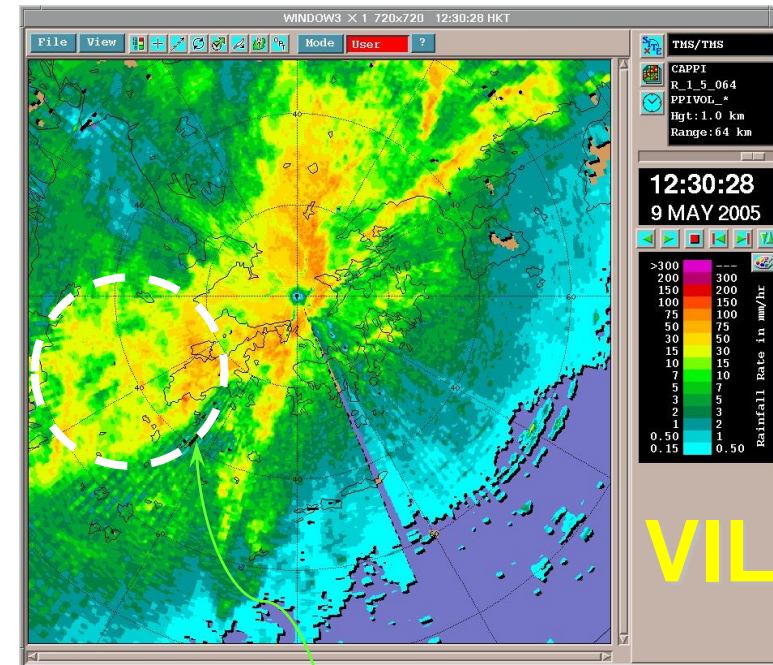
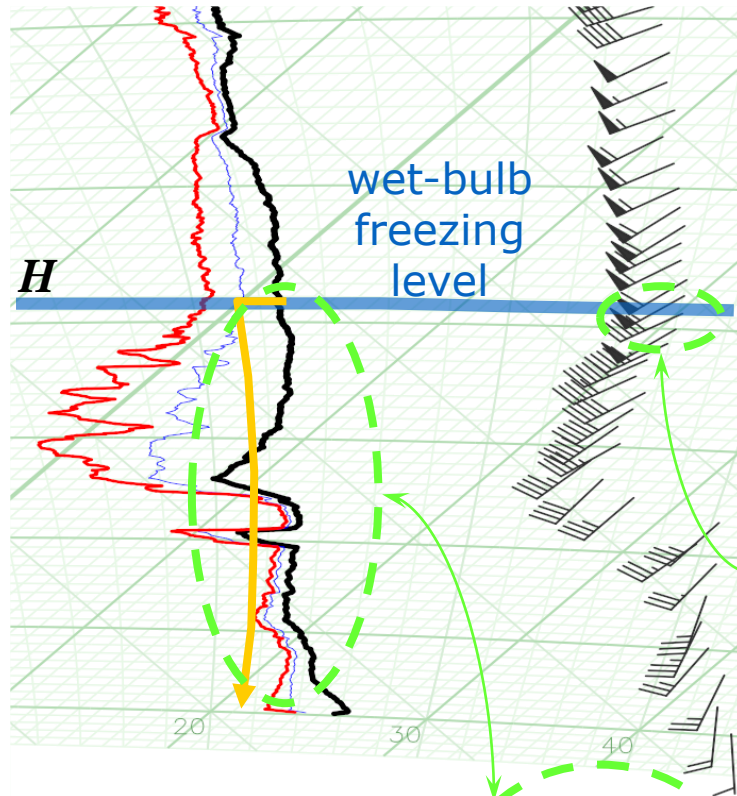


# Downburst/Gust Conceptual Model

- Blue trace refers to wet-bulb temp



# Downburst/Gust Nowcast Algorithm



$$w_o^2 = -2g \int_0^H \frac{\theta'_v}{\theta_{vo}} dz + w_H^2 + 2g \int_0^H L dz$$

buoyancy

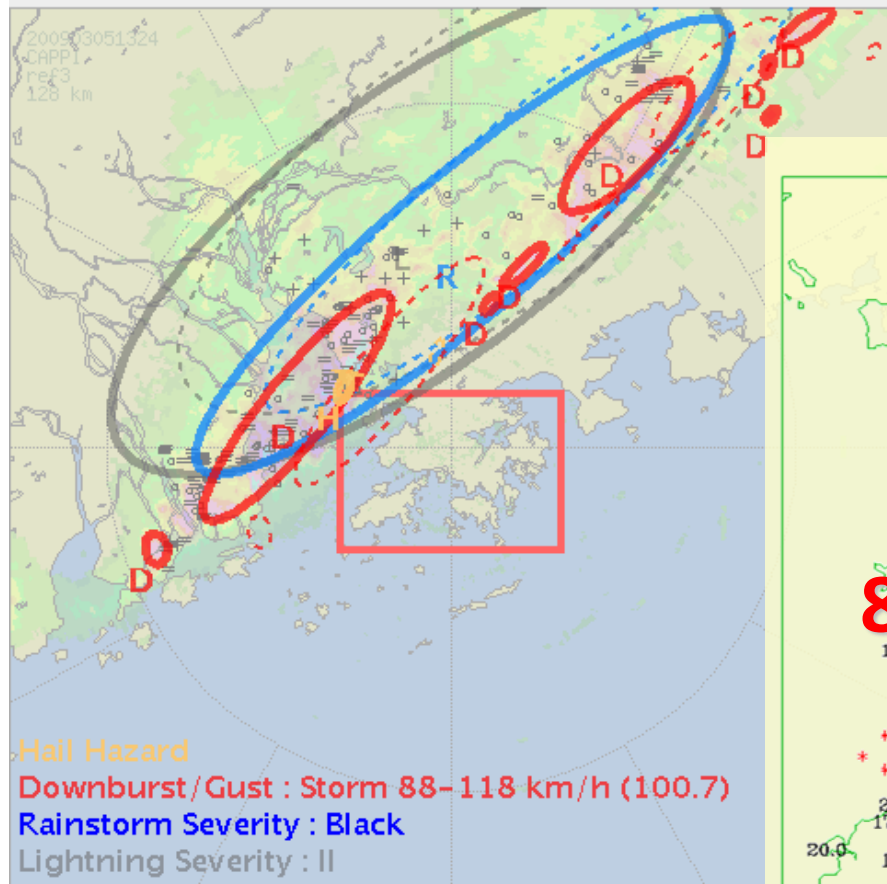
hori. mom.

precip. loading

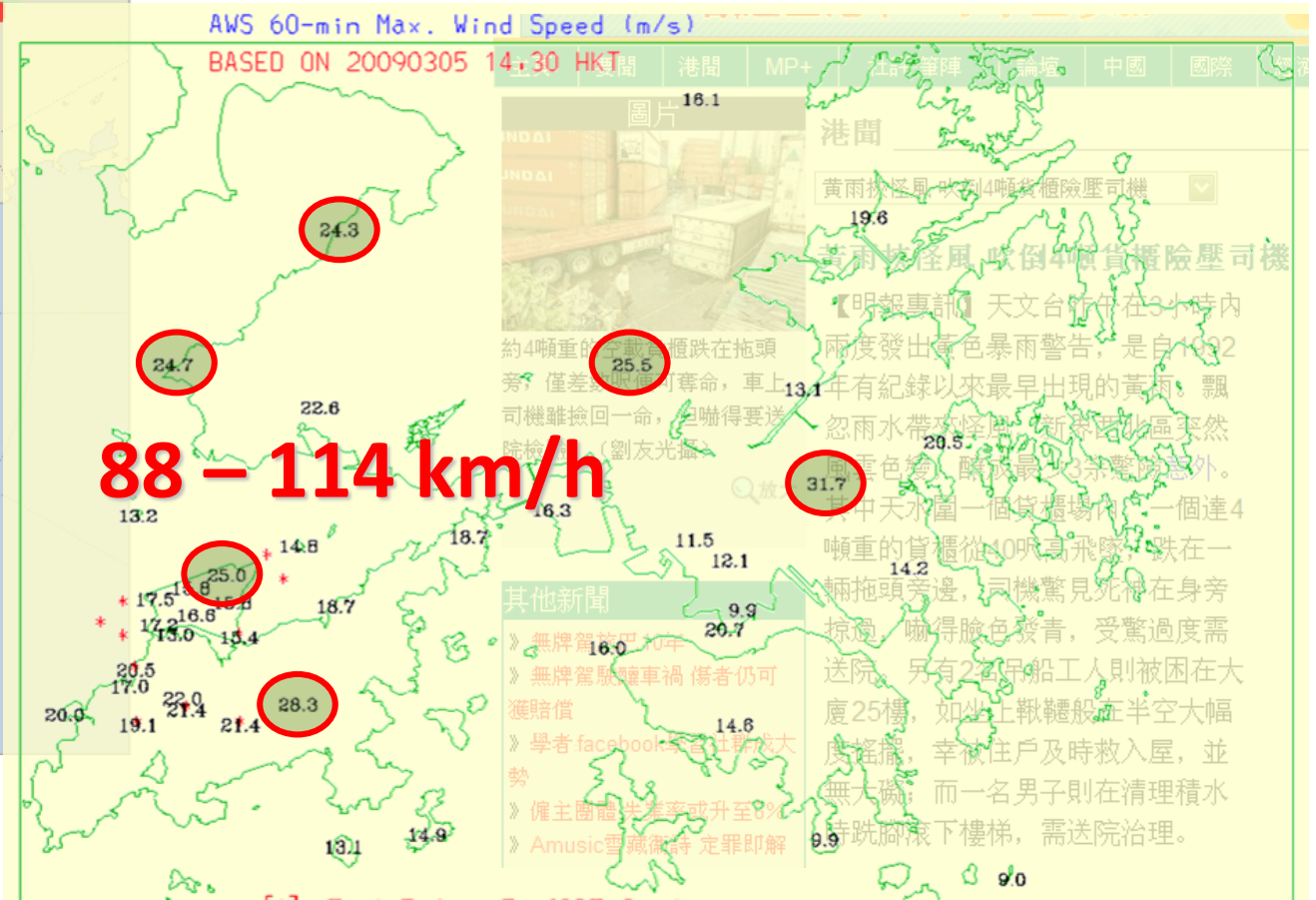


# Squall Nowcast – Hong Kong

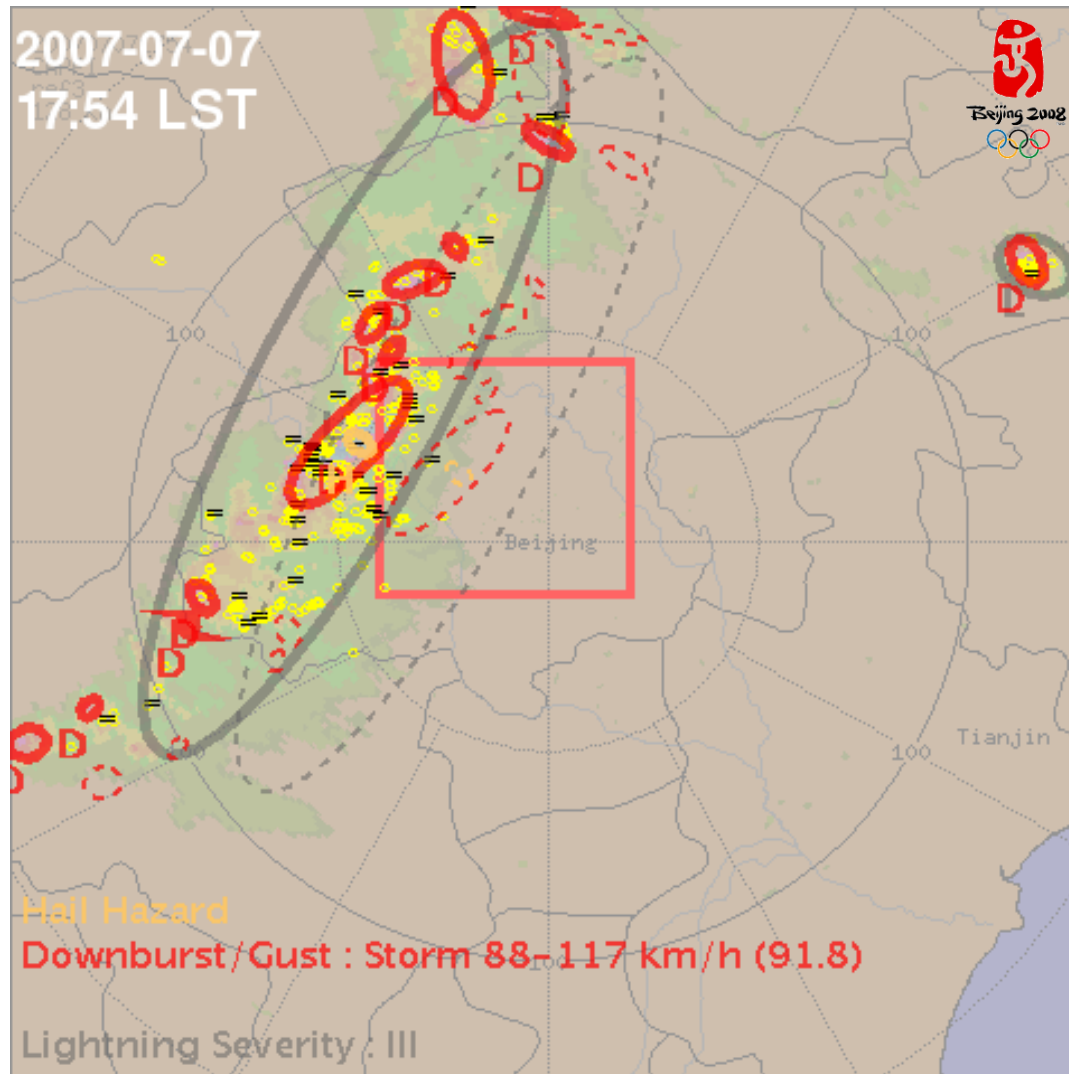
TMS 2009-03-05 13:24H Range 128 km Height 3 km



- squall line of 5 March 2009



# Squall Nowcast for Beijing



- damaging winds on 2007-07-07, ~ 7 pm
  - SWIRLS (5:54-7:12 pm) :
    - Gale F9 (82.2 km/h) to Storm F10 (91.8 km/h)
  - AWS - WSX (6:30-6:35 pm) :
    - Gale F9 (78.1 km/h)

Beijing Daily Messenger 北京娱乐信报 2007-07-08

## 吊车没“站稳”砸坏酒楼屋顶

昨夜行动 所幸未造成人员伤亡 车队负责人称吊车是大风刮倒的



## 雷阵雨突袭 气象台两发预警

【相关新闻】 雷阵雨突袭 气象台两发预警  
据气象部门消息，7月7日下午，北京市遭遇雷阵雨天气，伴有短时强降水、短时大风等强对流天气。气象台于17时30分发布雷电黄色预警信号，并于18时30分发布雷电橙色预警信号。北京市气象台提醒市民注意防范强对流天气带来的不利影响。



# Some Tips on Usage

- Lightning nowcast
  - based primarily on radar observations and warns about C-G lightning only
  - also checks for actual I-C lightning signals but may be too late due to latency of Beijing lightning data (updated hourly)
  - assumes dominance of -ve strokes in C-G lightning
- Downburst / Wind Gust
  - depending on the actual propagation of the gust fronts, actual gusty areas may be wider or further downstream than those indicated by the D-cells
  - tends to over-warn due to the current data set being derived solely from gusty cases
  - mainly applicable to pulse-type thunderstorms

# Nowcast of Hail

# Hail

- Hail hazard is identified where:
  - 60 dBZ echo can be located above 3 km altitude (60 dBZ Echo TOP radar product); AND
  - up to 2 km altitude, less than 5 mm vertical integrated liquid can be found (2 km VIL radar product)
- Then use ellipses to group the hail hazard area

# Hail Nowcast - Hong Kong

- case of 6 March 2009

- time - 1:10 - 1:40 a.m.

- hail size - 0.5-1 cm

明報即時新聞  
www.mingpao.com

2009年3月6日 星期五  
免費新聞速遞 北美明報: 紐約

主頁 即時港聞 即時經濟 即時兩岸 即時國際 即時體育 即時數碼 新聞

投票區

你對曾俊華第二份財政預算案的評分

☐ 0-20  
☐ 21-40  
☐ 41-50  
☐ 51-60  
☐ 61-70  
☐ 71-80  
☐ 81-90  
☐ 91-100

即時港聞

本港凌晨落冰雹[07:25]

**本港凌晨落冰雹 (07:25)**

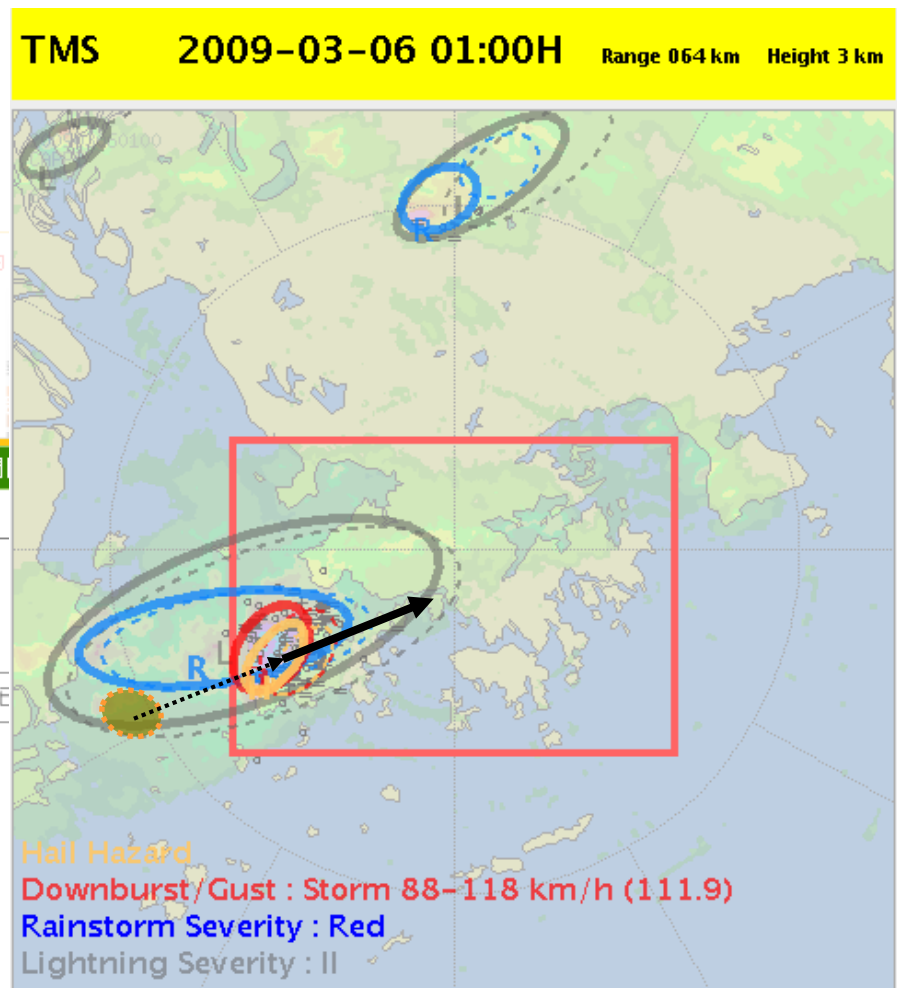
天文台表示，在凌晨約1時多，收到荃灣石圍角及馬灣落雹報告。

天文台表示，由於有雷雨區經過本港，並加上華南沿岸地區有一股冷鋒，產生較強的對流活動，形成冰雹。

有荃灣居民表示，落雹持續一至兩分鐘。

(即時新聞)

讀者報料  
歡迎讀者就不同突



# SWIRLS' HAIL FORECASTS

## Reported

Year	Date	Time	Areas of Incidence	Size of Hailstones	Other Remarks
2009	6-三月	0110 H - 0120 H	Tung Chung	diameter: 0.5 - 1 cm soy bean sized	Thunderstorm with heavy rain.
		0120 H	Ma Wan		Hail last for 1 to 2 minutes. Thunderstorm with heavy rain.
		0140 H - 0150 H	Tsing Yi	diameter: 0.5 - 1 cm	Heavy rain
		0130 H - 0140 H	Tsuen Wan	soy bean sized	Thunderstorm with heavy rain.
2013	19-Mar	shortly before 1800 H	Sheung Sze Wan Clearwater Bay (email)	About 20 seconds with stones the size of peas	Thunderstorm with heavy rain. Amber in force Trough of low pressure is bringing rain and thunderstorms to the coastal areas of Guangdong.
		Around 1730 H	The peak, near Black's Link (newspaper)	About 30 seconds, soy bean sized	Locally, rain and thunderstorms in the afternoon and evening brought more than 30 millimetres of rainfall to Hong Kong Island and Lantau Island)
2014	30-Mar	Around 2040 H	Tuen Mun, Yuen Long, Tsuen Wan, Tsing Yi, Kowloon Tong, Kwai Chung	marble sized, diameter: 1- 3 cm	Thunderstorm with heavy rain. Black in force. Trough of low pressure. Hail last for 10 min

## SWIRLS Hail Forecast (since 2011)

2009 (Partial): 3/5, **3/6 (01:18)**

2010 (Partial): 5/7 (x2), 9/8, 9/10

2011 (Full Year): 4/17, 7/28

2012 (Full Year): 4/13, 4/16, 5/4 (x2), 5/10, 7/21, 7/31,

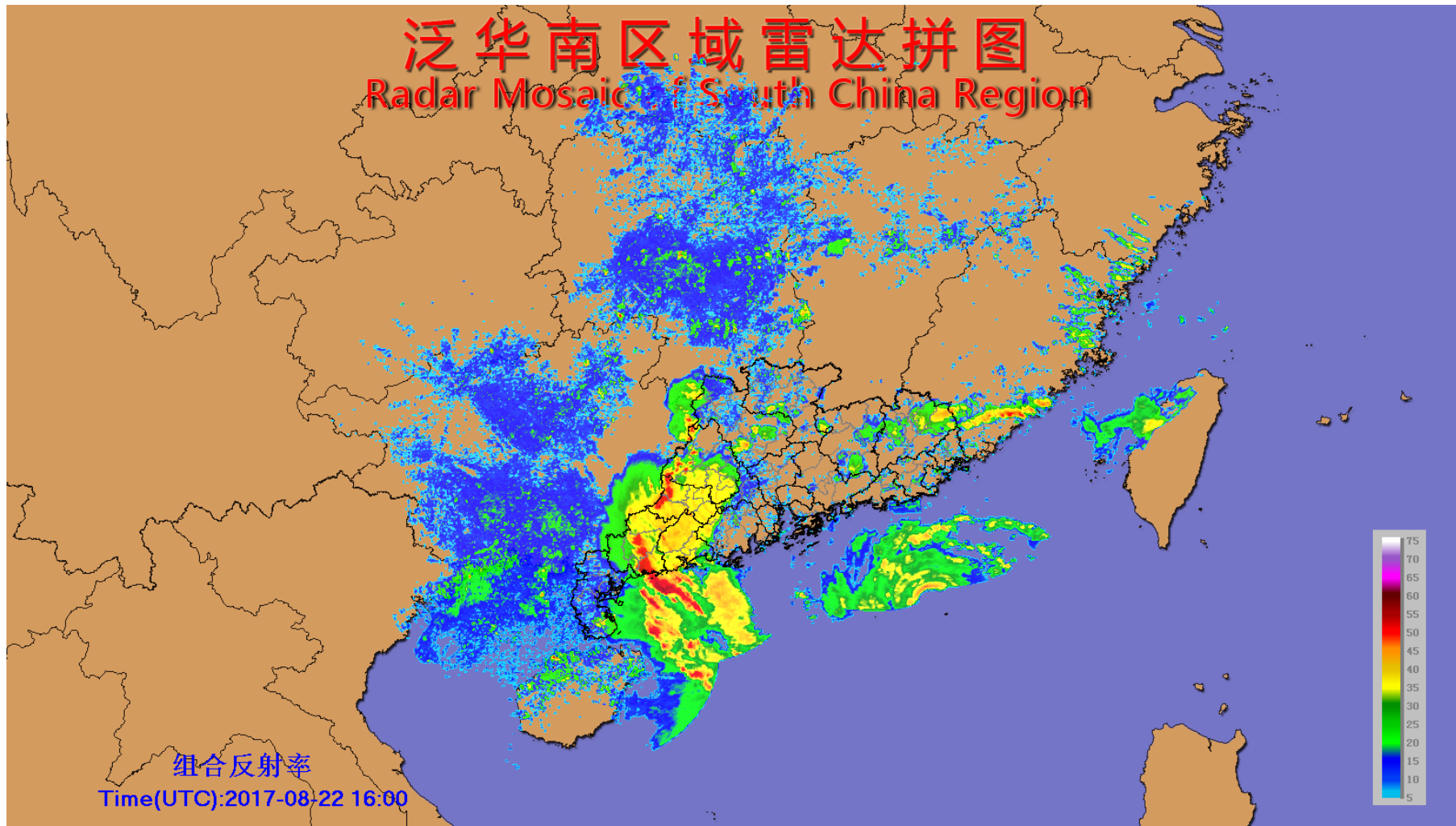
2013 (Full Year): **3/19 (14:24)**, 3/28

2014 (Full Year): **3/30 (18:30 & 2318)**, 3/31, **4/2 (05:00 & 21:30)**, 4/3

# Satellite Nowcast Application



# Why Satellite Retrieved Reflectivity?



12 hours before Super Typhoon Hato (1713) landed over Zhuhai, near Macao



# Radars are vulnerable in Tropical Cyclones



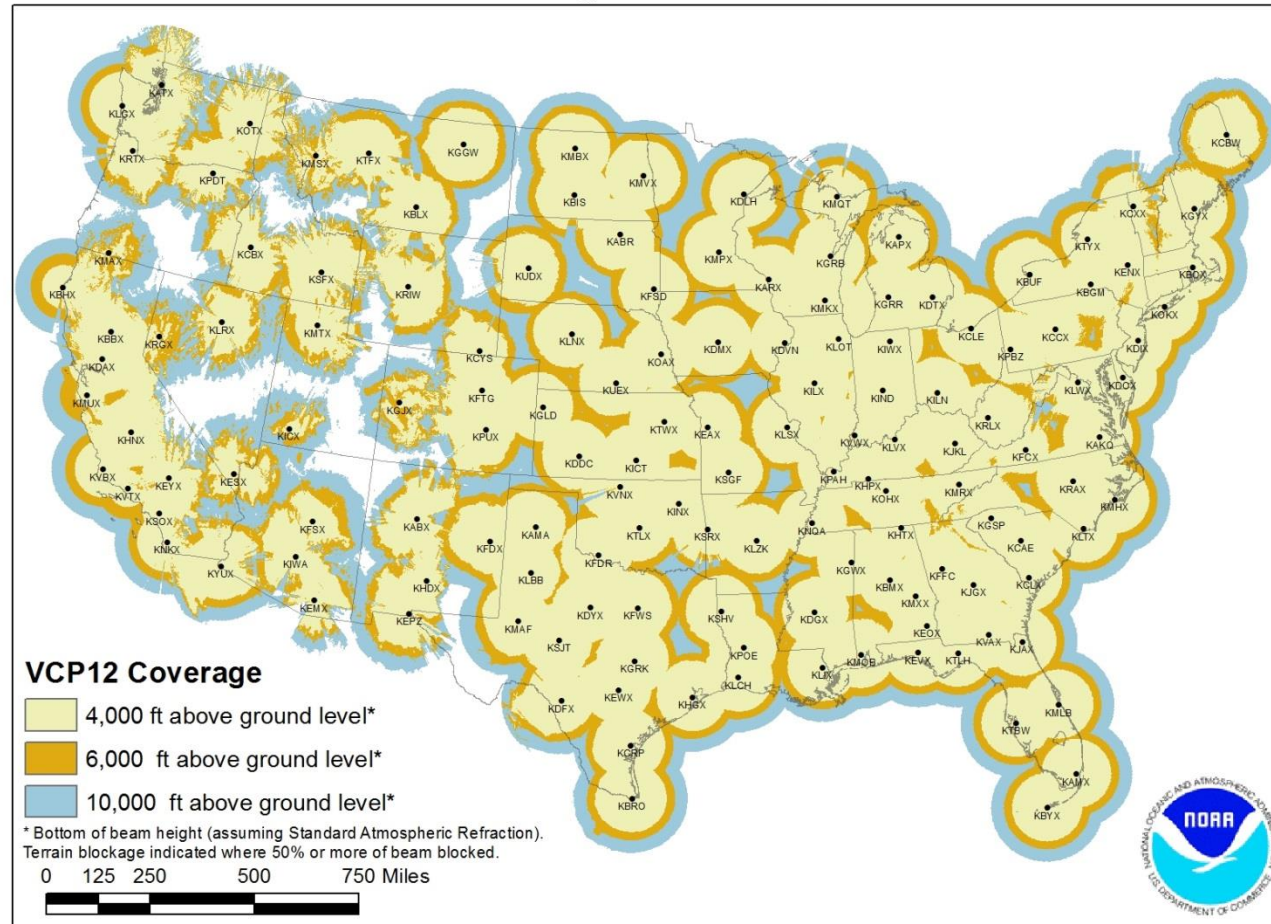
Puerto Rico weather radar  
destroyed by Hurricane Maria



Wufenshan weather radar  
destroyed by Super Typhoon  
Soudelor (1513)  
*Credit: Ettoday.net*

# Coverage of Radar Network

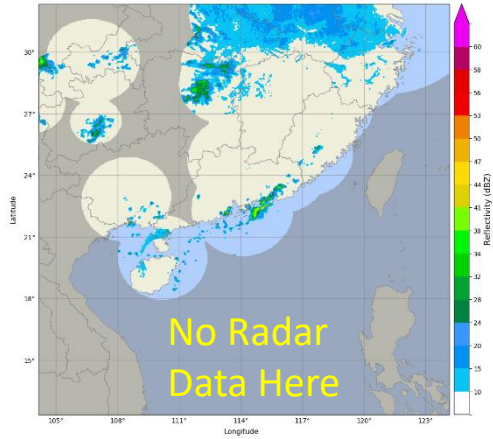
NEXRAD Coverage Below 10,000 Feet AGL



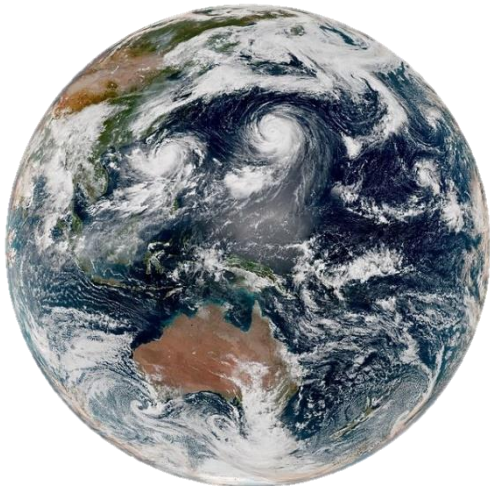
Source: <https://www.roc.noaa.gov/WSR88D/Maps.aspx>

# Simulate Radar Observations from Satellite Data using Neural Network

Reflectivity 2019-10-14 Based @ 01:00H  
HK Radars / ROVER-A / SC Valid @ 02:00H



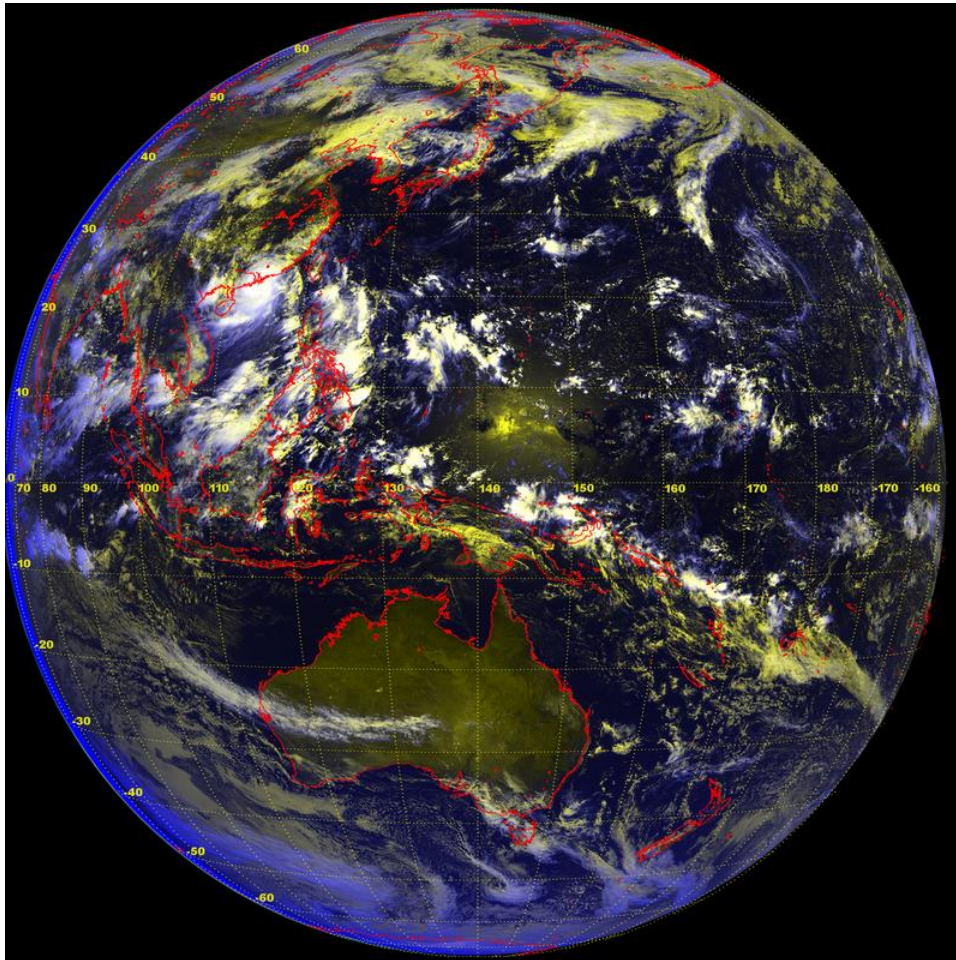
**Radars** can detect **Rain**,  
but have **Limited Coverage**



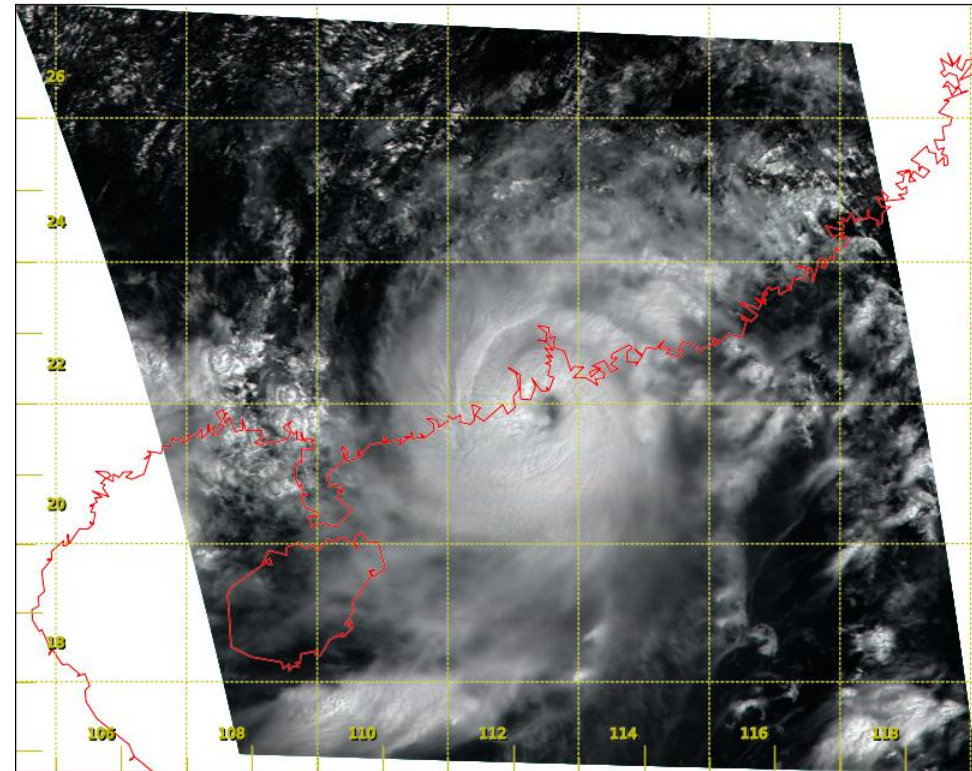
**Satellites** have **Wide Coverage**, but  
can only see **Cloud**, Not Rain



# Third Generation Satellite: Himawari-8



Full disc: once every 10 mins



Rapid-scan: once every 2.5 mins

# Spectral Information from Himawari-8

16 Bands of AHI (Advanced Himawari Imager)				
MTSAT Channels	Band		Wavelength [ $\mu\text{m}$ ]	Spatial Resolution
VIS	1	V1	0.46	1 km
	2	V2	0.51	1 km
	3	V3	0.64	0.5 km
IR4	4	N1	0.86	1 km
	5	N2	1.6	2 km
	6	N3	2.3	2 km
IR3 (WV)	7	I4	3.9	2 km
	8	WV	6.2	2 km
	9	W2	7.0	2 km
IR1	10	W3	7.3	2 km
	11	MI	8.6	2 km
	12	O3	9.6	2 km
IR2	13	IR	10.4	2 km
	14	L2	11.2	2 km
	15	I2	12.3	2 km
	16	CO	13.3	2 km



RGB band composited

Aerosol  
Water cloud and Ice cloud  
Size of the cloud droplet  
Fog, Hot spot (Forest fire)

Water vapor

SO<sub>2</sub> (Sulfur dioxide)  
O<sub>3</sub> (Ozone)

Atmospheric Windows

CO<sub>2</sub> (Carbon dioxide)

Extracted from "[Introduction to Himawari-8](#)", JMA

# Satellite vs Radar

	Radar (e.g. NEXRAD)	Satellite (e.g. Himawari-8)
Temporal Resolution	4/5/6/10 minutes	10 minutes (full disc) 2.5 minutes (target & Japan)
Spatial Resolution	250 m (range increment) 1/0.5° (azimuth increment)	0.5 km (B3/Red) 1.0 km (B1, B2, B4) 2.0 km (others)
Range	256 km (Effectively Useful) 512 km (Limited Use)	Almost half the Globe
2D / 3D?	Basically 3D (except the cone above the highest beam)	Mostly 2D (top down)
Correlation with precipitation	Better	Not as good

# What If?

- We have a field with
  - Data like Radars
  - Coverage like Satellites



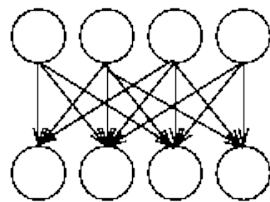
# Multi-layer perceptron artificial neural network (MLPANN)

- Features of MLPANN implemented in HKO:

Neural Network Architecture	Deep neural networks
Training Algorithm	Backpropagation
Learning Strategy	Supervised learning

Supervised learning

Observations (inputs)

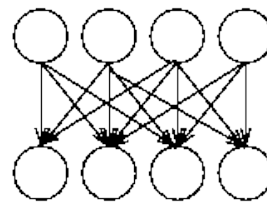


Observations (outputs)

(a)

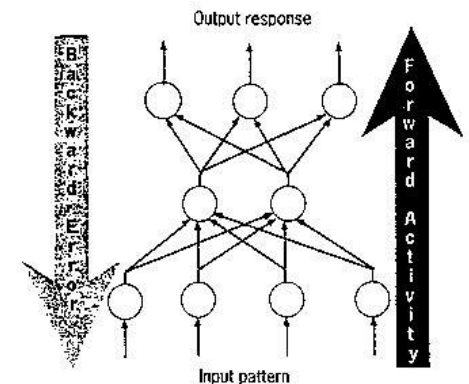
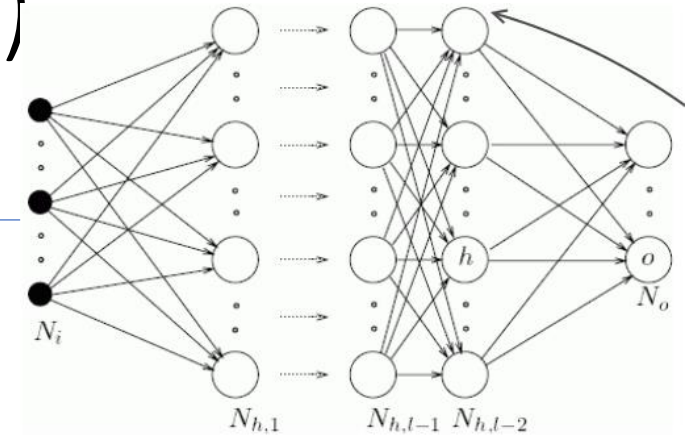
Unsupervised learning

Latent variables



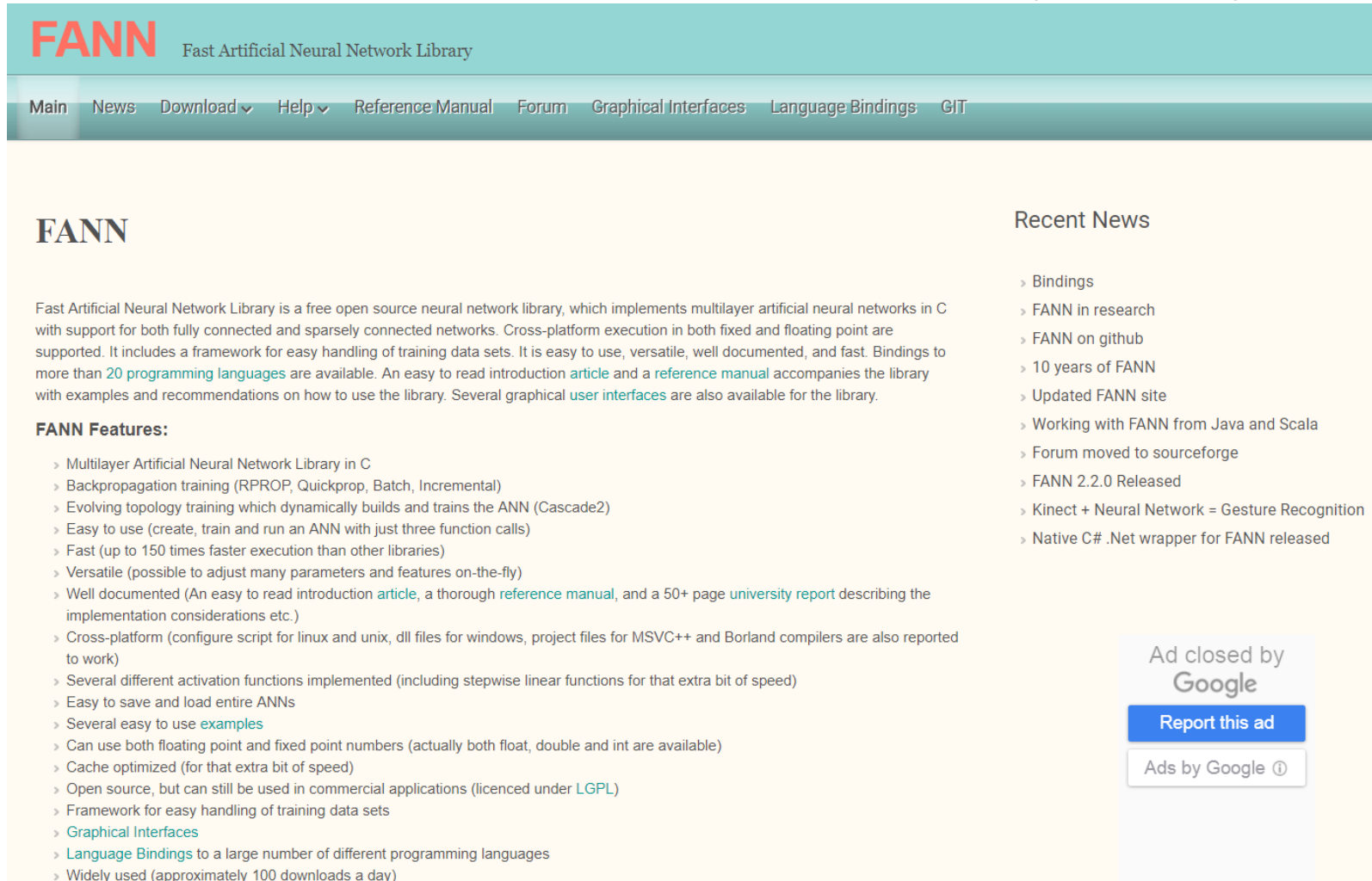
Observations

(b)



A backpropagation network trains with a two-step procedure. The activity from the input pattern flows forward through the network, and the error signal flows backward to adjust the weights.

# Use of fast artificial neural network (fann) library



**FANN** Fast Artificial Neural Network Library

Main News Download Help Reference Manual Forum Graphical Interfaces Language Bindings GIT

## FANN

Fast Artificial Neural Network Library is a free open source neural network library, which implements multilayer artificial neural networks in C with support for both fully connected and sparsely connected networks. Cross-platform execution in both fixed and floating point are supported. It includes a framework for easy handling of training data sets. It is easy to use, versatile, well documented, and fast. Bindings to more than [20 programming languages](#) are available. An easy to read introduction [article](#) and a [reference manual](#) accompanies the library with examples and recommendations on how to use the library. Several graphical [user interfaces](#) are also available for the library.

**FANN Features:**

- › Multilayer Artificial Neural Network Library in C
- › Backpropagation training (RPROP, Quickprop, Batch, Incremental)
- › Evolving topology training which dynamically builds and trains the ANN (Cascade2)
- › Easy to use (create, train and run an ANN with just three function calls)
- › Fast (up to 150 times faster execution than other libraries)
- › Versatile (possible to adjust many parameters and features on-the-fly)
- › Well documented (An easy to read introduction [article](#), a thorough [reference manual](#), and a 50+ page [university report](#) describing the implementation considerations etc.)
- › Cross-platform (configure script for linux and unix, dll files for windows, project files for MSVC++ and Borland compilers are also reported to work)
- › Several different activation functions implemented (including stepwise linear functions for that extra bit of speed)
- › Easy to save and load entire ANNs
- › Several easy to use [examples](#)
- › Can use both floating point and fixed point numbers (actually both float, double and int are available)
- › Cache optimized (for that extra bit of speed)
- › Open source, but can still be used in commercial applications (licenced under [LGPL](#))
- › Framework for easy handling of training data sets
- › [Graphical Interfaces](#)
- › [Language Bindings](#) to a large number of different programming languages
- › Widely used (approximately 100 downloads a day)

## Recent News

- › Bindings
- › FANN in research
- › FANN on github
- › 10 years of FANN
- › Updated FANN site
- › Working with FANN from Java and Scala
- › Forum moved to sourceforge
- › FANN 2.2.0 Released
- › Kinect + Neural Network = Gesture Recognition
- › Native C# .Net wrapper for FANN released

Ad closed by Google

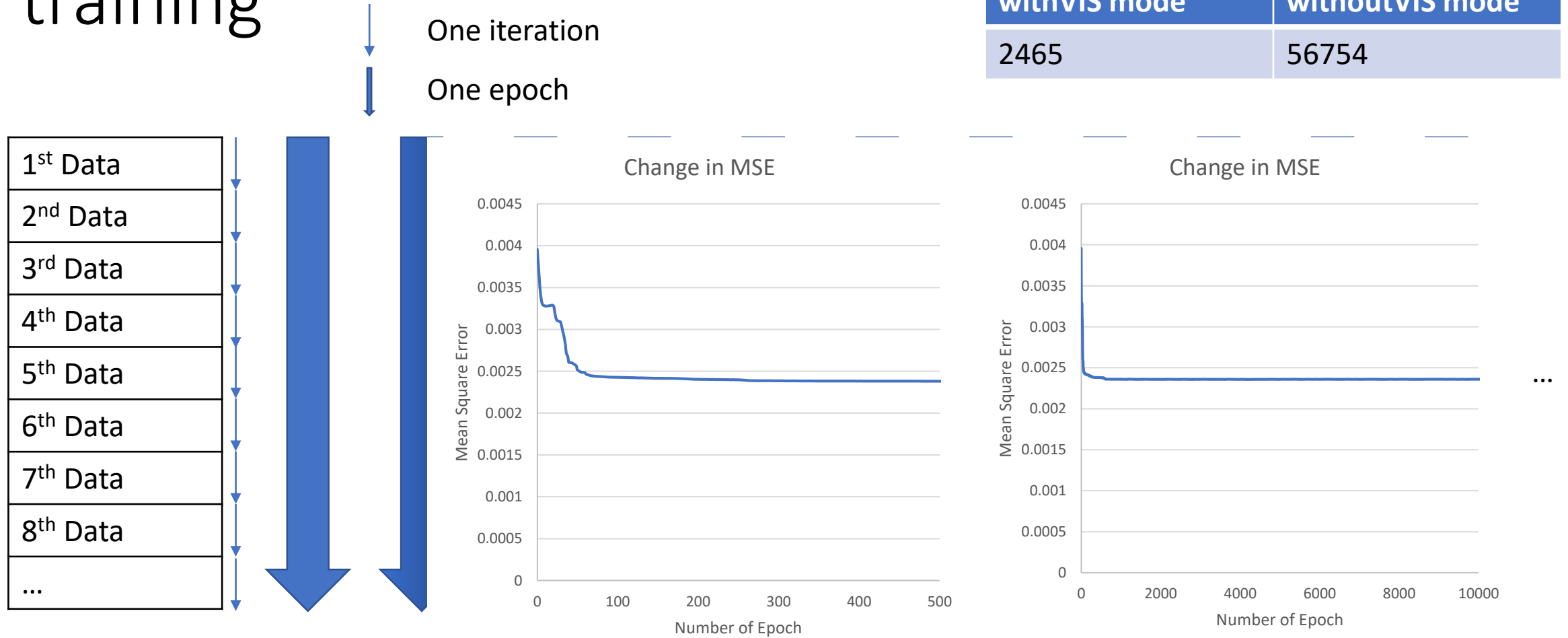
Report this ad

Ads by Google ⓘ

<http://leenissen.dk/fann/wp/>

# Optimize performance through repeat training

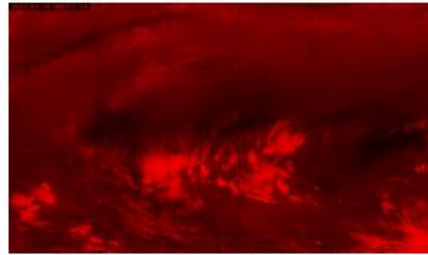
withVIS mode	withoutVIS mode
2465	56754



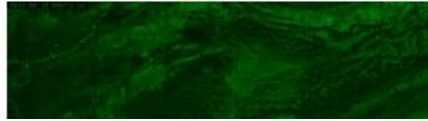
Training Data Set

# neural network training

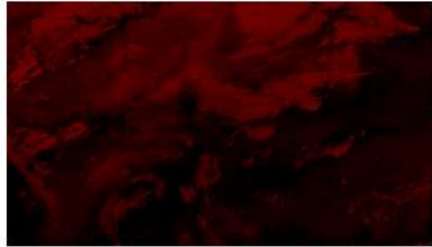
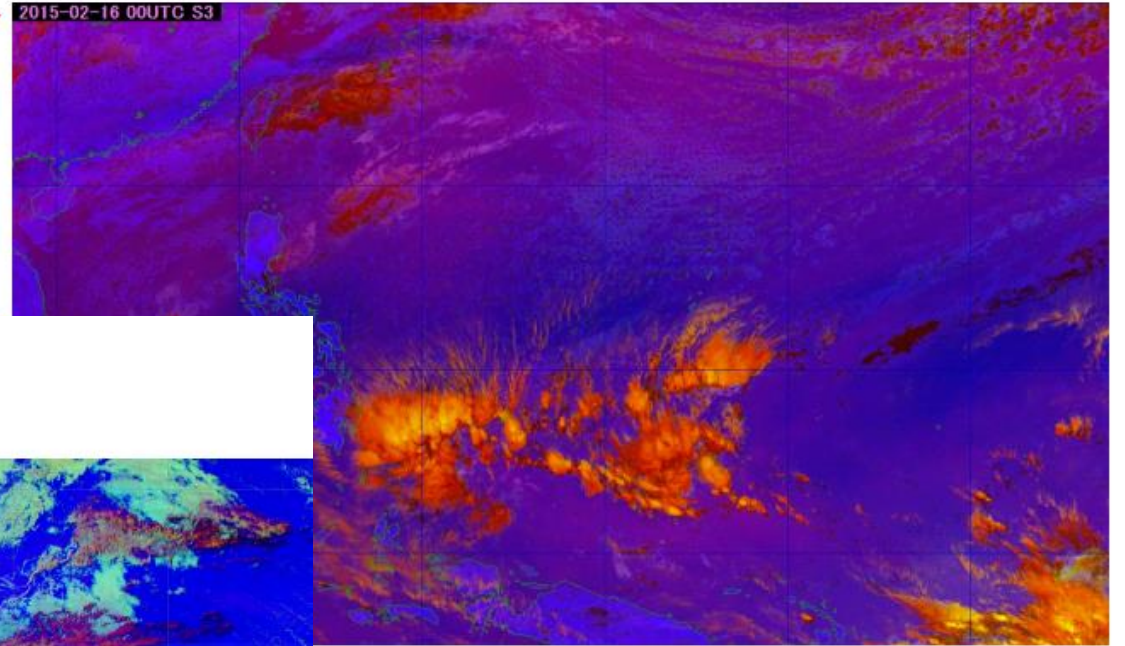
- Training Period:
  - July 2015 - June 2016 (12 months)
- Demarcation for Training & Verification
  - Even Hours for Training
  - Odd Hours for Verification



R : B08(WV6.2) - B10(W3 7.3)  
Range : -35 ~ 5 [K] Gamma : 1.0



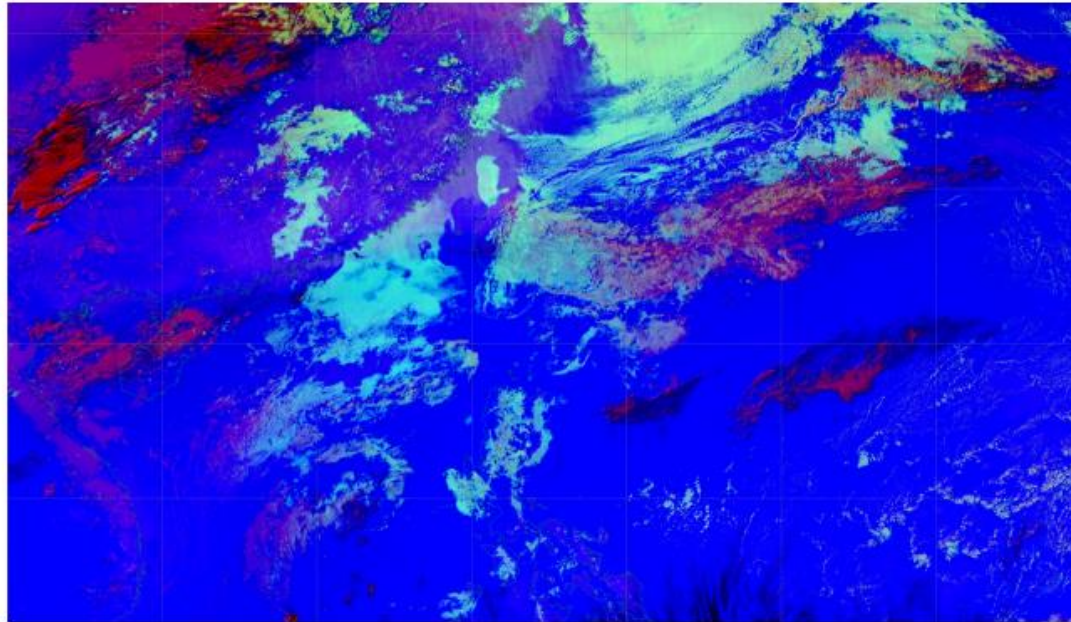
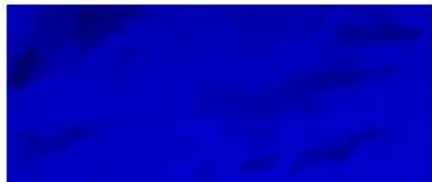
2015-02-16 00UTC S3



R : B15(I2 12.3) - B13(IR 10.4)  
Range : -4 ~ 2 [K] Gamma : 1.0



G : B13(IR 10.4) - B07(I4 3.9)  
Range : 0 ~ 10 [K] Gamma : 1.0

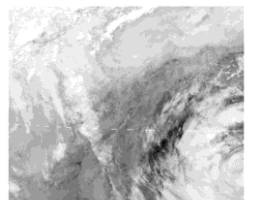
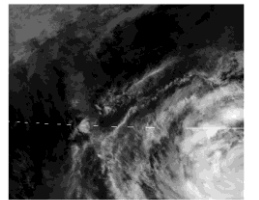
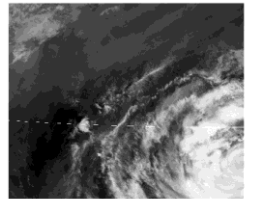
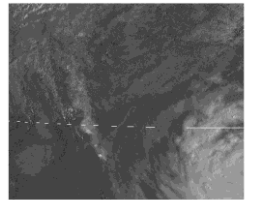
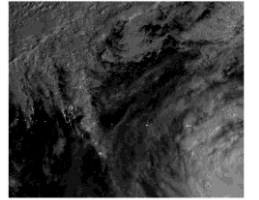


2015-02-16 10UTC



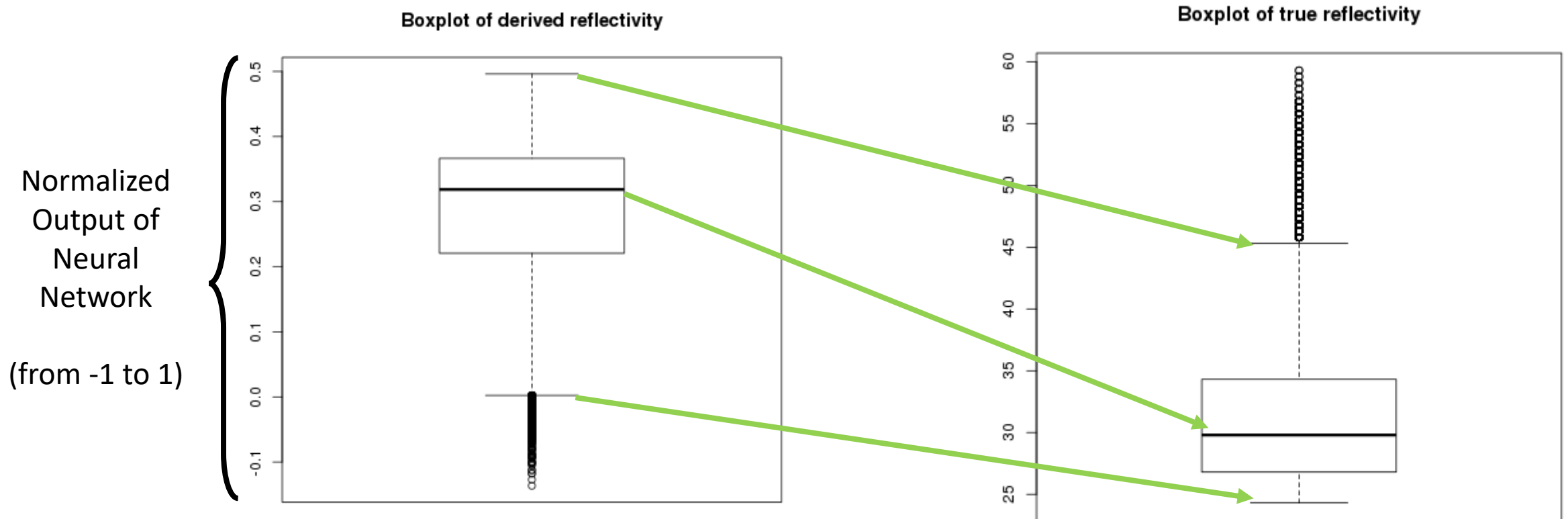
# Inputs

Input	Description
B03 (VIS0.64)	VIS0.64. Reflectivity of B03 depends on optical thickness. Thick cloud are displayed in white.
B05 (NIR1.6) - B04 (N1 0.86)	Difference between NIR1.6 and N1 0.86. B04 has high reflectivity for snow/ice covered area and clouds, sea surface looks dark. Reflection characteristic of B05 depends on the phase and size of cloud particles. On difference image, thick clouds with large ice particles are displayed in black (dark), low clouds and land/sea surface look whitish (bright)
B08 (WV6.2) - B10 (W3 7.3)	Difference between WV6.2 and W3 7.3. On difference image, thick clouds with high cloud are displayed in white, low clouds and thin Ci are indistinct.
B13 (IR10.4)	IR10.4, Atmospheric window band, available for 24 hours. High-level clouds and developed Cbs appear in white, mid-level cloud appear in bright gray.
B13 (IR10.4) - B15 (I2 12.3)	Difference between IR 10.4 and I2 12.3. Absorption by water vapor of B15 is slightly larger than that of B13. On difference image, thick cloud and low-level cloud contribute to rather grey color, high-level cloud contributes bright color.
Equinox day diff.	Indication of different Season
Minimal Brightness Temperature of IR1 in Pixel Rings	Distinguish Spatial Separation of Target Pixel and Cloud Top
Brightness Temperature Standard Deviation of IR1 in Pixel Rings	Local texture, assisting in classifying cloud type
Average Brightness Temperature of IR1 in Pixel Rings	Indicate Convective Strength of Surrounding Area

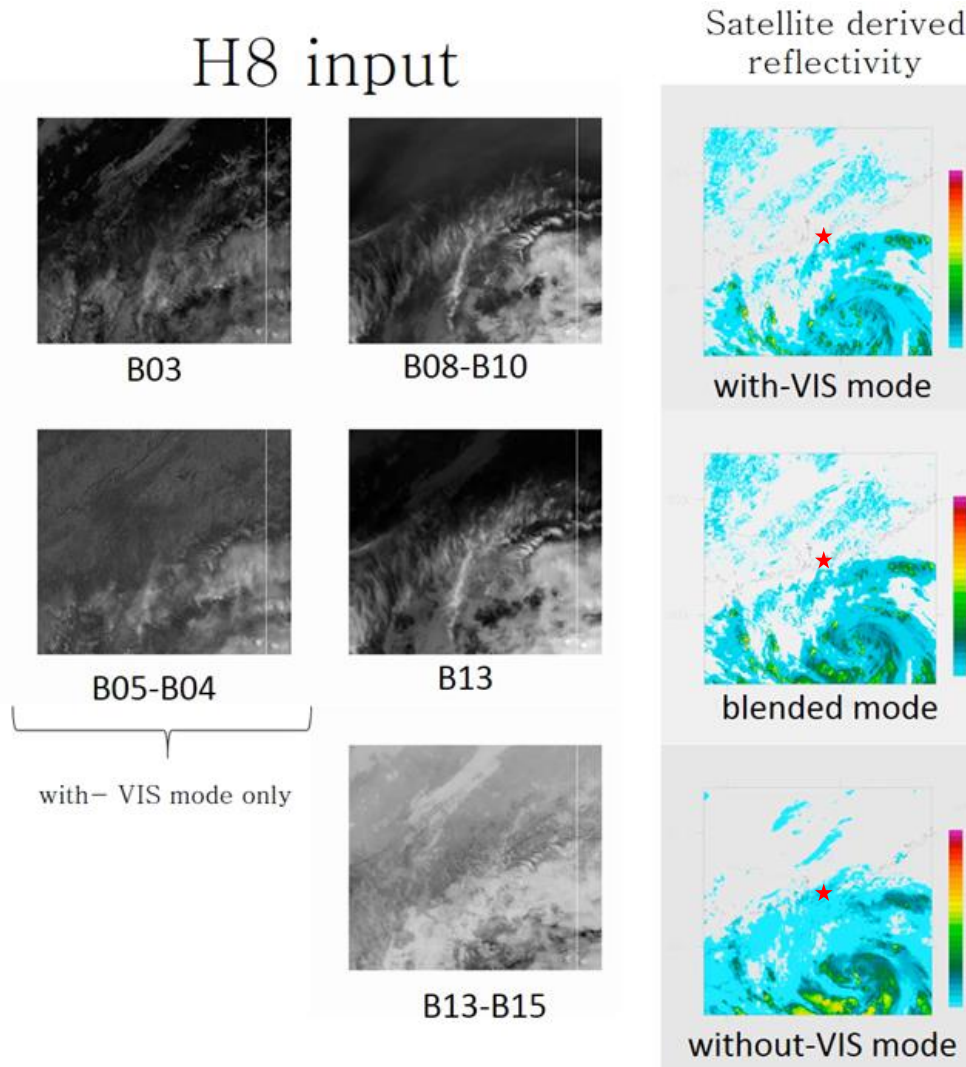




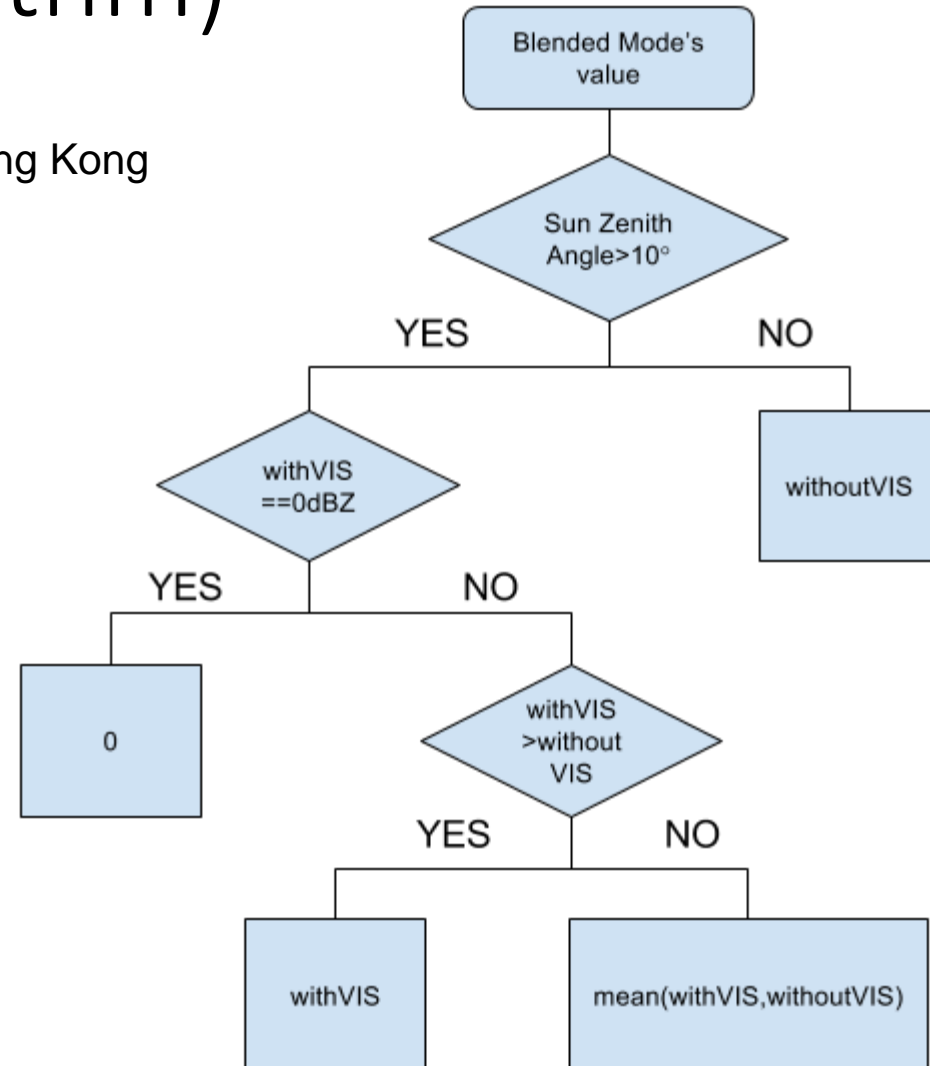
# Frequency Matching



# with-VIS mode, without-VIS mode, blended mode (composite algorithm)



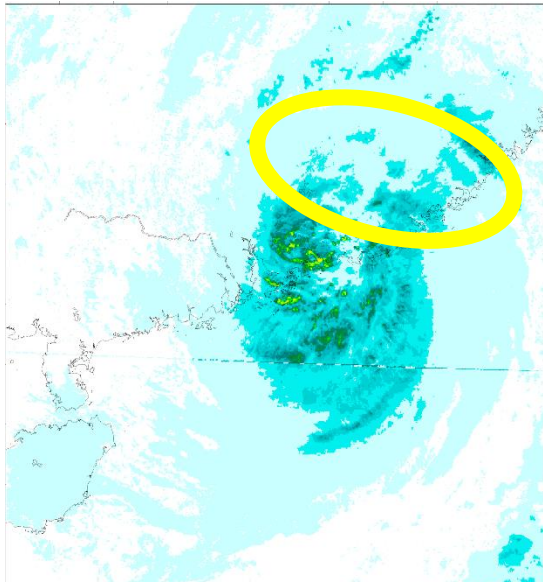
★ Hong Kong



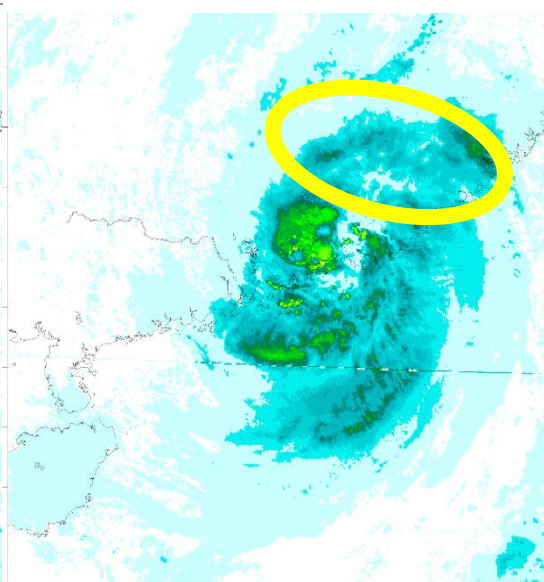


# Compare with Available Satellite Product

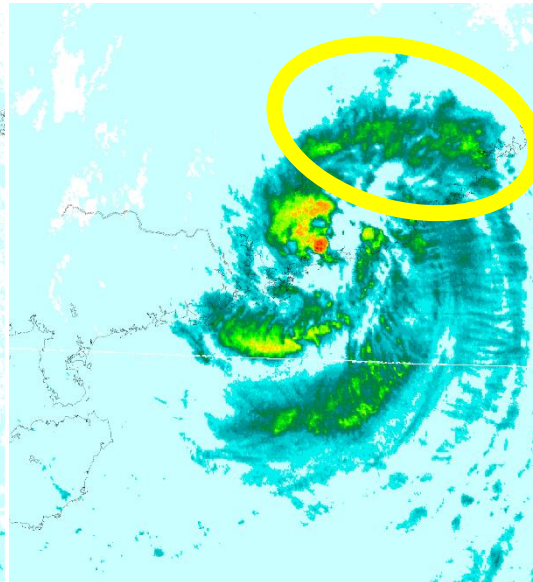
With-VIS Mode



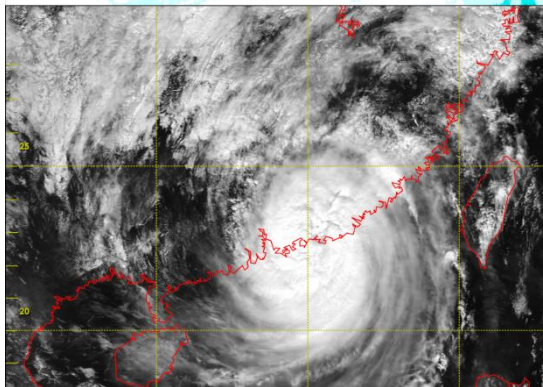
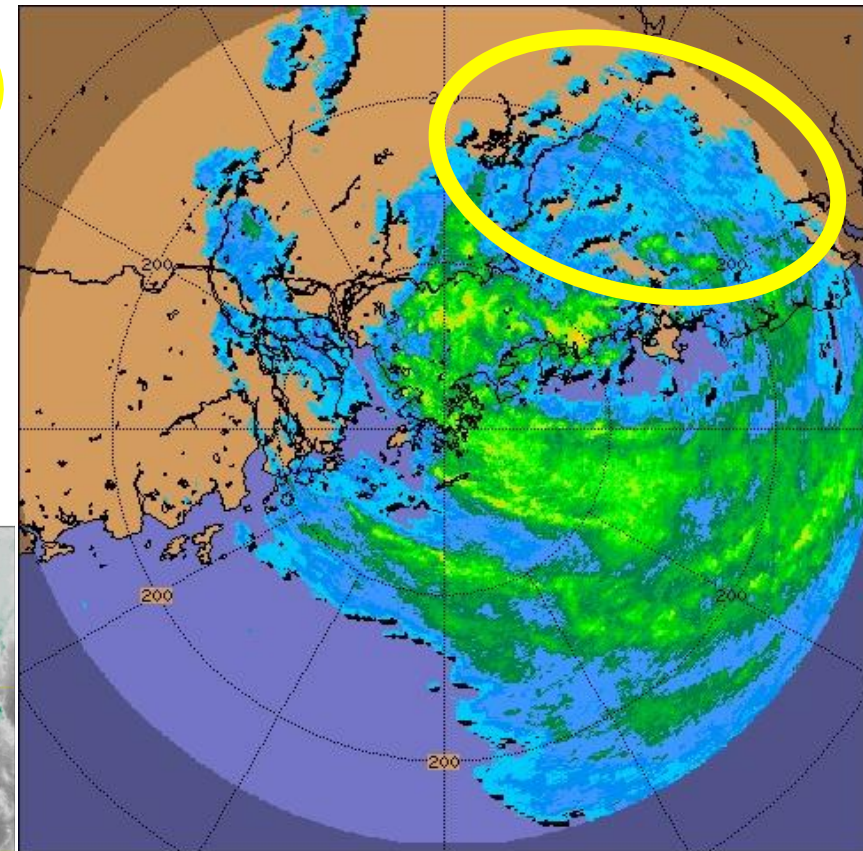
Blend Mode



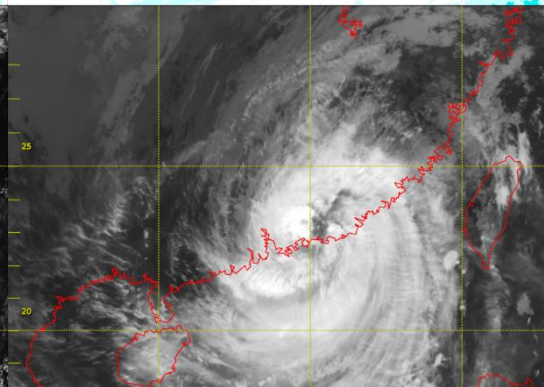
Without-VIS Mode



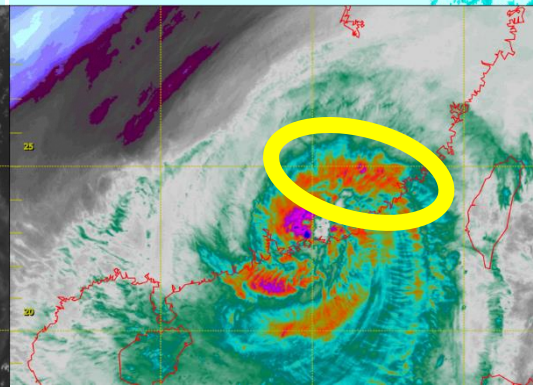
2016 Typhoon Haima  
20161021 UTC0400



Visible



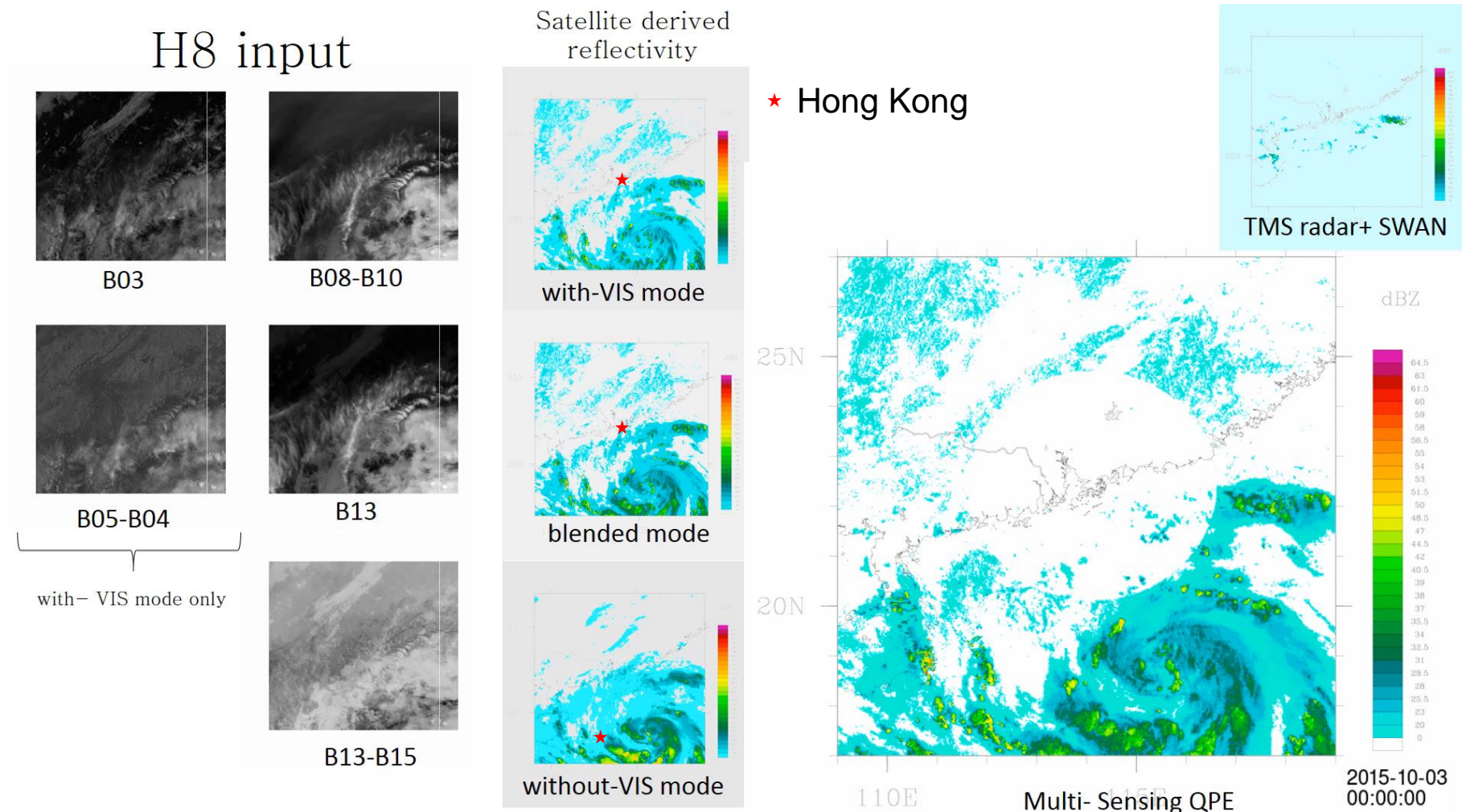
IR1



WV



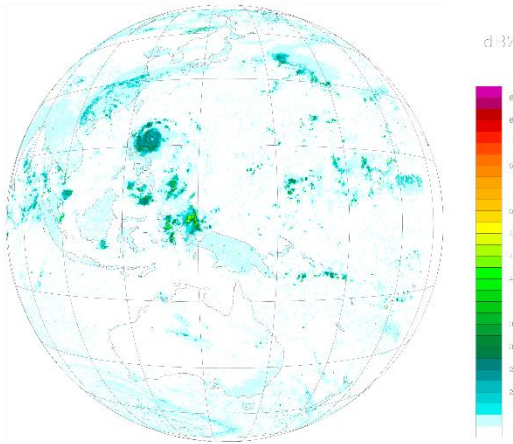
# Demonstration of application- MSQ



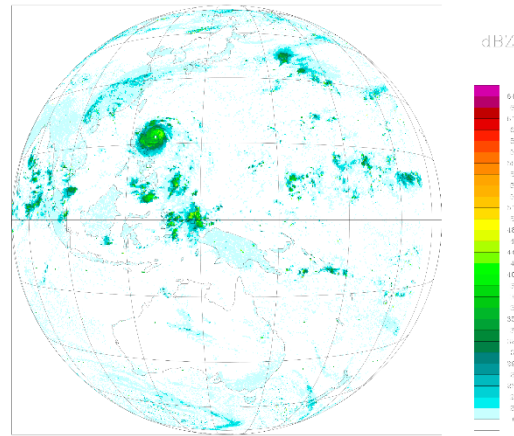
2015 Typhoon Mujigae

# Demonstration of application- Reflectivity map in different projection/ scales

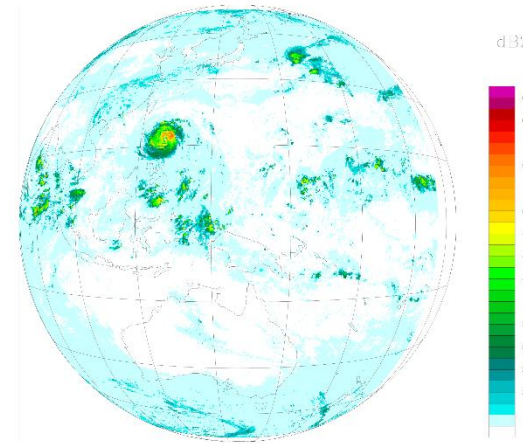
20161019\_0300\_fulldisk\_DAY



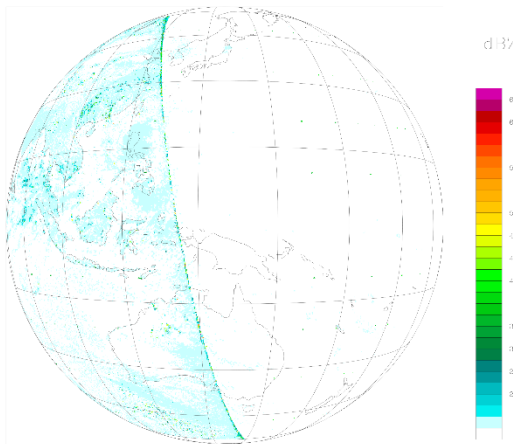
20161019\_0300\_fulldisk\_BLENDED



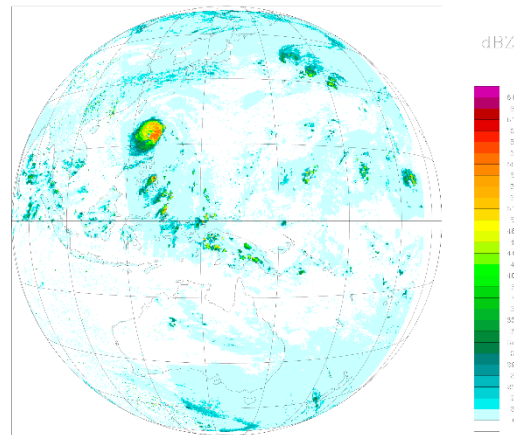
20161019\_0300\_fulldisk\_NIGHT



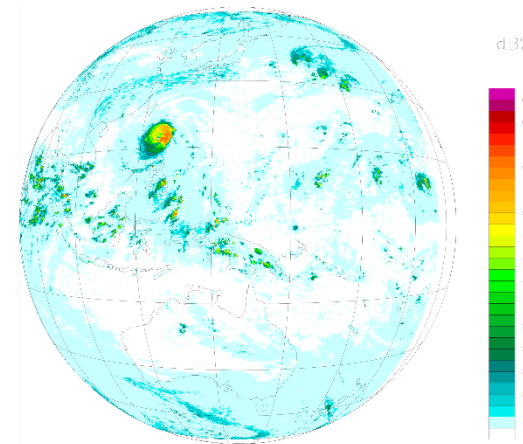
20161019\_0900\_fulldisk\_DAY



20161019\_0900\_fulldisk\_BLENDED

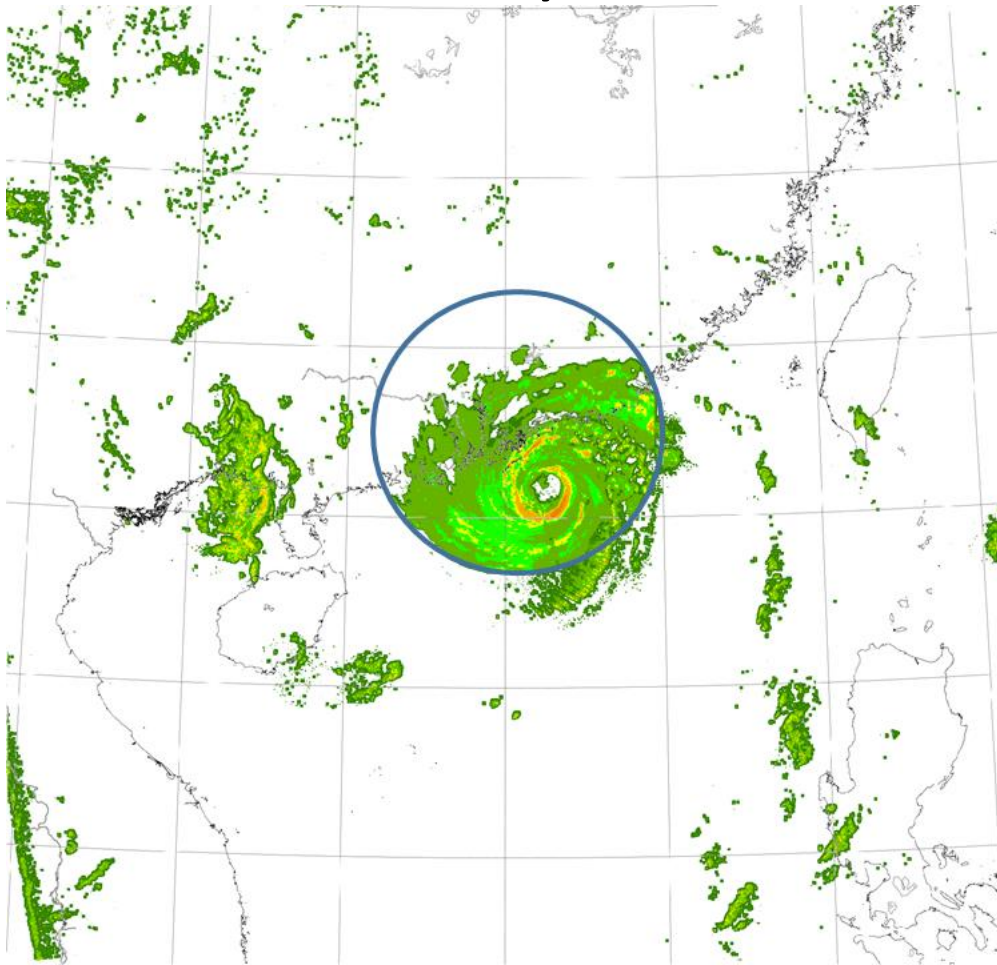


20161019\_0900\_fulldisk\_NIGHT

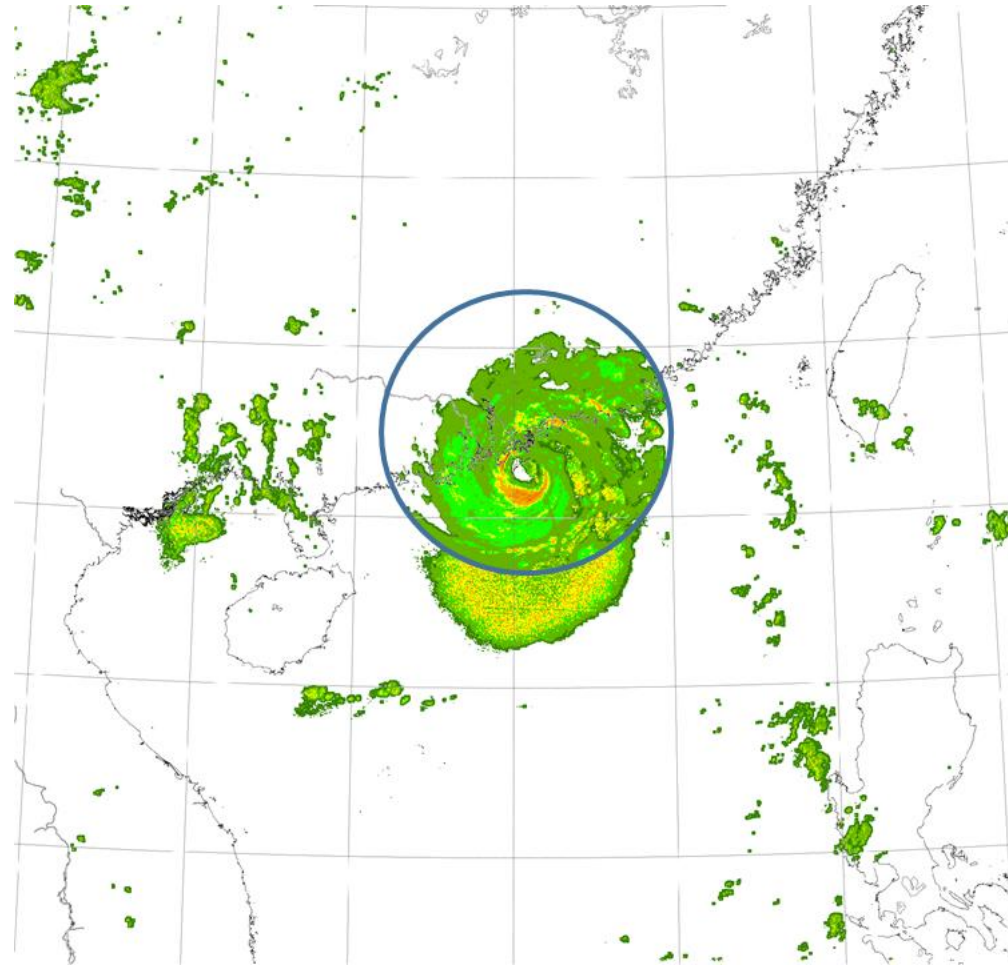




# Blending Synthetic Reflectivity with Real Reflectivity



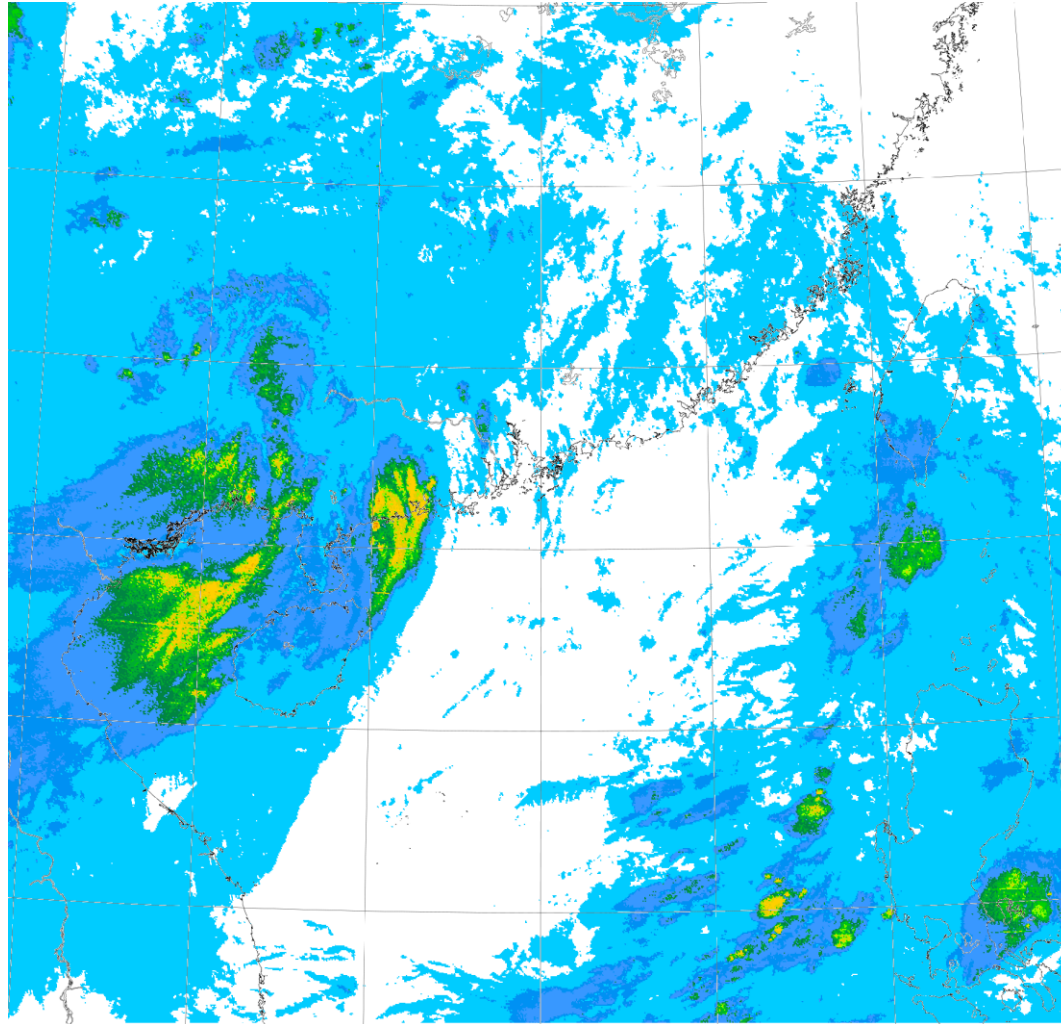
2017/08/23 07:00 HKT



2017/08/23 09:00 HKT

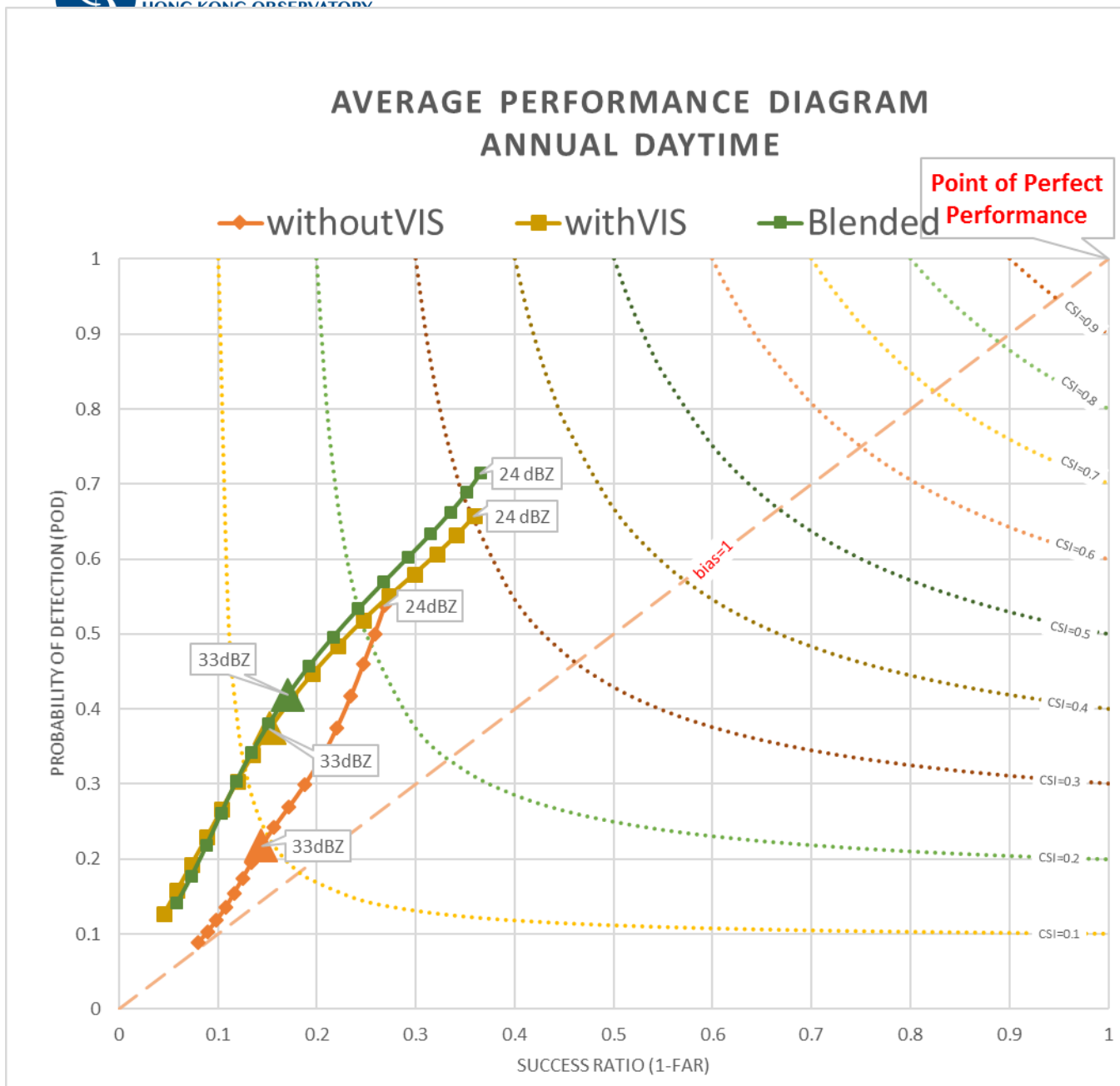


# “Reflectivity” of Super Typhoon Hato (1722)



# Verification

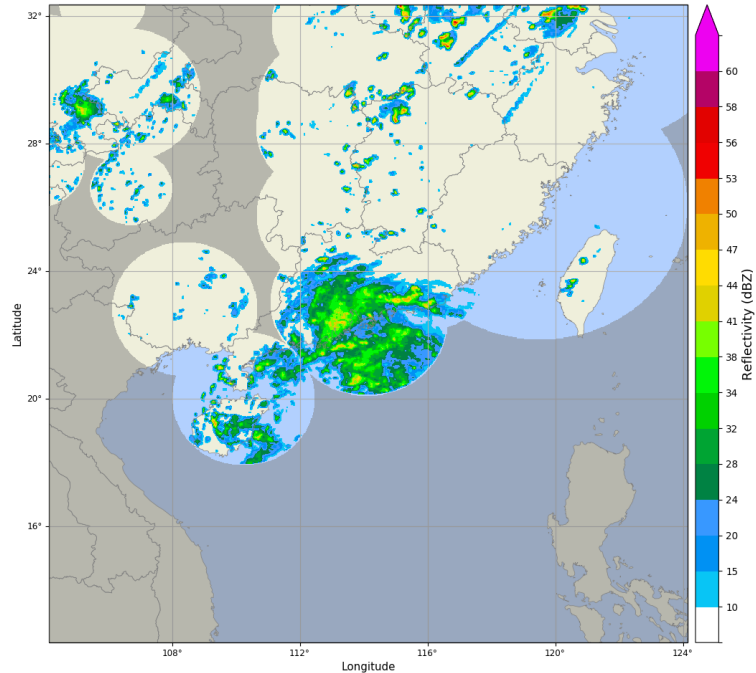
- Period: July 2015- June 2016 (12 months)
  - Odd Hours
  - On-the-hour
  - Daytime
- Results
  - POD at 24 dBZ > 70%
  - POD at 33 dBZ > 40%



# Simulate Radar Observations from Satellite Data using Neural Network

## Radar Mosaic Only

Reflectivity 2019-07-31 Based @ 15:00H  
CMA Radar / SC Valid @ 15:06H



## With Simulated Reflectivity

Reflectivity 2019-07-31 Based @ 15:00H  
Multi-Sensor / SC Valid @ 15:06H

