

# Precipitation verification

## Contributions from: CMA, DWD, ECMWF, JMA, MF, NCEP, RHMC, UKMO

# **QPF** recommandations

Reference note: Suggested methods for the verification of precipitation forecasts against high resolution limited area observations (JWGFVR, Nov 2013)

Primary temporal resolution (6h) Thresholds (1, 2, 5, 10, 20, 50 mm per 6h) Stratification (lead time, season, region, observed intensity threshold, ...) Comparison against station observation or gridded observations Aggregate verification scores should be accompanied by 95% confidence intervals

For deterministic model forecasts:

Equitable threat score (ETS) Extremal dependency index (EDI) Fractions skill score (FSS) (where gridded observations are available) (Additional diagnostics: HR, FAR, FBI)

For probabilistic forecasts interpreted from ensembles, or by statistical post-processing Brier skill score BSS (and components) ROC area Continuous ranked probability skill score (CRPSS)

Verification country	Models	Region	Sample size	Data processing	Accumulation period	Scores	Cinfidence intervals
СМА	Global deterministic	China	National network		24	ETS, FBI Also maps	
DWD	Global deterministic	Germany	National network (1000 stations)	Gridded	24	ETS, FBI	
ECMWF	Global deterministic and ensemble	Tropics, Extra- tropics, USA	GTS obs, NEXRAD		24	CRPSS, SEEPS, ETS, FBI FSS	
JMA	Global deterministic and 5km MSM	Japan	National network (1300 stations)	Gridded Station obs	6h	ETS, EDI, FBI	Yes
NCEP	Global deterministic GFS, NAM, CONUSNEST	USA			24h, 3h	ETS, FBI, EDI,	
Russia	HR models deterministic and ensemble	Sochi region	13 stations	Station obs	3h	EDI, PSS, Base rate BSS, ROCA	
UKMO	UM global (oper & e-suite)	Tropics, Global	GTS obs		6h, 24h	SEEPS	
Meteo-France	Global deterministic MF models (deterministic and ensemble)	France	National network (4000 stations)	Gridded Combined radar- gauge analysis	24h, 6h	FBI, POD, FAR, BSS, FSS	Yes

# **QPF Skill Scores over China**

NWPC/CMA 2015.03.20

# **QPF Skill Scores over China**

May 2014 – Sept 2014(warm season)

Models included in analysis:

- •NCEP GFS
- •CMC Global
- •ECMWF
- •JMA
- •UK

•CMA Global

## **Observation station distribution**



## Mean QPF Skill Scores over China

May 2014 - Sep 2014



# Mean QPF Skill Scores over China

#### May 2014 - Sep 2014



# Distribution of mean precipitation rates(mm/day) over China

(2014.5.04-2014.9.30)

Mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)

ECMWF 24h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)



ECMWF 48h forecast mean precipitation rates(mm/day) over China (2014.5.4–2014.9.30))

ECMWF 72h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30))



Mean precipitation rates(mm/day) over China (2013.6.01-2013.9.30)

CMC 24h forecast mean precipitation rates(mm/day) over China (2013.6.1-2013.9.30)



CMC 1/2/3day forecast mean precipitation rate distibution

CMC 48h forecast mean precipitation rates(mm/day) over China (2013.6.1-2013.9.30))

CMA 72h forecast mean precipitation rates(mm/day) over China (2013.6.1-2013.9.30))



Mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)

UK 24h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)



Mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)

JMA 24h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)



#### JMA 1/2/3day forecast mean precipitation rate distibution

JMA 48h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30))

JMA 72h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30))



Mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)

NCEP 24h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)



Mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)

T639 24h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30)



T639 48h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30))

T639 72h forecast mean precipitation rates(mm/day) over China (2014.5.4-2014.9.30))





# Precipitation verification at DWD

30<sup>th</sup> WGNE meeting, 23-26 March 2015, NCEP, Washington

U. Damrath (DWD)



1000 stations; controlled data are available around 10 days after measurement.

Verification method:

Aggregation to a 1° x 1° grid: forecasts in the model grid, observations as so called *superobservations* in each model grid. We are (again) sorry for (still) not entirly considering Laurie Wilson 's Verification proposal, due to several migrations of the verification system during the last year:

- •libdwd → GRIB-API (ECMWF)
- •GRIB1 → GRIB2
- •database requesting layer (csobank  $\rightarrow$  sky)
- •Cray XC30 → Cray XC30/40
- $\rightarrow$  this unfortunately caused a loss of data for summer and autumn 2014









Comparison between two verification methods: area mean and nearest neighbour













# ECMWF

## CRPSS for 24-h precipitation - day 1



## CRPSS for 24-h precipitation - day 3



### SEEPS – other centres



**Extra-tropics** 

Tropics

## ETS and frequency bias, extra-tropics



## Fractions Skill Score (NEXRAD data)



# WGNE QPF VERIFICATION over Japan Dec2013 – Nov2014

JMA WGNE-30
## Recommendations

- Include high resolution models and ensemble.
  - High resolution => included JMA MSM (5km)
  - Ensemble => not yet.
- 6-hour precipitation accumulation (Observed precipitation thresholds 1, 2, 5, 10, 20, 50mm)
- Verified with station observations.

- Verified with all stations and averaged over the whole of Japan.

- With 95% confidence intervals.
  - Estimated by bootstrap method.

# Data and Verification Method

- rainfall, temperature, wind and sunshine duration O

Manned stations:

rainfall
snowfall

- Verification grid
  - 1) 80km x 80km
  - 2) All stations over Japan.
- Converting method
  - 1) Simple average or interpolation.
  - 2) Using the nearest grid point.
- Reference data (Observations)
  - Amount of precipitation observed by raingauges
- Verified data (QPFs data)
  - Please see next page.
- Error bars
  - Estimated by bootstrap method with 95% confidence intervals.
- Verification method
  - Equitable Threat Score
  - Extremal Dependency Index
  - Bias Score (optional)

- -About 1300 stations over Japan
- -average distance (among stations): 17km

## Data Specifications (~ Nov. 2014)

NWP center	horizontal resolution of verified data (degree)	forecast time (hour)	Deep convection scheme	Large scale cloud scheme	converting method in 80km verif.
BoM	0.5625 X 0.375	6,12,18,,144	Gregory and Rowntree (1990)	Wilson and Ballard (1999)	Average
CMC	1.00 X 1.00	6,12,18 ,,120	Kain and Fritsch (1990), (1993)	Sundqvist et al. (1989), Pudykiewicz et al. (1992)	Interpolate
DWD	0.25 X 0.25	6,12,18,,174	Tiedtke (1989)	Kessler-type	Average
ECMWF	0.50 X 0.50	6,12,18,,72	Tiedtke (1989)	Tiedtke (1993)	Average
NCEP	1.00 X 1.00	6,12,18,,84	Pan and Wu (1994)	Zhao and Carr (1997)	Interpolate
UKMO	0.35 X 0.23 0.23 X 0.16	6,12,18,,96	Gregory and Rowntree (1990)	PC2: Wilson et al. (2008) Wilson and Ballard (1999)	Average
JMA	0.25 X 0.25(GSM)	6,12,18,,84	Arakawa and Schubert (1974)	Smith (1990)	Average
	5km(MSM)	6,12,18,,36	Kain and Fritsch (1990), Kain (2004)	Cloud microphysics (Ikawa and Saito 1991)	Average
observation	Corresponding to 17km X 17km	-	_	-	Average

## Verification with 80x80km grid.

• Verified with 80x80km grid by simple average or interpolation (see below).

NWP center	horizontal resolution of verified data (degree)	converting method in 80km verif.	
BoM	0.5625 X 0.375	Average	
CMC	1.00 X 1.00	Interpolate	
DWD	0.25 X 0.25	Average	
ECMWF	0.50 X 0.50	Average	
NCEP	1.00 X 1.00	Interpolate	
UKMO	0.35 X 0.23 0.23 X 0.16	Average	
ΙΜΑ	0.25 X 0.25(GSM)	Average	
JIVIA	5km(MSM)	Average	
observation	Corresponding to 17km X 17km	Average	





## Verification with station observations.

 Verified with all stations and averaged over the whole of Japan

NW <del>P</del> U	simzentahresonea pestifigrialar	oint of the forecast GRIBs.
center	(degree)	Manned stations:
BoM	0.5625 X 0.375	Unmanned stations: - rainfall, temperature, wind and sunshine duration o - rainfall
CMC	1.00 X 1.00	- snowfall +
DWD	0.25 X 0.25	
ECMWF	0.50 X 0.50	S States
NCEP	1.00 X 1.00	
UKMO	0.35 X 0.23	
	0.23 X 0.16	
JMA	0.25 X 0.25(GSM)	
	5km(MSM)	
observation	Corresponding to	Str.
	17km X 17km	a state and a state of the stat
	43	
		54 °





# Verification with all stations

- Winter
  - High resolution model (5km MSM) performs better.
  - UKMO and JMA perform better.
- Summer
  - High resolution model (5km MSM) performs better.
  - ECMWF performs better.
  - BI of 5mm/6h averaged for all stations are larger than that for 80km ave.
  - Large bias are predicted at 15JST in DWD,ECMWF and UKMO. At 21JST in BoM and JMA, and at 03JST in CMC.









# Intercomparison over France of QPF from WGNE members models

- Observations : Rain gauges
- RR24: 24 hours accumulated rainfall
- J+1
- Bias, FAR, POD and HSS
- •Thresholds 1mm and 10 mm

# **QPF** verification

 Average the data and the models QPF at 0.5°x0.5°



**Climatological state network** 

## ~4000 raingauges giving 24 hours accumulated rain every day





#### **Frequency Bias**

### % Observation

15

20





### Lead time **54 UTC**

#### **Probability of Detection**



Precipitation threshold (mm/day)



### **WINTER 2014**

Heidke Skill Score against persistence

### Lead time 54 UTC



Precipitation threshold (mm/day)

#### **Frequential Bias**

#### % Observation

10

15

UKMO

ECMW

JMA

NCEP

02/10/2014

20

25



### **Summer** 2014

### Lead time **54 UTC**

**False Alarm Ratio** 



**Probability of Detection** 



### **Summer 2014**

Heidke Skill Score against persistence

### Lead time 54 UTC



Precipitation threshold (mm/day)

# QPF verification over France from operational models against hight resolution observations

- Gridded observations : combined radar-gauge analyses (ANTILOPE)
- RR24
- Verification grid 0.025°
- Year 2014
- Bias, BSS\_NO
- Thresholds 0.2, 0.5, 1, 2, 10, 20 and 50 mm

# Combined radar-gauge analyses ANTILOPE against rain gauges stations

• A new version V2 available since July 2013



### **RR24 Year 2014 Frequency Bias**





# QPF verification over France from the operational HR model AROME using neighbourhood method

- RR6: 6 hours accumulated rainfall
- recommandation : FSS
- Météo-France choice : BSS

### **6 hours accumulated rainfall**



data and models QPF are averaged on 0.0025°squares

#### **Climatological state network**

~1800 raingauges giving hourly accumulated rain

Red circles of radius 50 km give exemples of neighbourhood

### FSS versus BSS\_NO

**BS** or **FBS** = 
$$\frac{1}{N_{days}} \sum_{j=1}^{N_{days}} \frac{1}{N_{obs}} \sum_{o=1}^{N_{obs}} \left( \boldsymbol{v}_{forecast} \left( o, j \right) - \boldsymbol{v}_{obs} \left( o, j \right) \right)^{2}$$



$$= \frac{1}{N_{days}} \sum_{j=1}^{N_{days}} \frac{1}{N_{obs}} \left[ \sum_{o=1}^{N_{obs}} \nu_{forecast}(o, j)^2 + \sum_{o=1}^{N_{obs}} \nu_{obs}(o, j)^2 \right]$$





### 6 hours accumulated rainfall BSS\_NO



### 6 hours accumulated rainfall BSS\_NO



### **Probabilistic forecasts from ensembles**

### • RR6 verification of PEARP

✓ for thresholds 0.2 1 2 et 4mm/6h // raingauges ;

 $\checkmark$  0.5° grid

 $\checkmark$  Verification using the nearest grid point of the observation

- RR24 verification for thresholds 1 5 10 20mm /24h
- Scores :
  - $\checkmark\,$  BSS and components
  - ✓ Reliability diagram
  - ✓ Roc diagram and roc area

## **BSS and components**

PEARP 18 UTC/SYNOP Domain EURAT56 hours accumulated rainfall for threshold 1 mm



# **Reliability diagram**



\_ Fréquence Observée sur la période de vérification\_ Fréquence de l'occurence sur 10 an
## **Roc diagram and roc area**



#### **SUMMER 2014**

- 6 hours accumulated rainfall
- threshold 1 mm
- issu 18 UTC
- validity 18 UTC

### **Roc area : 3 month mean evolution**

## PEARP 18 UTC/SYNOP Domain EURAT56 hours accumulated rainfall for threshold 1 mm



### QPF Verification at NCEP for Deterministic NCEP and International Models

- 24h (12Z-12Z) contingency table-based verifications for all models
- 3-hourly contingency table-based verifications for NCEP operational and parallel models
- 24h fractions skill scores computation for NCEP operational and parallel models. Retrospective FSS for GFS and NAM from 2002.

#### ETS/Bias over ConUS, Jan – Dec 2014, 1 & 2 day fcsts

STAT=FH0 PARAM=APCP/24 FH0UR=24+48 V\_RGN=G211/RFC VYMDH=201401010000-201412312300 CI ALPHR=0.050







GFS,NAM,CMCGLB,CMC,JMA

STAT=FH0 PARAM=APCP/24 FHOUR=24+48 V\_RGN=G211/RFC VYMDH=201401010000-201412312300 CI ALPHR=0.050



STAT=FH0 PARAM=APCP/24 FH0UR=24+48 V\_RGN=G211/RFC VYMDH=2014010100D0-201412312300 CI ALPHA=0.050



GFS, DWD, ECMWF, METFR, UKMO

#### **Extremal Dependence Index over ConUS** Jan – Dec 2014, 1 &2 day fcsts



STAT=FH0 PARAM=APCP/24 FHOUR=24+48 V\_RGN=G211/RFC VYMDH=201401010000-201412312300 CI ALPHA=0.050

GFS,NAM,CMCGLB,CMC,JMA

#### GFS, DWD, ECMWF, METFR, UKMO

#### ConUS-averaged 3-hourly precip, Jan-Dec 2014 GFS/NAM/CONUSNEST

BIHS\_SCORE

T=FH0 PARAM=APCP/D3 V\_RGN=G218/RFC THRSH=0.1 VYMDH=201401010000-2014123123

STAT=FH0 PARAM=APCP/03 V\_RGN=G218/RFC THRSH=0.25 VYMDH=201401010000-201412312300



#### T=FH0 PARAM=APCP/D3 V\_RGN=G218/RFC THRSH=0.1 VYMDH=201401D10D00-2014123123





STAT=FH0 PARAM=APCP/03 V\_RGN=G218/RFC THRSH=0.25 VYMDH=201401010000-201412312300



FORECAST HOUR

#### ConUS-averaged 3-hourly precip, Jan-Dec 2014 GFS/NAM/CONUSNEST vs. analysis



#### GFS, NAM, CONUSNEST 24+48 FSS, Jan-Dec 2014

STAT=FSS PARAM=APCP/24>005.0 FH0UR=24+48 V\_ANL=CCPA V\_RGN=6240/CNS VYMDH=201401010000D-201412312300



STAT=FSS PARAM=APCP/24>025.0 FHOUR=24+48 V\_ANL=CCPA V\_RGN=G240/CNS VYMDH=20140101000D-201412312300



STAT=FSS PARAM=APCP/24>010.0 FHOUR=24+48 V\_ANL=CCPA V\_RGN=G240/CNS VYMDH=201401010000-201412312300



STAT=FSS PARAM=APCP/24>050.0 FHOUR=24+48 V\_ANL=CCPA V\_R6N=6240/CNS VYMDH=201401010000-201412312300

MODEL=GFS MODEL=NAM

SCR

ID N



## EDI, ETS, and PSS were applied for HIW forecast verification during trial competitions (2013) and Olympic Games (2014) in Sochi

Eight deterministic forecast systems and six EPS were involved in the WWRP FDP/RDP FROST-2014. Interrelations of various performance measures have been studied for FROST-2014 forecasts with special attention to the distribution tails.

#### Analyzed systems and periods presented below:

- Two deterministic systems, COSMO-Ru2 (2.2 km) and NMMB (1 km), for 2013: EDI as a tool to estimate the skill of HIW prediction
- Six EPSs, COSMO-S14-EPS,GLAMEPS,ALADIN-LAEF,NMMB-EPS,HarmonEPS,and COSMO-Ru2-EPS, for Olympic Games 2014): ROCA for all EPSs
- **Tool:** The R Project for Statistical Computing



Contact person: Anatoly Muravev muravev2003@mail.ru

#### Deterministic models: PSS, EDI and Base Rate as functions of threshold 3 hr forecasts, COSMO-Ru2 (top) & NMMB (bottom)

<u>Trial period</u>: Jan-Mar 2013 <u>Mountain Cluster of the Sochi</u> <u>2014 Olympics</u>: 10 stations <u>Thresholds</u>: 0 - 4 mm/h, step 0.25 <u>Initial time</u>: all starts, 00,06,12,18 UTC

<u>EDI - red, PSS - blue,</u> <u>Base Rate (p) - black</u>

**#The 0 mm EDI (precip event) is higher for COSMO-Ru2** 

**#The nonzero precip EDI is significantly higher** for NMMB

**#With EDI we can reasonably estimate the skill of rare event forecasts** 



Totally, COSMO-Ru2 is more skillful in predicting the event of precipitation, while NMMB performs better for heavier precipitation and HIW

#### EPS: BSS and ROCA for January 15- March 15, 2014. 13 stations in Sochi2014 mountain cluster, nearest point approach



## Global model precipitation verification

×1024

Score with forecast lead time, April 2012 to February 2015

#### SEEPS skill score from UM Global 6-hour accumulations (6h to 48h) **Diurnal averages** Tropics: red & black Global: blue & green 6h precipitation diurnal average (1 - SEEPS) scores EG UK-GM (Trop) 🗕 UK-GM (Trop) Annual Mean EG UK-GM (Global) 0.6 UK-GM (Global) 0.5 0.4 (1 - SEEPS) 0.3 0.2 0.1 0.0 ₽ 8 Forecast lead time (hours)



SEEPS skill score from UM Global 24-hour precipitation accumulations (day 1 to 6) crown copyright

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Score with forecast lead time, April 2012 to February 2015

- Globally, model has useful skill
- SEEPS shows model has almost 3x skill globally than in the Tropics.
- Latest UM upgrades initial signs of improvement over the Tropics
- Tropics errors are almost constant with forecast lead time

Decomposition into constituent error sources

UK-GM, EG\_UK-GM diurnal average SEEPS decomposition  $S_{vt}$  trial average over dates (20110401 to 20150123) Observed Light Dry Heavy 0.5 0.4 0.3 Dry 0.2 0.1 0.0 0.5 0.4 Forecast 0.3 Light 0 0.1 0.0 0.25 0.20 0.1 Heavy 0.10 0.05 0.00 120 144 144 96 24 48 72 120 24 120 144 24 72 96 48 72 96 Lead time (hours) Lead time (hours) Lead time (hours) UK-GM (Global) UK-GM (Trop) Diagonal Panels observed frequency/2 Model forecast frequency/2 EG UK-GM (Global) EG UK-GM (Trop)

Diurnal Average 2011-2015

24-hour totals

Decomposition into constituent error sources

UK-GM, EG\_UK-GM diurnal average SEEPS decomposition  $S_{vf}$  trial average over dates (20110401 to 20150123)



Diurnal Average 2011-2015

> 6-hour totals

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Decomposition into constituent error sources

- Source contributing most to SEEPS score from 24-h accumulations is the observed dry/forecast light error category.
- Largest fraction of SEEPS score for 6-h accumulations is contributed by observed heavy/forecast light.
- Drop in skill in 24-h scores over Tropics is from observed dry/forecast light and heavy and the observed heavy/ forecast light categories.
- Similar story for the 6-h scores over Tropics, but with the addition of the contribution from the observed heavy/ forecast dry.
- Under-prediction of the number of dry events for both 6-h and 24-h accumulations.
- Over-prediction of the number of light precipitation events for both 6-h and 24-h totals.

Decomposition into constituent error sources

• UM GA6 currently indicating improved frequency bias in number of dry events for both 6-hour and daily totals.

• Dips in skill seen in Northern Hemisphere summer (associated with convection and due to domination of Northern Hemisphere sites to the aggregated total score).

• Missed heavy events are penalised more at longer lead times, and a large source to error score.

# Regional model precipitation verification

×1024

# Regional model precipitation verification

Area of active research

Exploring use of neighbourhood processing for probabilistic prediction

## **MOGREPS-UK** 2.2km ensemble



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## MOGREPS-UK ... with Neighbourhood processing



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## **Conclusions and Perspectives**

More contributions from centres compared with WGNE29

QPF verification of global models with high resolution national observation network is extremely useful:

- results should be ideally available on Web site (password if necessary)
- extend comparison to more models, when possible
- increase forecast data resolution in time (at least 6h) and space

Progressive adoption of suggested methods for the verification of precipitation forecasts against high resolution limited area observations (JWGFVR, Nov 2013):

- should be pursued in each centres,
- generalize the use of confidence intervals on aggregate verification
- still a lot to do for EPS verification