



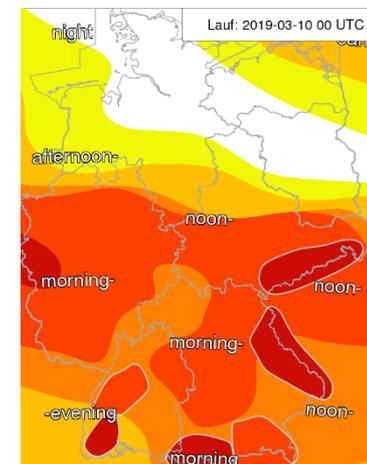
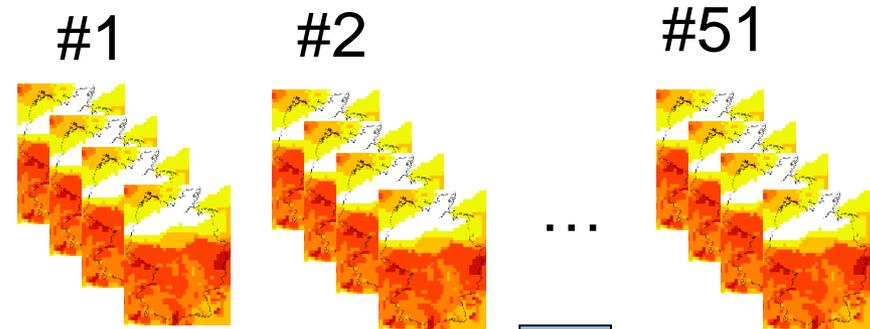
## Ensemble based seven day high impact weather outlook

Guido Schröder, Dirk Heizenreder  
DWD, Germany

## Motivation

- Currently at DWD: Forecasters produce text product for Germany
- In testing: Forecasters produce a graphical product for Germany
- In development: An automated ensemble based product (Daily Model Guidance - DMG)
  - as support for forecasters
  - as potential product for the public

- Challenges: Combine ensemble and temporal information for one day and one warning event in one graph that is ...
  - “pretty”
  - meteorologically meaningful
  - without clutter
  - easy to understand
  - with as much information reduction as possible
- Prerequisite : model forecast good enough for a 7 days high impact weather outlook
- Product that allows for quick comparison
  - of different models
  - of different model runs
  - with observations (in retrospectpective)
  - with forecasters’ warnings (in retrospectpective)



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# 1 Main features of DMG

2 Input data

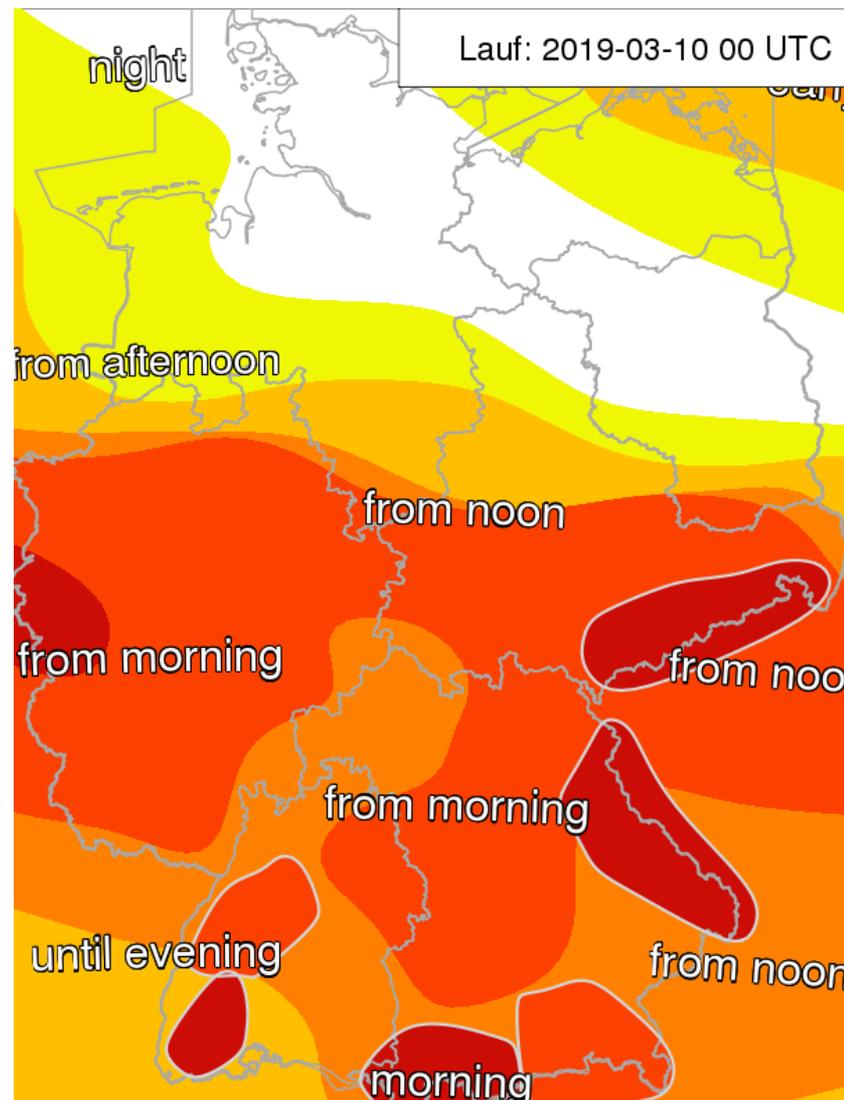
3 Smoothing

4 Uncertainty

5 Example results

# Overview – DMG (Daily Model Guidance)

- Generated from Ensemble data
- For IFS-EPS, ICON-EU-EPS, COSMO-D2-EPS (only 2 days)
- For gusts, persistent rain, snowfall and thunderstorms
- Model data converted to warning categories based on 90<sup>th</sup> percentile (via optimization of Heidke Skill Score)



# Overview – DMG (Daily Model Guidance) Uncertainty

Lauf: 2019-03-09 00 UTC

→  $r = (Q90 - Q10) / Q50$

→ Labelling:

$0.5 < r$       uncertain

$0.3 < r < 0.5$     less certain

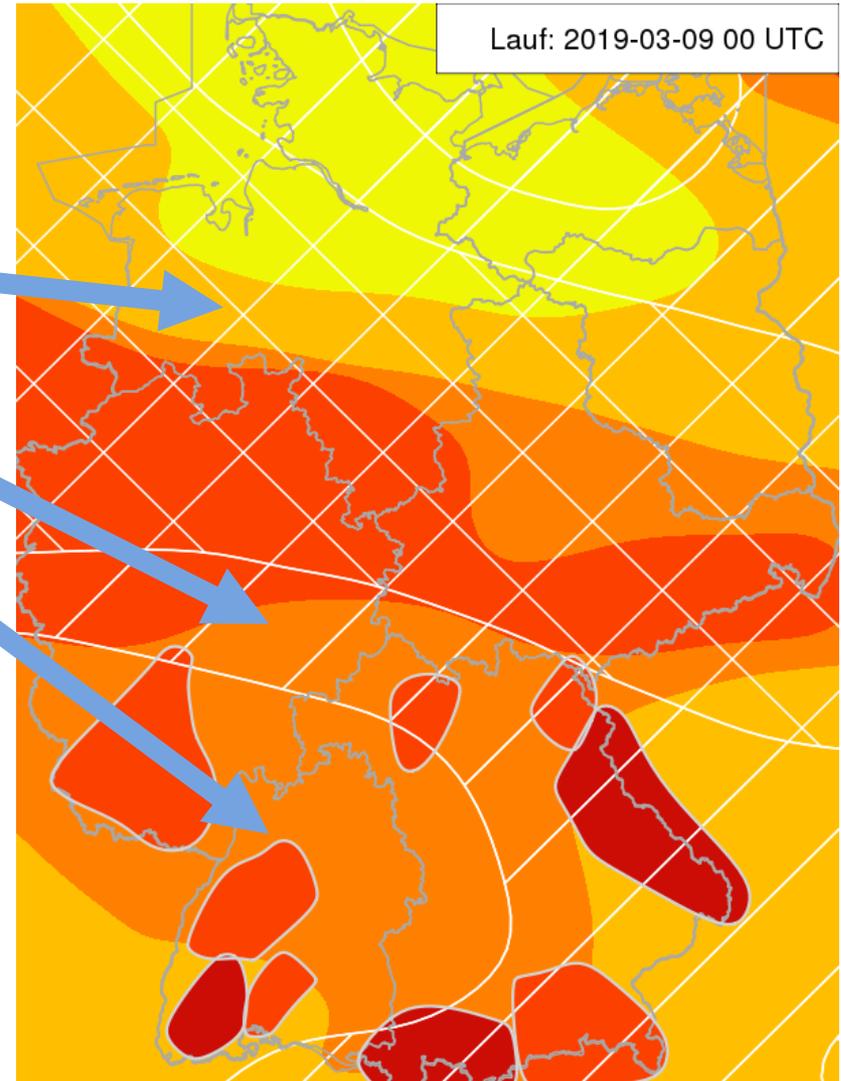
$r < 0.3$       more certain

→ Rain and snow: (Q90-Q10)

$\geq 2$  warning categories – uncertain

1-2 warning categories – less certain

$< 1$  warning category – more certain



# Overview – DMG (Daily Model Guidance)

## Uncertainty

→  $r = (Q90 - Q10) / Q50$  (for wind)

→ Labelling:

$0.5 < r$       uncertain

$0.3 < r < 0.5$     less certain

$r < 0.3$       more certain

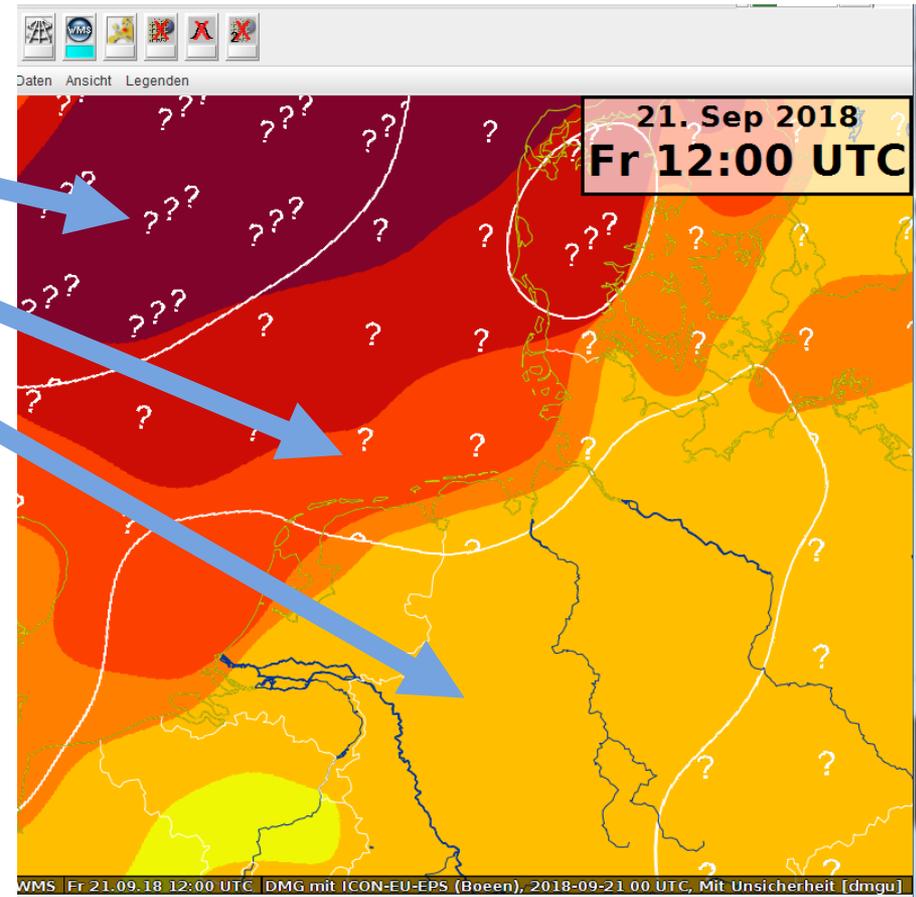
→ Rain and snow: (Q90-Q10)

$\geq 2$  warning categories – uncertain

1-2 warning categories – less certain

$< 1$  warning category – more certain

In meteorological workstation NinJo



- 
- 1 Main features of DMG
  - 2 Input data**
  - 3 Smoothing
  - 4 Uncertainty
  - 5 Example results

# Input data – Correlation with station data

## Verification period Dec '18 – March '19

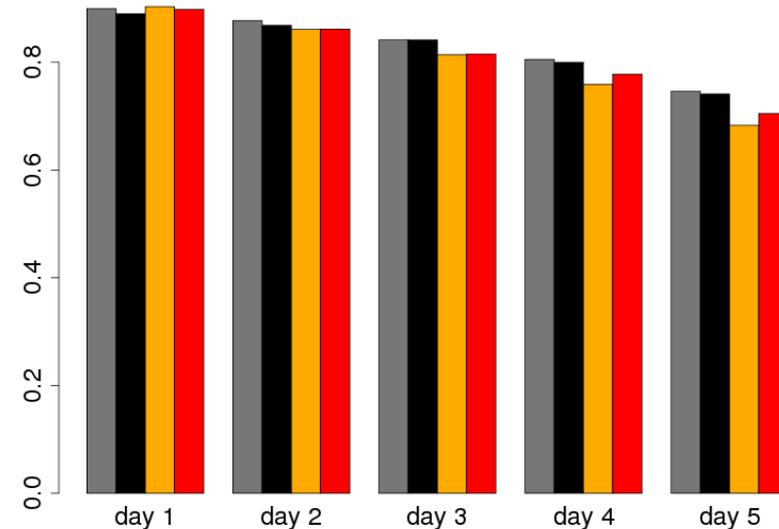
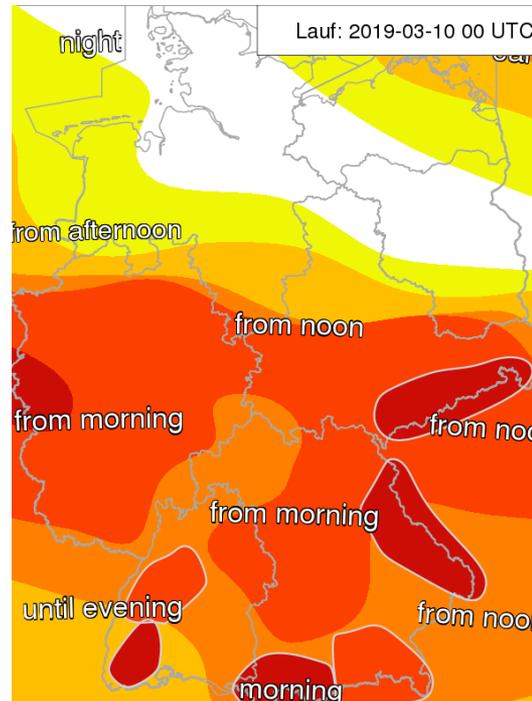
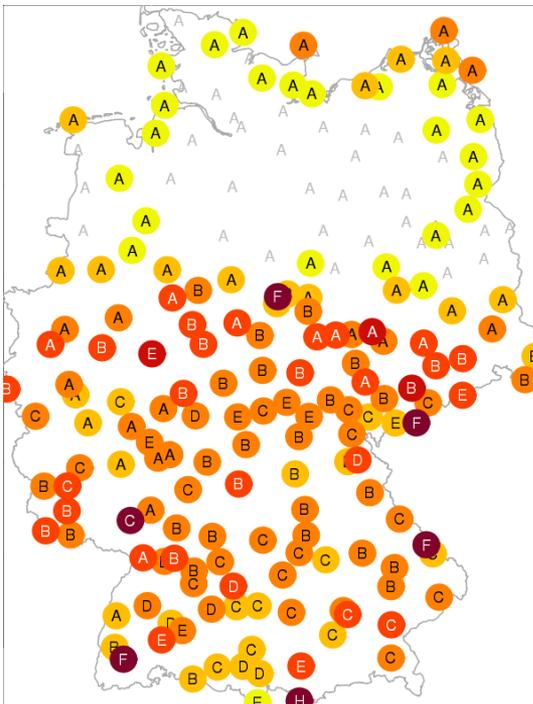
- ➔ Verification with station observations
- ➔ Station data and model data is coarsened to 150km radius and 24h maximum to avoid location/time mismatch

### Gust correlation

Gusts: ~220 stations

Example

FX > 10m/s



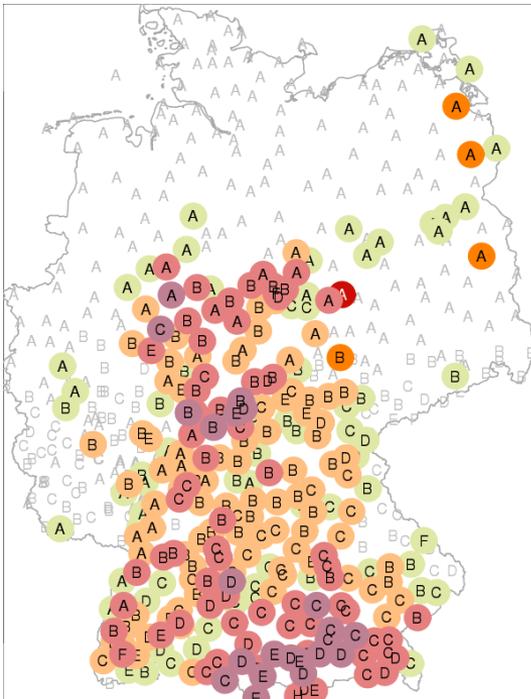
- IFS-EPS-Q50
- IFS-EPS-Q90
- ICON-EU-EPS-Q50
- ICON-EPS-Q90

# Input data – Correlation with station data

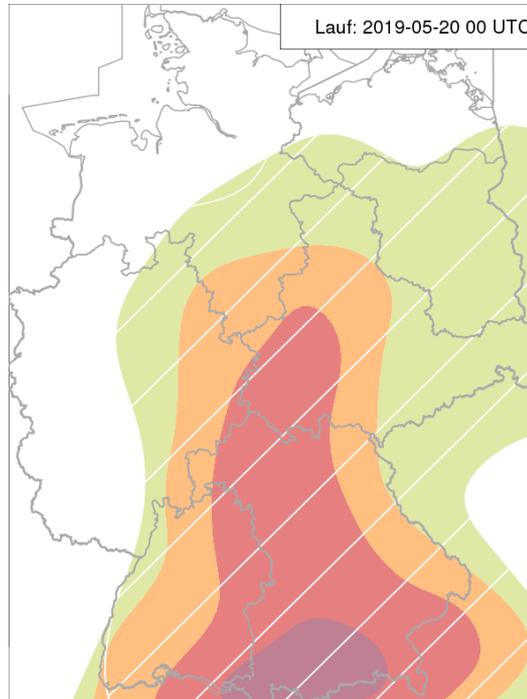
## Verification period Dec '18 – March '19

- Verification with station observations
- Station data and model data is coarsened to 150km radius and 24h sum to avoid location/time mismatch

Rain: ~530 stations

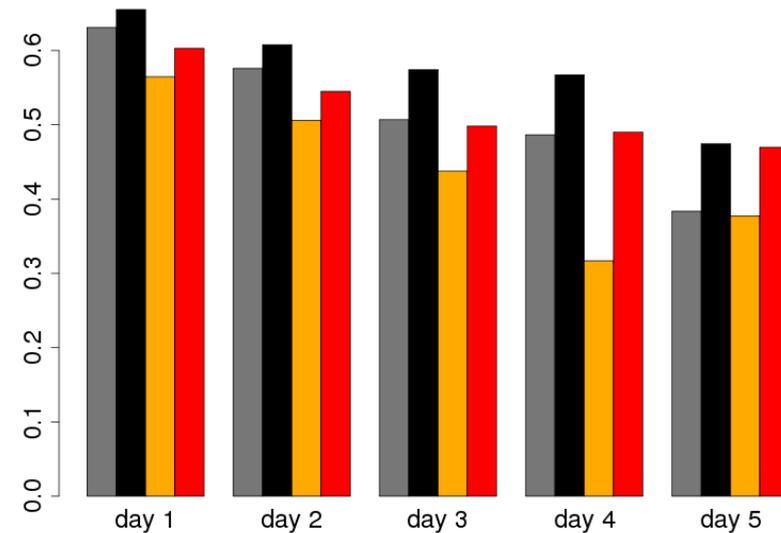


Example



Rain correlation

RR > 5mm, 150km



- IFS-EPS-Q50
- IFS-EPS-Q90
- ICON-EU-EPS-Q50
- ICON-EPS-Q90

# Input data – Correlation with station data

## Verification period Dec '18 – March '19

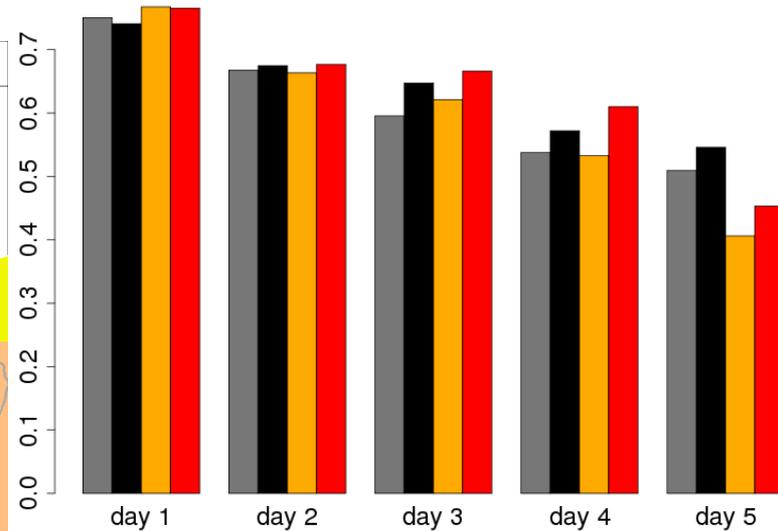
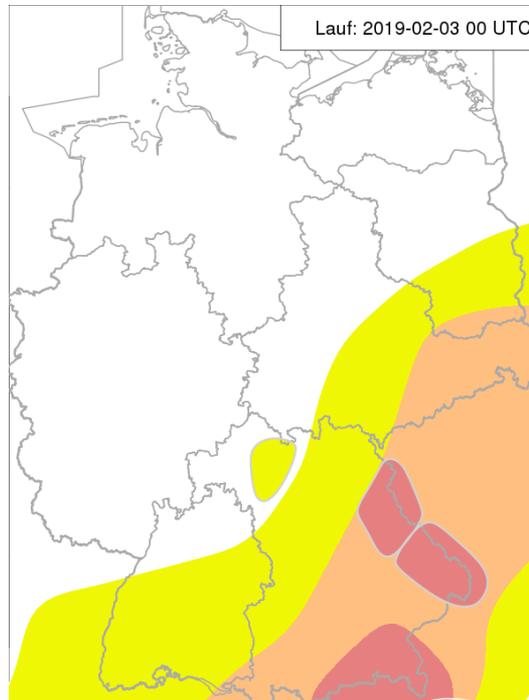
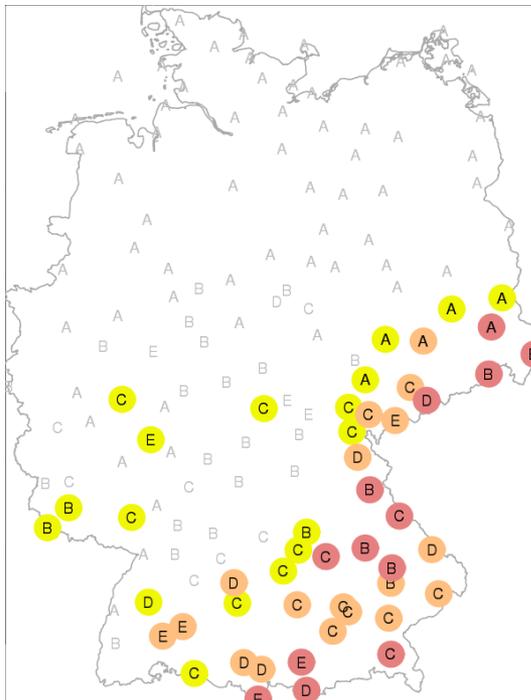
- Verification with station observations
- Station data and model data is coarsened to 150km radius and 24h maximum to avoid location/time mismatch

Snow depth: ~150 stations

Example

### Snowfall Correlation

Snow > 0cm



- IFS-EPS-Q50
- IFS-EPS-Q90
- ICON-EU-EPS-Q50
- ICON-EPS-Q90

# Input data – Correlation with NowCastMIX Analysis

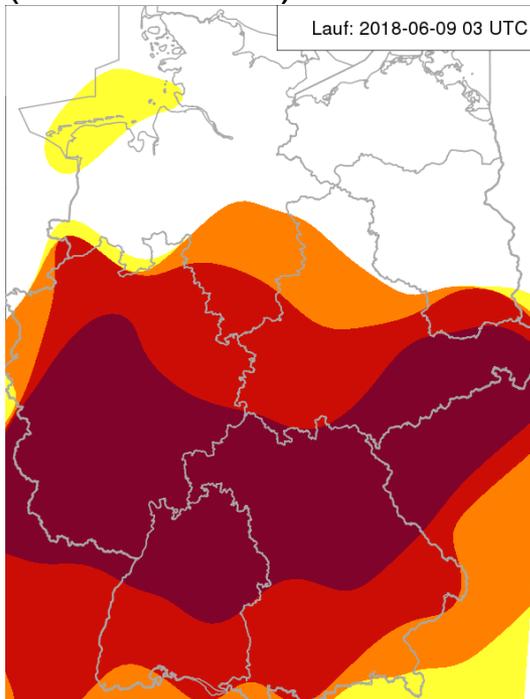
## Verification period 06 June - 31 July 2018

Deutscher Wetterdienst  
Wetter und Klima aus einer Hand

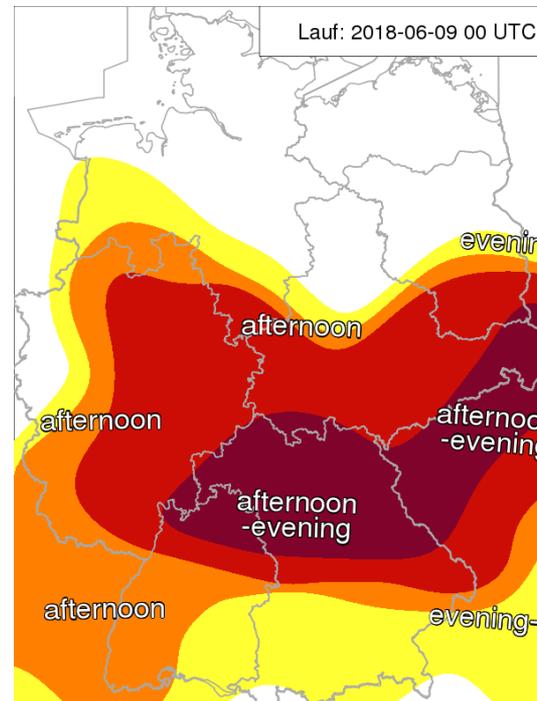


- Analysis data and model data is coarsened to 150km radius and 24h maximum to avoid location/time mismatch
- Lightning flash density from IFS (not available for ICON)

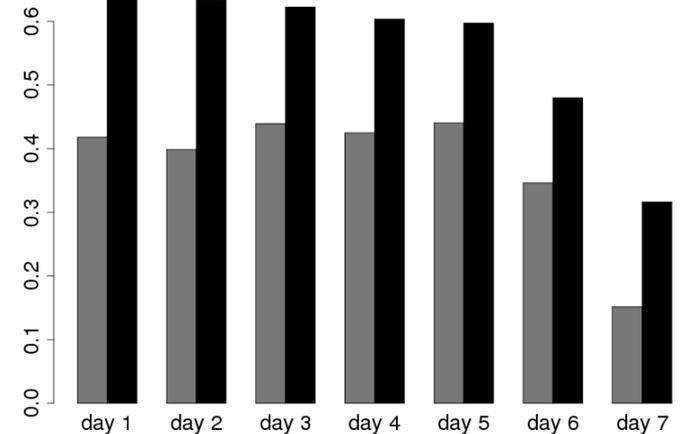
### NowCastMIX Analysis (James et al.)



### Example



### Thunderstorm correlation



■ IFS-EPS-Q50  
■ IFS-EPS-Q90

\* James, P.M. et al. 2018: NowCastMIX: Automatic Integrated Warnings for Severe Convection on Nowcasting Time Scales at the German Weather Service. Wea. Forecasting 33. 1413-1433.

- 1 Main features of DMG
- 2 Input data
- 3 Smoothing**
- 4 Uncertainty
- 5 Example results

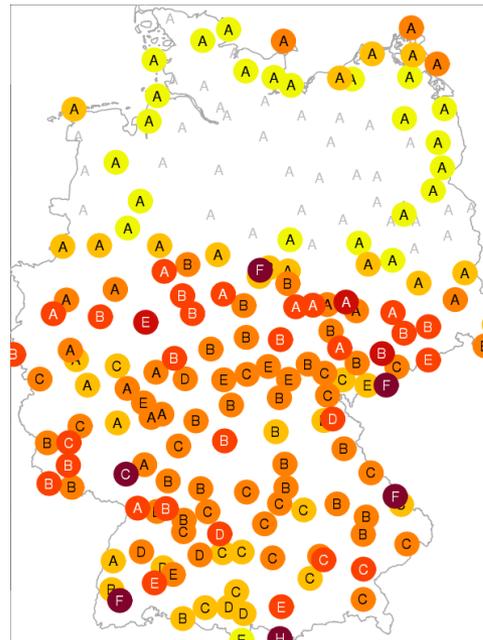


# Why smoothing?

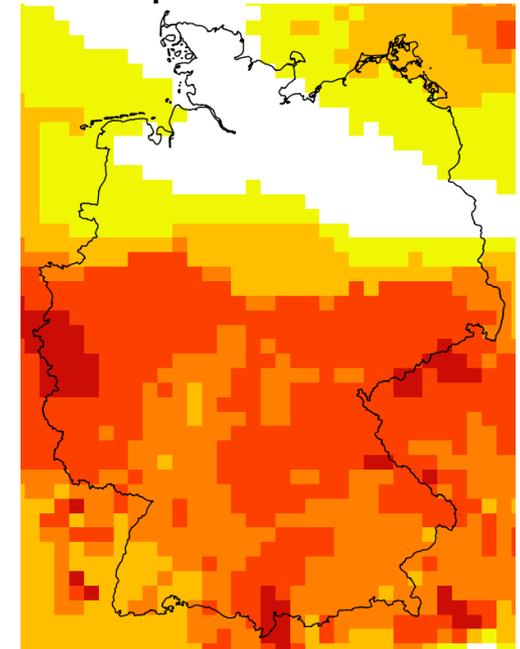


- DMG is a coarse product
- Certain features not significant especially several days ahead
- Noisy data more difficult to interpret for laymen

Gust observations  
10 March 2019



Same day IFS forecast  
90th percentile



## Station height levels:

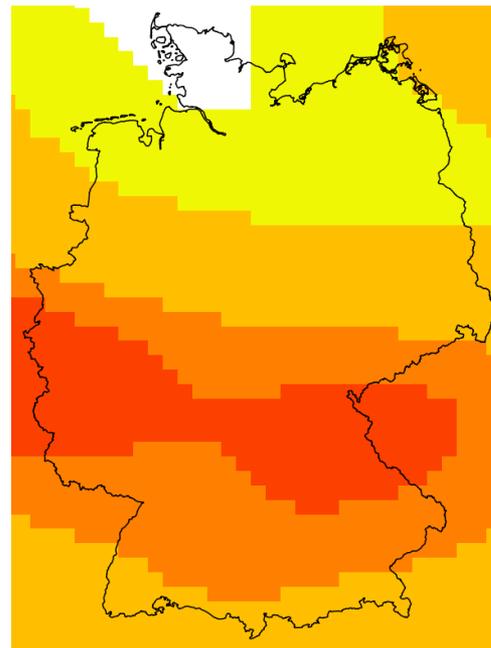
A - > 0m			
B - > 200m	-	□	-
C - > 400m	Bft 7	□	>14m/s
D - > 600m	Bft 8,9	□	>18m/s
E - > 800m	Bft 10	□	>25m/s
F - > 1000m	Bft 11	□	>29m/s
G - > 1500m	Bft 12	□	>33m/s
H - > 2000m	> Bft 12	□	>39m/s



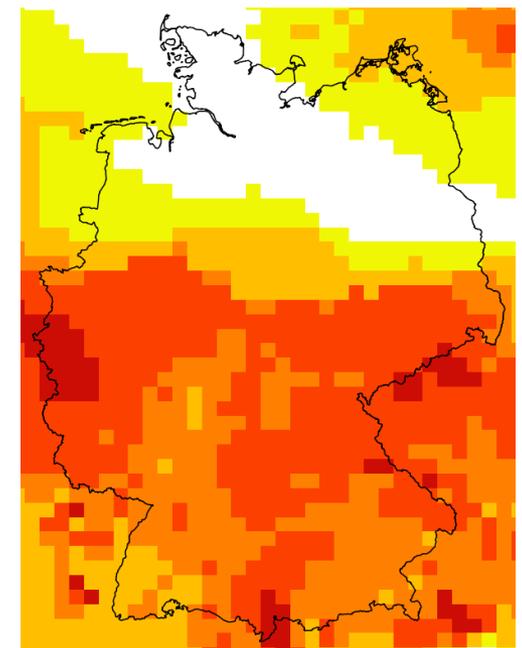
# Why not simple smoothing?

- Example – basic 3 point filter  $u'_i = 0.25u_{i-1} + 0.5u_i + 0.25u_{i+1}$
- Extrema damped (underwarning)
- Overwarning in other areas
- Some significant features removed

Same day IFS forecast (smoothed 50 times with 3p-Filter)



Same day IFS forecast

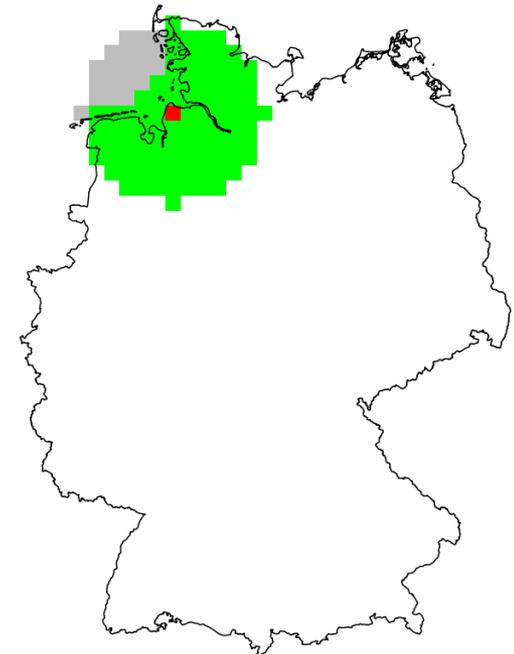
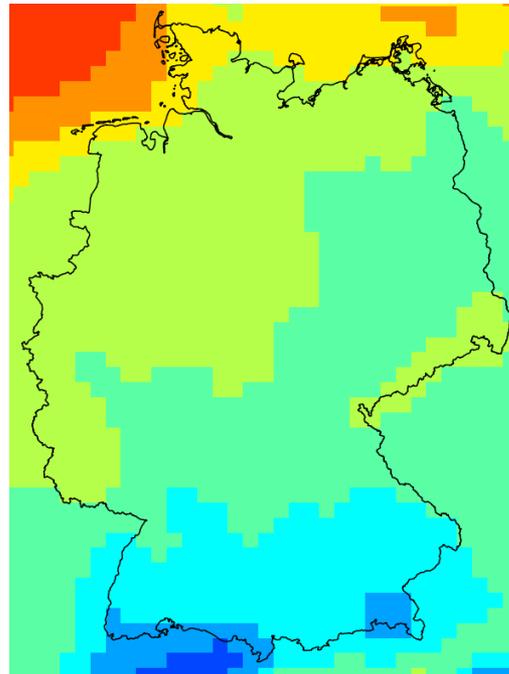
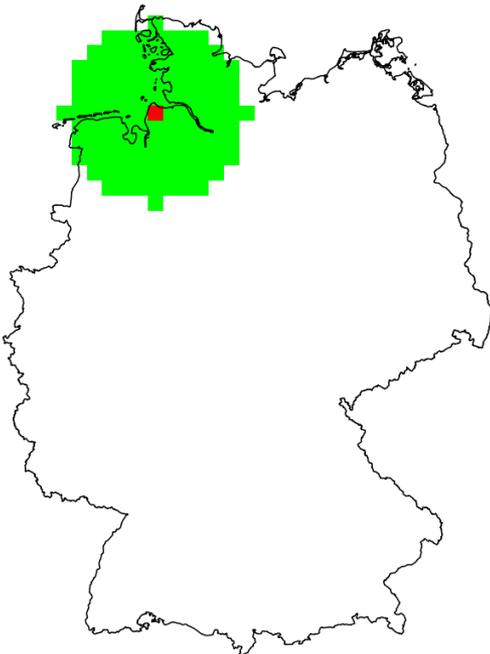


-	□	-
Bft 7	■	>14m/s
Bft 8,9	■	>18m/s
Bft 10	■	>25m/s
Bft 11	■	>29m/s
Bft 12	■	>33m/s
> Bft 12	■	>39m/s

# Smoothing algorithm for DMG

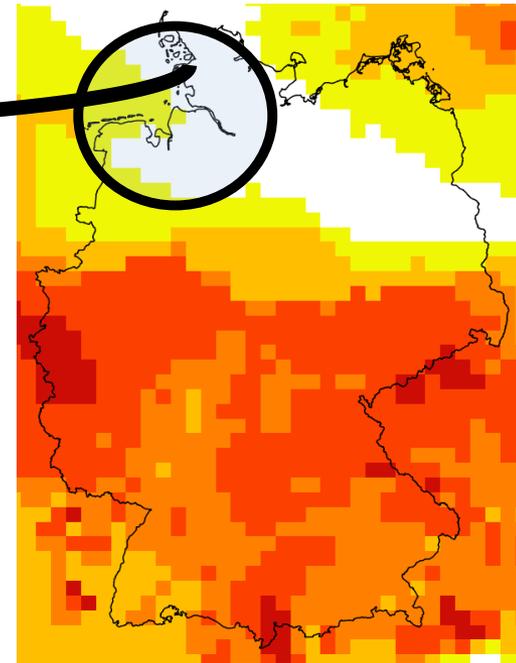
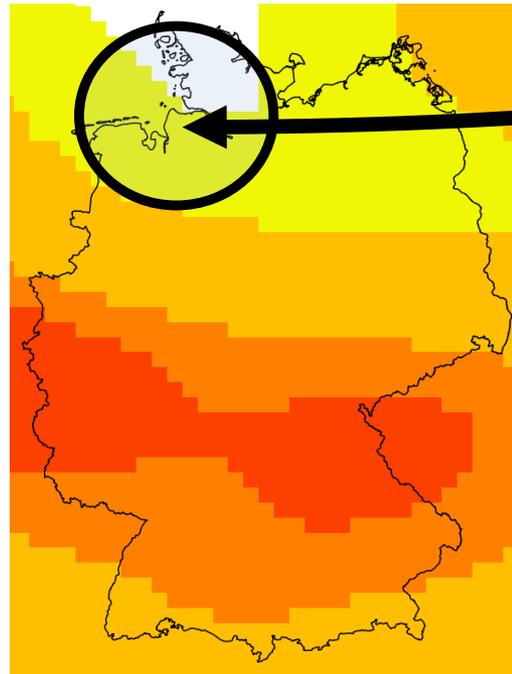
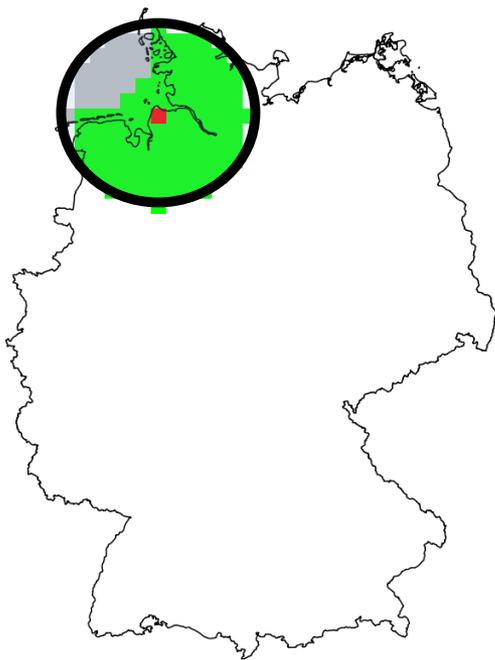
- Define radius  $r$
- Smoothed value of each grid point is constructed from grid points within circle
- Only grid points considered with similar climatology (defined by threshold  $th$ )

IFS Climate (50%ile –  
winter – 1m/s contour)



# Smoothing algorithm for DMG

- Start from simple smoothing
- For target grid point compute rank within (green area of) circle based on smoothed field
- From the non smoothed field retrieve the value with the same rank
- This becomes the value of the target grid point



# Smoothing algorithm for DMG

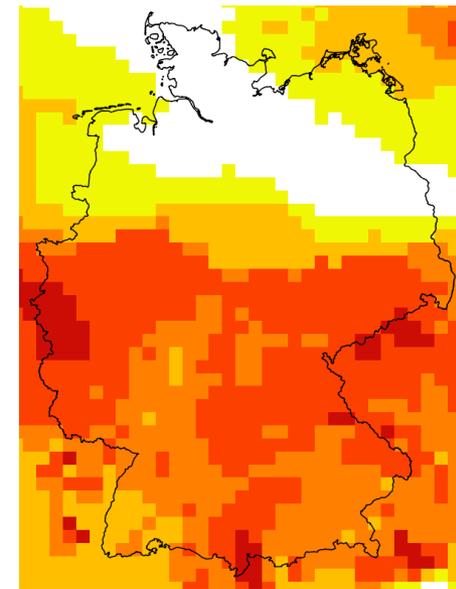
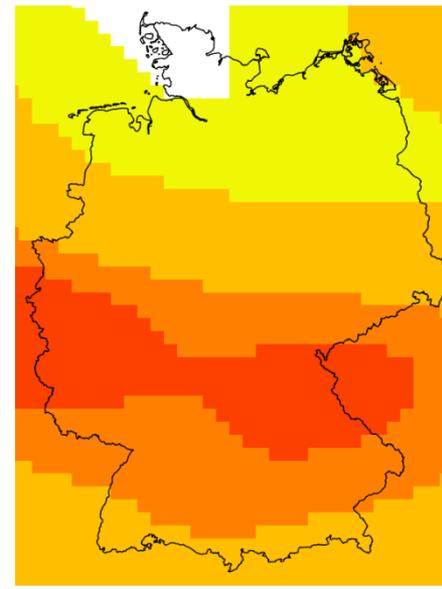
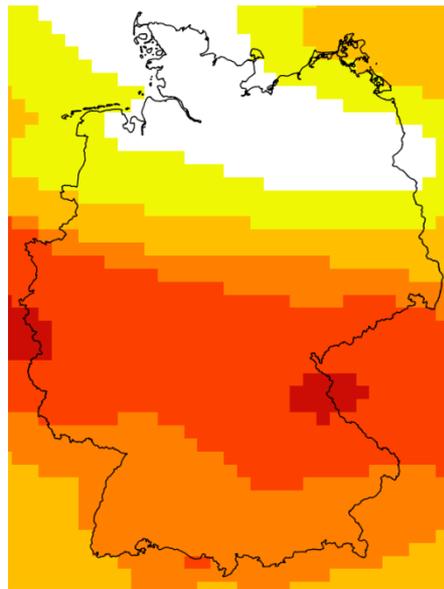
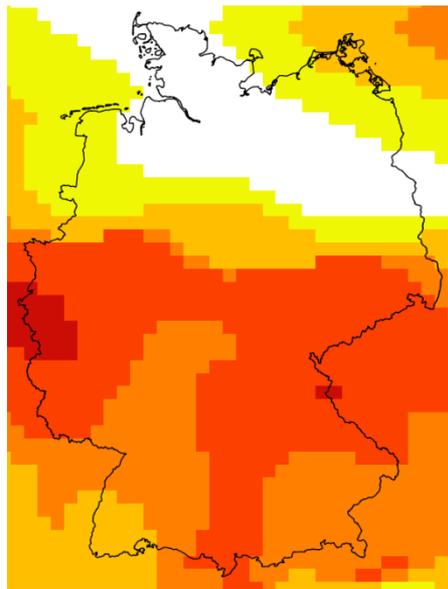
## Examples for different configurations

*3p – Filter: 50 times*  
*r = 60km*  
*th = 1m/s*

*3p – Filter: 50 times*  
*r = 240km*  
*th = 1m/s*

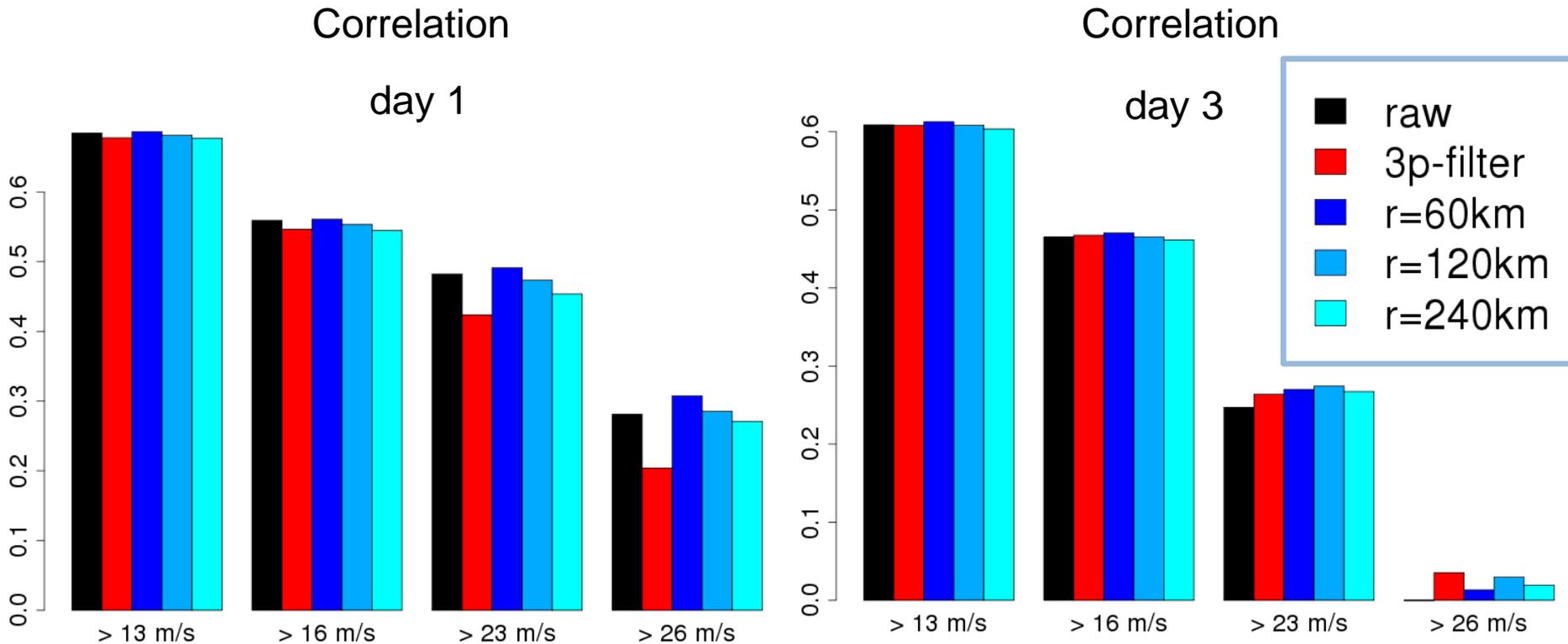
*3p – Filter: 50 times*

raw IFS forecast



# Correlation depending on configuration

- Verification for gusts for Dec 2018-March 2019
- Correlation computed for subset of data (FX >13, 16, 23, 26m/s)
- Good result for leadtime



# Smoothing algorithm for DMG

## Examples for different configurations

### Day 1-2

*3p – Filter: 50 times*  
*r = 60km*  
*th = 1m/s*

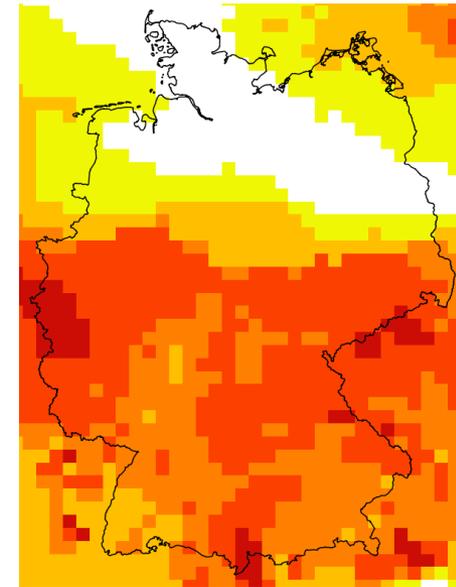
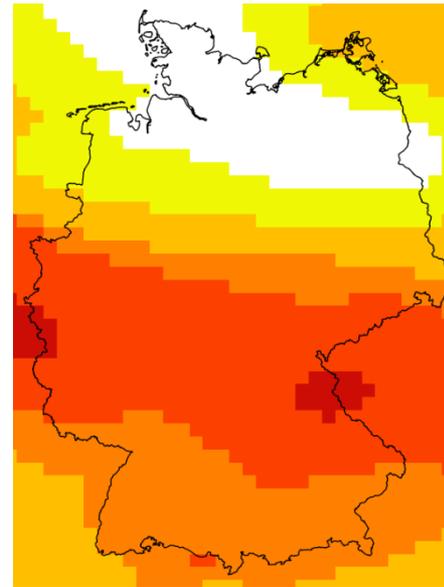
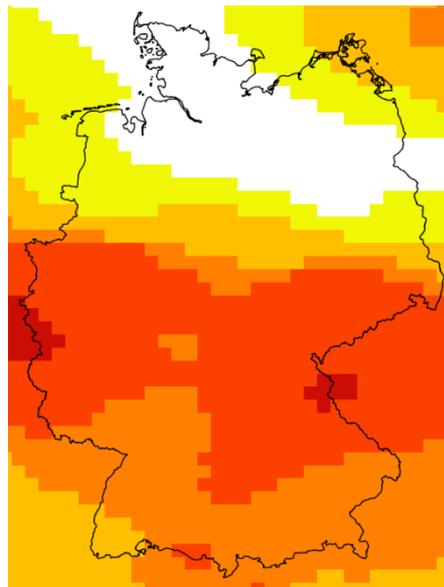
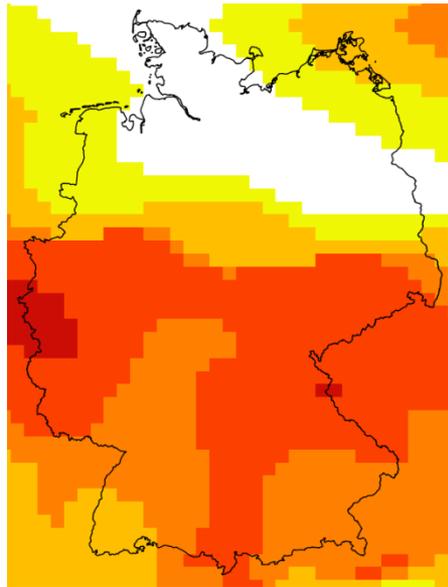
### Day 3-5

*3p – Filter: 50 times*  
*r = 120km*  
*th = 1m/s*

### Day 6-7

*3p – Filter: 50 times*  
*r = 240km*  
*th = 1m/s*

raw IFS forecast



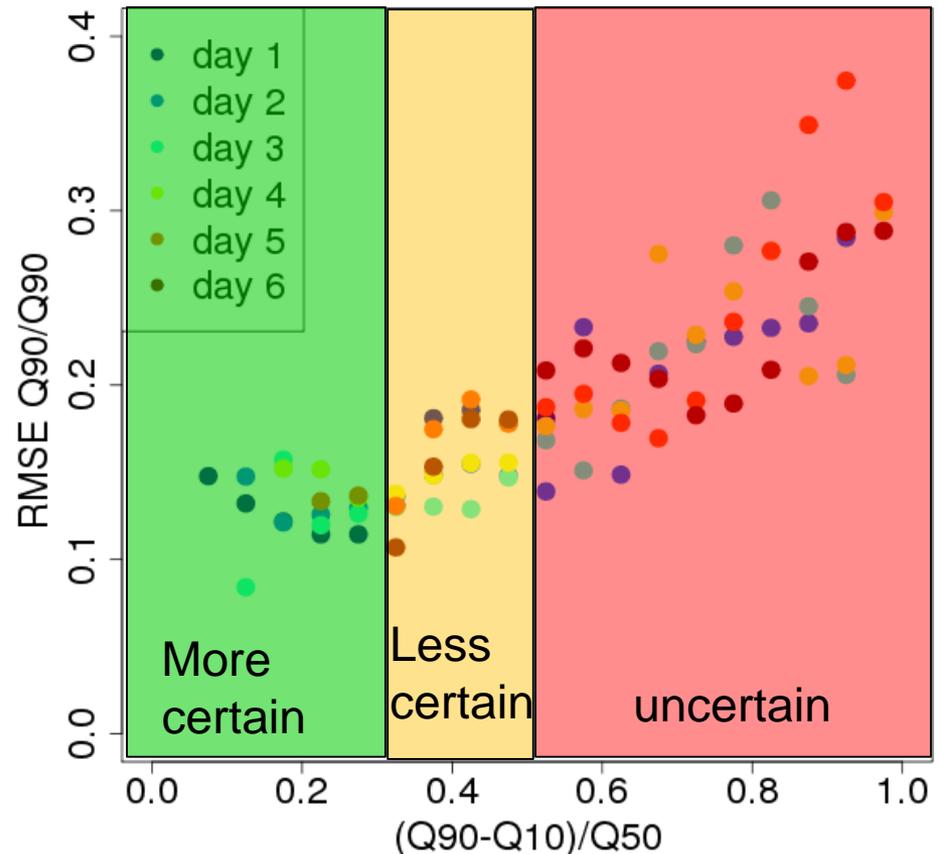
- 1 Main features of DMG
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- 4 Uncertainty**
- 5 Example results



- Dec 2018-Mar 2019
- Daily FX max
- Model FX Q50 > 14m/s
- 10,000-15,000 data points

Normalized difference of  
90%ile-10%ile

IFS



# Components

## Uncertainty of forecast

Lauf: 2019-03-09 00 UTC

→  $r = (Q90 - Q10) / Q50$

→ Labelling:

$0.5 < r$       uncertain

$0.3 < r < 0.5$     less certain

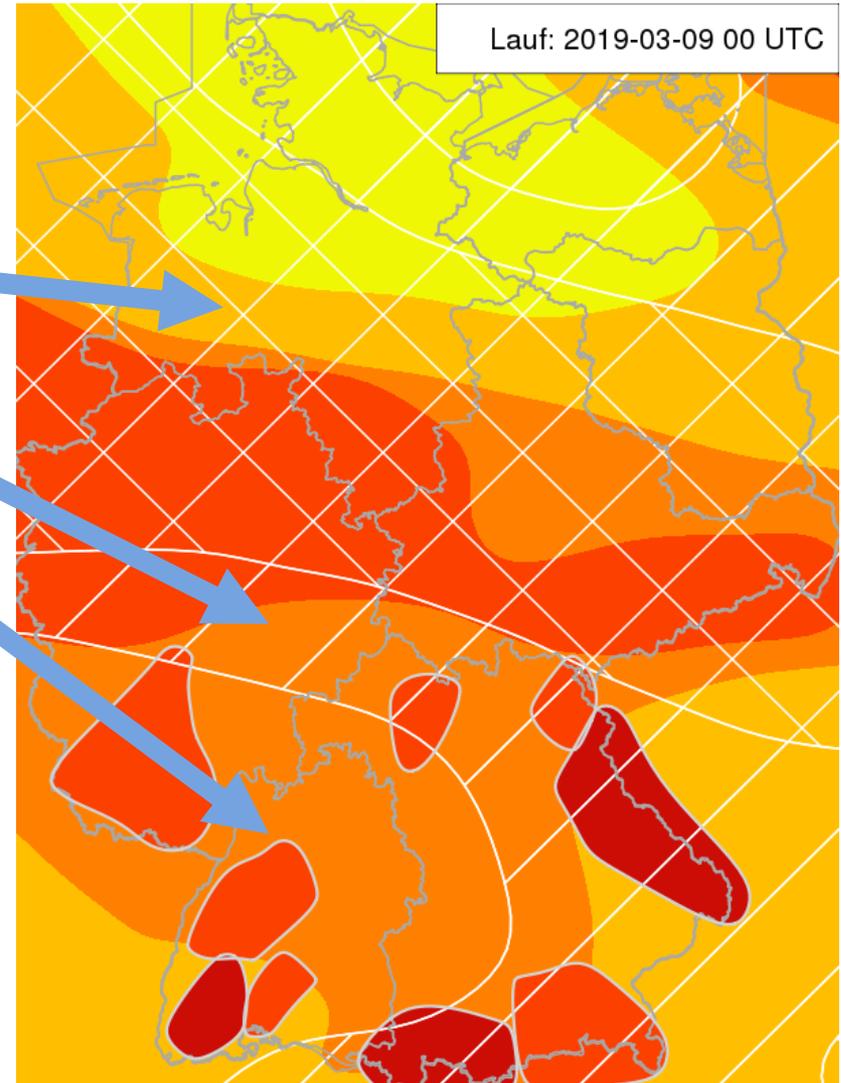
$r < 0.3$       more certain

→ Rain and snow: (Q90-Q10)

$\geq 2$  warning categories – uncertain

1-2 warning categories – less certain

$< 1$  warning category – more certain



- 1 Main features of DMG
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# Wind gusts

## IFS 09 March 2019 00 UTC

### MIRAKEL ▾

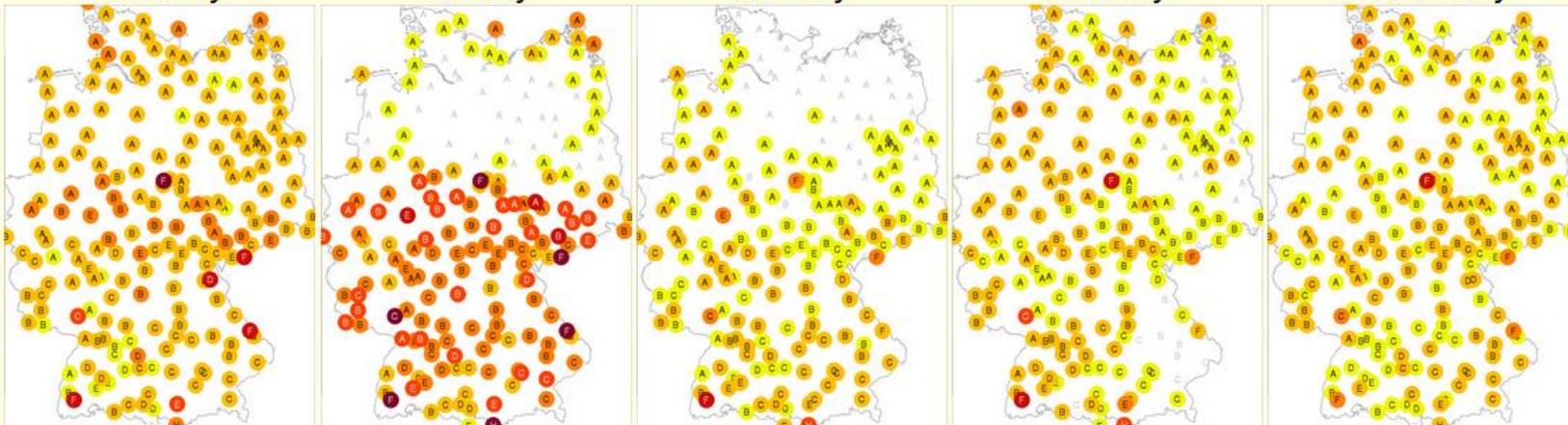
Saturday

Sunday

Monday

Tuesday

Wednesday



- -
- >14m/s
- >18m/s
- >25m/s
- >29m/s
- >33m/s
- >39m/s

### IFS-EPS (V1.2.1) ▾

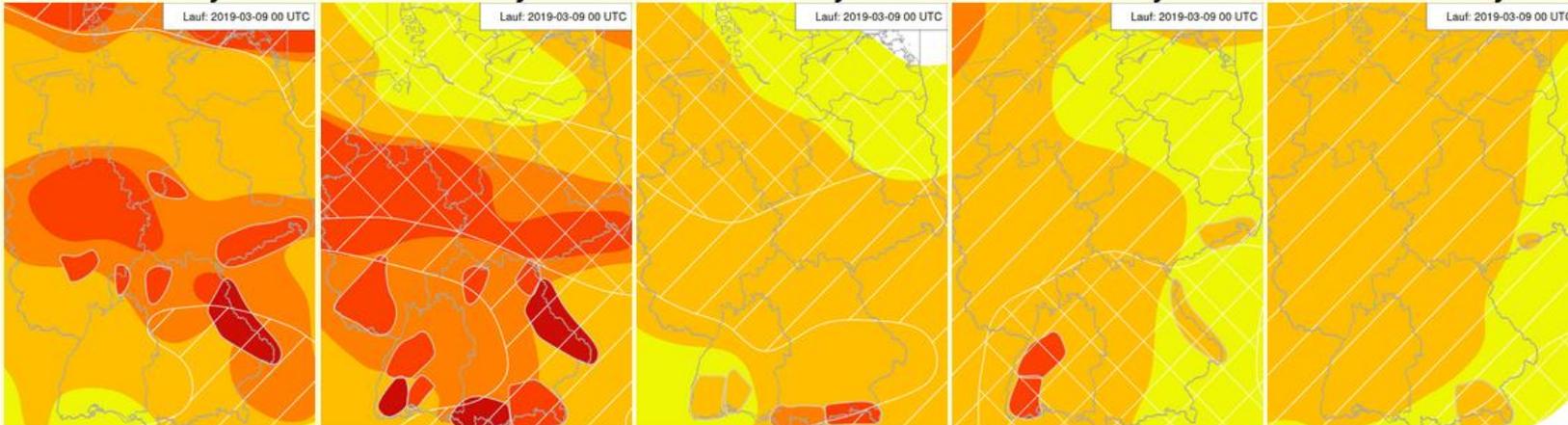
Saturday

Sunday

Monday

Tuesday

Wednesday



# Wind gusts

## 09 Feb 2019

MIRAKEL ▾

Saturday

Saturday

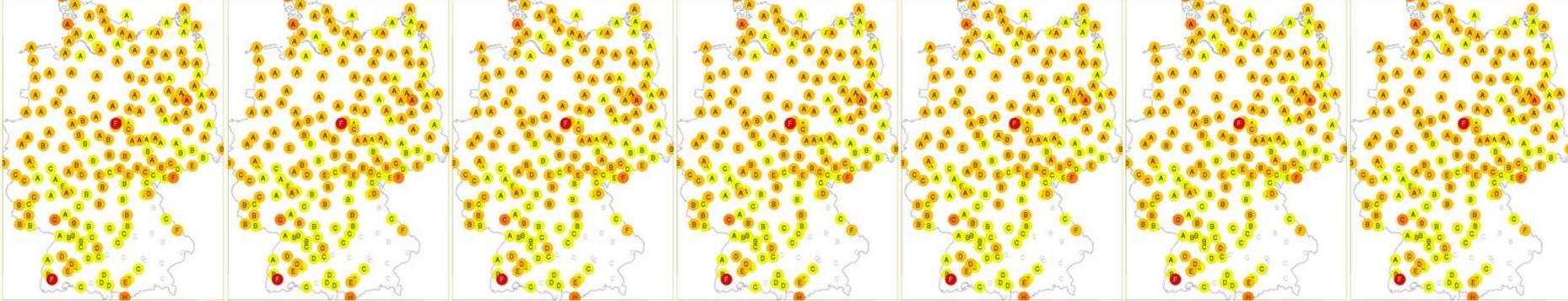
Saturday

Saturday

Saturday

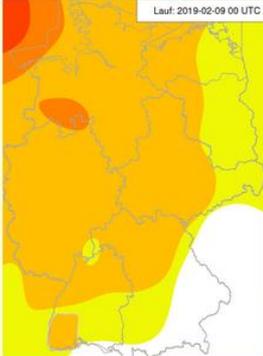
Saturday

Saturday

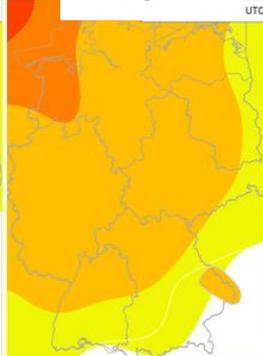


IFS-EPS (V1.2.1) ▾

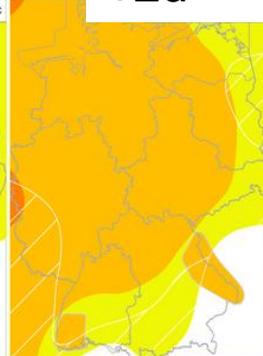
Saturday



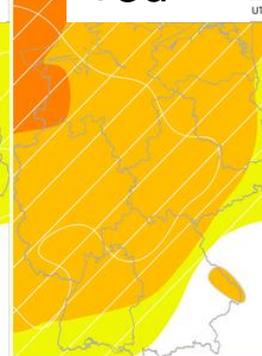
+1d



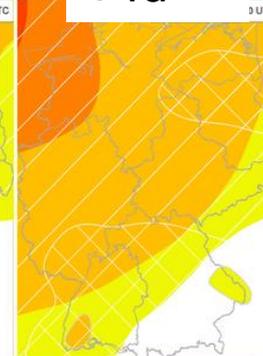
+2d



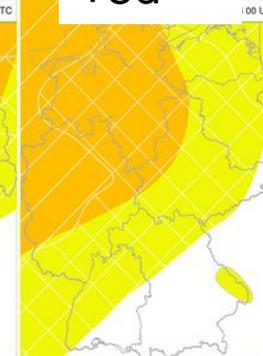
+3d



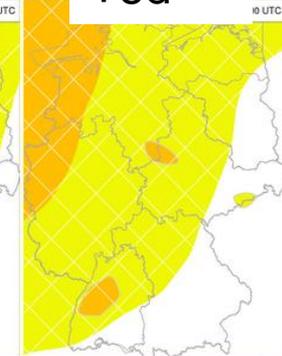
+4d



+5d



+6d



# Persistent rain IFS 18 May 2019 00 UTC

MIRAKEL ▾

Saturday

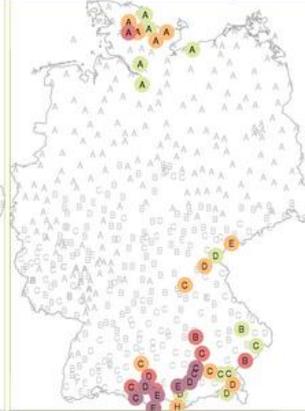
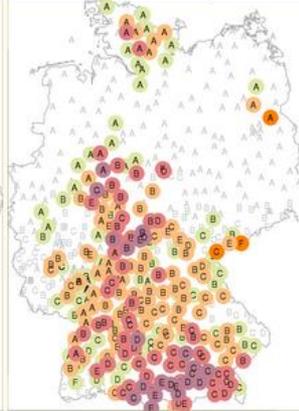
Sunday

Monday

Tuesday

Wednesday

- >30mm/24h
- >50mm/24h
- >80mm/24h



IFS-EPS (V1.2.1) ▾

Saturday

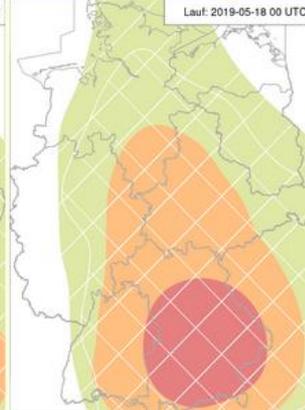
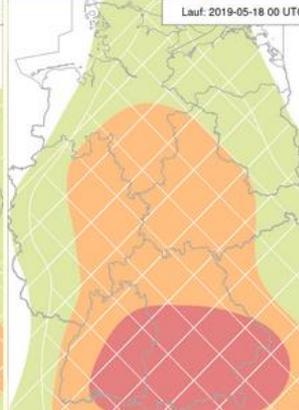
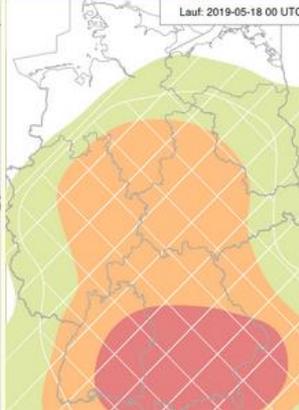
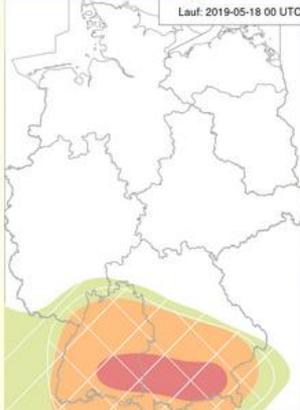
Sunday

Monday

Tuesday

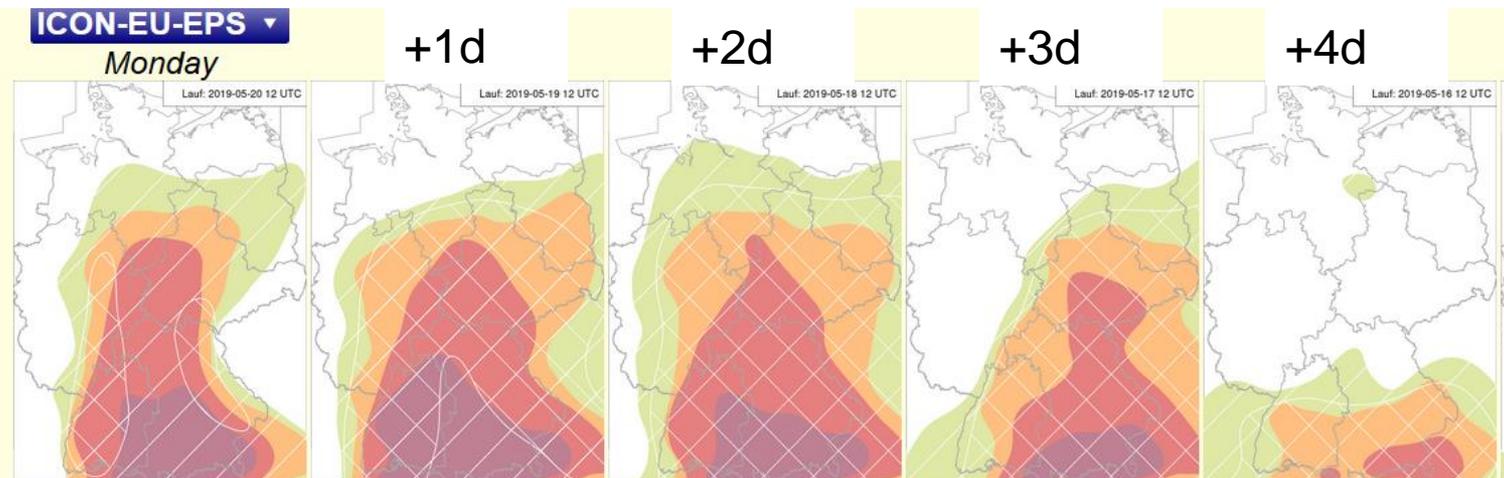
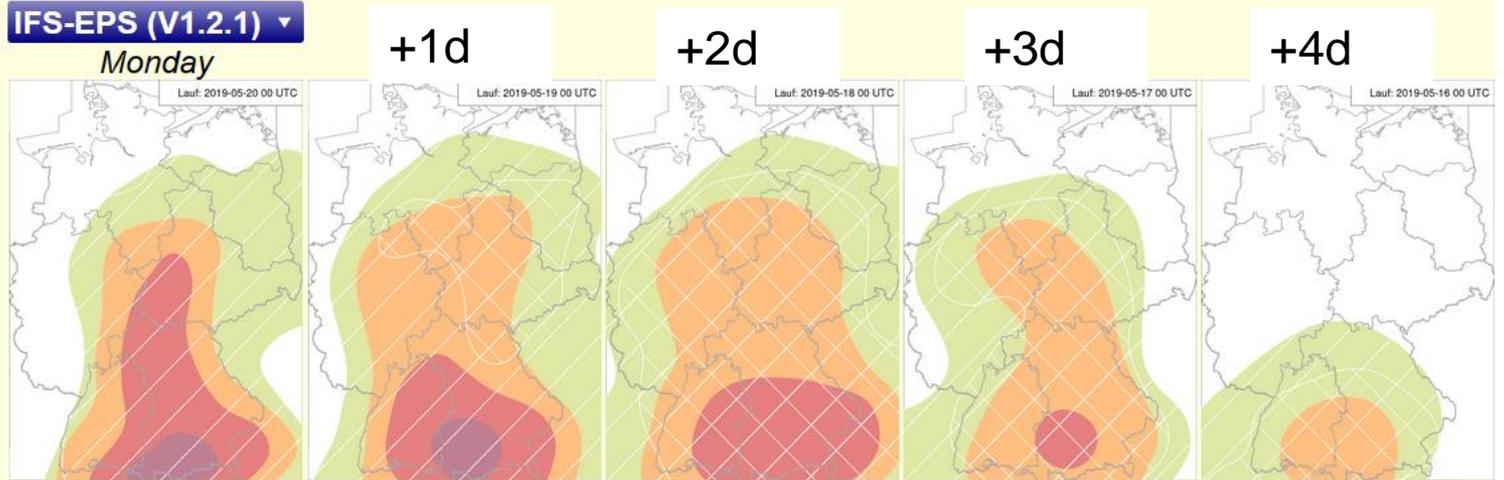
Wednesday

Lauf: 2019-05-18 00 UTC



# Persistent rain 20 May 2019

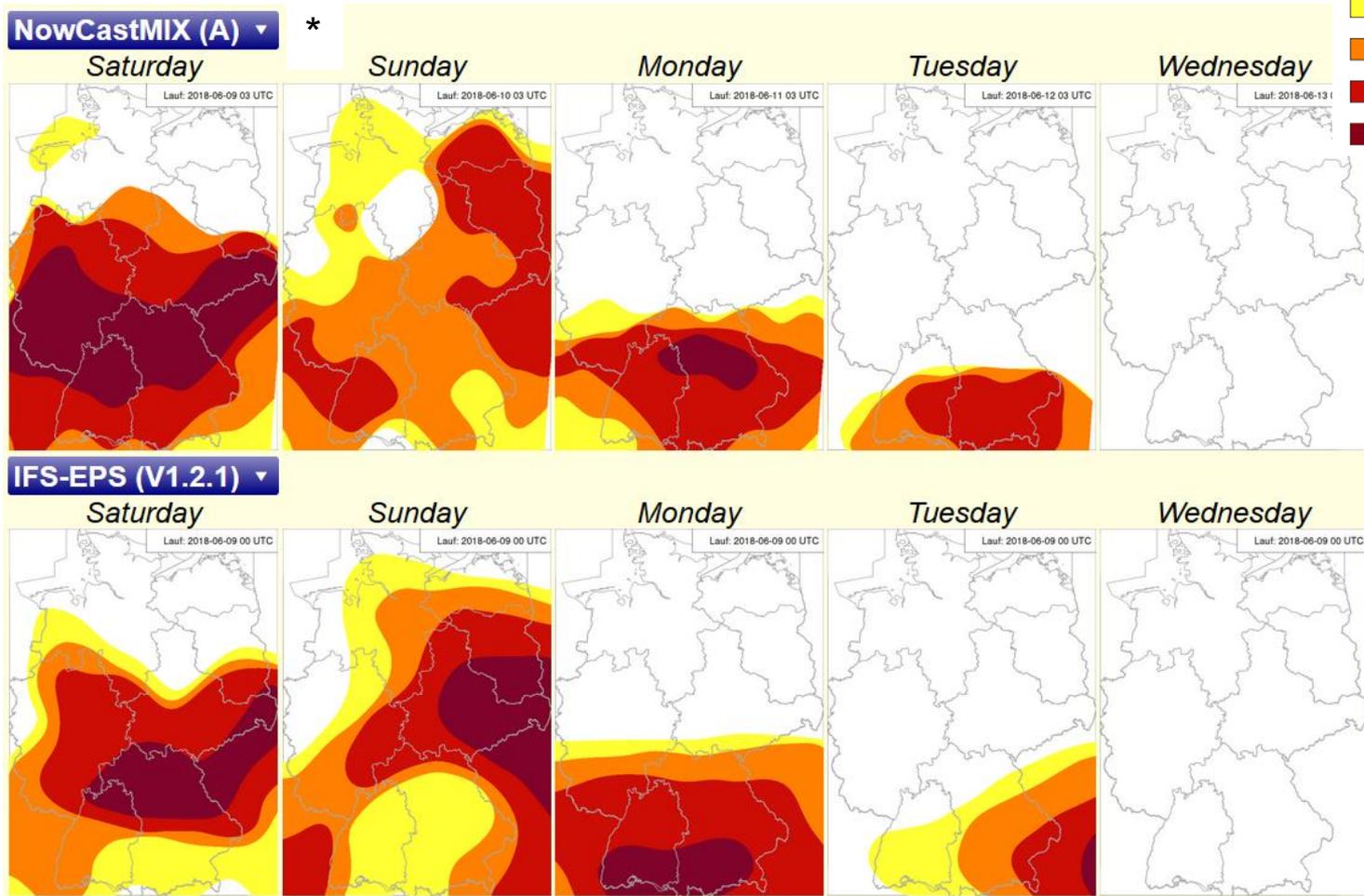
Gauge data



- >30mm/24h
- >50mm/24h
- >80mm/24h

# Thunderstorms

## Week from 9 June 2018



- Thunderstorms
- Heavy thunderstorms
- Severe thunderstorms
- Extreme thunderstorms

Graphs for  
thunderstorms  
without  
uncertainty  
information

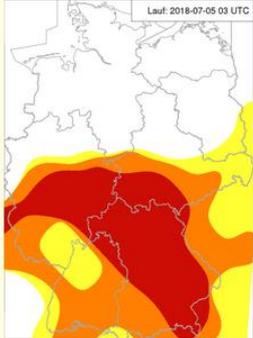
\*James, P.M. et al. 2018: NowCastMIX: Automatic Integrated Warnings for Severe Convection on Nowcasting Time Scales at the German Weather Service. Wea. Forecasting 33. 1413-1433.

# Thunderstorms

## 05 July 2018

NowCastMIX (A) ▾

Thursday



- Thunderstorms
- Heavy thunderstorms
- Severe thunderstorms
- Extreme thunderstorms

IFS-EPS (V1.2.1) ▾

Thursday

+1d

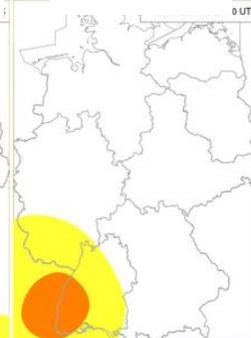
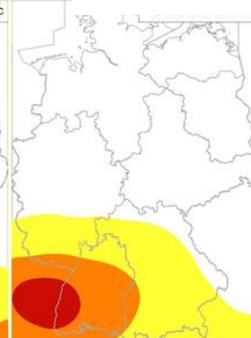
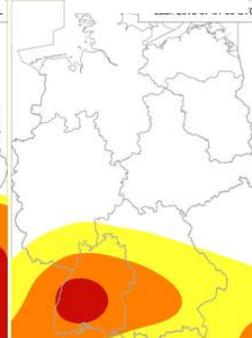
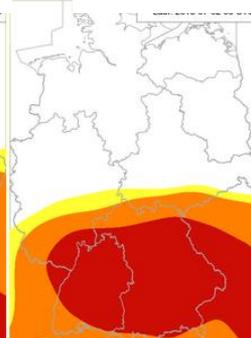
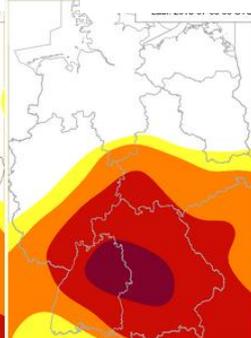
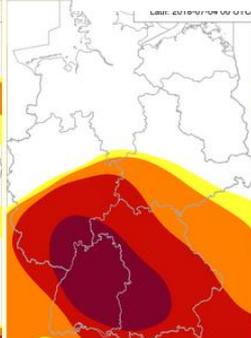
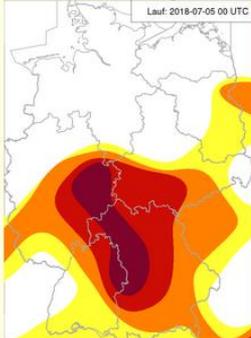
+2d

+3d

+4d

+5d

+6d



- DMG (Daily Model Guidance) provides one graph each for gusts, persistent rain, snowfall and thunderstorms
- Includes uncertainty and timing
- One graph per model and day
- Smoothing configuration depending on uncertainty (fixed via lead time)

## Further steps

- Combination of several models
- Uncertainty measure should include multiple models and maximum forecast
- Uncertainty and smoothing adjustment for rain, snow and thunderstorms
- Coarser warning categories to account for predictability

**Thanks!**

# Appendix



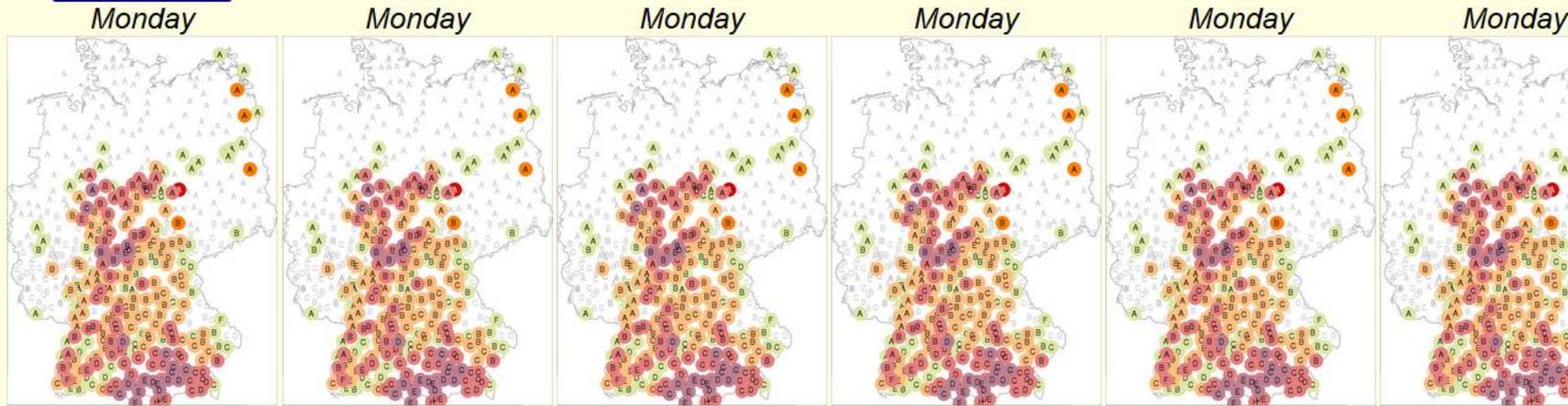
Monday  
20.05.2019 03:00 UTC



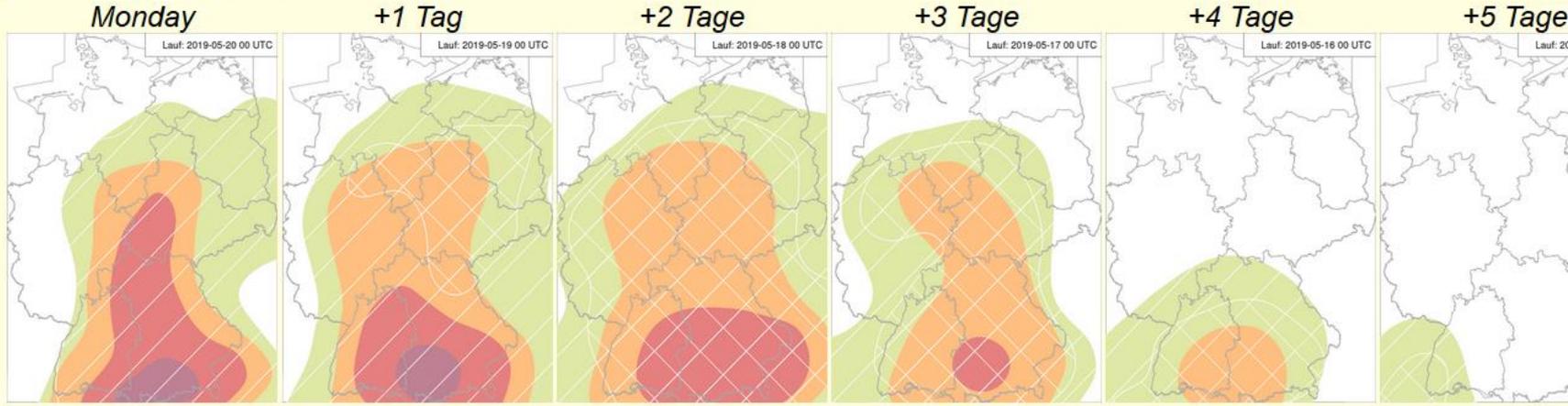
[Neu: Anleitung DMG in NinJo](#)

Was ist DMG **Regen** **Historie** **Config**  Zeit einblenden

**MIRAKEL**



**IFS-EPS (V1.2.1)**





Sunday

10.03.2019 12:00 UTC

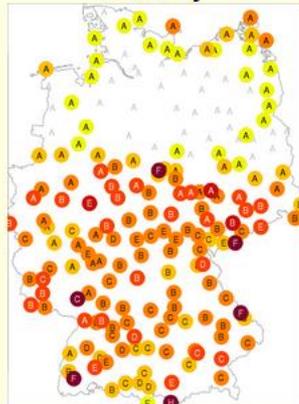


[Neu: Anleitung DMG in NinJo](#)

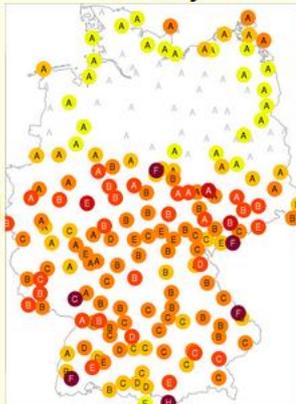
Was ist DMG **Böen** **Historie** **Config**  Zeit einblenden

**MIRAKEL**

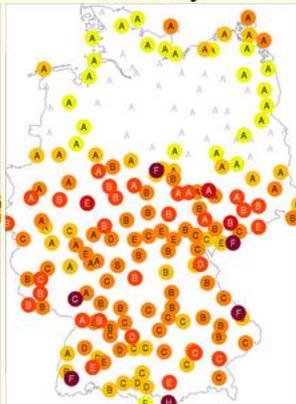
Sunday



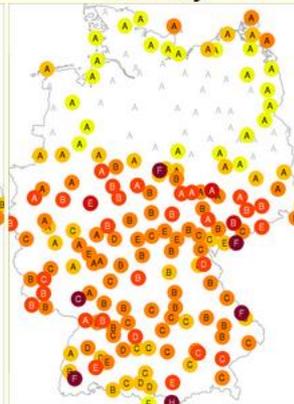
Sunday



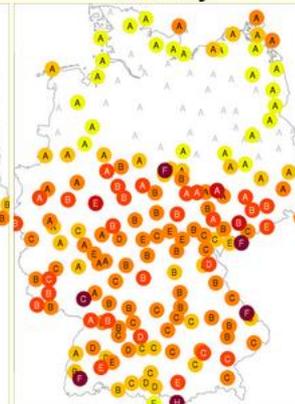
Sunday



Sunday



Sunday

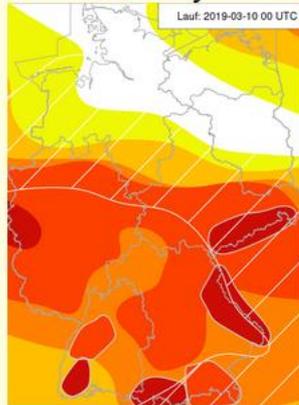


Sunday

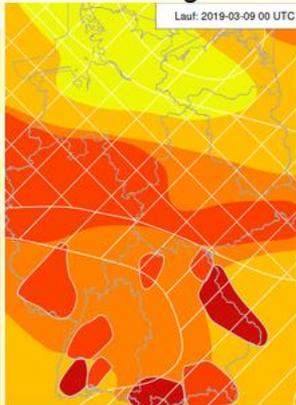


**IFS-EPS (V1.2.1)**

Sunday



+1 Tag



+2 Tage



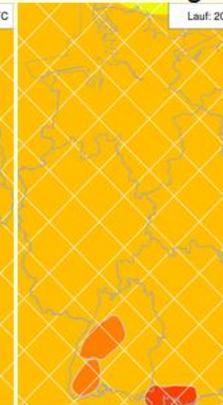
+3 Tage



+4 Tage

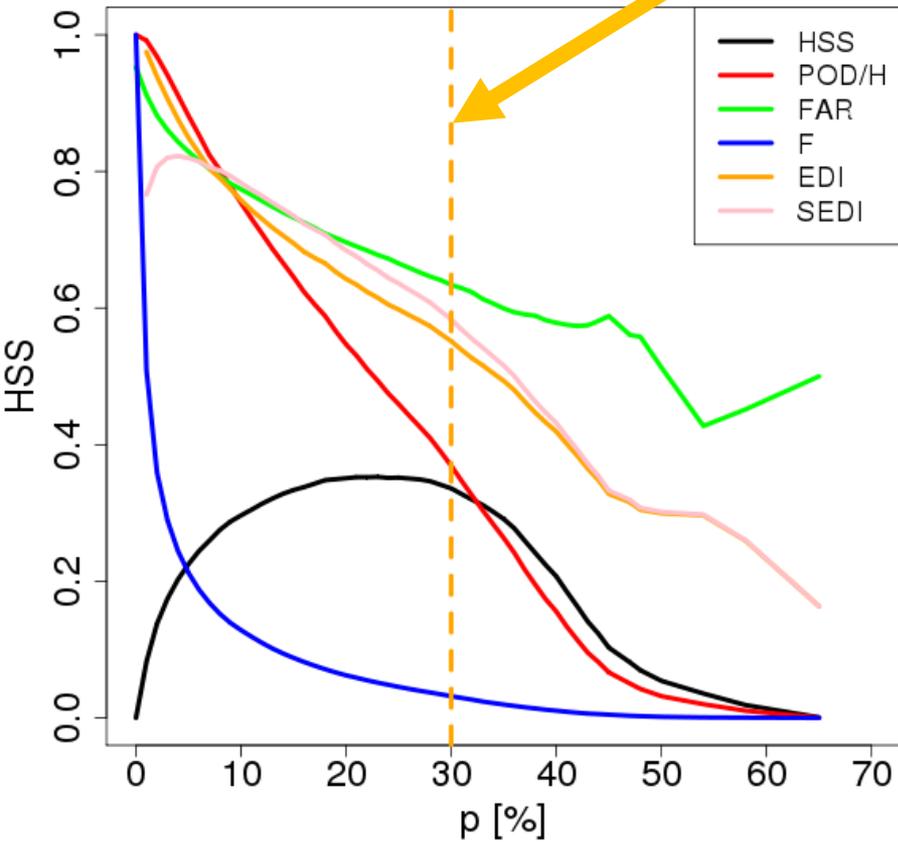


+5 Tage

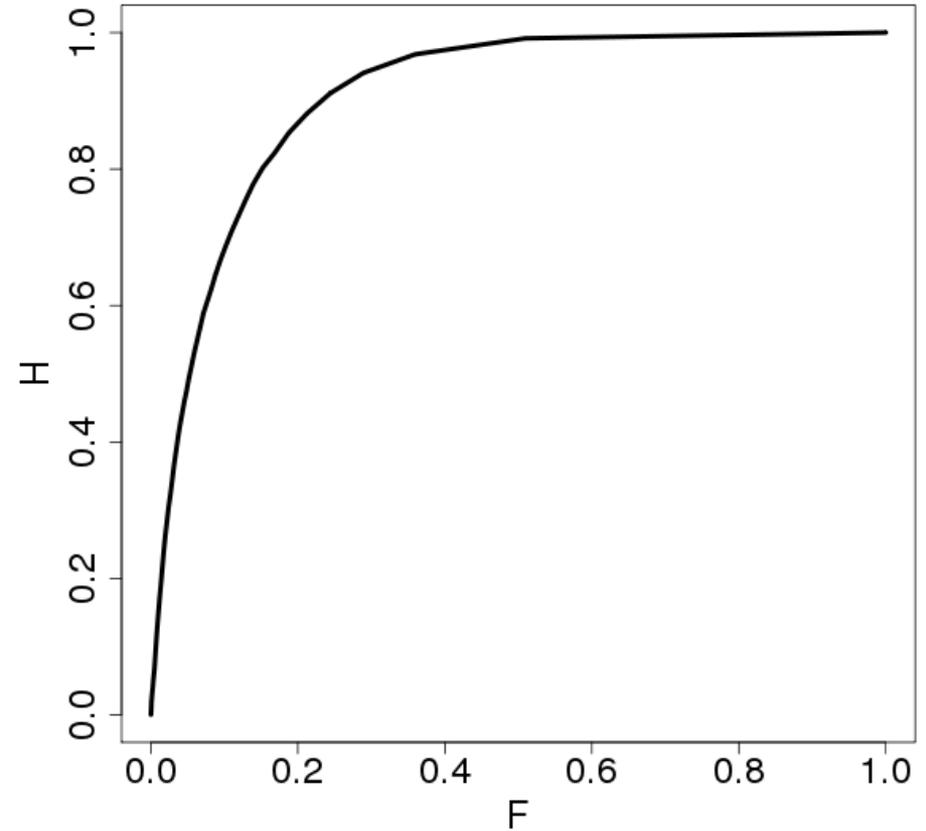


EDI needd Calibration:  
no BIAS!

### WarnMOS Gewitterwahrscheinlichkeit



### WarnMOS Gewitter-p, SSROC= 0.81

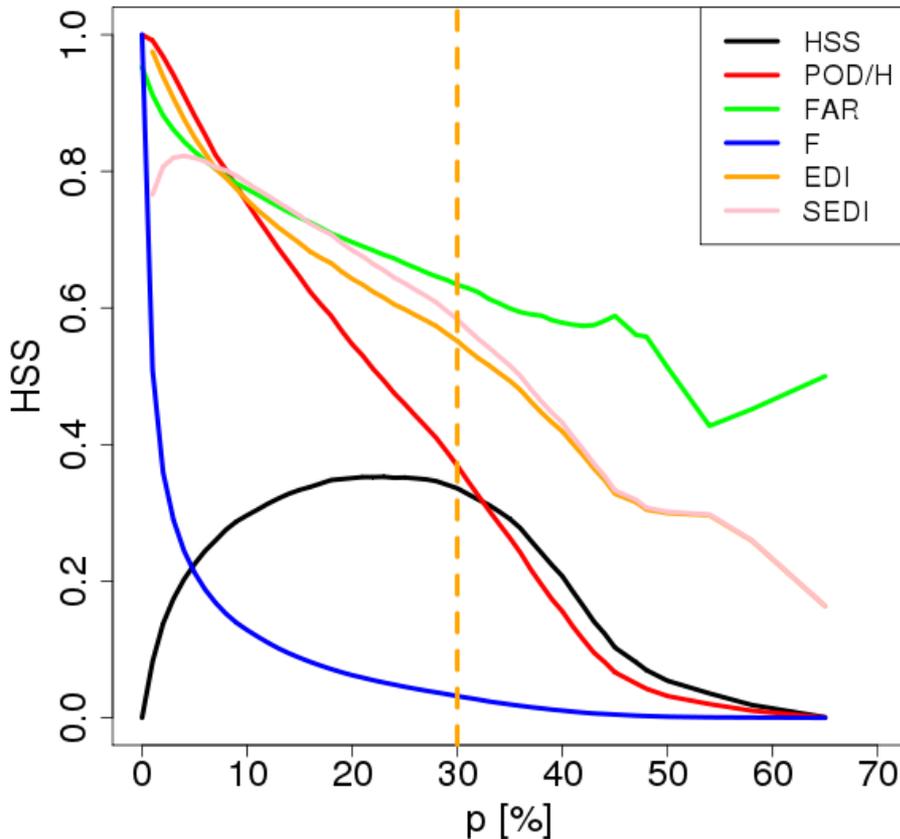


# Scores when added non-events

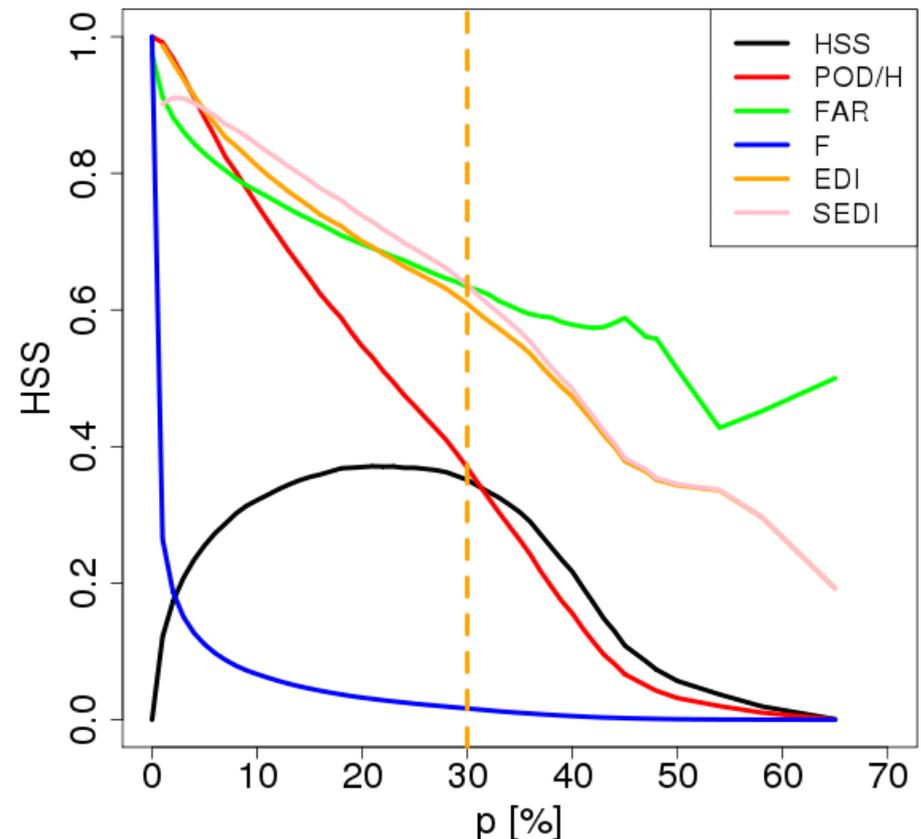
POD, FAR stay the same  
HSS increases slightly  
SEDI changes location of maximum

Test: 1 month of correctly forecast non-events added

WarnMOS Gewitterwahrscheinlichkeit



WarnMOS Gewitterwahrscheinlichkeit



HSS-max 0.35 at 21%  
SEDI-max 0.82 at 4%

HSS-max 0.37 at 21%  
SEDI-max 0.91 at 2%



# Gewitterkalibrierung- Welches Quantil für COSMO-D2-EPS?

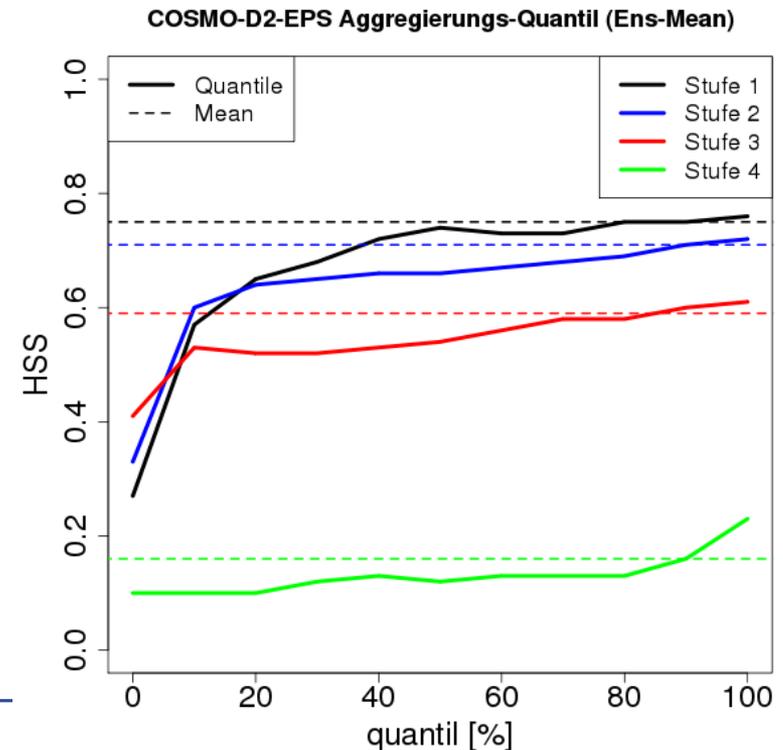
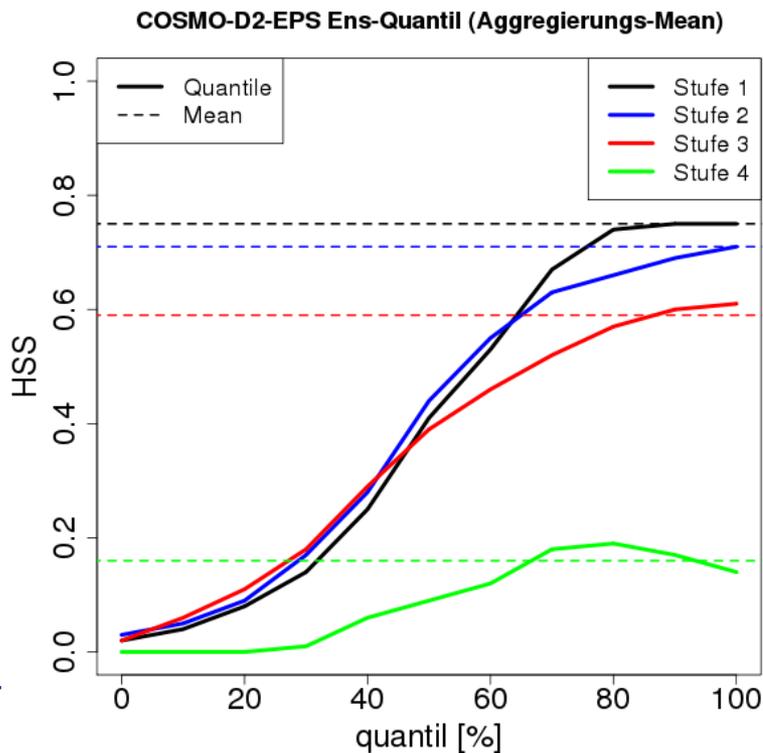
→ 2 Quantile relevant für COSMO-D2-EPS:

→ Aggregierung von 2.2 km auf 20km – hier wird ein Quantil gebildet

→ Vom Ensemble wird ein Quantil gebildet

Ensemblequantil wird variiert  
bei festem Aggregierungs-Mean

Aggregierungsquantil Quantil wird  
variiert bei festem Ensemble-Mean



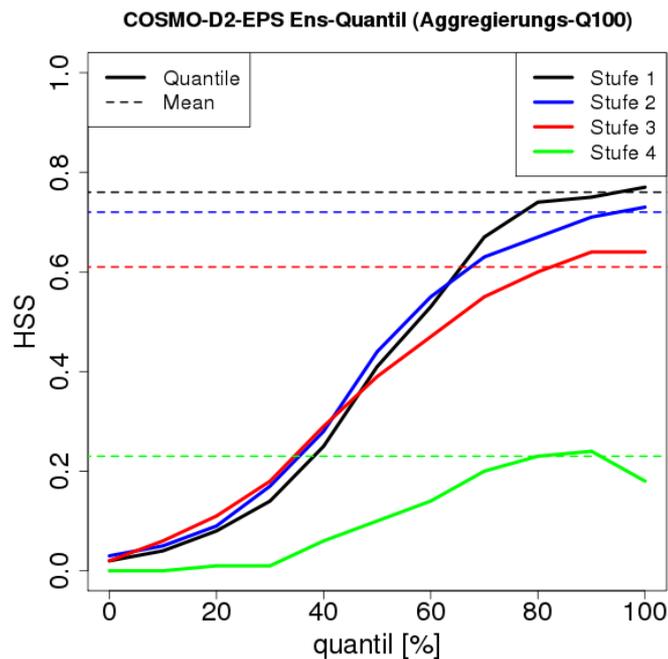
# Gewitterkalibrierung- Welches Quantil für COSMO-D2-EPS?

→ 2 Quantile relevant für COSMO-D2-EPS:

→ Aggregation von 2.2 km auf 20km – hier wird ein Quantil gebildet

→ Vom Ensemble wird ein Quantil gebildet

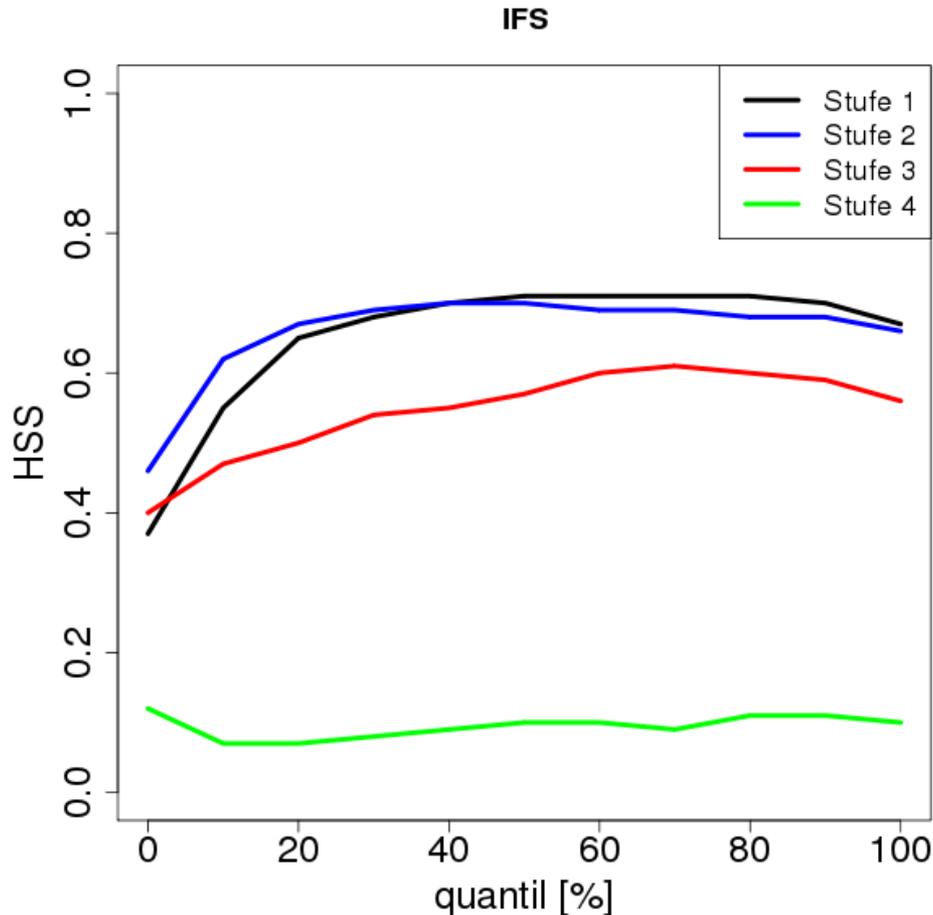
Ensemblequantil wird variiert bei festem Aggregierungsquantil 100



→ Am besten man nimmt das Maximum bei der Aggregation und auch vom Ensemble

# Gewitterkalibrierung- Welches Quantil für IFS?

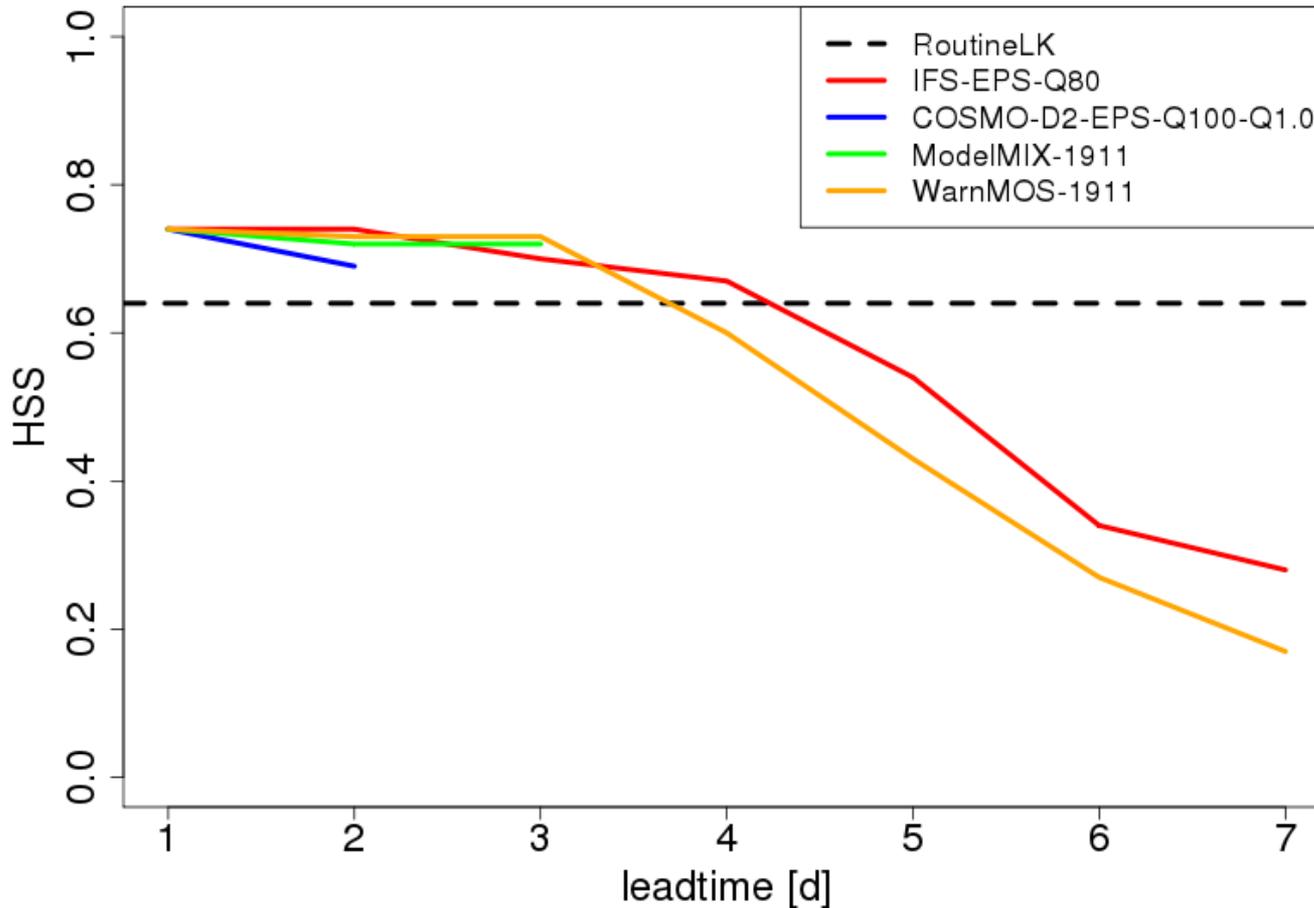
- Nur Ensemble-Quantile relevant für IFS-EPS
- Das 80. Perzentil scheint optimal zu sein



Auswertung für 50km  
Unschärfe-Radius und 12h-  
Zeitintervall

# Thunderstorm calibration for 06/06/2018-31/07/2019

HSS, Day 3, Gewitter Stufe 1, 250km 24h

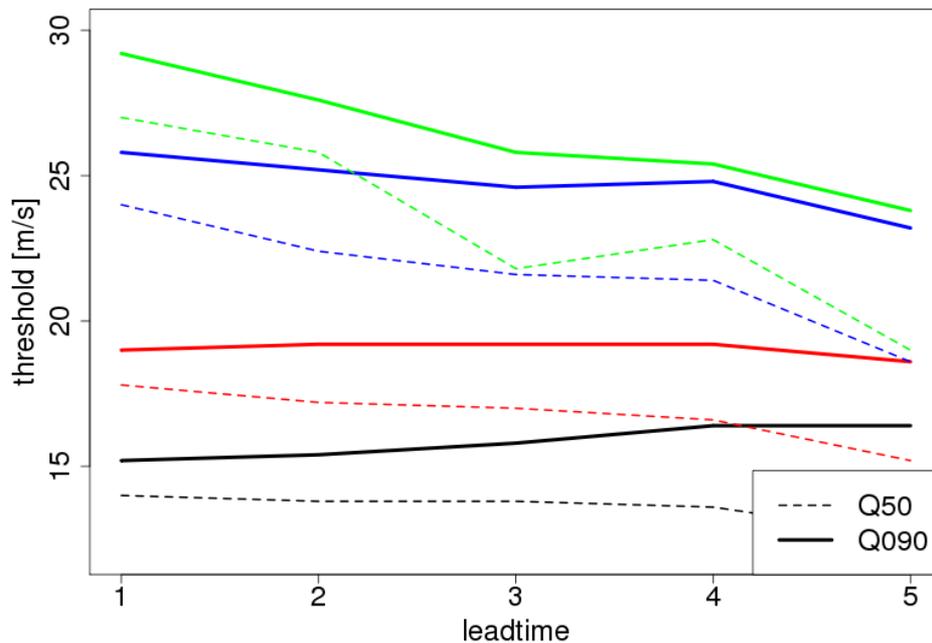


➔ After day 6 skill drops

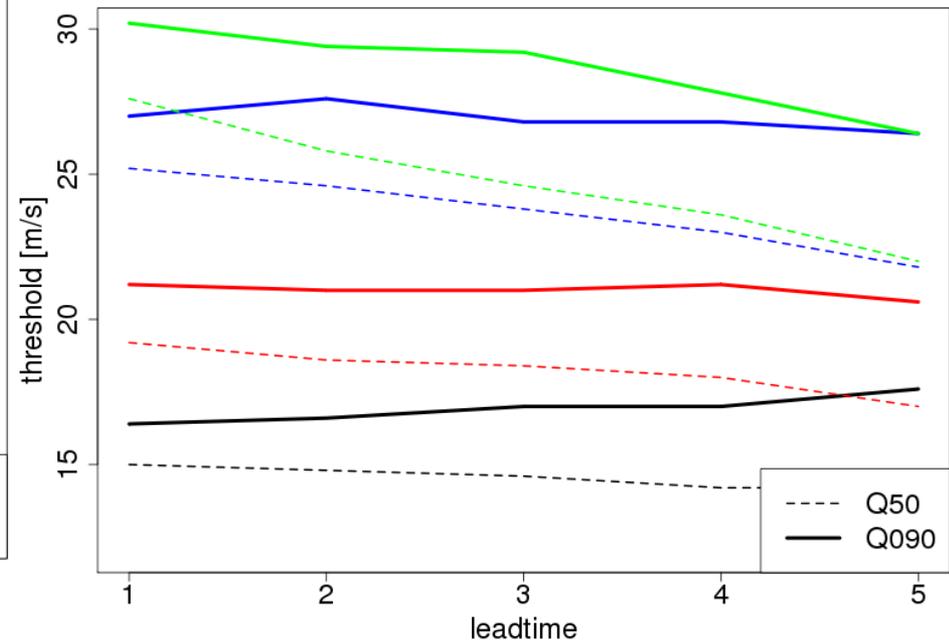
## Which quantile?

- ➔ For Q50 strong dependency of threshold from lead time
- ➔ For Q90 weaker dependency
- ➔ => 90th percentile more recommendable

threshold, ICON



threshold, IFS



→ IFS better for larger lead times

