

# Predictability of European windstorms

Workshop on “climate change and weather modelling”

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[www.rain-project.eu](http://www.rain-project.eu)

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# Outline

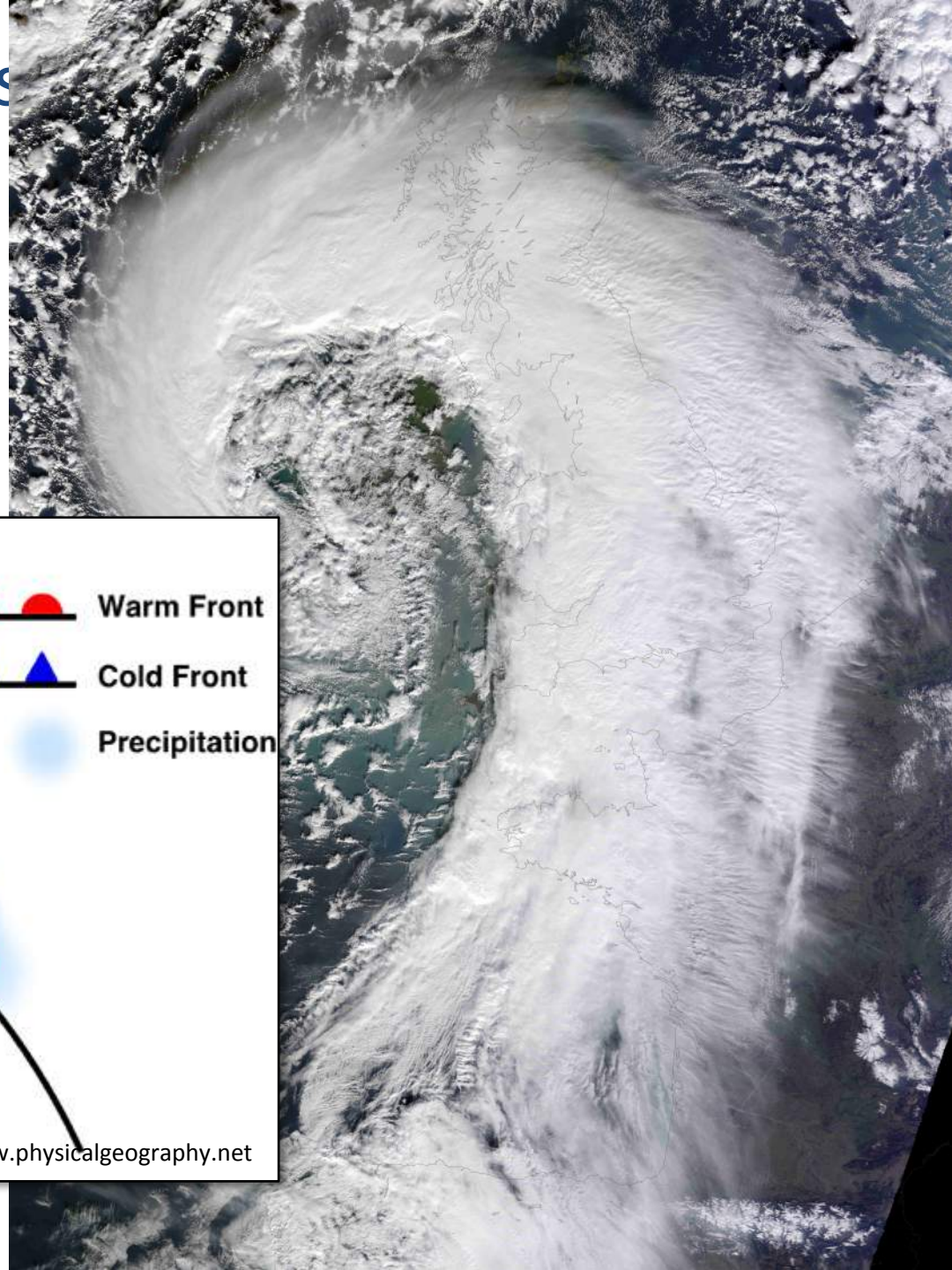
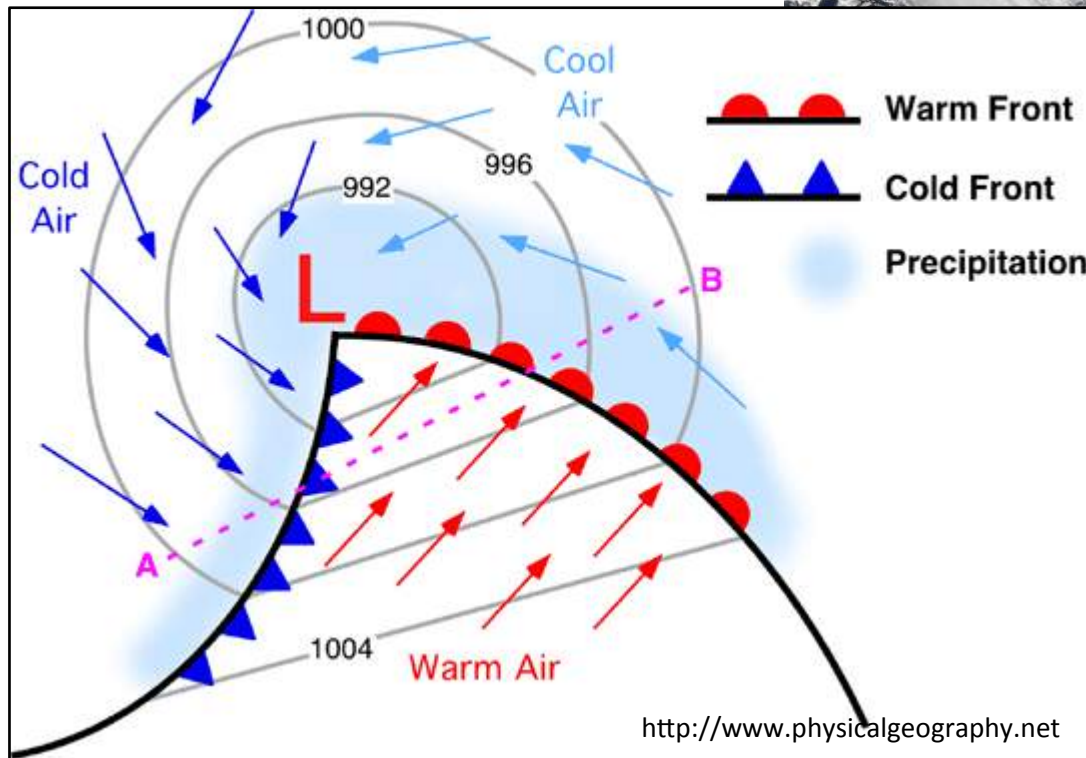
- Extra-tropical cyclones and related windstorms
- Numerical weather prediction
- Identification and tracking of windstorms
- Predictability of European windstorms
  - From ensemble forecasts to windstorm probabilities
  - Are forecasted probabilities reliable?



# Extra-tropical Cyclones

Low-pressure systems in the mid-latitudes, which are related to

- Cloudiness
- Precipitation
- Increased wind speeds



# Extra-tropical Cyclones

## Windstorms and impacts

- Extra-tropical cyclones are a **day to day phenomenon** in Europe
- However, certain atmospheric conditions can cause an **intensification** of cyclones
- Intense extra-tropical cyclones can lead to **severe windstorms**

### Some prominent examples of severe windstorms:

Name	Date	Insured losses	Fatalities
Lothar and Martin	Dec 1999	>10 billion €	140
Kyrill	Jan 2007	4.3 billion €	53
Xynthia	Feb 2010	1.3–3 billion €	51



# Extra-tropical Cyclones

## Impacts on critical infrastructure

- Extreme windstorms can affect different types of **critical infrastructure**

### Electricity network



### Roads



### Rail transport



# Extra-tropical Cyclones

## Results from stakeholder interviews

- Interviews with stakeholders of different critical infrastructures
- 93% of the stakeholders state that their infrastructure can be affected by windstorms
  - **Windstorm forecasts** are needed, for example, to
    - prepare power grids
    - reduce speed limits of trains
    - deploy extra personnel for road management and emergency services
  - **Important aspects** for windstorm predictions:
    - timing, location and intensity of the event
- **Skillful predictions of windstorms are important!**
    - How does numerical weather prediction work?
    - How skillful and reliable are windstorm forecasts?
    - On which time range are skillful forecasts possible?

# Numerical weather prediction

## Introduction

### Observations



Best estimate of the current  
state of the atmosphere

Initial  
conditions

### Atmospheric Model

- Equations based on physical principles

$$\begin{aligned}\rho \frac{d\mathbf{v}}{dt} &= -\nabla p + \rho \mathbf{g} - 2\boldsymbol{\Omega} \times (\rho \mathbf{v}) - \nabla \cdot \underline{\mathbf{t}} \\ \frac{d\rho}{dt} &= -\rho \nabla \cdot \mathbf{v} \\ \rho \frac{dq^x}{dt} &= -\nabla \cdot \mathbf{J}^x + I^x \\ \rho \frac{de}{dt} &= -p \nabla \cdot \mathbf{v} - \nabla \cdot (\mathbf{J}_e + \mathbf{R}) + \varepsilon.\end{aligned}$$

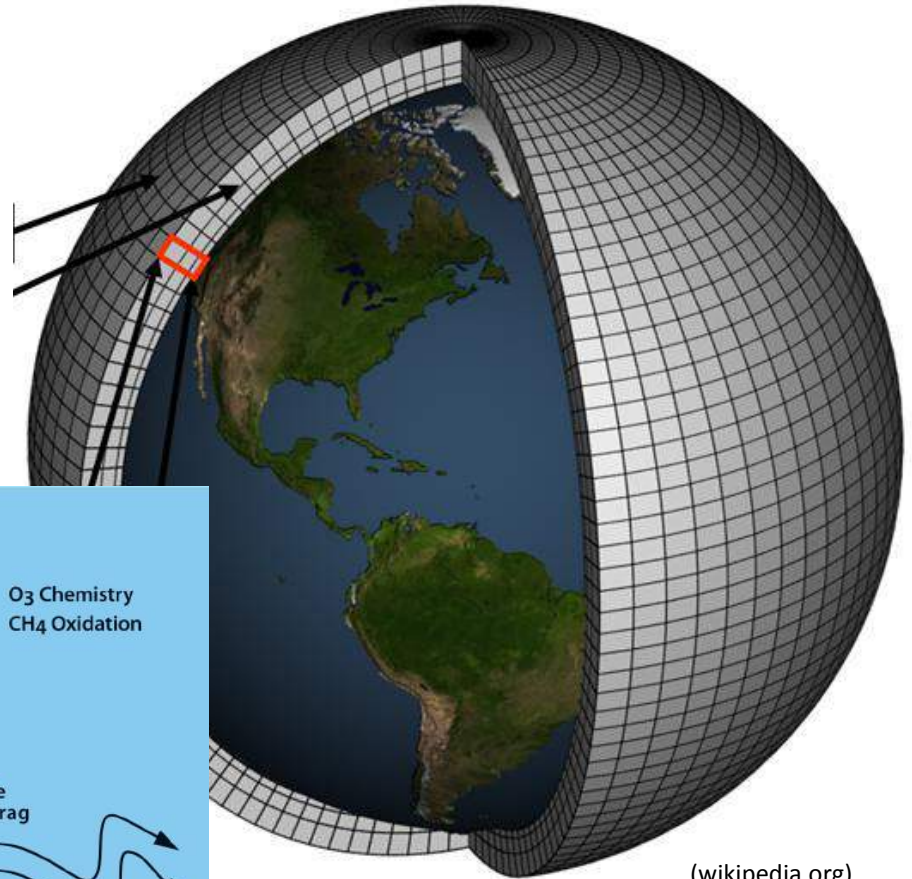
Forecast



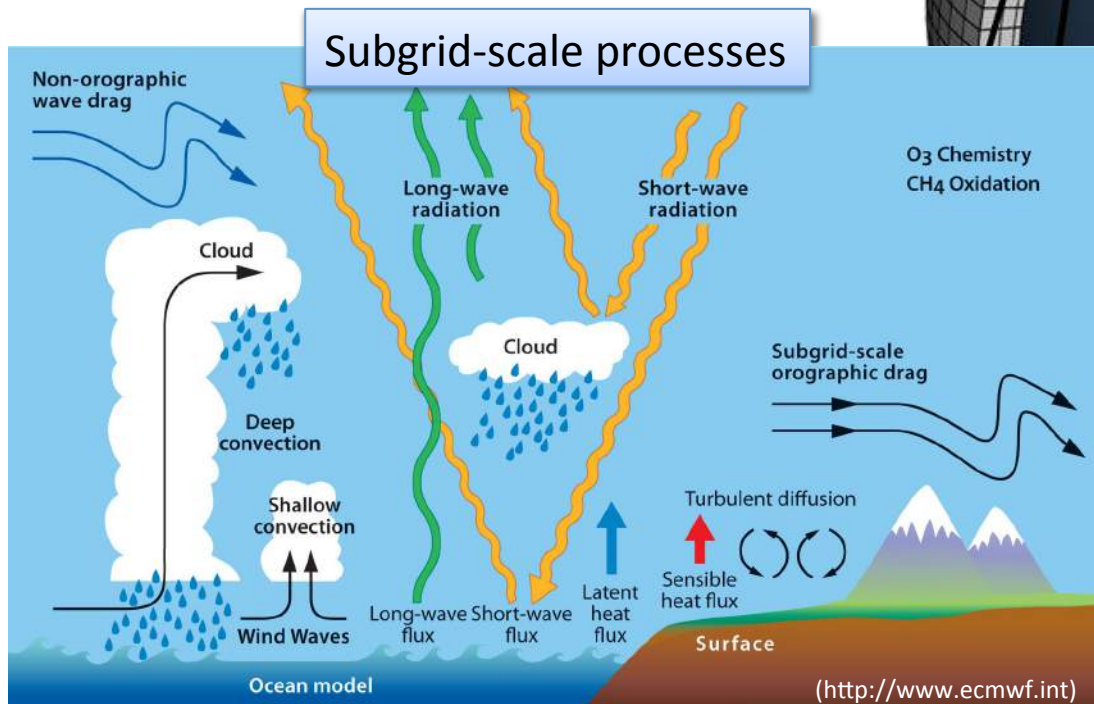
# Numerical weather prediction

## Global atmospheric models

- The atmosphere is covered by a three-dimensional grid
- Equations are solved for each grid cell
- Subgrid-scale processes are calculated by parameterizations



(wikipedia.org)

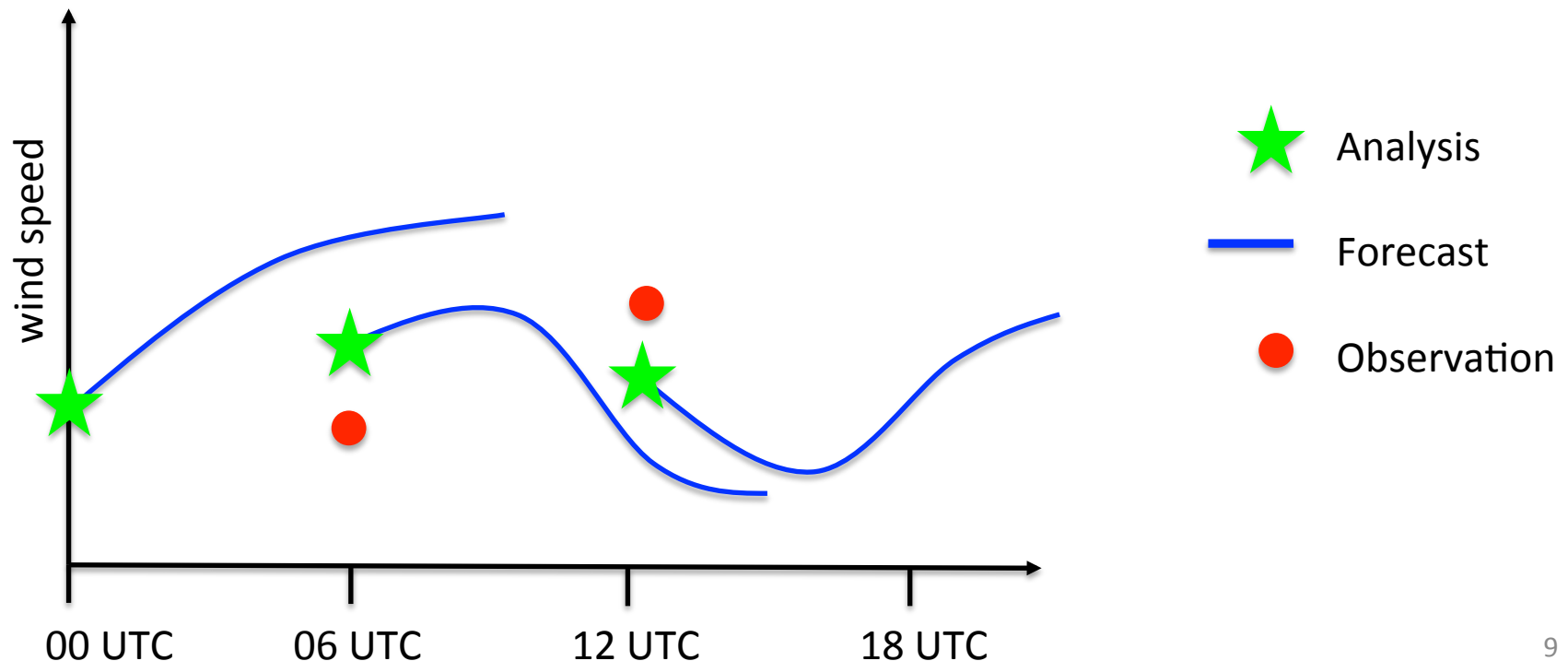




# Numerical weather prediction

## Schematic forecasting cycle

- The **analysis** is the best estimate of the current atmospheric state
- A **forecast** is initialized with the **analysis**
- A new **analysis** is created by combining the latest **forecast** with new **observations** (data assimilation)
- This procedure is repeated at regular time intervals



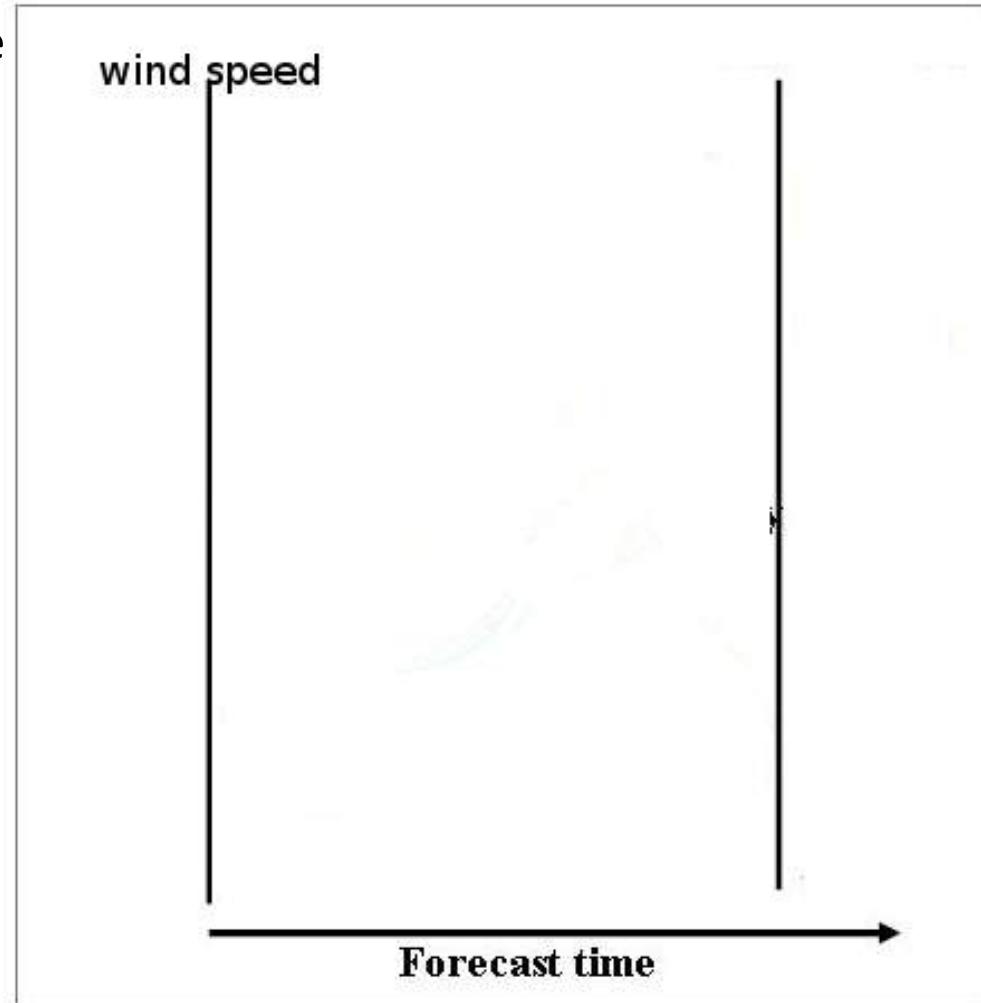
# Numerical weather prediction

## Ensemble prediction systems

- Weather forecasts are very sensitive to the initial conditions
  - Small differences in the analysis can lead to large differences in the forecast

### Keywords

- **Ensemble prediction system (EPS)**
  - several forecasts are made at the same time
- **Ensemble members**
  - individual forecasts of an ensemble
  - perturbed initial conditions
- **Ensemble spread**
  - Forecast uncertainty

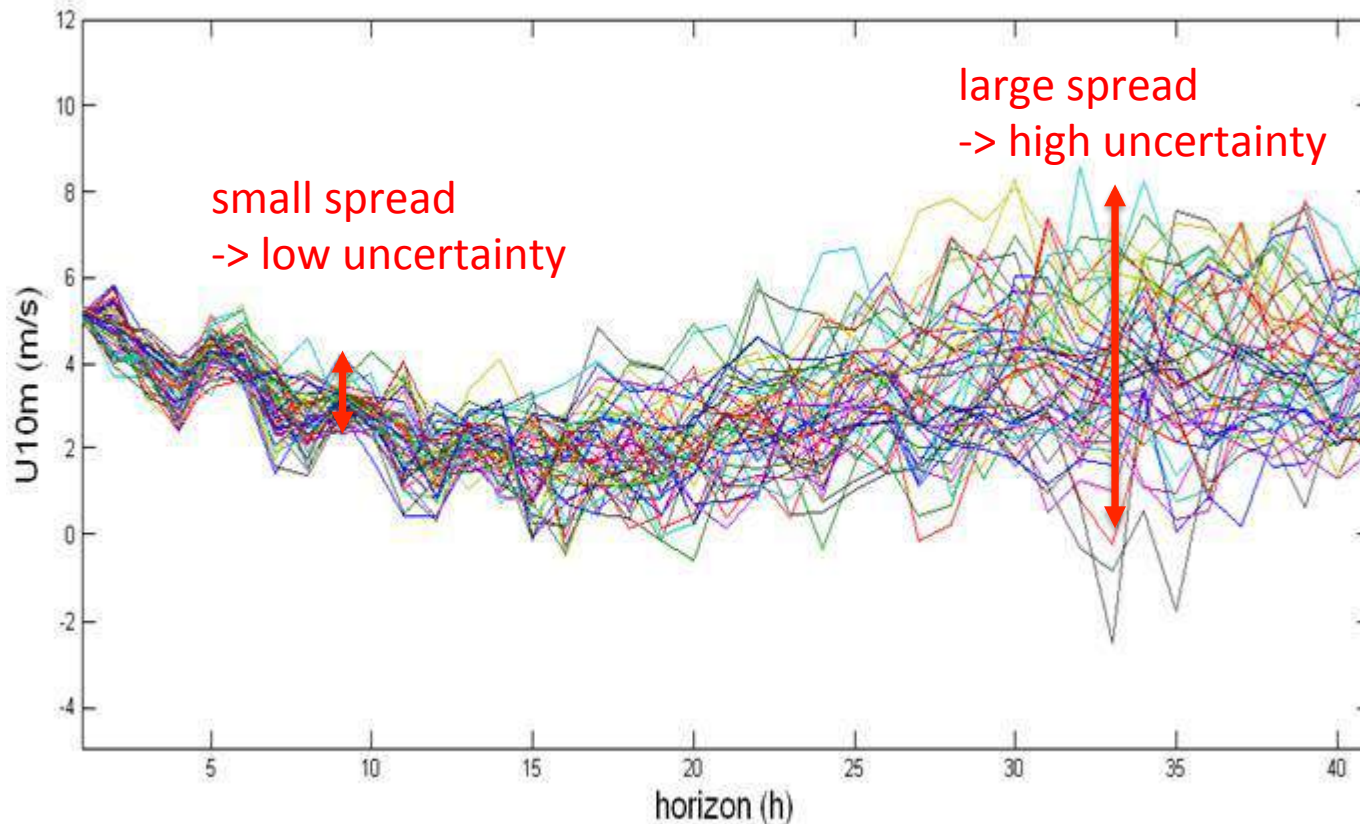


(<http://grida3.crs4.it>)

# Numerical weather prediction

## Ensemble prediction systems

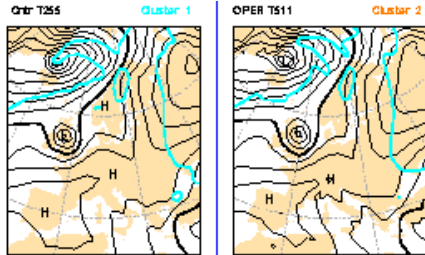
- **Example:** Ensemble forecast of wind speed at 10m height for a wind farm in France



(<http://www.ewea.org/events/workshops/wp-content/uploads/2013/04/Ensemble-prediction-01.jpg>)

# Numerical weather prediction

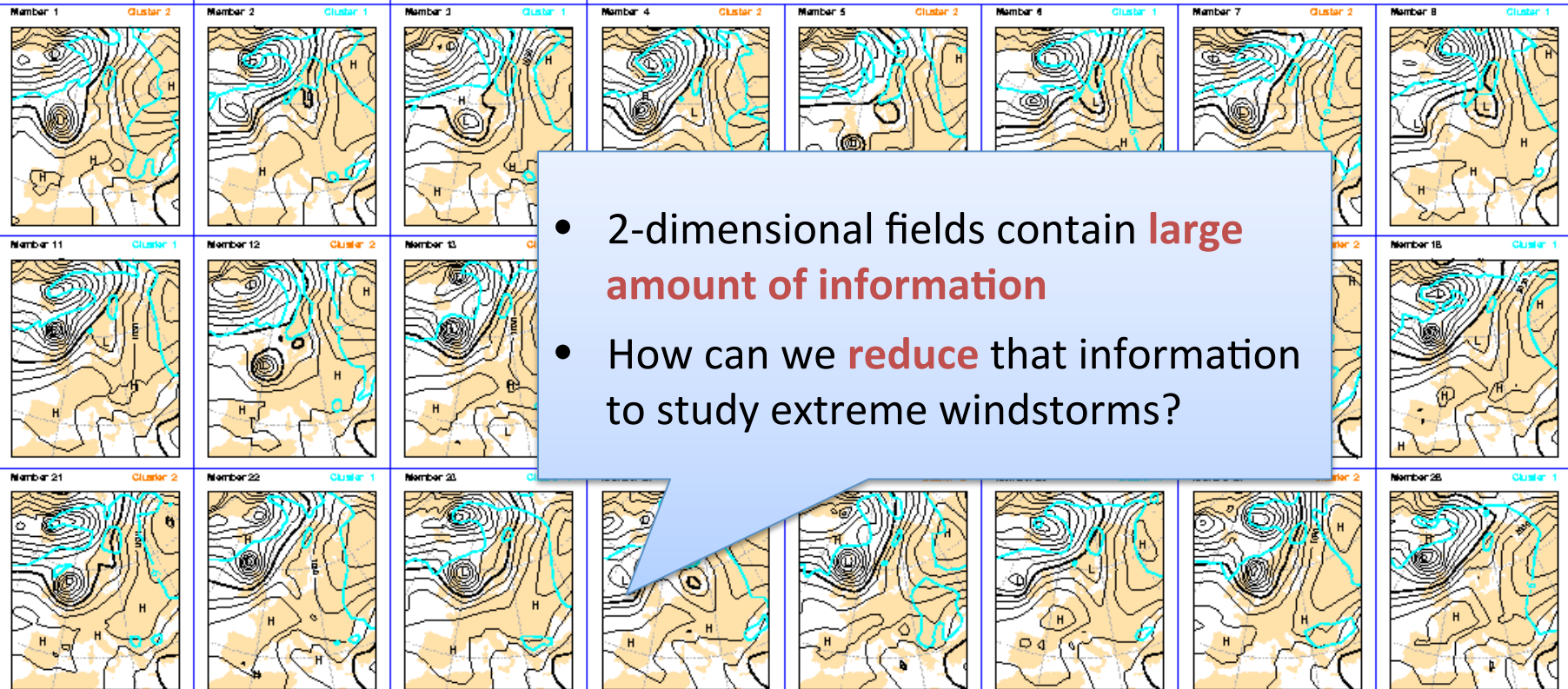
## Ensemble prediction systems



### Ensemble forecasts, ECMWF 3-day forecast for 05 Dec 2001

ECMWF ENSEMBLE FORECASTS

Sunday 2 December 2001 12UTC ECMWF Forecast t+72 VT: Wednesday 5 December 2001 12UTC S  
MSLP (contour every 5hPa) and Temperature at 850hPa (only -8 and 16 isolines are plotted)



- 2-dimensional fields contain **large amount of information**
- How can we **reduce** that information to study extreme windstorms?

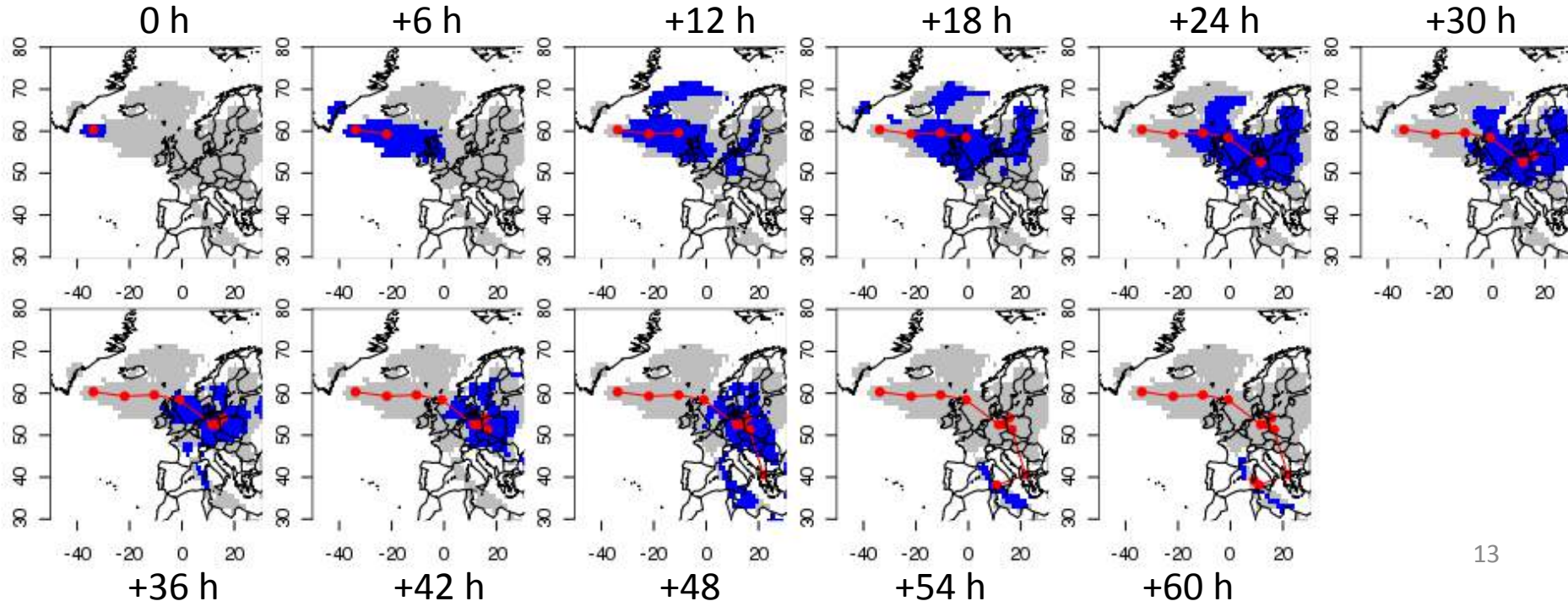


# Identification and tracking of windstorms

2D wind fields

trajectories of windstorms

- How does the tracking work?
  1. Coherent areas of extreme wind speed are identified (>98<sup>th</sup> percentile)
  2. The area centres are tracked in time using a nearest neighbour approach
- Tracking of windstorms allows a **tailored evaluation** focusing on relevant events
- It is possible to assign **intensity measures** to single events

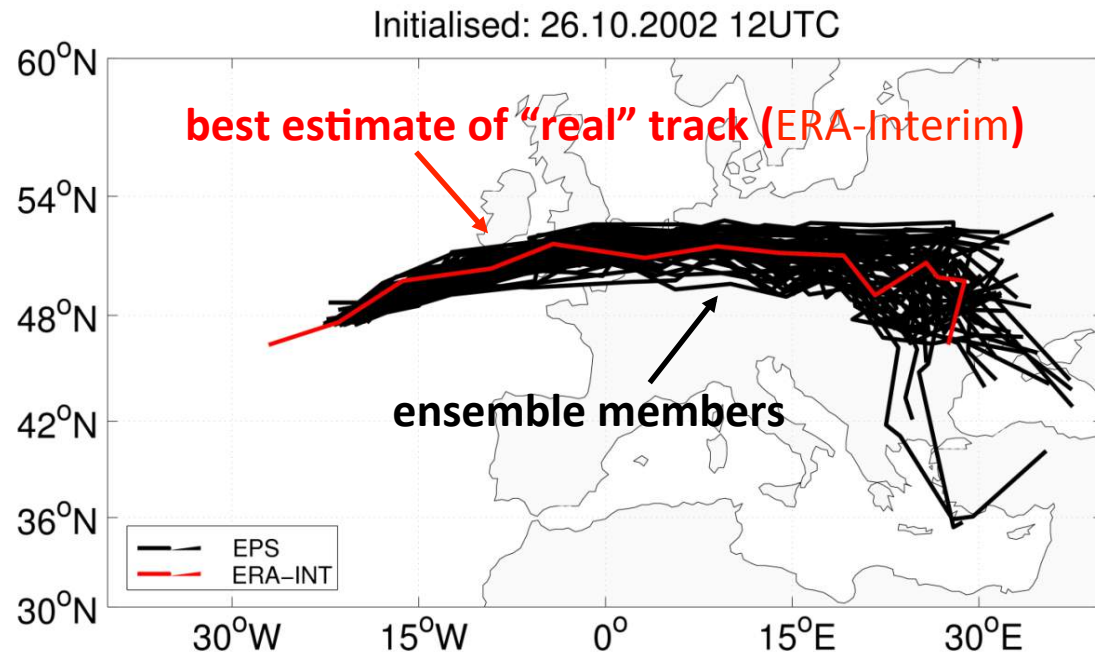


# Data

- **Ensemble Prediction System (EPS) of the European Centre for Medium Range Weather Forecasts (ECMWF)**
- Time period: 01.02.2006 - 25.01.2010, October-March
- 10-day forecasts
- 50 ensemble members, every 12 hours
- **Windstorm tracks are identified** in each forecast and ensemble member

## Example:

Storm „Jeannette“  
26.10.2002 06UTC –  
29.10.2002 12UTC



# Windstorms in the ECM

## Example: 10-day forecast

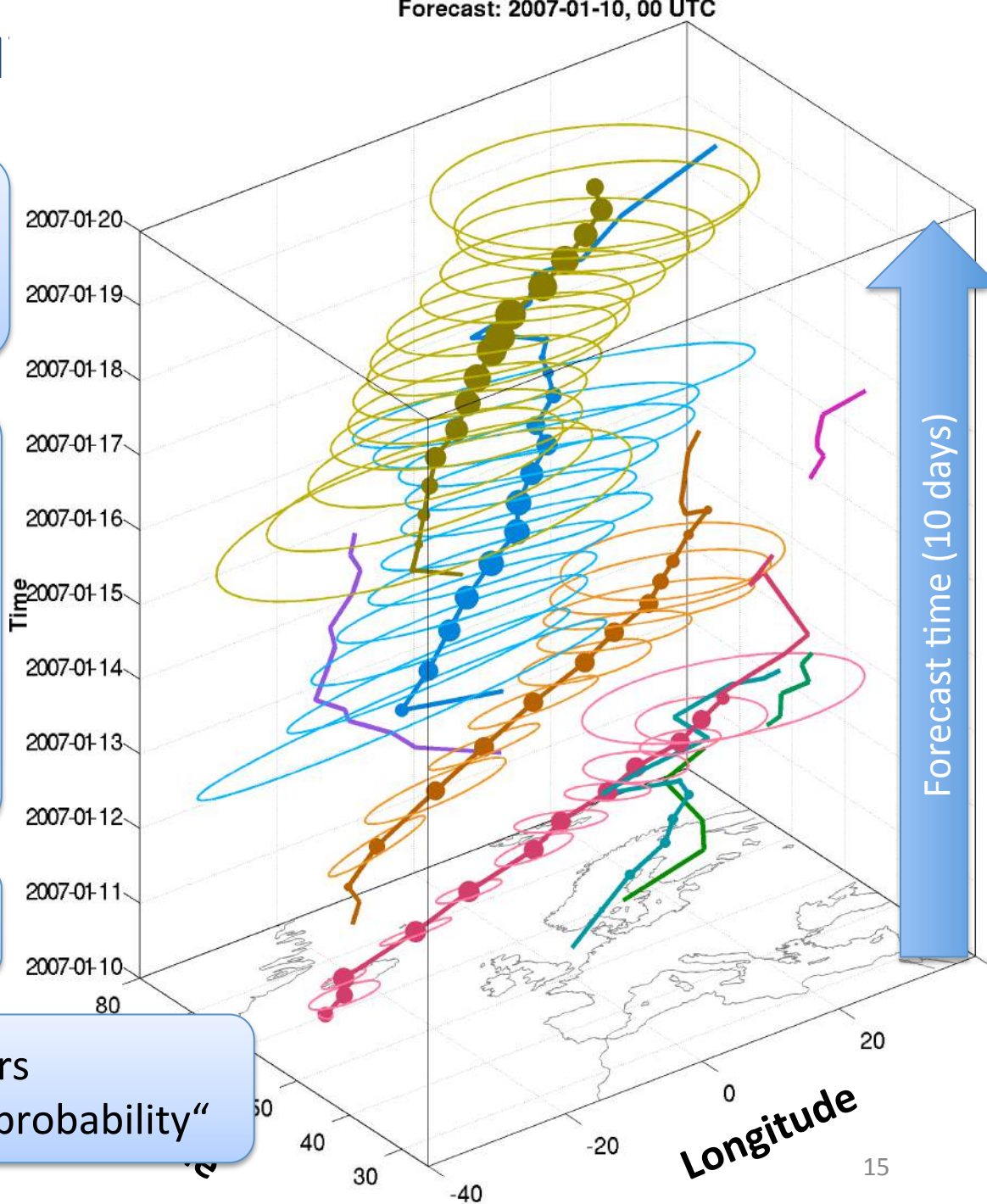
- Initialized on 10 Jan 2007
- 50 ensemble members

## Identification of clusters

- storm cluster = different realizations of the same storm
- matching criteria: distance in space and time

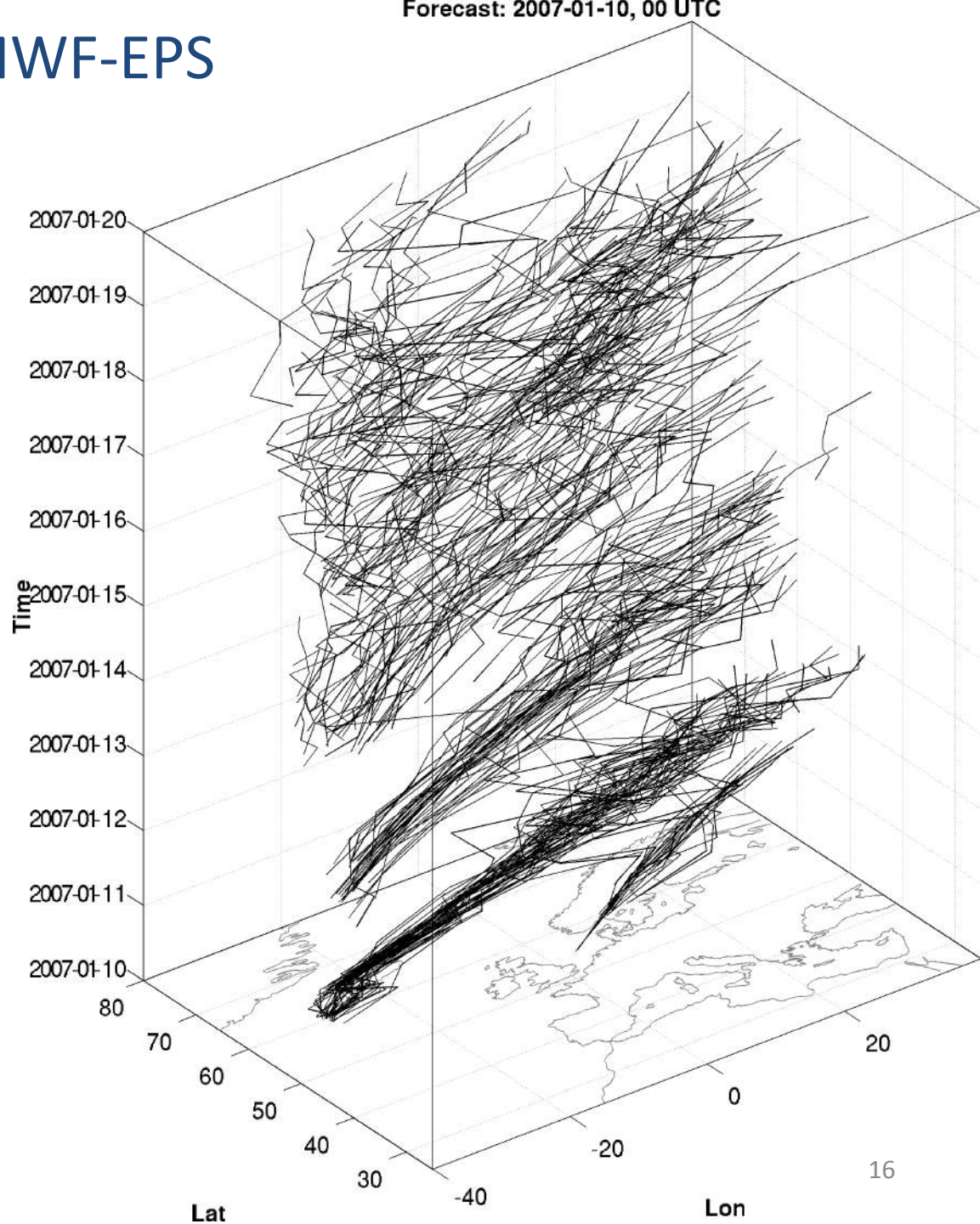
- 9 clusters

- Mean tracks of storm clusters
- Areas with a certain „strike probability“



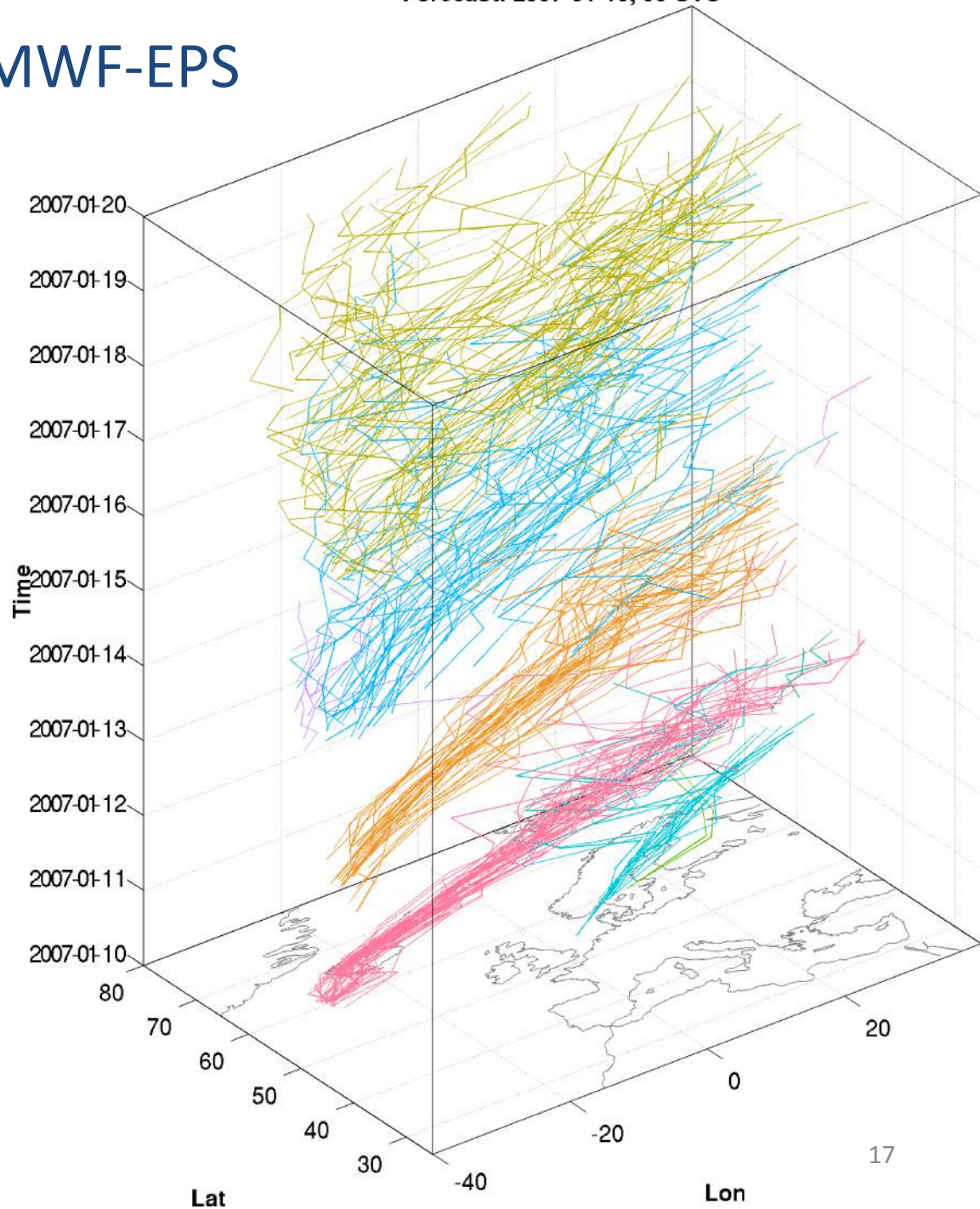


# Windstorms in the ECMWF-EPS

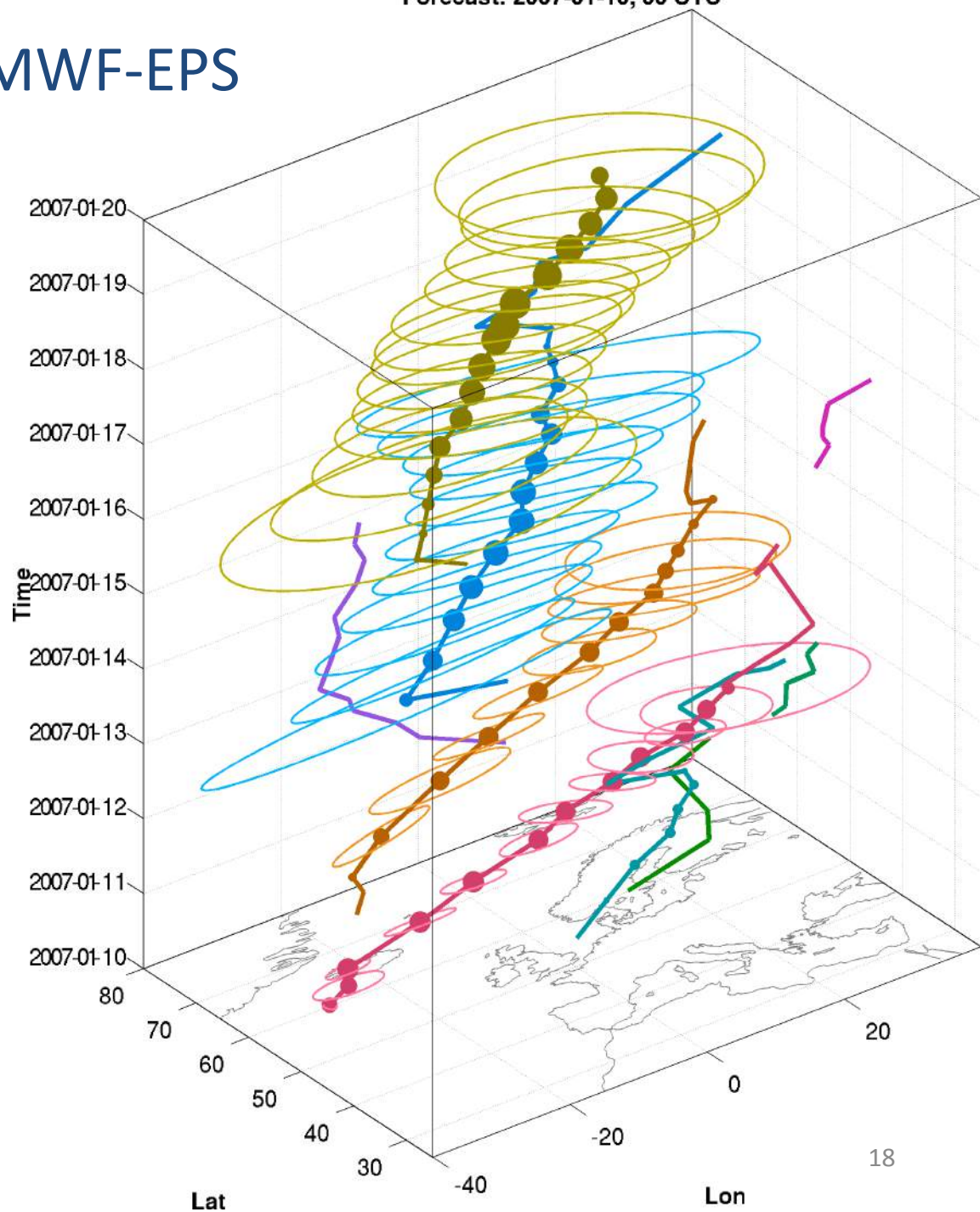




# Windstorms in the ECMWF-EPS

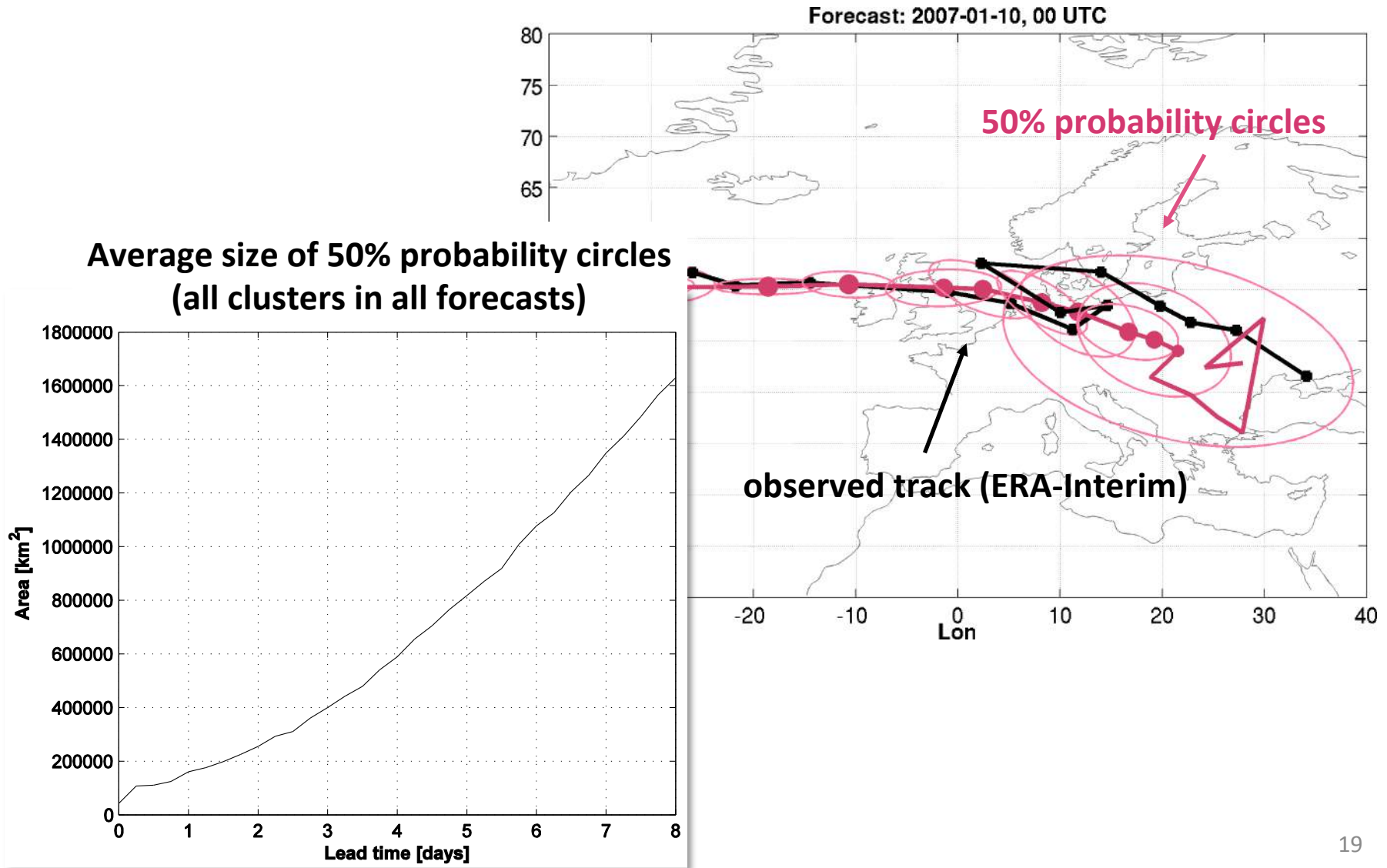


# Windstorms in the ECMWF-EPS



# Windstorms in the ECMWF-EPS

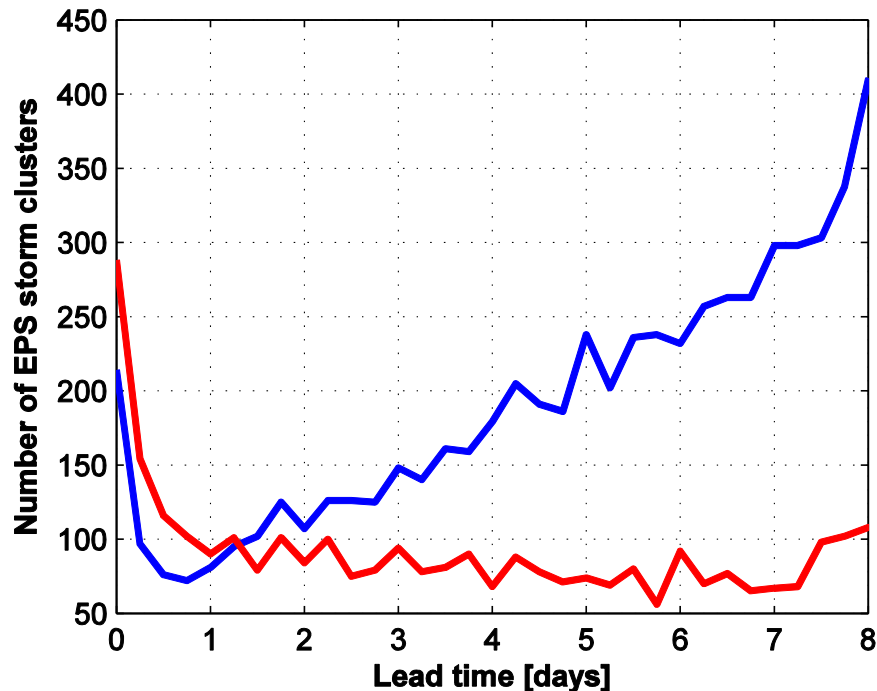
- How does the spatial uncertainty depend on the lead time?



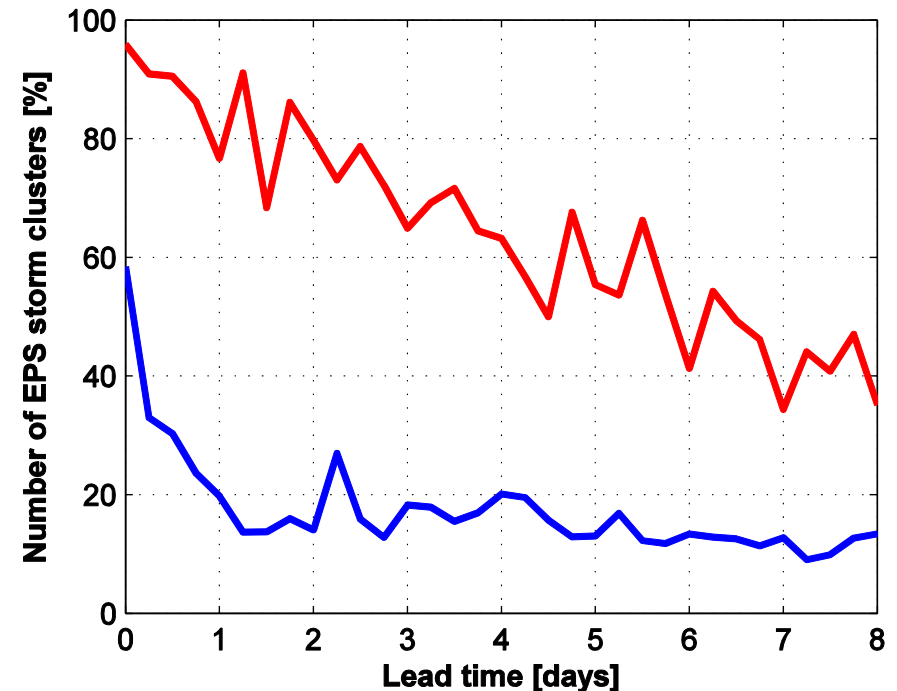
# Windstorms in the ECMWF-EPS

- How many clusters are found in total, depending on lead time
  - Few storm clusters with high probability
  - Increasing number storm clusters with low probabilities at longer lead times
- How many clusters are associated to an **observed storm**?
  - Clusters with a high probability are frequently associated to an observed storm

**Total number of clusters**



**Number of clusters with an observed storm**



clusters with >50% of the members -> high probability

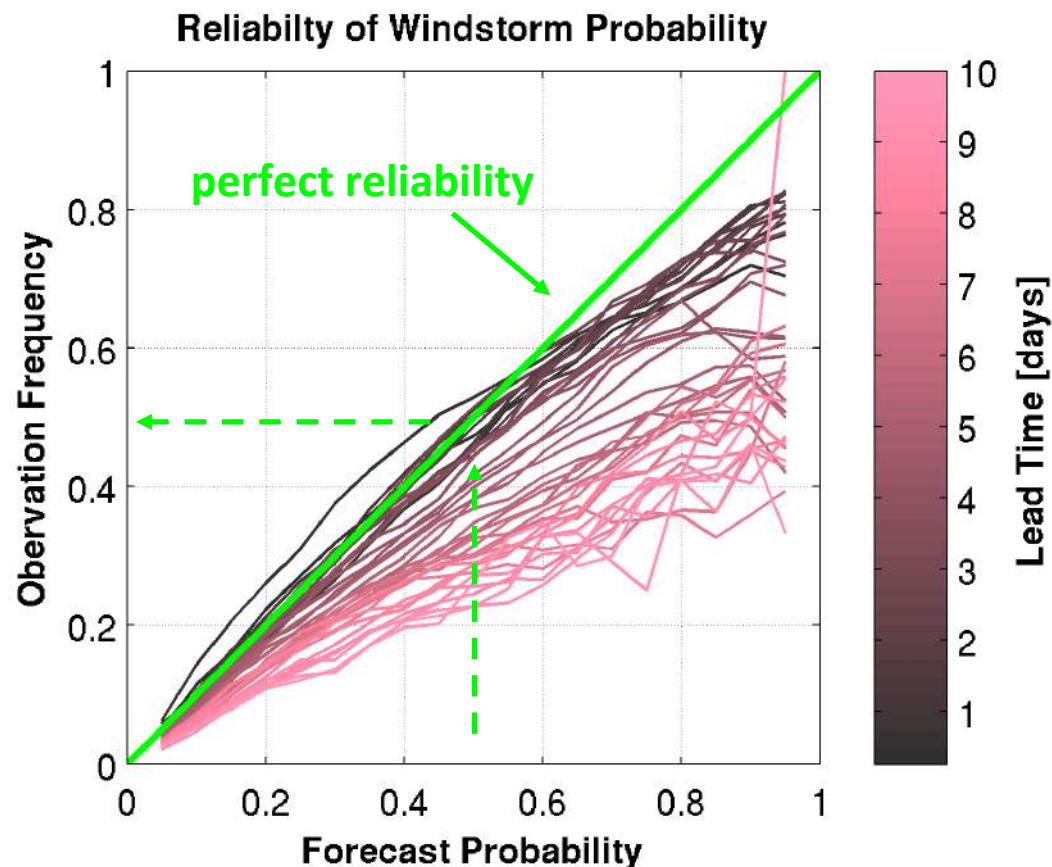
clusters with <50% of the members -> low probability



# Evaluating all storm clusters

- How reliable are the forecasted cluster probabilities?

- Ideally: If an occurrence probability of 50% is predicted 100 times, a storm should be observed 50 times
  - The probability circles are reliable for lead times of around 3 days
  - At lead times larger than 3 days the occurrence probabilities are overestimated



# Summary

- Windstorms caused by extra-tropical cyclones can **cause severe damages**
- Skillful forecasts are necessary
- Ensemble prediction systems provide **forecasts with uncertainty information**
- Tracking of windstorms allows **event-based evaluation** of windstorm predictions
- Windstorms were analyzed in the ECMWF ensemble prediction system
- **Clustering approach** to group different realizations of the same storm
- Forecast probabilities are derived for the storm clusters
- Storm forecasts with high probabilities are frequently related to observed storms
- Probabilities related to the track position **are reliable up to around 3 days lead time**

# RAIN Project

[www.rain-project.eu](http://www.rain-project.eu)

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10m wind speed

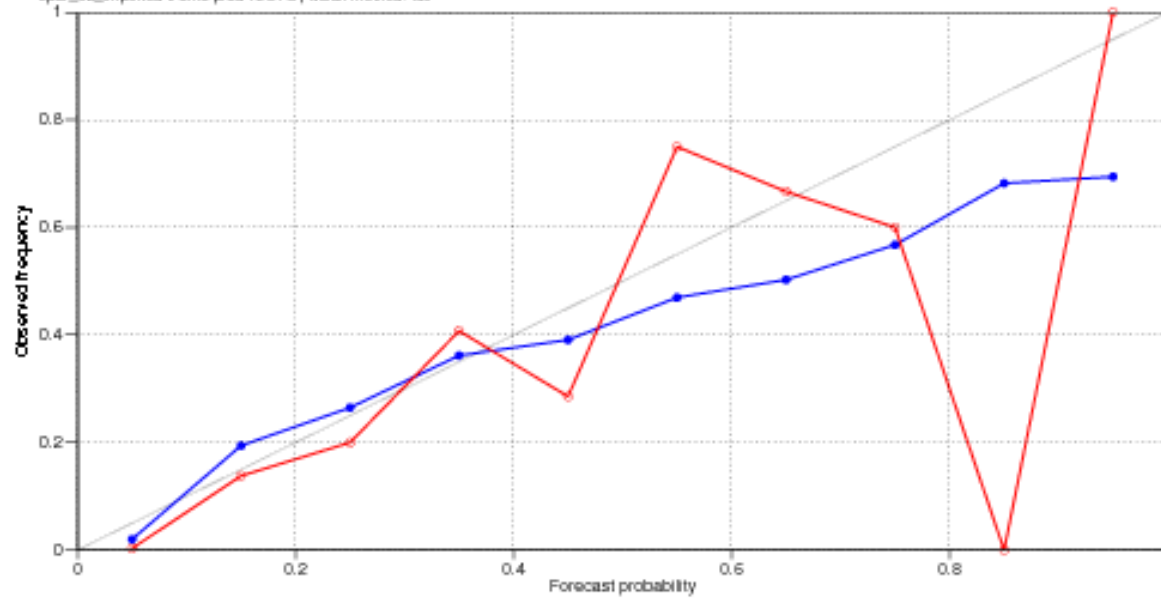
Europe (lat 35.0 to 75.0, lon -12.5 to 42.5)

20150701 12UTC to 20150930 12UTC T+96

oper\_ab\_imported & enfo prod 12UTC | Mean method: fair

value >15.0

value >10.0



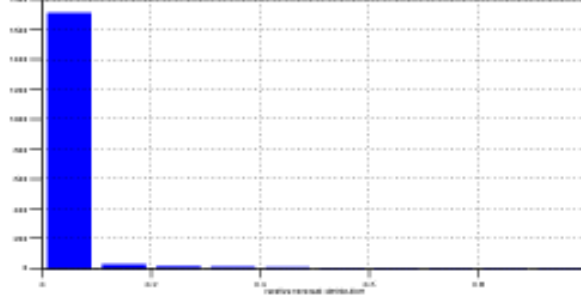
StatScore 10m wind speed

value >10.0

Example: per 1000000 obs, 100000 obs

20150701 12UTC to 20150930 12UTC T+96

oper\_ab\_imported & enfo prod 12UTC | Mean method: fair



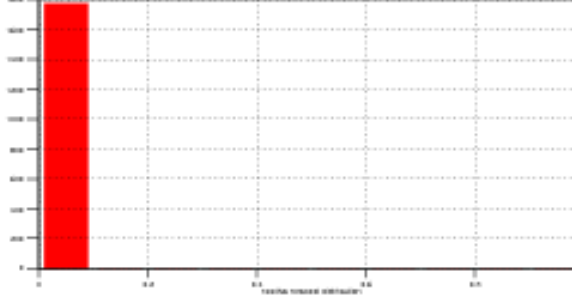
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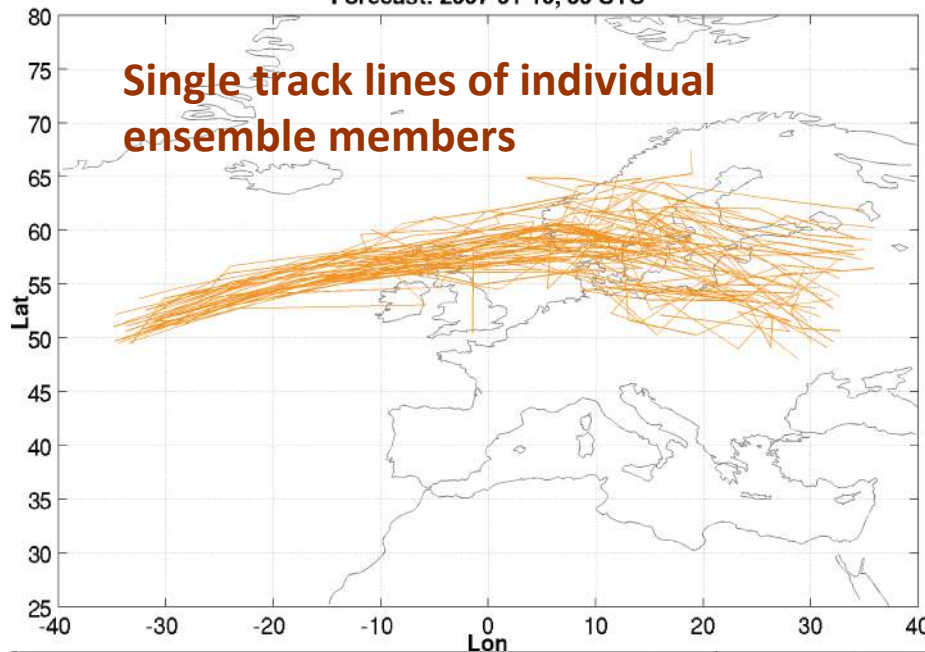


# Predictability of Winterstorms

## Clustering of storms

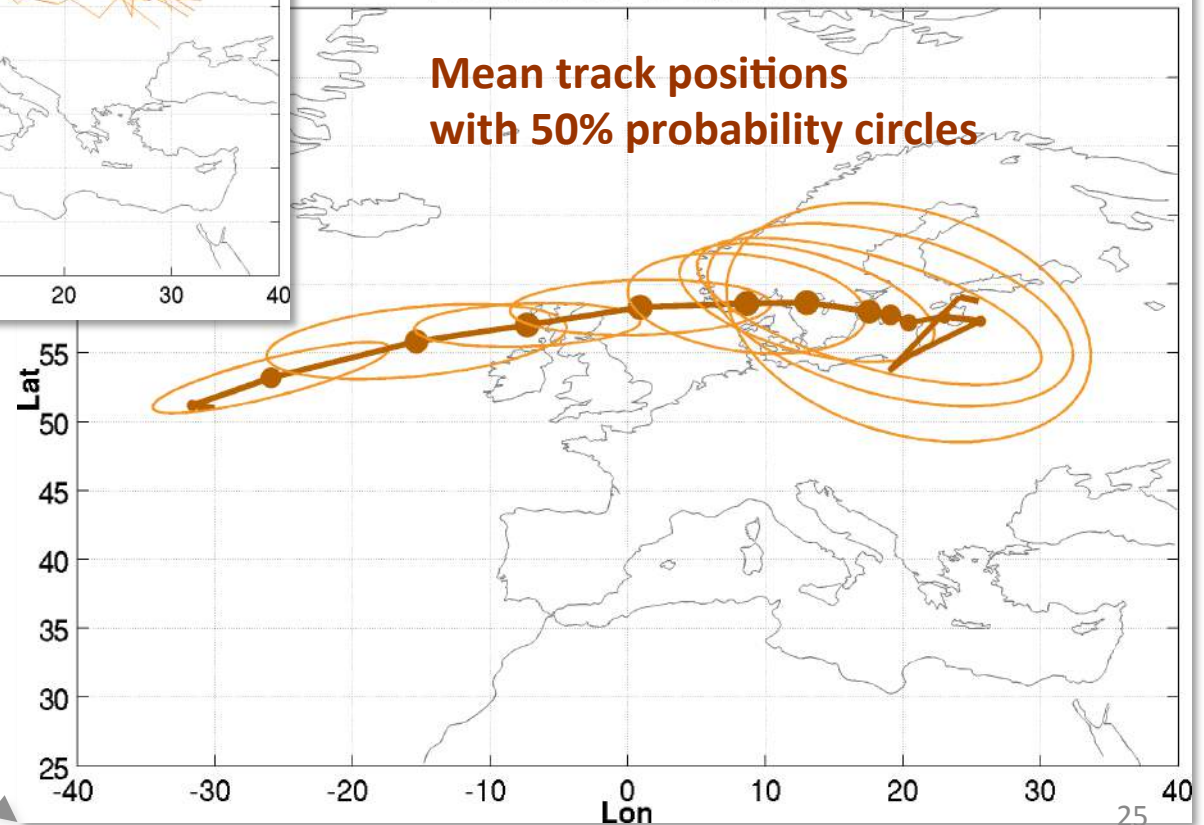
Forecast: 2007-01-10, 00 UTC

**Single track lines of individual ensemble members**



Forecast: 2007-01-10, 00 UTC

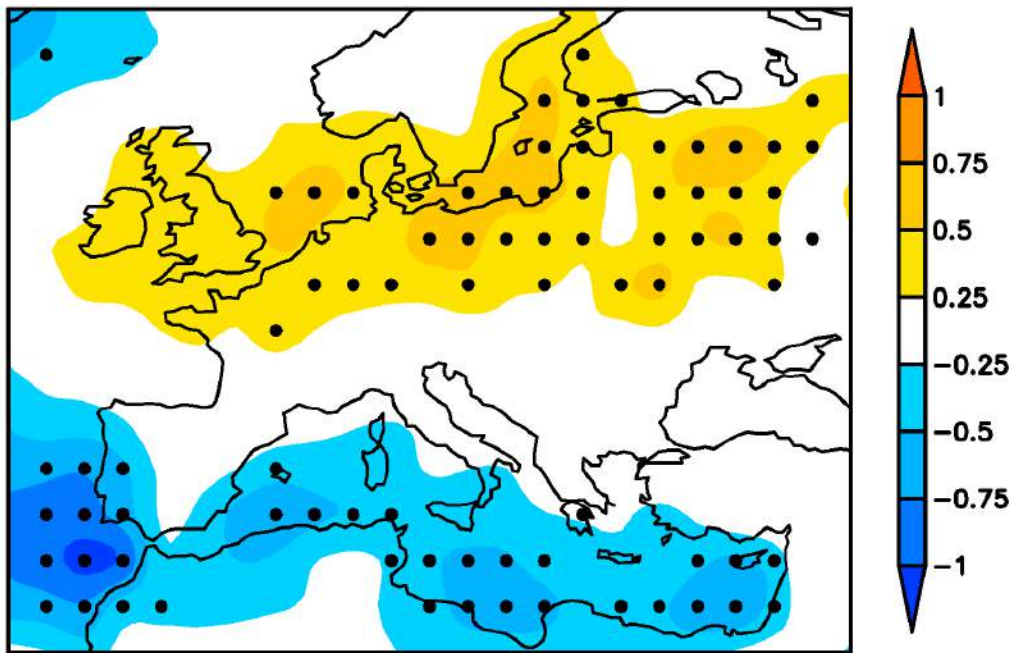
**Mean track positions with 50% probability circles**



# Extratropical Cyclones

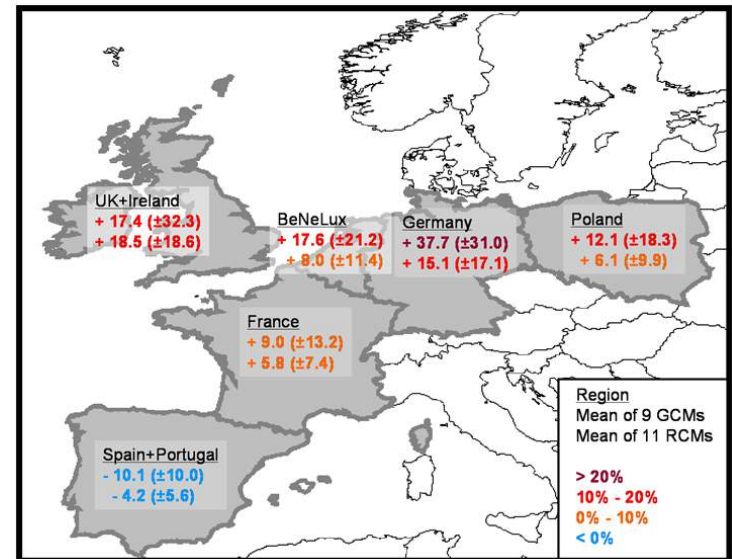
## Windstorms and climate change

98th percentile of wind speeds, changes for A1B (2071–2100)  
relative to 20C (1961–2000):



(Donat et al., 2011)

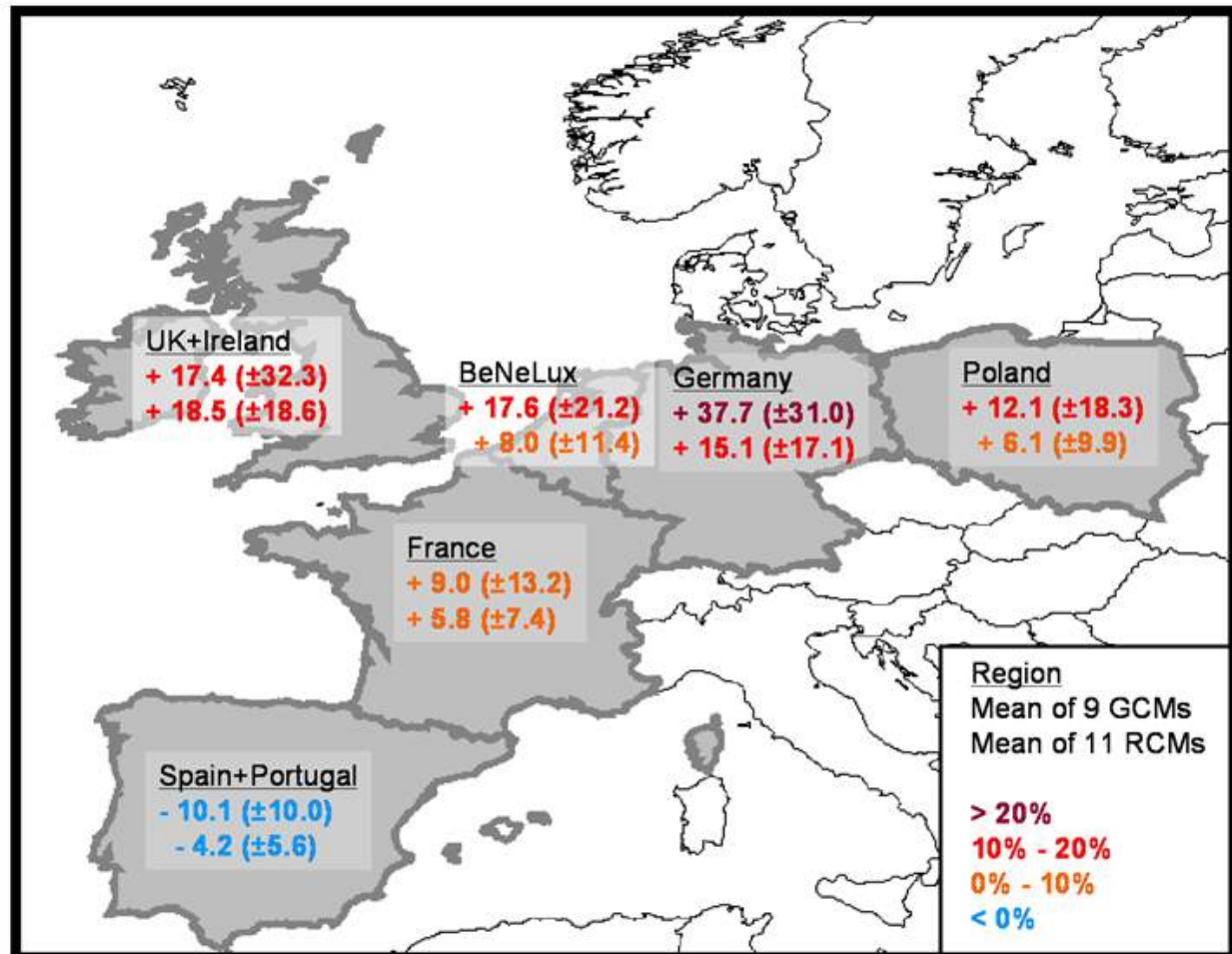
Relative changes (unit: %) of  
mean annual storm loss potential  
for A1B (2071–2100) relative to  
20C (1961–2000)



# Extratropical Cyclones

## Windstorms and climate change

Relative changes (%) of mean annual **storm loss potential** for A1B (2071–2100) relative to 20C (1961–2000)



(Donat et al., 2011)