

# Ensemble Prediction Systems Applied to Aeronautics



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# THE GOAL!

The aim of this project is to develop a new product with the purpose of making probabilistic interpretation of forecasts from the **Ensemble Prediction System** for specific grid points (**epsgram**).

In particular, the application focuses on a new tool to help forecasters to elaborate the very short range **airport** forecasts (**TAF**).

# OUTLINE

## Goal

**1. Motivation**

**2. Features**

**3. Methodology**

**4. Results**

**5. Searching the best method (ongoing work)**

**6. Conclusions**

**Acknowledgements**

**References**

1. Motivation

# Terminal Aerodrome Forecasts (TAF)

A concise statement of the expected meteorological conditions at an airport during a specified period (24 hours) (*Aviation Weather Center*)

Apply to approximately **8 km** radius from the centre of the airport runway complex

```

TAF LEBL 310500Z 3106/0106 34008KT 9999 FEW020
TX22/3113Z TN13/0105Z
BECMG 3111/3113 VRB04KT
PROB40 TEMPO 3118/3122 07010KT
TEMPO 3112/3118 SHRA SCT018TCU
PROB30 TEMPO 3112/3118 4000 TSRA SCT018CB=
    
```

(Ogimet)

Meteorological Elements in TAFs
Surface Wind
Visibility
Weather Phenomena (moderate/heavy precipitation, thunderstorm, etc.)
Cloud
Temperature

Use of Probability Groups
PROB30
PROB40
Use of Change Groups
BECMG
TEMPO

Prepared by the meteorological office designated by the meteorological authority concerned (*Meteorological Service for International Air Navigation, WMO*)

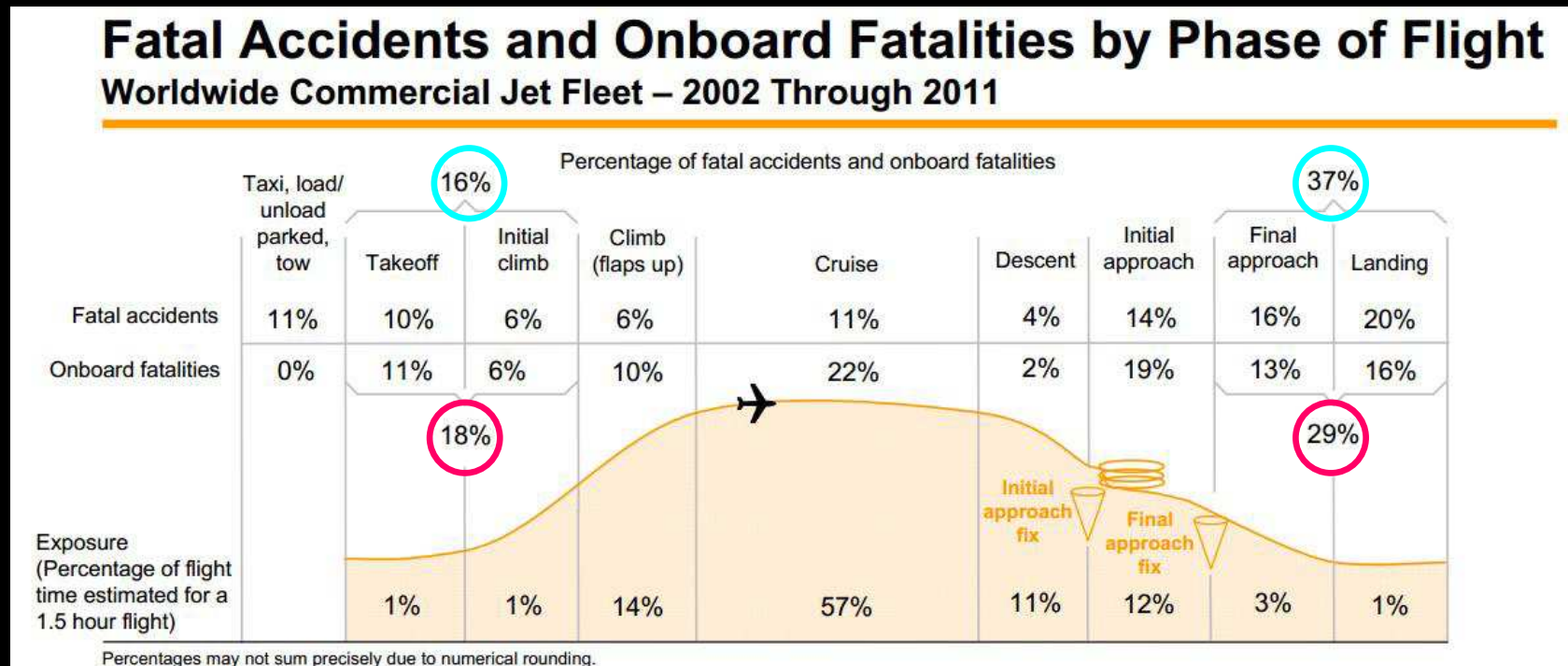
*“La Agencia Estatal de Meteorología... condición de autoridad meteorológica aeronáutica...” (B.O.E. número 39, 14 de febrero de 2008)*

1. Motivation

# Aeronautical Meteorology

Aviation Weather Hazards: turbulence, aircraft icing, reduced visibility, volcanic ash clouds

Accidents:

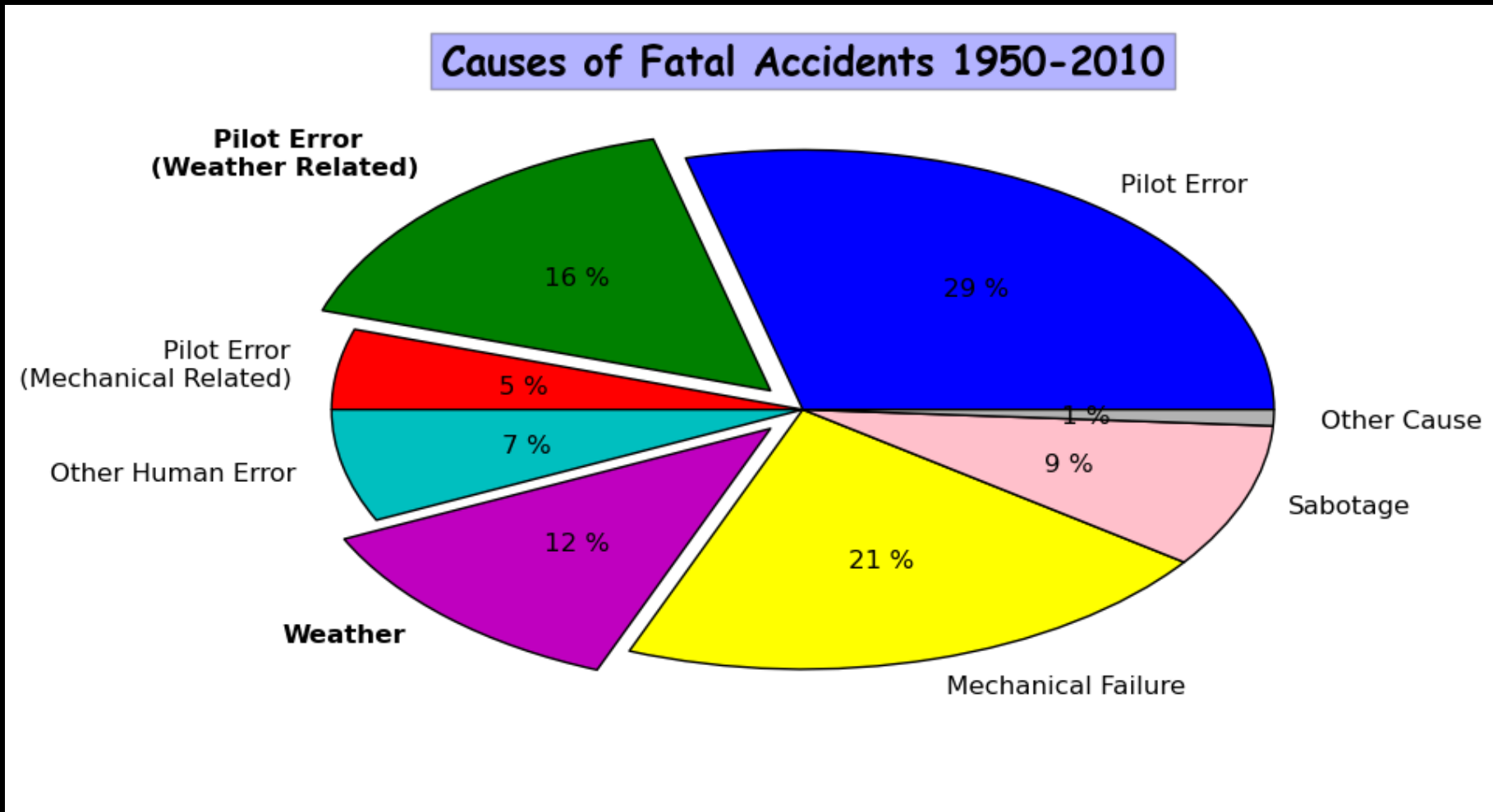


Worldwide Commercial Jet Fleet, 2002-2011

16% + 37% = 53% of fatal accidents in the vicinity of airports

18% + 29% = 47% of onboard fatalities in the vicinity of airports

## 1. Motivation



Data: Plane Crash Info

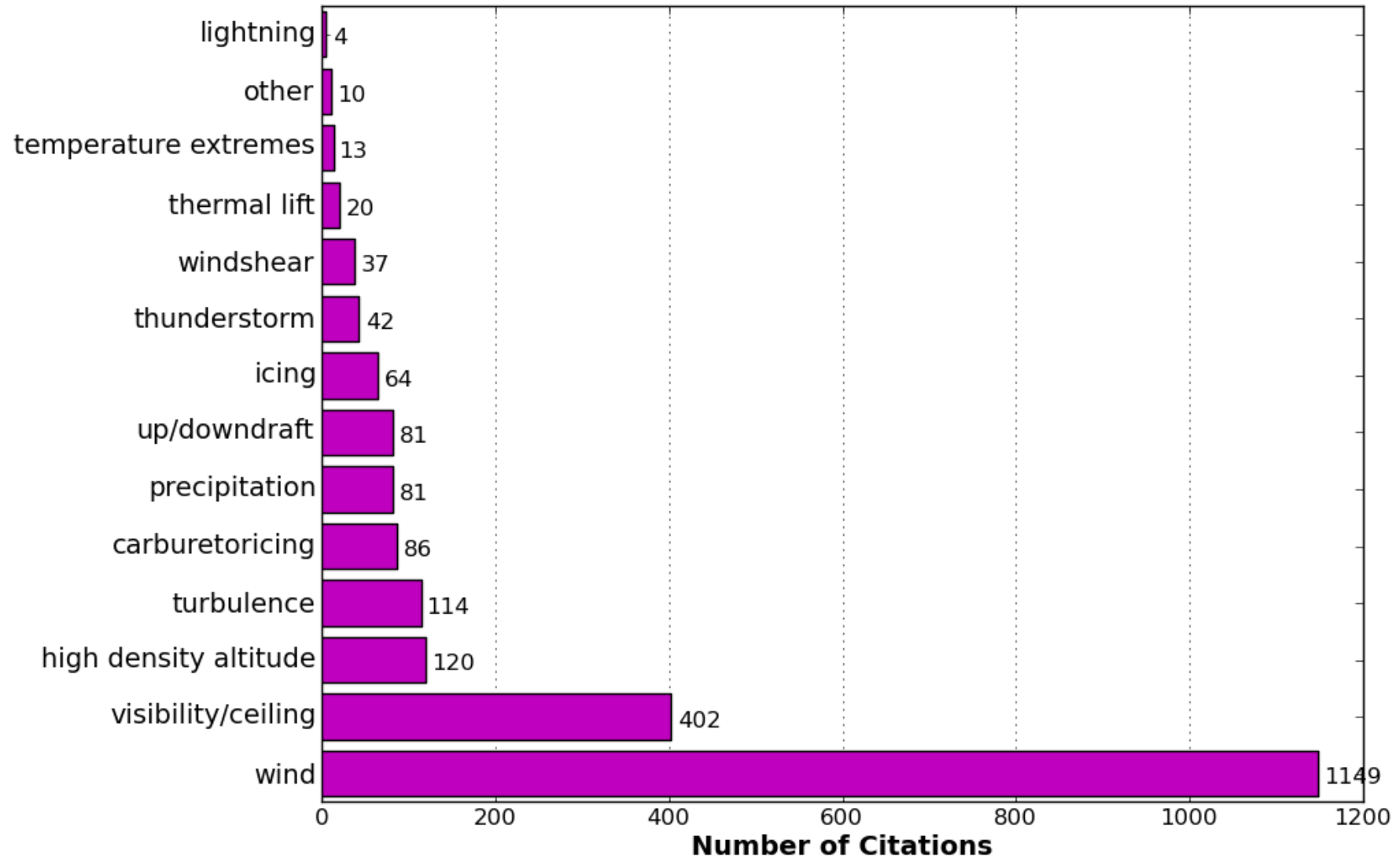
**12 % + 16 % = 28 %** of accidents in which WEATHER was the cause

# 1. Motivation

## Ensemble Prediction Systems Applied to Aeronautics

Data: NTSB Aviation Accident and Incident Database

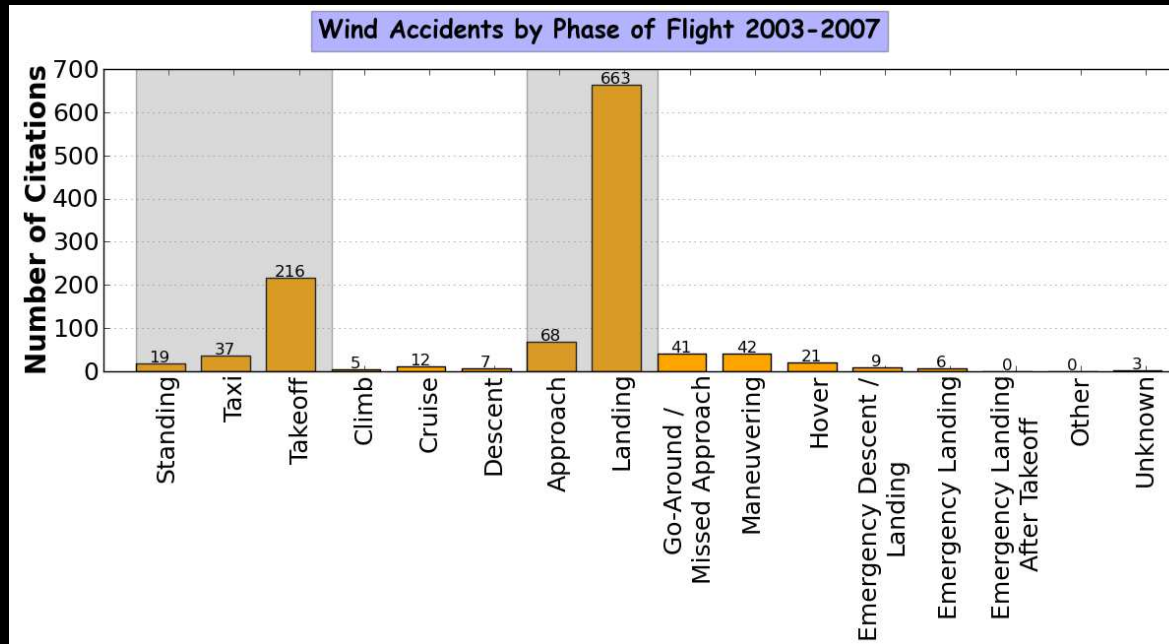
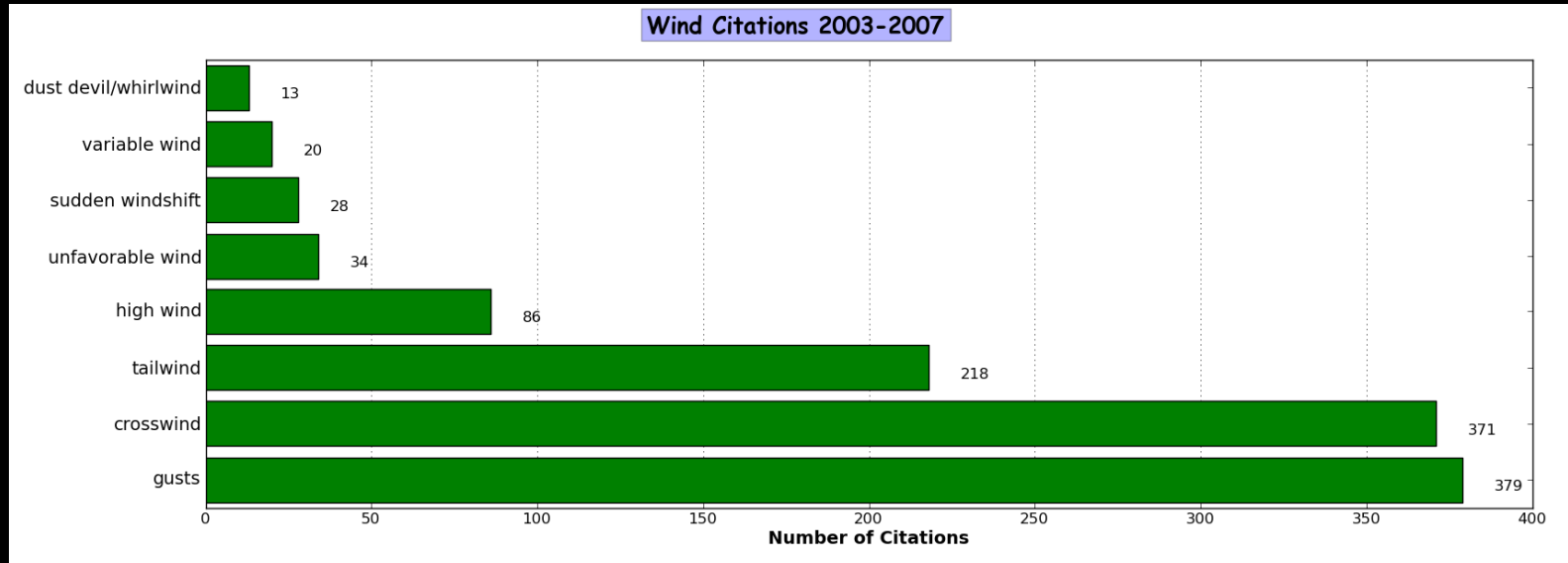
Breakdown of Weather-related Accident Citations 2003-2007



# 1. Motivation

## Ensemble Prediction Systems Applied to Aeronautics

Data: NTSB Aviation Accident and Incident Database



# 1. Motivation

## Ensemble Prediction System (EPS)

From the point of view of the primitive equations, the atmosphere is considered as a chaotic non-linear system (Lorenz, 1963)



Eduard Lorenz  
(1917-2008)

Errors and/or uncertainties in:

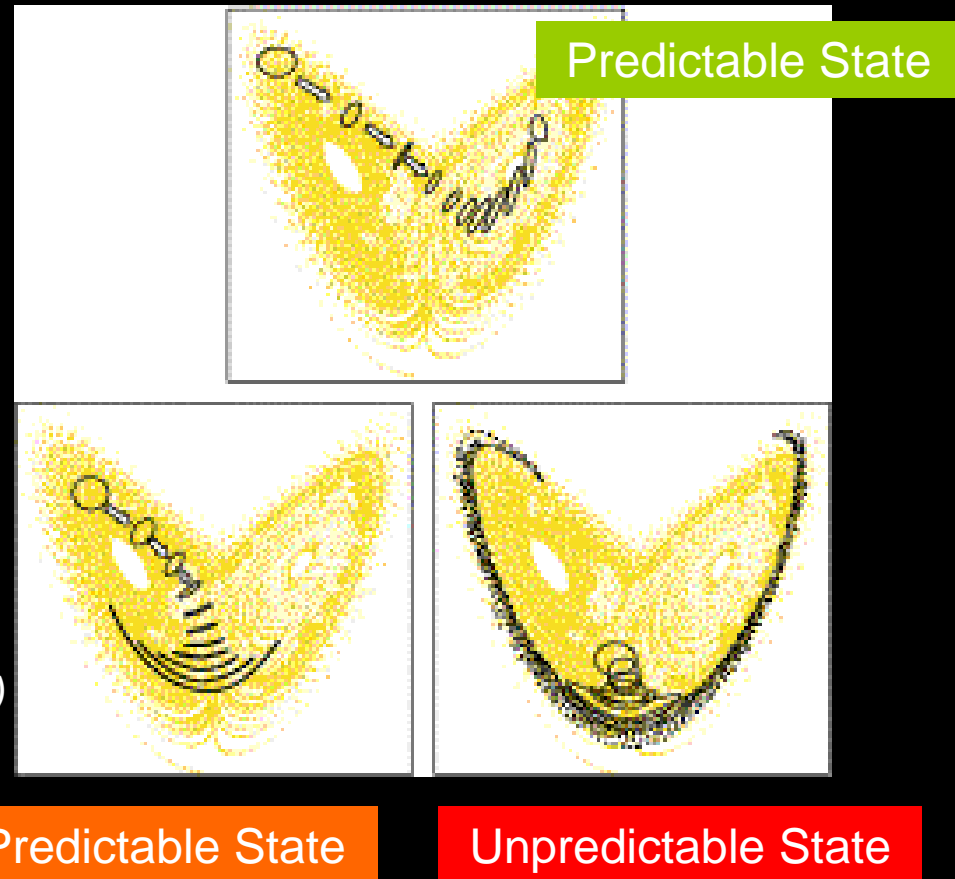
- Initial Conditions
- Numerical Weather Prediction



Loss of Atmospheric Predictability

(García-Moya et al., 2010;  
Callado et al., 2013)

The Lorenz “butterfly” Attractor

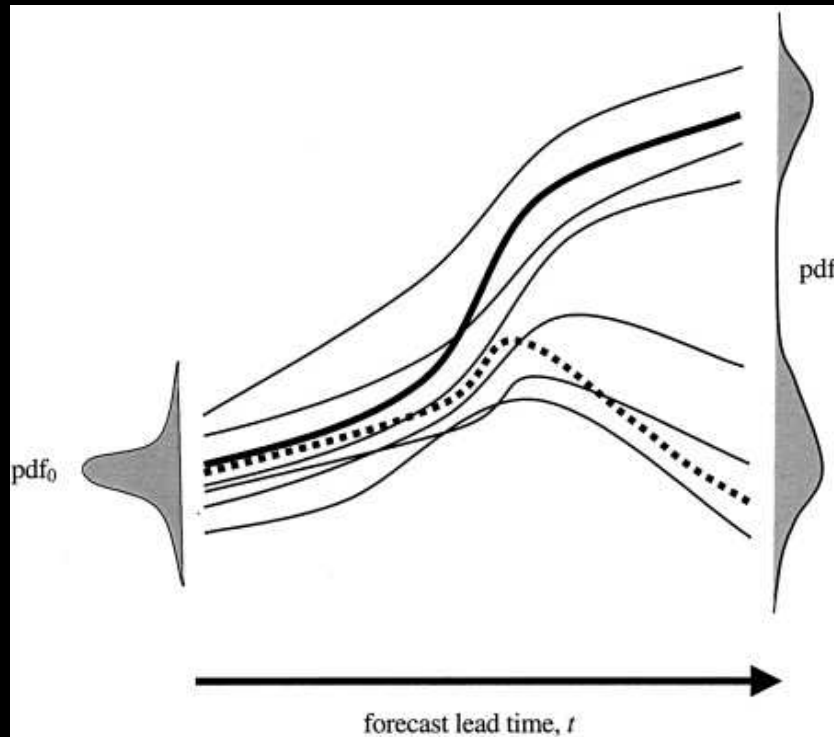


## 1. Motivation

Deterministic Modelling Techniques → single forecast

EPS → suite/ensemble of predictions (estimate the probability distribution function of forecast states)

(Buizza et al., 2005)



pdf <sub>0</sub>	initial uncertainties
	single forecast
	future state
	ensemble of perturbed forecasts
pdf <sub>t</sub>	estimated pdf

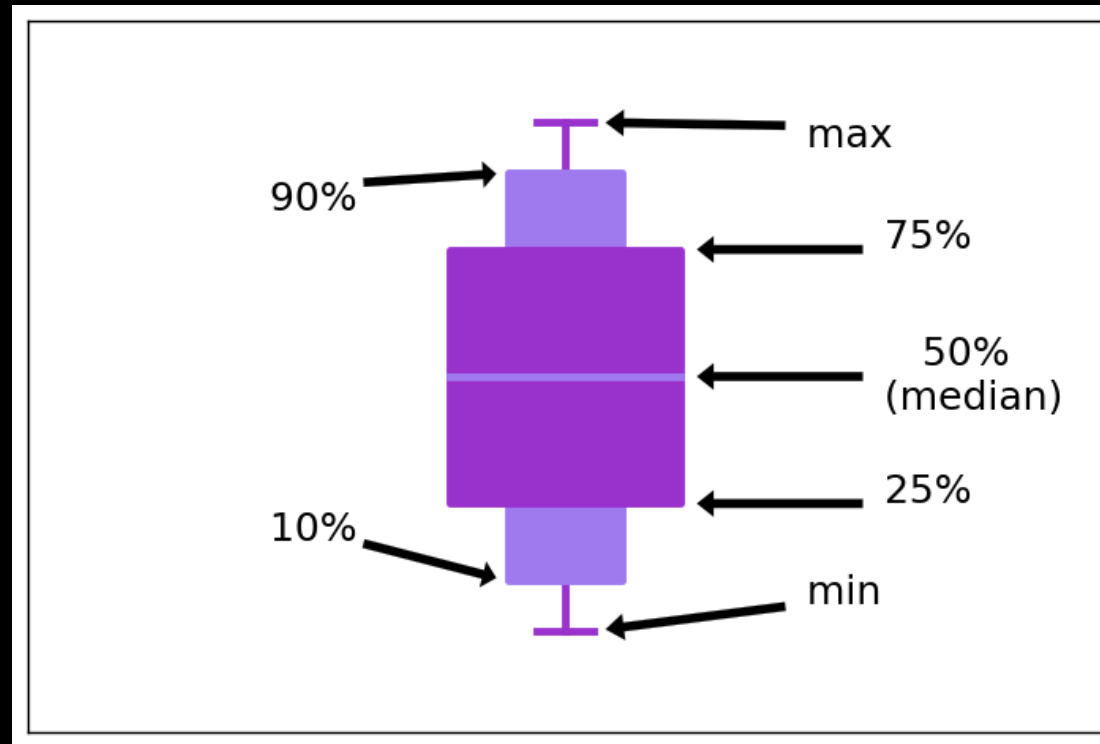
### SREPS: Short-Range EPS

EPS	Resolution	Main Feature
ECMWF-EPS	~30 km	50 members + control (non-perturbed analysis)
AEMET-SREPS	~25 km	Multi-model multi-boundaries (20 members)
AEMET- $\gamma$ -SREPS	~2.5 km	Based on HARMONIE non hydrostatic model (testing phase)

## 1. Motivation

### EPS meteogram = epsgrams

Probabilistic interpretation of forecasts from the EPS for specific locations, describing the probabilistic distribution of each step (*Persson, 2011*)



Epsgrams are considered as a measure of uncertainty and predictability of the forecast (*Callado, Escribà, García-Moya, Montero, Santos, Santos-Muñoz, Simarro, 2013*)

## 2. Features

### Epsgrams for all airports in Spain

- Generated every 6 hours
- Showing parameters in TAF

Meteorological Elements in TAF	Epsgrams Used to (Aeronautical) Forecast
Surface Wind	10m Wind Velocity, Direction and Gust
Visibility	2m Temperature, Dew Point and Visibility
Weather	Precipitation
Cloud	Low, Medium and High Cloud Cover
Temperature	2m Temperature

### Adaptability

- To any EPS (GRIB1 & GRIB2 format)

### Dinamism

- Percentiles to show
- Number of steps

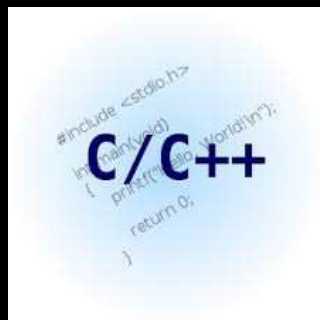
## 2. Features

### Operational

- ❑ Feedback comments from aeronautical forecasters
- ❑ Optimal use for aeronautical forecasters

### Programming Languages

- ❑ Use of classes (in Python)



## 2. Features

# epsgrams.py

- ❑ Python package being developed

The screenshot shows the documentation page for EPSgrams 0.1. At the top, it says 'EPSgrams 0.1 documentation' with links for 'NEXT', 'MODULES', and 'INDEX'. The main heading is 'Welcome to EPSgrams' documentation!'. Below this, there is a 'Contents:' section with a list of links: Introduction, Ensemble Prediction Systems, Epsgrams, Download, Epsgrams module, and Examples. The Examples section is expanded to show three sub-items: Example 1 - Simple Epsgram, Example 2 - Temperature Epsgram, and Example 3 - Precipitation Epsgram. On the right side, there is a 'TABLE OF CONTENTS' section with three items: Introduction, Epsgrams module, and Examples. Below that is a 'SEARCH' section with a text input field, a 'Go' button, and a prompt to 'Enter search terms or a module, class or function name.'

EPSgrams 0.1 documentation

[NEXT](#) | [MODULES](#) | [INDEX](#)

## Welcome to EPSgrams' documentation!

Contents:

- [Introduction](#)
  - [Ensemble Prediction Systems](#)
  - [Epsgrams](#)
  - [Download](#)
- [Epsgrams module](#)
- [Examples](#)
  - [Example 1 - Simple Epsgram](#)
  - [Example 2 - Temperature Epsgram](#)
  - [Example 3 - Precipitation Epsgram](#)

## Indices and tables

- [Index](#)
- [Module Index](#)
- [Search Page](#)

## TABLE OF CONTENTS

[Introduction](#)

[Epsgrams module](#)

[Examples](#)

## SEARCH

Enter search terms or a module, class or function name.

## 2. Features

# Ensemble Prediction Systems Applied to Aeronautics

### EPSgrams 0.1 documentation

[PREVIOUS](#) | [NEXT](#) | [MODULES](#) | [INDEX](#)

## Introduction

**Release:** 0.1

**Date:** February 07, 2013

Welcome!

I welcome you to Epsgrams module web page.

The [Ensemble Prediction Systems](#) and [Epsgrams](#) sections provide a brief description about this type of forecasts and their interpretation respectively. [Download](#) section contains the file you need to apply this module written in Python. [Epsgrams module](#) contains both classes and methods (with their arguments) which are part of this module.

## Ensemble Prediction Systems

An ensemble forecast is simply a collection of two or more forecasts verifying at the same time. Because of chaotic behaviour of the atmosphere, small errors in the initial conditions of a NWP model can lead to large errors in the forecast. Apart from that, a NWP model itself is not perfect and observations are uncertain and incomplete. Ensemble systems provide a possible way to estimate the probability distribution function of forecast states. If you are not familiar with these concepts I encourage you to visit these websites:

- [User guide to ECMWF forecast products](#) (Anders Persson, 2011)
- [The Ensemble Prediction System - Recent and Ongoing Developments](#) (T N.Palmer, R.Buizza, M. Leutbecher et al., 2007)
- [Predictability and ensemble forecasting](#) (ECMWF)
- [Predictability of short-range forecasting: a multimodel approach](#) (J.A. García-Moya, A. Callado, P. Escribà, C. Santos et al., 2010)

## Epsgrams

The EPS meteogram (EPSgram) is a probabilistic interpretation of forecasts from the EPS for specific grid points. It displays the time evolution of the distribution of several meteorological parameters from the ensemble at each range by boxes and whiskers plot (Anders Persson, 2011). It gives an explicit

### TABLE OF CONTENTS

Introduction	
Ensemble Prediction Systems	
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Epsgrams module	
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### SEARCH

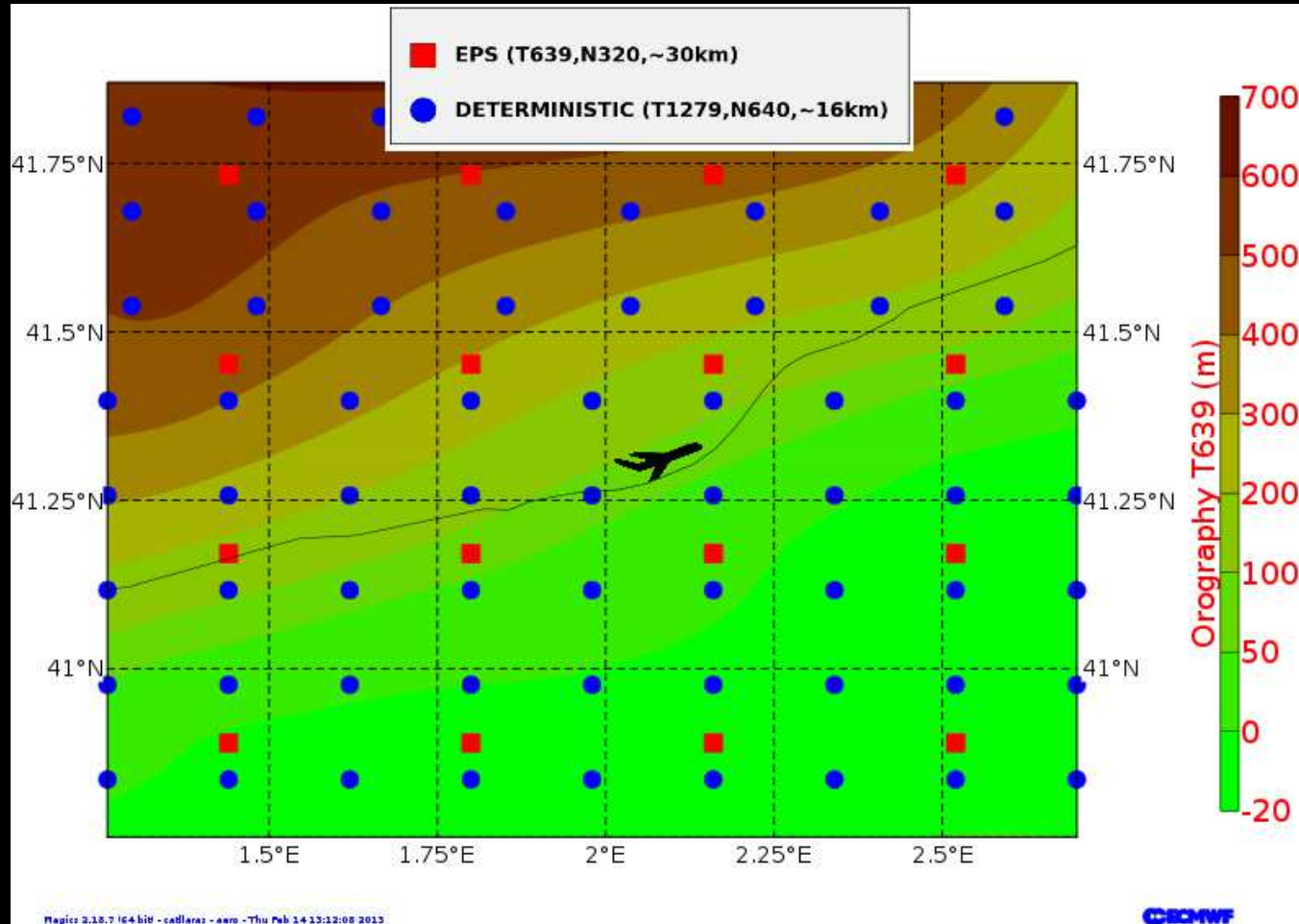
 

Enter search terms or a module, class or function name.

## 2. Features

Land-Sea Mask

- Distinguish between ocean-land grid points.



Grid spacing and orography fields over Barcelona airport surrounding area for the N320 and N640 Gaussian grids

## 2. Features

### Correction of T2m

- Altitude correction (reduction) of variables (specially **temperature**)
  1. The whole vertical profile (u,v,T,q,ps) at the model surface is vertically interpolated to the airport height -> **ETAETA subroutine**
  2. The new surface temperature is evaluated preserving surface layer lapse rate, i.e., keeping the potential temperature increment between the lowest model level and the earth surface constant.
  3. The screen level (**T2m, Q2m, U10m, V10m**) are rediagnosed in the new surface layer by formulae proposed by Geleyn (1987) based on the Monin Obukhov similarity theory -> **TQUV subroutine**

*(Navascués, 1997)*

- A Python interface has been developed by using this scheme.

3. Methodology



MARS

Meteorological Achival  
and Retrieval System



ecgate

1) `get_grib.scr`

Members = 51

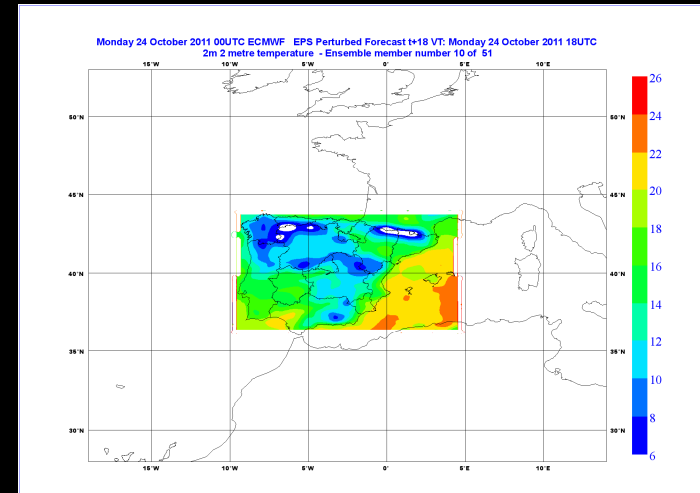
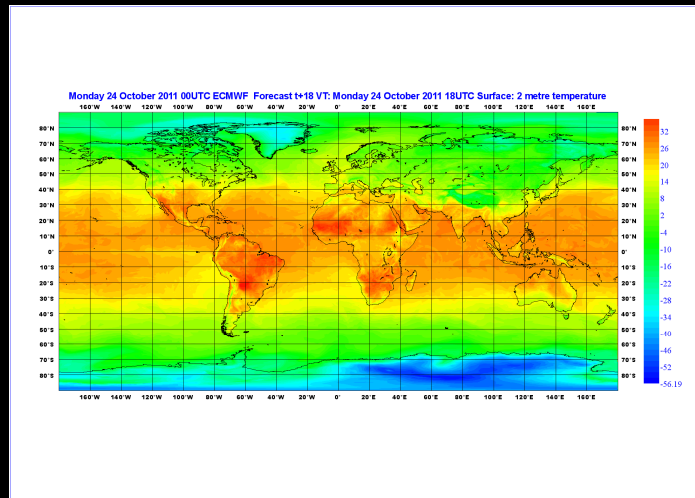
Steps = 12, 18, 24, 30, 36

Parameters = 2t, 2d, 10u, 10v, lsp, acpcp, lcc, 10fg

### 3. Methodology

## Ensemble Prediction Systems Applied to Aeronautics

### 2) GeoMask.cpp



	Without GeoMask	With GeoMask
edition	1	2
packing type	grid_simple	grid_jpeg
file size	414.1 MB	3.7 MB (> 110 times smaller!)

### 3. Methodology

## Ensemble Prediction Systems Applied to Aeronautics

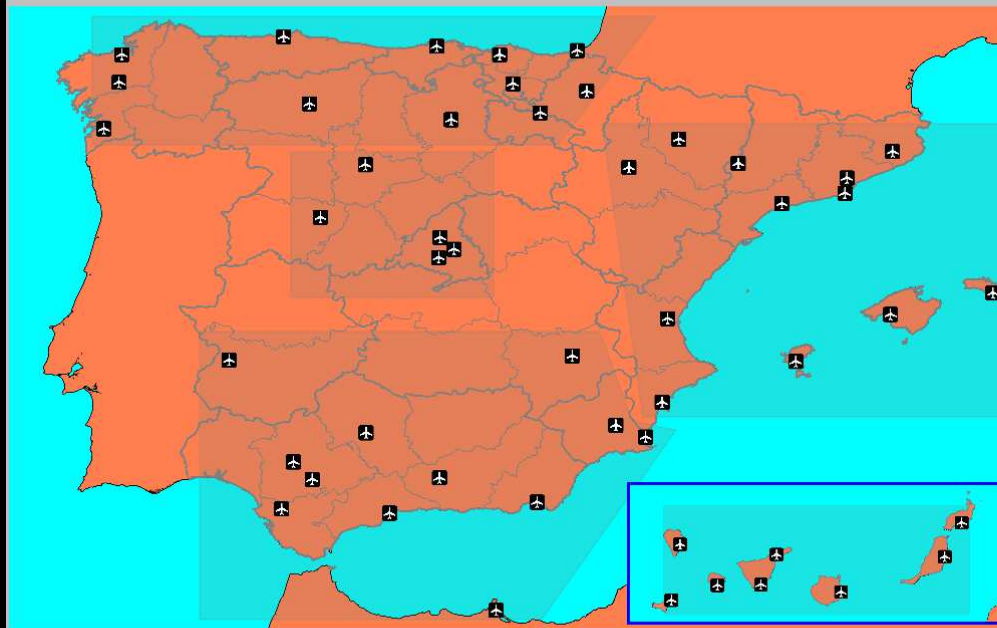
3) `transfer.scr`

From ECMWF to AEMET

4) `plot_epsgrams.py`

Epsgrams for all Spanish airports available on the AEMET intranet (very soon!)

Select airport or geographic area from the map or list below. If you don't find the airport, you should click the corresponding area or look up in the list:



■ [Eastern Aeronautical Zone](#)

- [Barcelona-El Prat \(LEBL\)](#)
- [Girona-Costa Brava \(LEGE\)](#)

- [Menorca \(LEMH\)](#)
- [Eivissa \(LEIB\)](#)

# Ensemble Prediction Systems Applied to Aeronautics

## 3. Methodology

### East

Select one airport from the list or map below:

- Barcelona-El Prat (LEBL)
- Girona-Costa Brava (LEGE)
- Reus (LERS)
- Sabadell (LELL)
- Lleida-Alguaire (LEDA)
- Palma (LEPA)
- Menorca (LEMH)
- Eivissa (LEIB)
- Zaragoza (LEZG)
- Huesca (LEHC)
- València (LEVC)
- Alacant (LEAL)

Select one airport from the list or map below:

- León (LELN)
- Burgos (LEBG)
- Logroño (LELO)
- Pamplona (LEPP)
- Vitoria (LEVT)
- San Sebastián (LESO)
- Bilbao (LEBB)
- Santander (LEXJ)
- Asturias (LEAS)
- A Coruña (LECO)
- Santiago (LEST)
- Vigo (LEVX)

### North

Select one airport from the list or map below:

- Madrid / Barajas (LEMD)
- Madrid / Torrejón (LETO)
- Madrid / Getafe (LEGT)
- Madrid / Cuatro Vientos (LEVS)
- Madrid / Gormezuela (LECV)
- Valladolid (LEVD)
- Salamanca (LESA)

### Centre

### Canary Islands

Select one airport from the list or map below:

- Tenerife Norte (GCXO)
- Tenerife Sur (GCTS)
- Gran Canaria (GCLP)
- La Gomera (GCGM)
- La Palma (GCLA)
- El Hierro (GCHI)
- Fuerteventura (GCFV)
- Lanzarote (GCRR)

Select one airport from the list or map below:

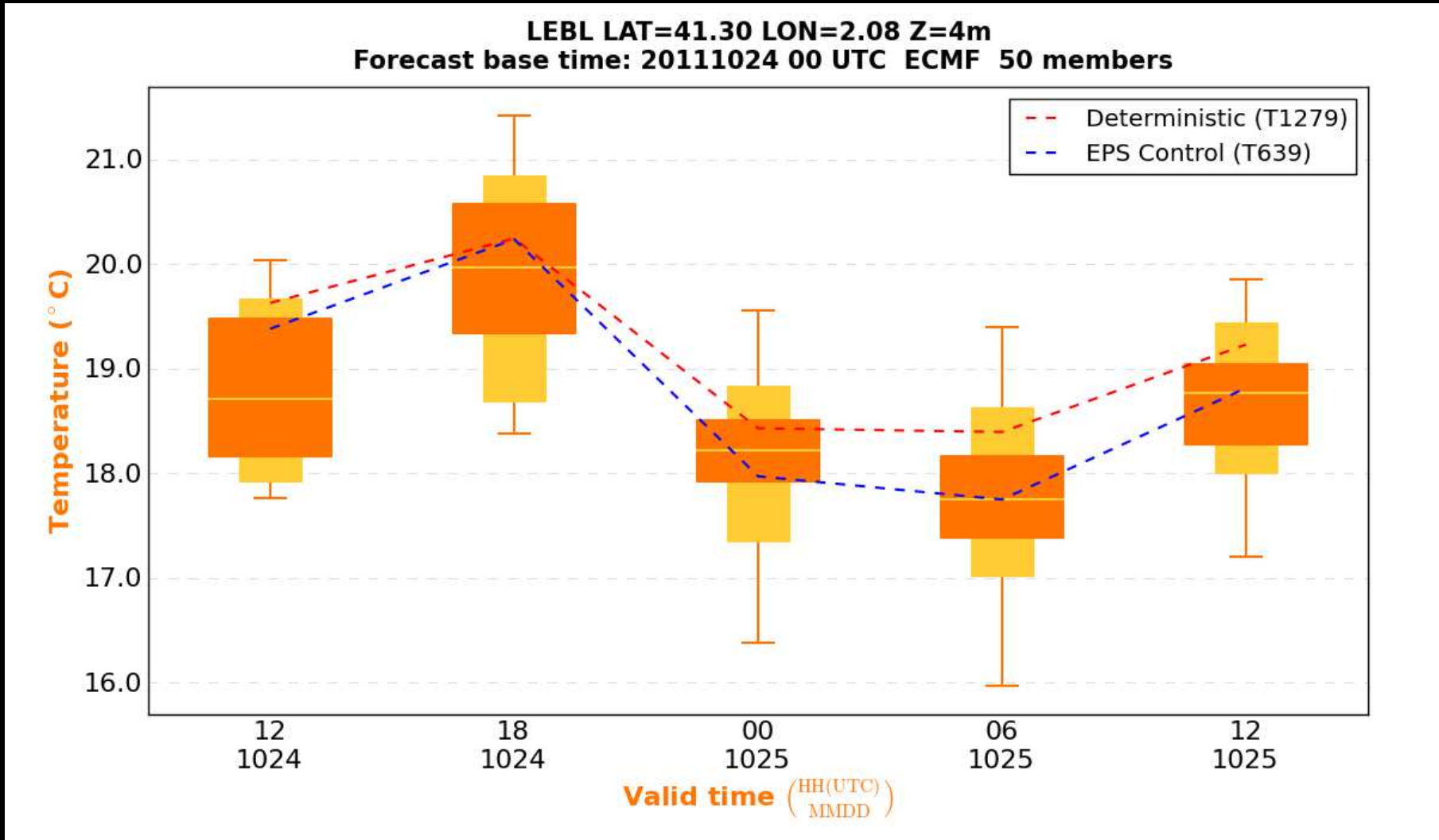
- Albacete (LEAB)
- Badajoz (LEBZ)
- Sevilla (LEZL)
- Morón (LEMO)
- Jerez (LEJR)
- Málaga (LEMG)
- Granada (LEGR)
- Almería (LEAM)
- Melilla (GEML)
- Armilla (LEGA)
- Murcia / Alcantarilla (LERJ)
- Murcia / San Javier (LELC)

### South

4. Results

Nearest Grid Point at Barcelona Airport, ICAO code: LEBL

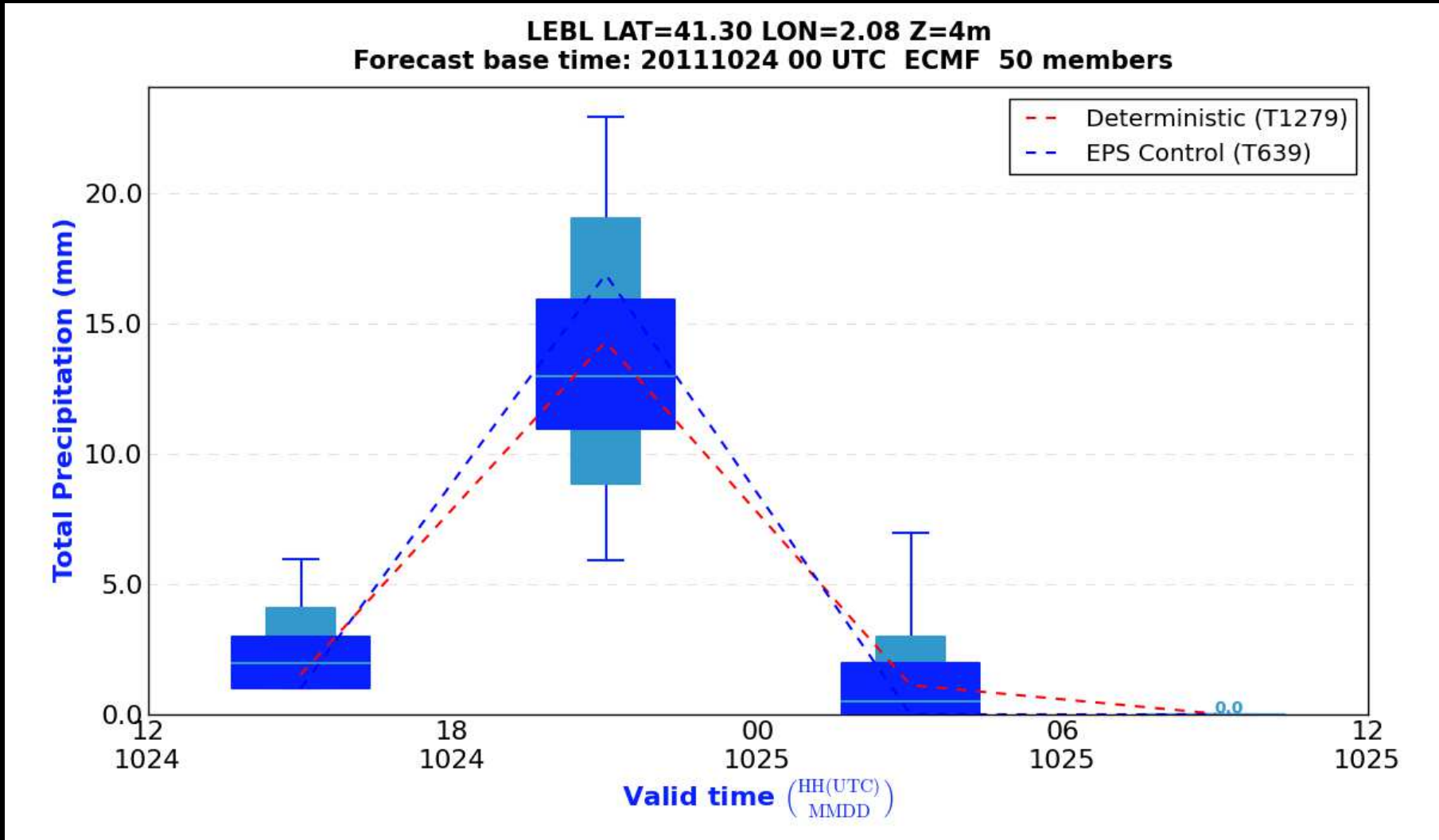
LAT = 41.15    LON = 2.16    Z = 160 m    at 19 km



4. Results

Nearest Grid Point at Barcelona Airport, ICAO code: LEBL

LAT = 41.15    LON = 2.16    Z = 160 m    at 19 km

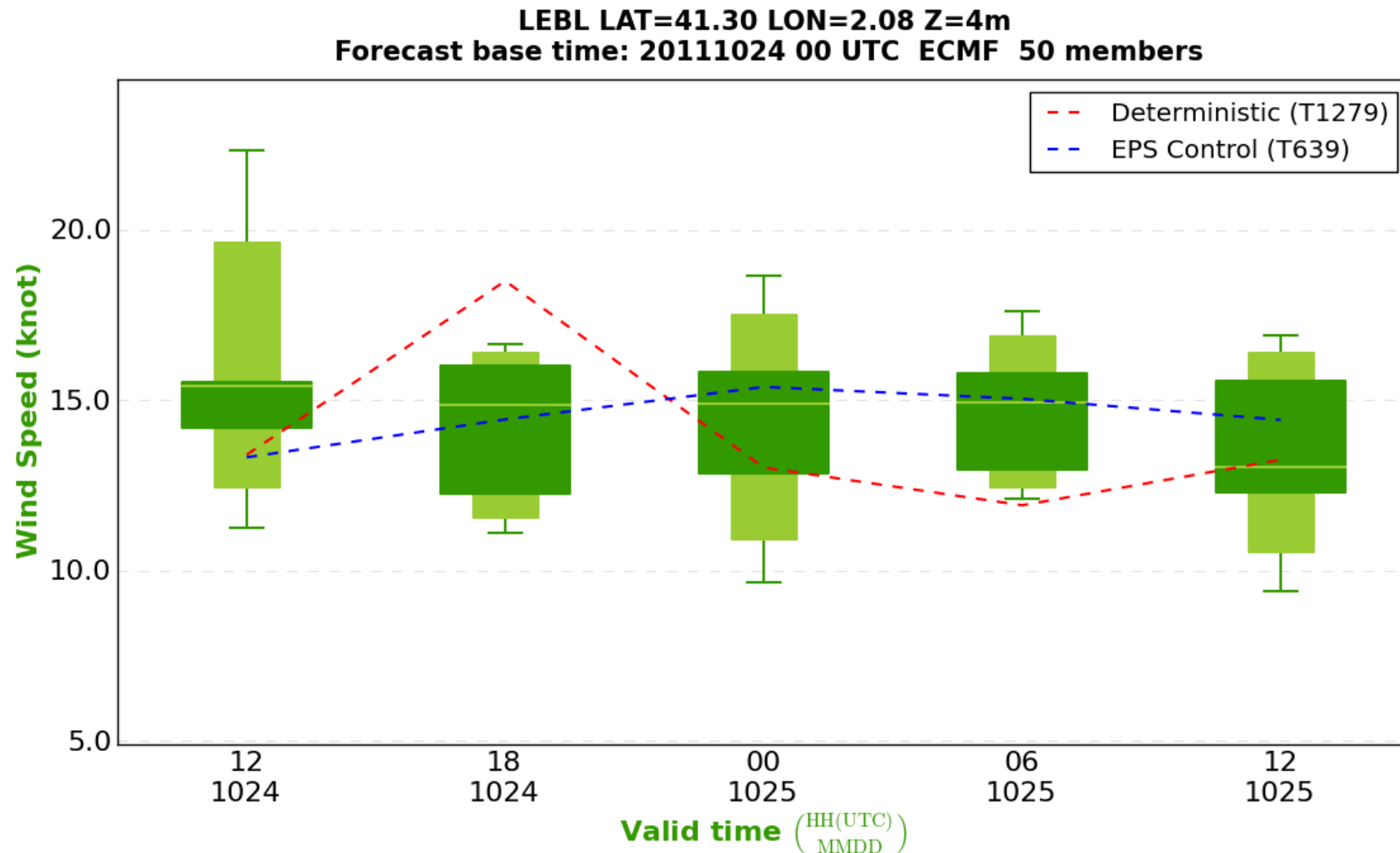


## 4. Results

## Ensemble Prediction Systems Applied to Aeronautics

Nearest Grid Point at Barcelona Airport, ICAO code: LEBL

LAT = 41.15    LON = 2.16    Z = 160 m    at 19 km



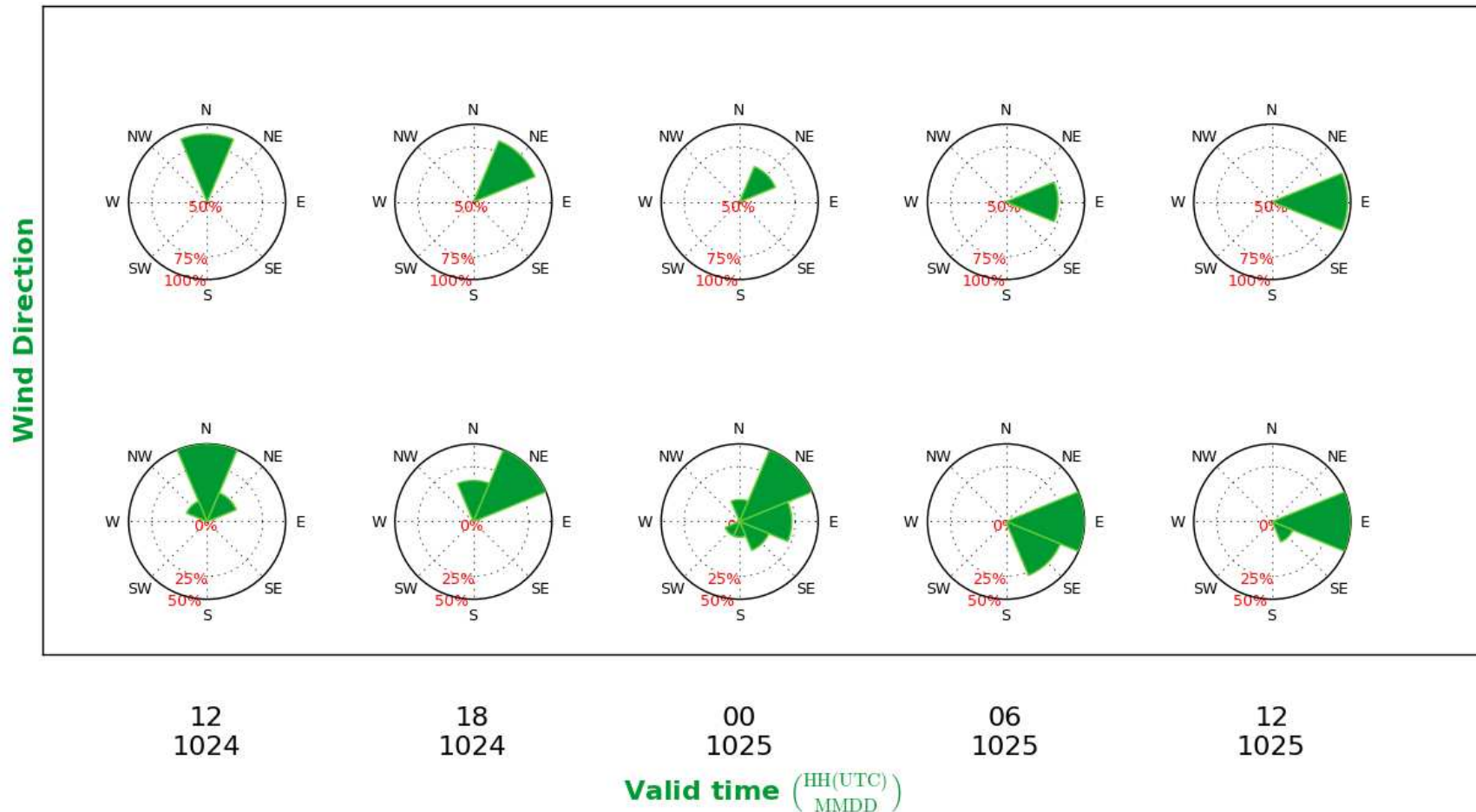
# 4. Results

## Ensemble Prediction Systems Applied to Aeronautics

Nearest Grid Point at Barcelona Airport, ICAO code: LEBL

LAT = 41.15    LON = 2.16    Z = 160 m    at 19 km

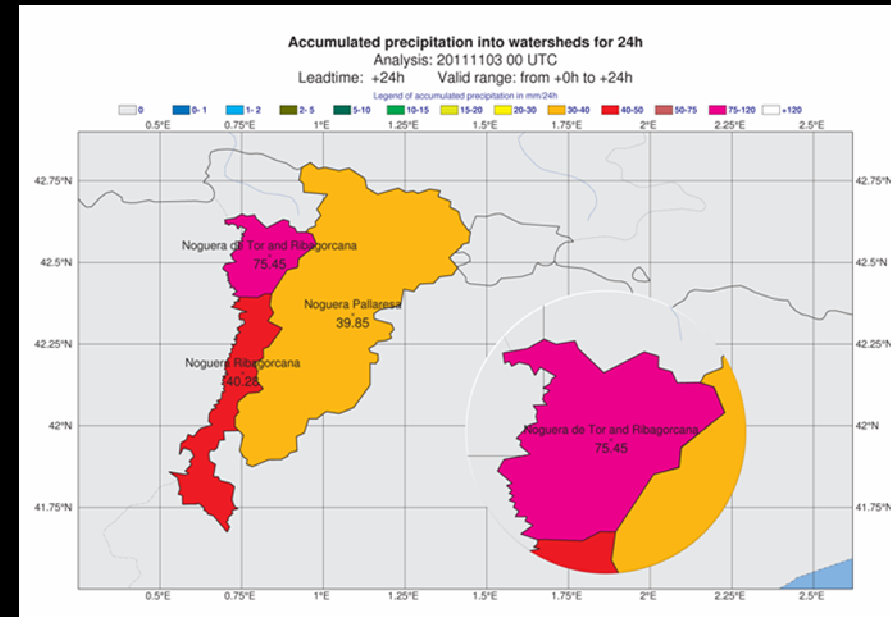
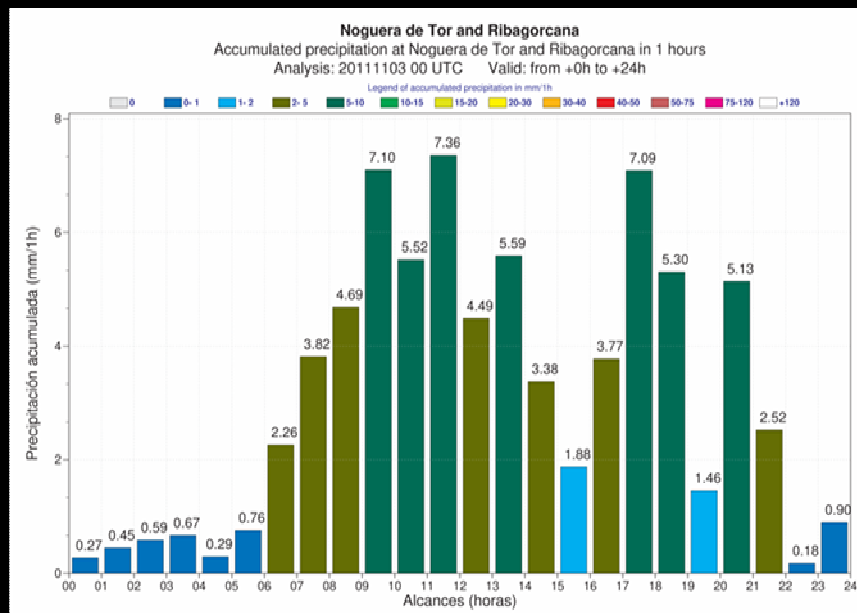
LEBL LAT=41.30 LON=2.08 Z=4m  
Forecast base time: 20111024 00 UTC ECMF 50 members



## 4. Results

## Ensemble Prediction Systems Applied to Aeronautics

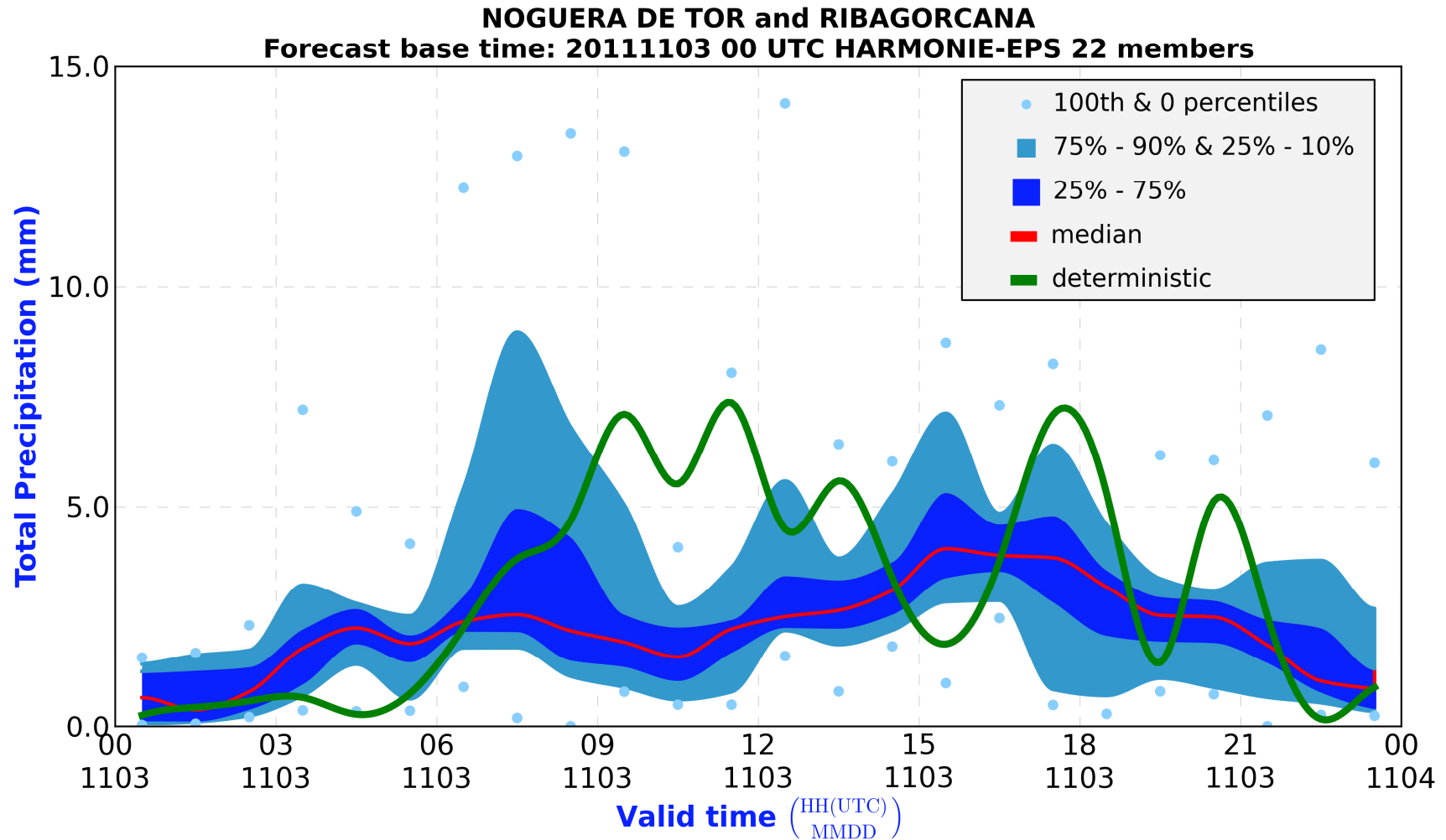
### Continuous Epsgrams (in very high resolution EPS) Epsgrams for Polygons: drainage basins



(A. Callado)

## 4. Results

## HARMONIE (Hirlam Aladin Regional / Meso-scale Operational NWP In Europe

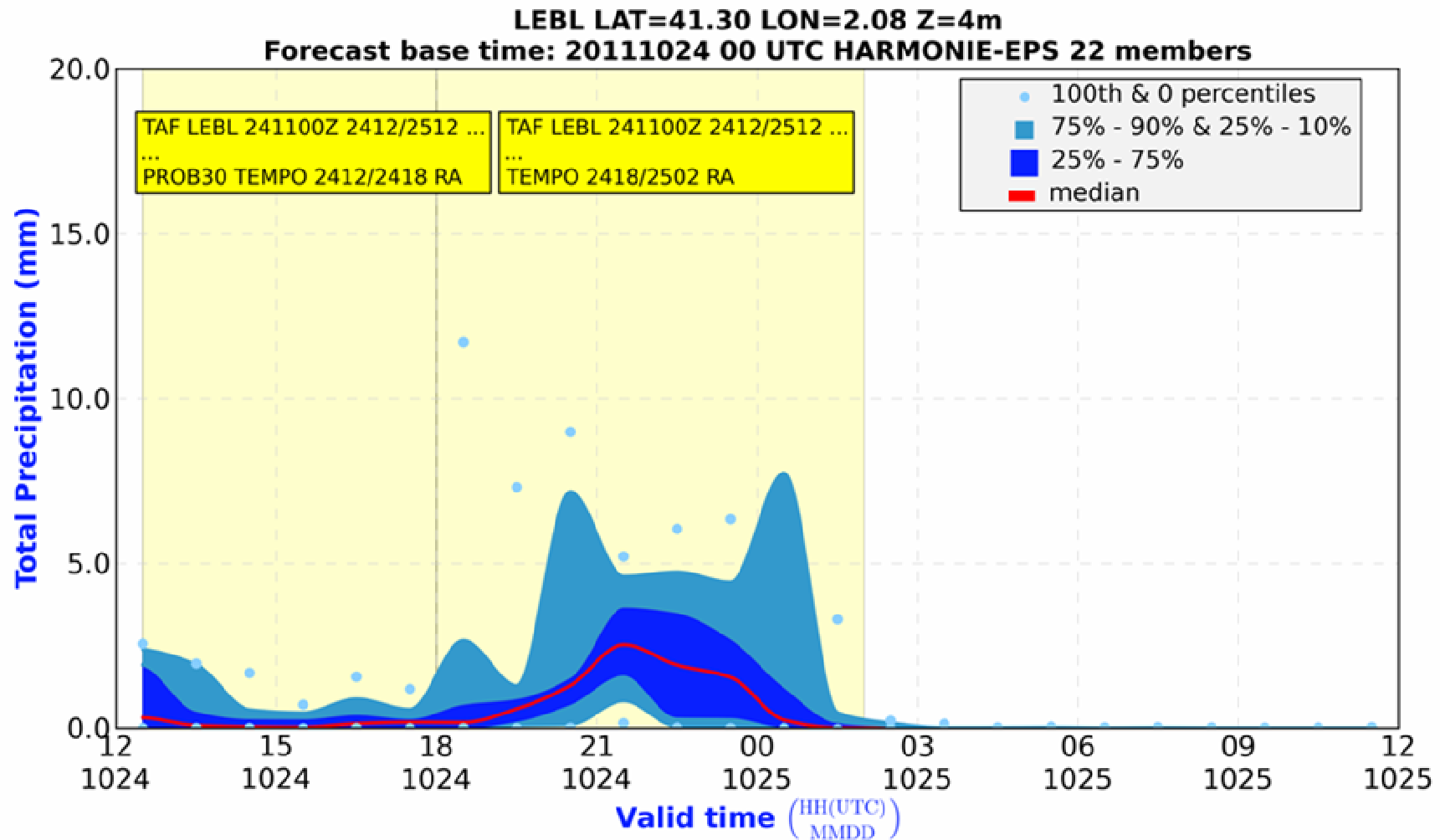


## 4. Results

Ensemble Prediction Systems Applied to Aeronautics

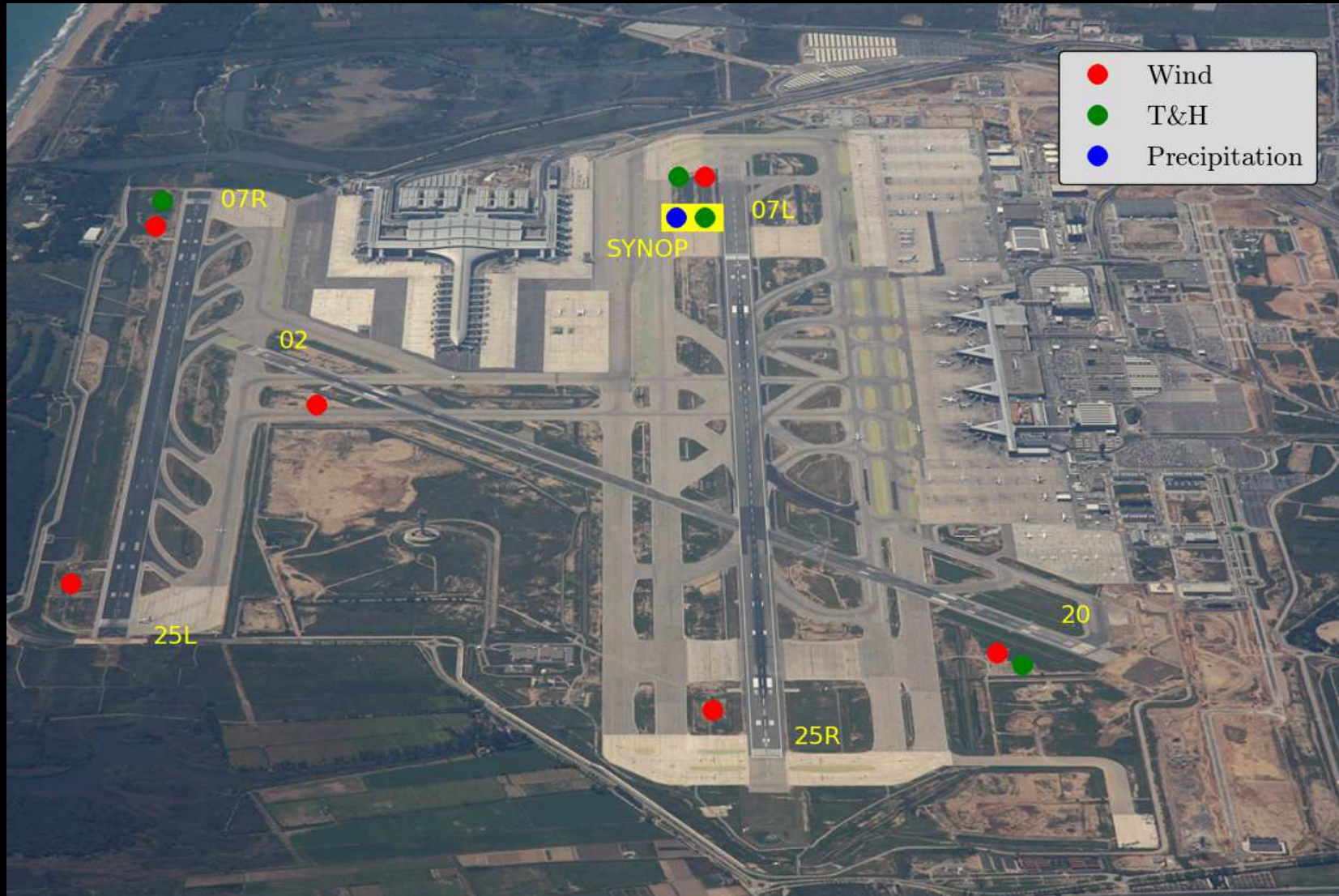
Suggestions for forecasters in epsgrams

### Automatic Detection of Significant Weather Changes (TAF's TEMPO & BECMG groups)



5. Searching the best method

Availability of observation “ensembles” in airports\*



(\* ) J.L. Casado. DTCAT looking for East airport observations

5. Searching the best method

Standard Probabilistic Verification Methods
Attribute Diagrams
Spread-Skill Diagram
Continuous Ranked Probability Skill Score
Brier Score (BS), Brier Skill Score (BSS) and their decompositions
Relative Operating Characteristic (ROC) curve and ROC area
Relative Value Diagrams

Variables
10m Wind Velocity
10m Wind Direction
2m Temperature
Precipitation
2m Dew Point Temperature
Low Cloud Cover

Verification will be applied to **50** airports

5. Searching the best method

ensemble prediction VS. “ensemble” observation

For us, **verification** as a tool to find the best method!

Experiment	Description
Nearest Point	Closest NWP grid point to the airport
Nearest Land Point	Closest NWP grid point to the airport over land
Bilinear Interpolation	<ul style="list-style-type: none"> <li>▪ 4-point interpolation of the four closest NWP grid points</li> <li>▪ Anywhere / over land</li> </ul>
Bicubic Interpolation	<ul style="list-style-type: none"> <li>▪ 16-point interpolation of the sixteen closest NWP grid points</li> <li>▪ Anywhere / over land</li> </ul>
4-point EPS	<ul style="list-style-type: none"> <li>▪ 4-point “subensemble”</li> <li>▪ Weight / non-weight with distance</li> </ul>
16-point EPS	<ul style="list-style-type: none"> <li>▪ 16-point “subensemble”</li> <li>▪ Weight / non-weight with distance</li> </ul>
Polygon-points EPS	NWP grid points “subensemble” inside airport “climatological” coherent area

## 6. Conclusions

- ✓ Strong relationship between probabilistic forecasts and TAF reports.
- ✓ At the moment, epsgrams plotted from ECMWF EPS data. In the future, AEMET-SREPS and AEMET- $\gamma$ -SREPS too.
- ✓ Feasible applications in aeronautics, such as Airport Weather Warnings (AWWs), or in drainage basins.
- ✓ Is 'correction for 2m temperature' really worth?
- ✓ Verification process will depend on, among other things, airport database.

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Climatology: *B. Téllez*

Forecasters Group: *J. Arús, J.C. Bullón, G. Cuevas, J. Fernández, S. González,  
A. Pladevall, S. Viana and E. Werner*

*B. Orfila, E. Terradellas, J. L. Casado*

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- <http://www.intlaviationstandards.org/Documents/PhaseofFlightDefinitions.pdf>
- <http://hepex.nmpi.net/files/download/workshops/post-processing/GarciaMoya-56.pdf>
- <http://www.ecmwf.int/research/predictability/>
- <http://planecrashinfo.com/cause.htm>

**THANK YOU VERY MUCH FOR YOUR ATTENTION**



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