



# Black swans and butterflies: analogues of atmospheric circulation

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LSCE & IPSL

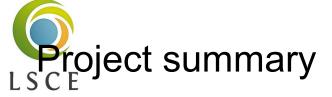
Gif-sur-Yvette



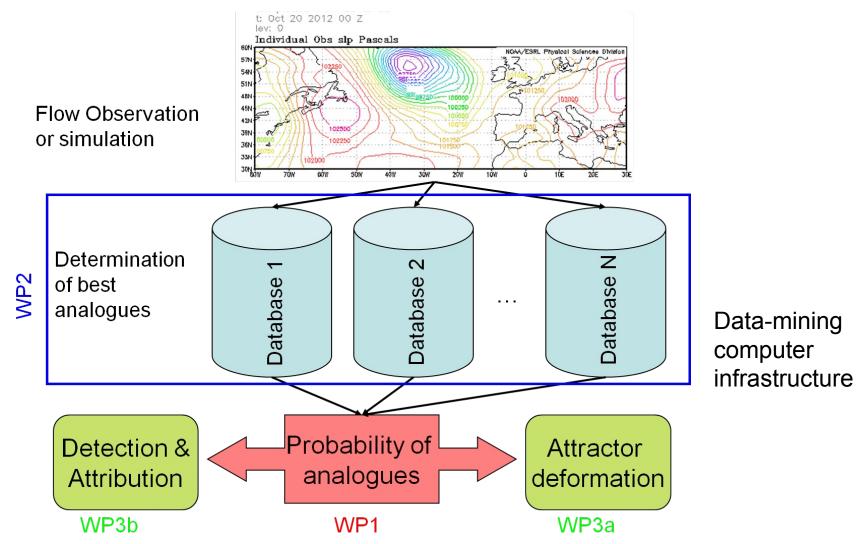


#### Motivations

- Study climate events and relate them to largescale atmospheric circulation
- If there is a climate attractor, how to measure a qualitative alteration?
  - Link with forcings (solar, volcanoes, GHG...)
- Detection, attribution and emergence?







Eg: Black swans

Animation Th4 Emergence of new regimes 3





#### Who & what

- WP1: mathematics and statistics of circulation analogues
  - How do we measure rarity and emergence in chaotic systems?
  - PY, P. Naveau, M. Vrac & <u>1 PhD + 1 Postdoc</u>
- WP2: Engineering of analogue computation
  - Compilation of databases
  - Continuous time assessments
  - PY & <u>1 engineer</u>
- WP3: Applications to climate change
  - Last millennium, future, D&A
  - PY, R. Vautard & <u>1 PhD + 1 postdoc</u>
- Administration
  - PY & J. Bazire



# Circulation analogues (1)

- Reference database R, containing consistent pressure (SLP and/or geopotential heights), temperature, precipitation etc. data during a reference period of observations
  - E.g. Reanalysis data for a fixed period, model control simulation
- Target dataset T, with only pressure data (SLP or geopotential height)
  - E.g. Observation during a period outside of the reference





- We want to infer the value of climate variables (e.g. T, Prec., Wind speed) in the dataset T, from information in the database R.
- For each day in T, find best analogues of pressure in R.
  - Minimize distance (Euclidean, Mahalanobis...)
  - Maximize spatial correlation (rank)



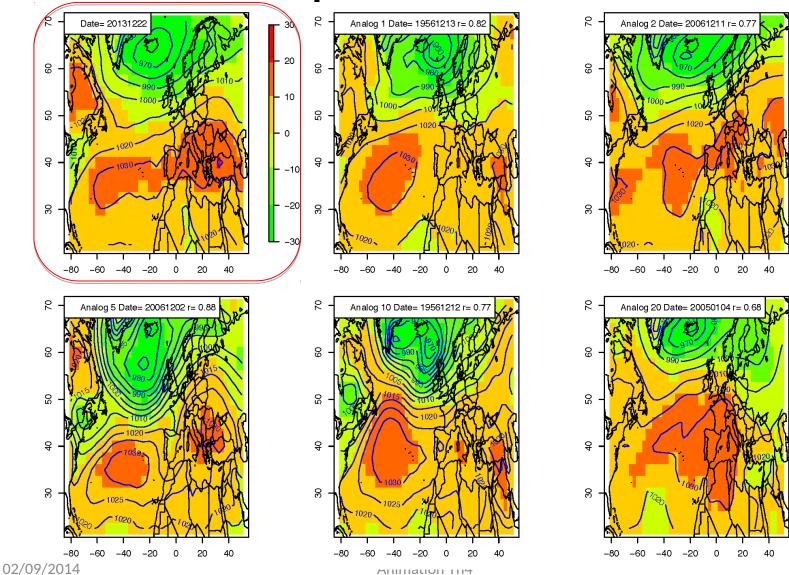


- What is a good analogue? (butterflies)
  - Hypothesis of recurrent patterns in a phase space to be defined
  - Probability distribution of distances of analogues
- Cases without analogues (black swans)
  - Extremes of the probability distribution of distances
- Re-construction of 3D field from the constraint on a boundary of the domain?





#### **Example: Storm Dirk**







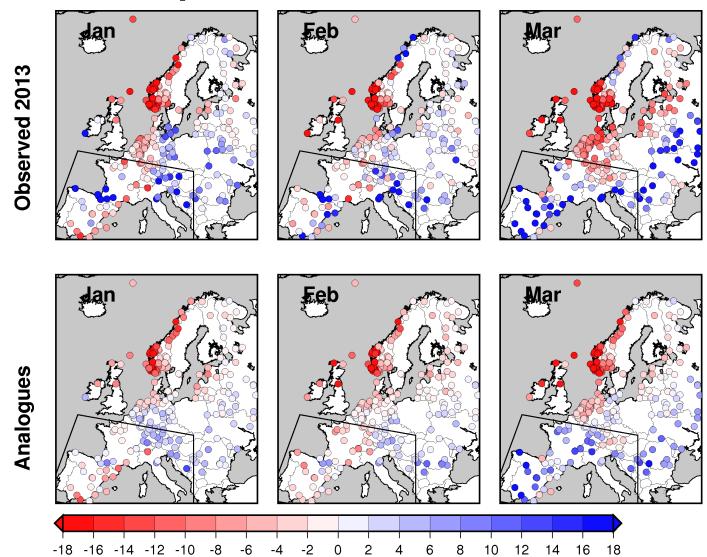
# LS c Meteorological analogues

- Average daily temperature (TN) anomaliesor precipitation (RR) over Europe
  - ECA&D database
- Compute the median temperature for 10 circulation analogue days
  - Analogue temperature or precipitation & spread of analogues





#### Example: Winter 2013

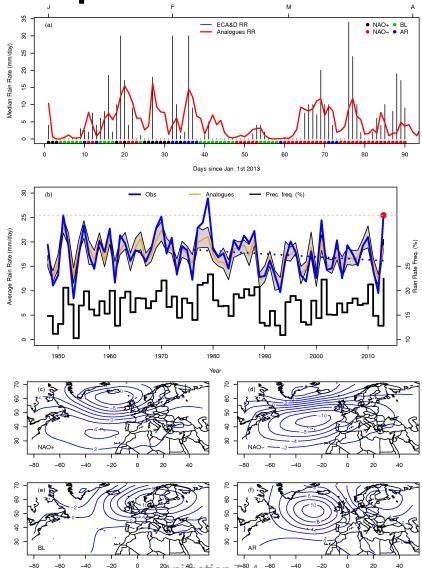


**Animation Th4** 





### Example: Winter 2013





#### **Conclusion & Perspectives**

- Flexible approach to investigate the likelihood of some extreme events from atmospheric variability
  - Special issues of the BAMS (2012, 2013, 2014)
- Analysis of the probability of "black swans" (i.e. events with no analogues in the past)
- Simulation of catalogues of extreme events (e.g. storms):
  - 1000 samples out of 30 years of observations



## **ESTIMR Project Mapping**

- D&A, assessment of extremes in Europe in continuous time
  - Copernicus
- Methodologies to analyze rare events last 1k, future, Europe, America, Atmospheric flow Analogues for Climate Change
  - ERC
- Extremes in France, past 1k, future, present
  - Fr. Min. Envir.







# Thank you