## Probabilistic Weather Forecasts for Insurance Risk Assessment and Pricing of Weather Derivatives

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## Aims:



• motivate the need for probabilistic weather forecasts (PWF)

 outline strategies for producing PWF

- statistical forecast models
- dynamical forecast models

## explain where we're at now and what the future holds.



## Weather Risk Management

Customers want protection from the adverse impacts of weather on their business.

"adverse weather" could be:

a) rare extreme events

b) more common weather conditions

a - the traditional realm of insurers

b - a vast potential market, currently providing the stimulus for the development of weather derivatives.



To assess weather risk, for rare or for common events, one needs:

a forecast probability distribution for the relevant weather conditions, i.e. a probabilistic weather forecast (PWF)





#### How can a PWF be obtained?

- *a*) Exploit past experience (i.e. historical data)
- *b*) Exploit scientific understanding of the causes of weather fluctuations

# Forecasting strategies differ in the extent to which, and the ways in which, they employ *a* and/or *b*.

Two basic classes:

#### **Statistical forecast models** - focus on *a*, but must also employ *b*

#### **Dynamical forecast models**

- focus on b





Much of the variability in weather is random, but an important part is related to slow changes in the ocean state.

Historical data are analysed to:

- characterise the random variability
- identify relationships to ocean conditions
- identify any external influences
- A mathematical model is developed that:
- is consistent with the historical data
- exploits our understanding of the causes of weather fluctuations



## **Dynamical forecast models**

Starting point: physical laws that describe the behaviour of the atmosphere and ocean

- Laws are expressed as mathematical equations describing the state of the atmosphere and ocean on a global grid of points
- Dynamical models are MUCH more complex than statistical models
- Historical data are not used directly, but data describing the present state of the atmosphere and ocean are needed.



#### **Ensemble Forecasting**

To generate a PWF multiple forecasts are made from slightly different initial conditions

Because the atmosphere is *chaotic*, different forecasts diverge



With a large ensemble of forecasts one can compute probability distributions for future weather conditions, i.e. PWF.



#### **Advantages of Dynamical Forecasts**

- Makes maximal use of scientific understanding
- Does not rely on historical data
- Better able to predict unprecedented events

#### **Disadvantages of Dynamical Forecasts**

- Cost
- Systematic model errors
- Low spatial resolution
- Current ensemble sizes are small



## **Statistical vs Dynamical Forecasts**

• Dynamical forecasts are superior for lead-times of a few days

• For longer timescale "seasonal" forecasts, the best approach depends on the specific application (location, timescale, variable etc)



## Where are we now?

- Dynamical seasonal forecasts are made at a number of centres around the world. These offer useful skill for some applications but:
  - the availability of output is very restricted
  - systematic errors are a serious problem
  - We are able now to provide statistical forecasts for applications such as as Heating/Cooling Degree Days.



## Where is the future?

- In the long run, as systematic errors are reduced and ensemble sizes increase, dynamical models should provide the best forecasts.
- In the meantime the optimum strategy will be to combine statistical and dynamical forecasts to exploit the benefits of both.

