



Institute  
and Faculty  
of Actuaries

## GIRO40

8 – 11 October, Edinburgh



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## Is Your Cat Model a Dog ?

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 onsorship  
 Thought leadership  
 Progress  
 Community  
 Sessional Meetings  
 Education  
 Working parties  
 Volunteering  
 Research  
 Shaping the future  
 Networking  
 Professional support  
 Enterprise and risk  
 Learned society  
 Opportunity  
 International profile  
 Journals  
 Support

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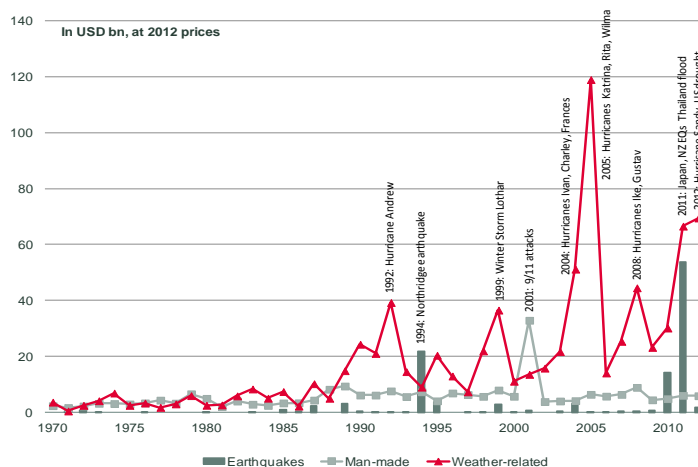
## Introduction

- Fitting to Historical Loss Data
- Invention of Catastrophe Models
- What Actually Goes into Cat Models ?
- Model Error in a Simple Cat Model
- Impact of Model Error on Reinsurance & Capital
- Conclusion

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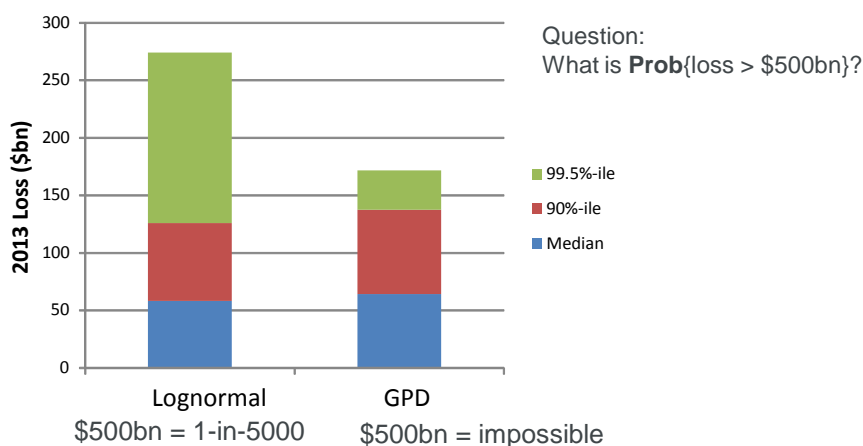
## Swiss Re Catastrophe History



Source: Sigma reports

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## Fitted 2013 Distributions (GLM + MOM)



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## Invention of Cat Models

- Invented late 1980's, adopted early/mid 1990's
- Solve the problems of just using historic loss data
  - Limited credible historic loss information
  - Revaluing of losses for changes in portfolio through time
  - Loss experience doesn't reflect full potential of what could happen
- Catastrophe Models
  - Use actual exposures as inputs
  - Built from longer time series of hazard data
  - Allow use of latest scientific knowledge & theories

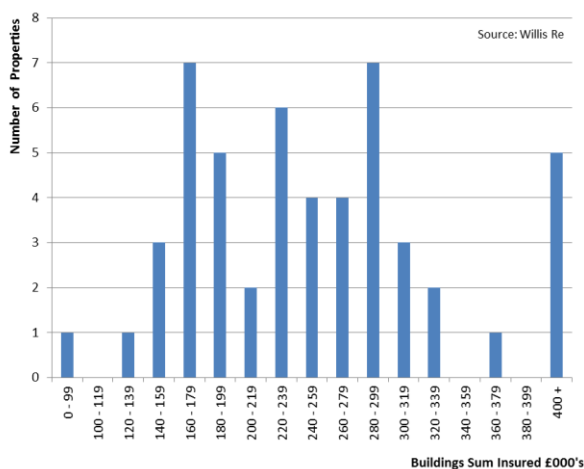
## Exposure Data is Fact ?



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## Exposure Data is Fact ?



Why ?

- Source of Data
- Calculation Assumptions
- Timing of Data
- Consistency

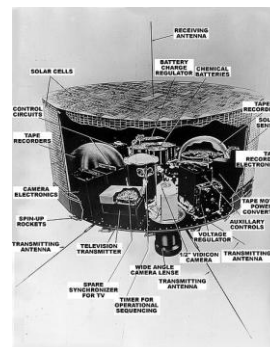
Modifiers more consistent ...

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## Long History Of Hazard Data ? - Atlantic Hurricanes

- HURDAT 1851 – present
- Based on Observations
  - But, older storm 'data' is the output of models run to match very limited data
- Completeness ?
  - c.1900 onwards - landfalling storms
  - c.1950 onwards - all storms
- Reanalysis
  - Hurricane Andrew Upgraded to Cat 5 in 2002
  - June 2013 (1941-1945) TS+4, C2+1, C3-2, C4+1



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## Long History Of Hazard Data ? - European (Extra-Tropical) Storm

- Storm Events
  - ERA 40 mid 1957 - 2001 (44½ years)
  - ERA Interim 1979 - present (34½ years)
- Site Based Wind Speeds
  - Gaps in records
  - Anemometers are moved
  - Station metadata important to understanding
  - Models used to adjust historical data to common basis

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## Long History Of Hazard Data ?

### - Earthquake

- Seismic Observation
  - 1875 seismometer invented
  - 1892 seismometers installed at 40 locations around world
  - 1935 Richter Scale invented
  - 1961 World-Wide Standardized Seismic Network (paper records)
  - Mid-1970 digital records
  - paleoseismology
- Cat Models may all be based on same underlying information
  - Japan (JMA / Usami) Tohoku – expected magnitude
  - NZ Christchurch - unknown fault

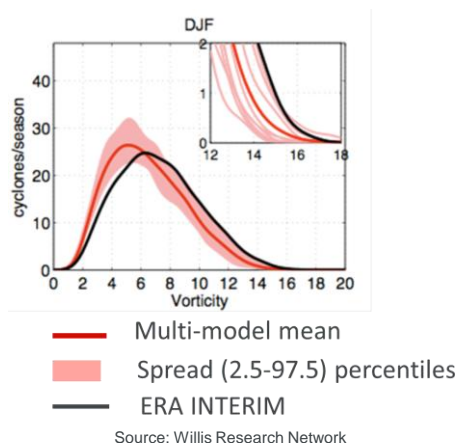
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## Extending Observation History

### - Use of GCMs

- GCMs increasingly being used to extend observation history
- GCM are just models and most have biases
  - Modelled North Atlantic ETC's are generally weaker and further south than observed



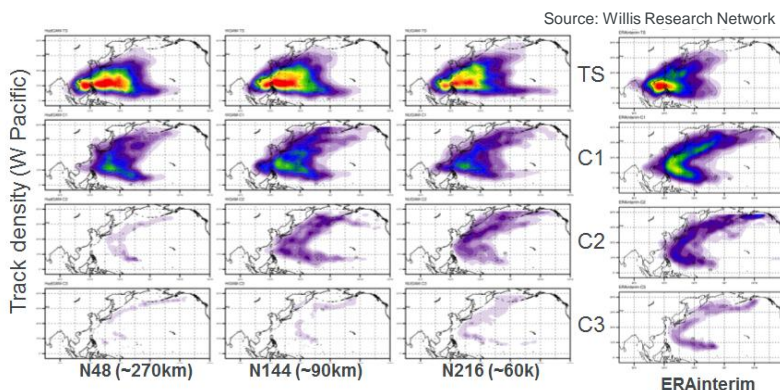
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## Extending Observation History

### - Use of GCMs

- Modelled Tropical Cyclones / Hurricanes are –
  - Weaker than observed



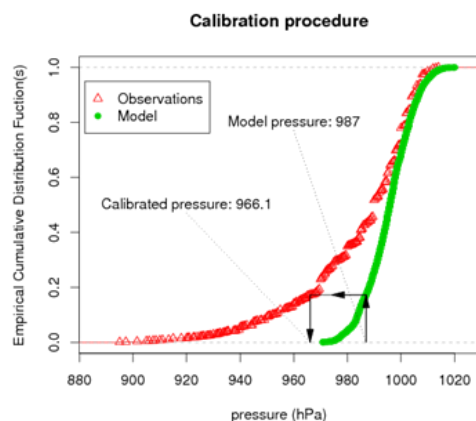
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## Extending Observation History

### - Use of GCMs

- Therefore the output of GCMs is calibrated back to observations
- Partly defeats the purpose of using GCMs in the first place



Source: Willis Research Network

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## Vulnerability

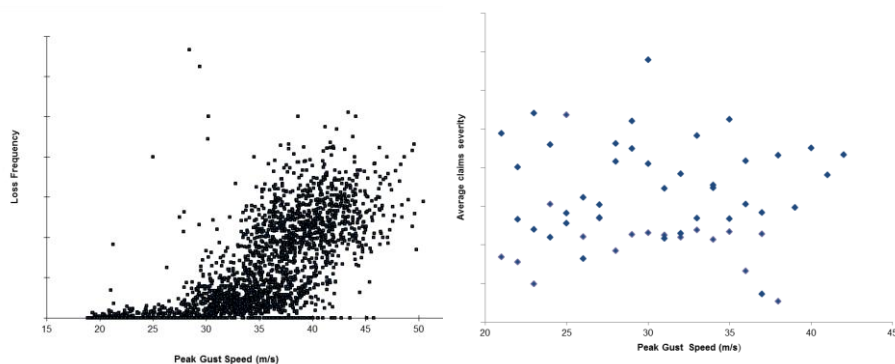
- Vulnerability Curves relate the hazard at a location to damage
- To produce these you need, for historical events
  - individual claim data with corresponding sum insured & actual hazard value for that risk's location.
  - The hazard value for all risks that didn't give rise to claim.
- Detailed claims data is available though not generally very far back (mergers, systems changes etc)
- Hazard data can be harder, especially at right resolution for flood
- Historic Sum Insured data less reliable than present (but consistency needed...)

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## Vulnerability

- Individual claims data often shows much variability.
- Well behaved ETC example below



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## Calibration

- If you try to build a catastrophe model from lots of separate components the first results will generally be unexpected
- Most models will have a 'calibration' step
- e.g.
  - UK Windstorm – vulnerability calibration based on 90A (Daria)
    - but need to revalue historic data up to present day
    - we are almost back where we started without cat models

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## What can we learn from Statistics?

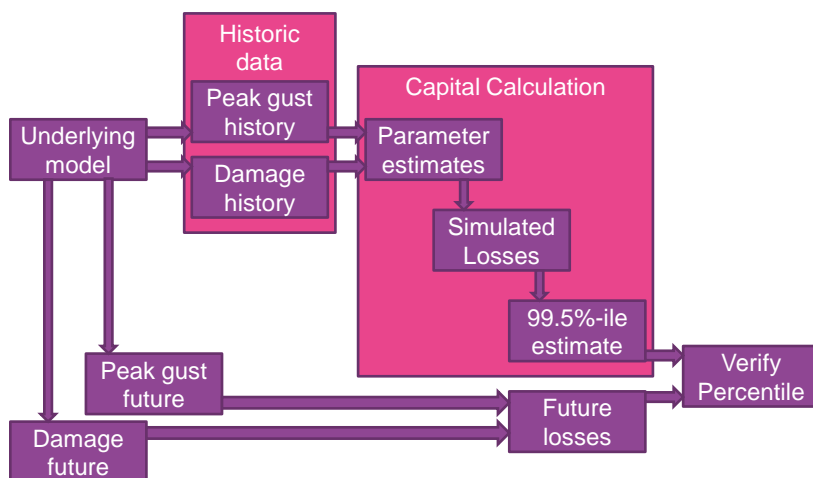
- There is an established statistical literature on parameter and model error (also called "robust statistics")
- We calculated an example based on EU windstorm
- 40 years' peak gust data, recording 52 storms with peak gust exceeding 25 m/s at a particular weather station (which implies a Poisson frequency  $\phi = 1.3$ )
- Gust excess over 25 m/s have roughly a Pareto distribution with shape parameter  $\alpha = 10$
- 10 years' damage ratio data. This suggests damage ratios are proportional to  $(\text{max gust} - 25\text{m/s})^3$ . Given a 50m/s gust, the damage is generally (95% of the time) in the range from 5% to 10% of aggregate sum assured.

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## Allowing for Model and Parameter Error



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## Model and Parameter Error Results

- If we know the underlying model, and we generate 1999 scenarios, there is a 0.5% chance that the next observation lies above scenario #1990 (when ranked in increasing order)
- This is because the aggregate 2000 scenarios are a random sample so there is a 1-in-2000 chance that any particular observation is in the top 10
- This no longer works if
  - The next observation comes from the underlying distribution
  - But the 1999 scenarios come from a fitted distribution
- For our parameters, there is approximately a
  - 2% chance the next observation lies above scenario #1990
  - 0.5% chance the next observation lies above scenario #1998

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## Impact of Model Error - Reinsurance

- Example
  - Typical reinsurance programme structured and pricing using 'base' model output

Example Company				
Real World cf Model	Top Layer Expected Loss Ratio	1 in 200 layer attachment		
		% diff	probability	% diff
+ 30%	47.7%	+ 45%	0.798%	+ 60%
+ 20%	42.9%	+ 31%	0.699%	+ 40%
+ 10%	37.9%	+ 15%	0.600%	+ 20%
base	32.8%	0%	0.500%	0%
- 10%	27.7%	- 16%	0.401%	- 20%
- 20%	22.4%	- 32%	0.300%	- 40%
- 30%	17.2%	- 48%	0.225%	- 55%

- Gearing Effect of RI evident
  - Largest for 'binary' layers (e.g. ILW)

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## Impact of Model Error - Capital Requirements

- Impact on 1-in-200 Net AEP
  - i.e.  $P(\text{annual net loss} \geq X) = 0.005$
- Excess of Loss Results in
  - Gearing
  - Skewness
- Net Results are Biased w.r.t. Model Error

Example Company				
Real World cf Model	Gross 1-in-200 AEP Loss		Net 1-in-200 AEP Loss	
	£m	% diff	£m	% diff
+ 30%	312.7	+ 30%	107.2	+ 77%
+ 20%	290.8	+ 21%	88.8	+ 47%
+ 10%	263.9	+ 9%	66.7	+ 10%
base	241.1	0%	60.6	0%
- 10%	219.3	- 9%	54.9	- 9%
- 20%	195.3	- 19%	52.8	- 13%
- 30%	173.2	- 28%	50.4	- 17%

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## Conclusions

- There's lots of model issues we haven't touched on. Many attempts at quantification of errors in cat model focus on a single component.
- Some applications (such as certifying 1-in-200 ruin risk) require CAT models to be accurate in absolute terms
- Other applications (such as monitoring exposure change over time or ranking yields on ILS) require only relative accuracy, which is more plausible
- Established high layer reinsurers are implicitly aware of model risk which is why rate on line >> modelled burning cost. Is new capacity equally well informed?

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**Questions**



**Comments**

Expressions of individual views by members of the Institute and Faculty of Actuaries and its staff are encouraged.

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