

Complexity in Climate Change

OASIS Conference 3-4th May, 2023

Panel Discussion

PartnerRe





Complexity in Climate Change Panel Discussion

Moderated by **Paul Della-Marta**, Head of
Catastrophe Research, Partner Re

- **Steve Jewson**, Independent Climate Science Researcher
- **Kelsey Mulder**, Catastrophe Research Manager, Liberty Specialty Markets
- **Lauren Mudd**, Senior Engineer, Applied Research Associates
- **Cat Pigott**, Head of Science & Natural Perils, AXA XL



Complexity in Climate Change Panel Discussion

How to implement **expected (and past)** climate change in cat models?

To estimate:

- Future
- Current

Risk-of-loss





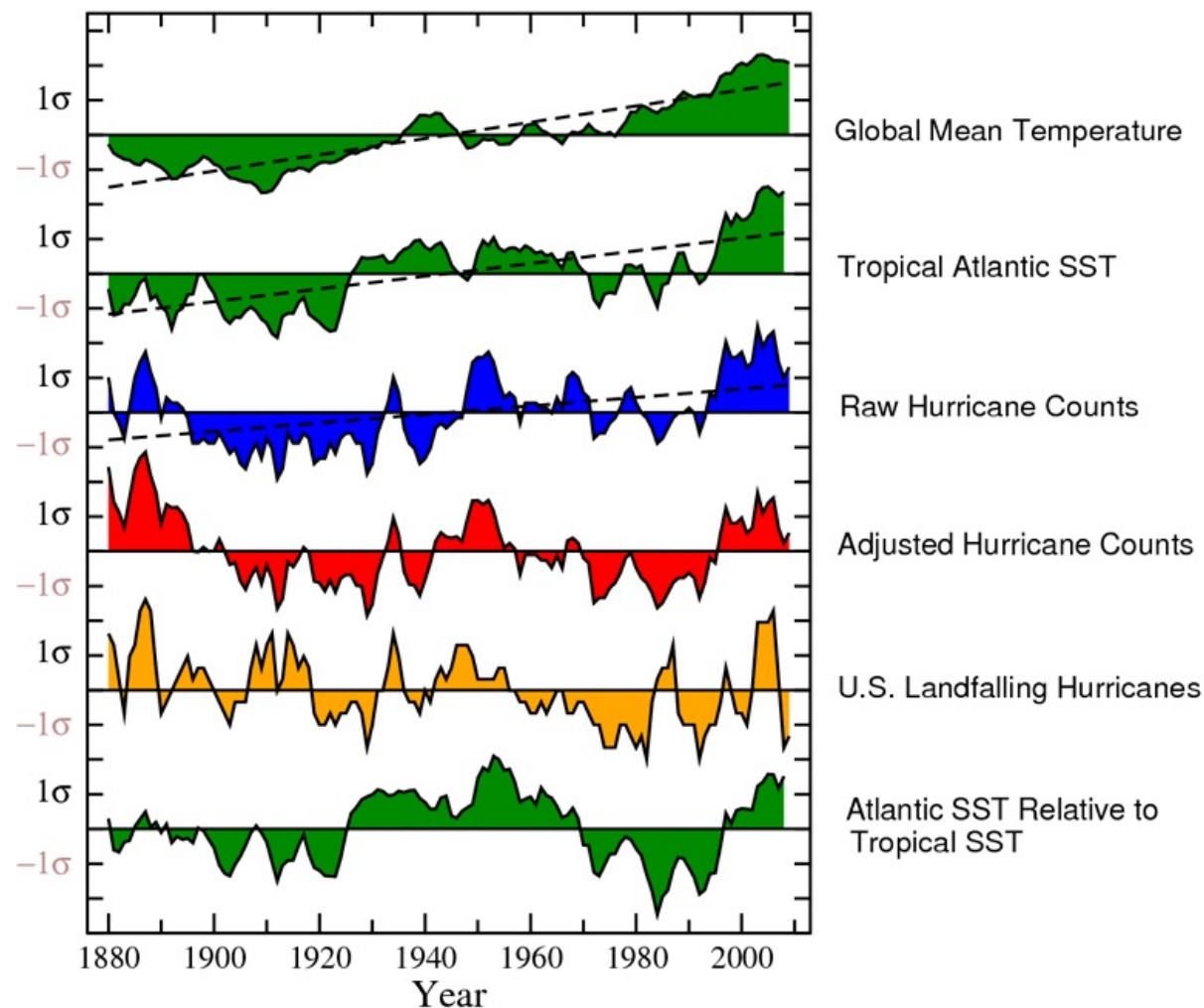
General Approaches to Capture Climate Effects on Hurricanes

1: Identify and extrapolate statistical or temporal trends between environmental parameters and hurricane behavior

- Simplicity is both an advantage and disadvantage
- *“... failure to account for radiative properties of the atmosphere can distort the response of tropical cyclone activity to changing distributions of sea surface temperature.”*

Emanuel, K. (2010). Tropical cyclone activity downscaled from NOAA-CIRES reanalysis, 1908–1958. *Journal of Advances in Modeling Earth Systems*, 2(1).

Normalized Tropical Atlantic Indices



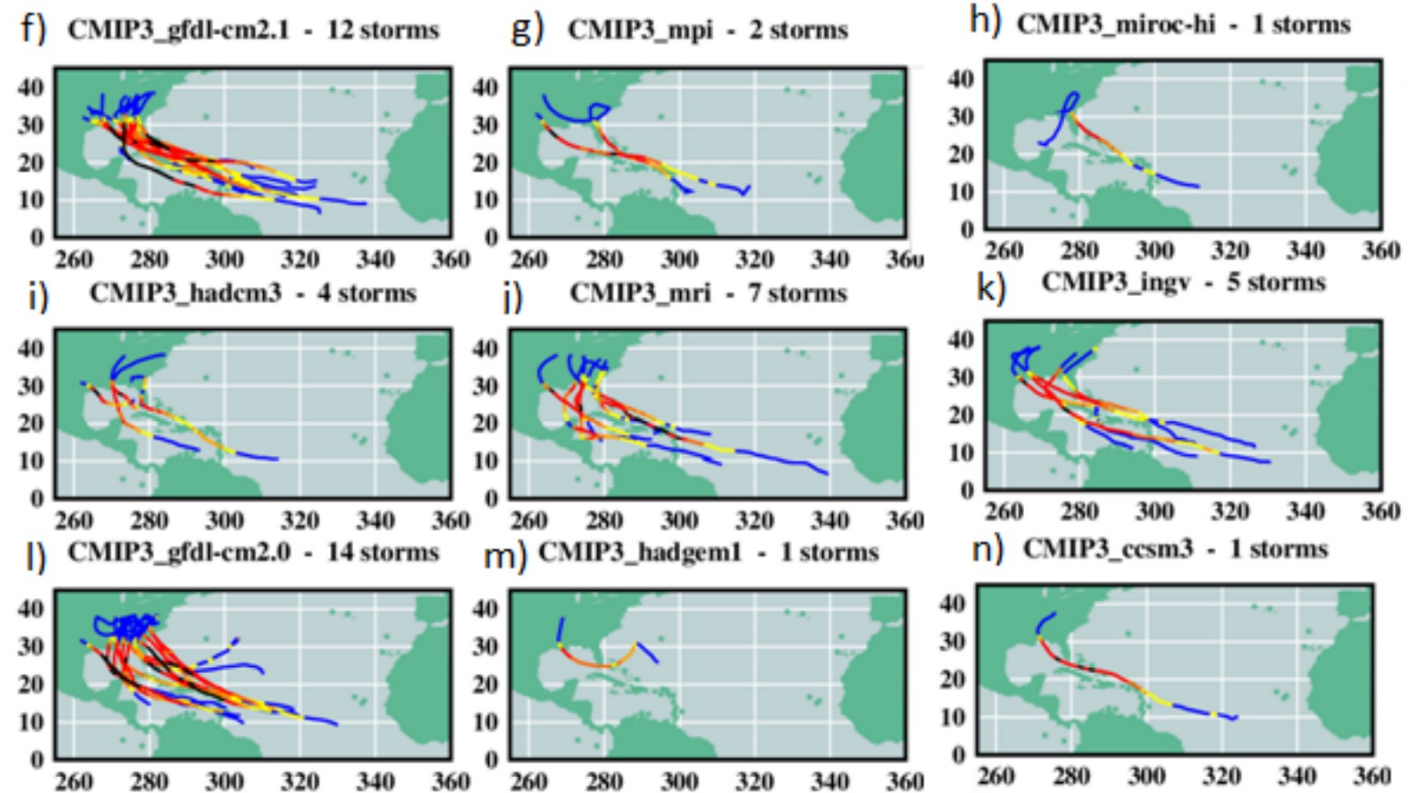
https://www.gfdl.noaa.gov/wp-content/uploads/pix/user_images/tk/global_warm_hurr/6stack_NOAA_FACT_Sheet_2012_crop.png



General Approaches to Capture Climate Effects on Hurricanes

2: Downscale hurricane tracks from global circulation models

- Able to capture complex environmental interactions
- High level of uncertainty in downscaled tracks
 - + scenario uncertainty
 - + GCM uncertainty
- Computationally expensive
- Often can not accurately represent the historical record on a geographical level useful for planning, design, or risk analysis



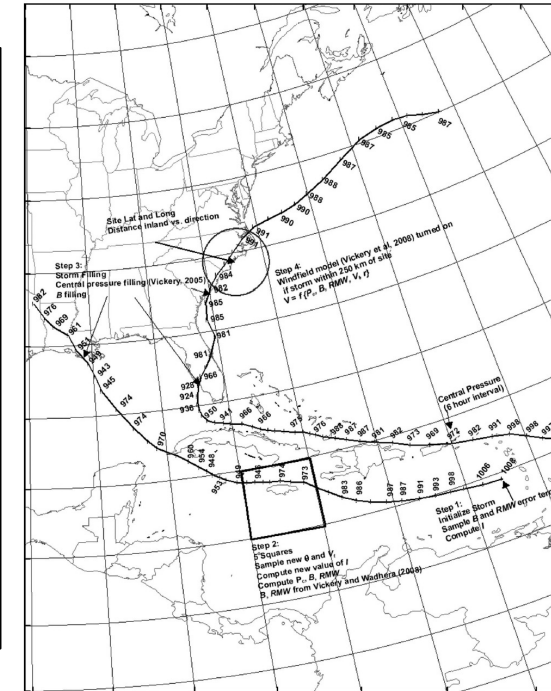
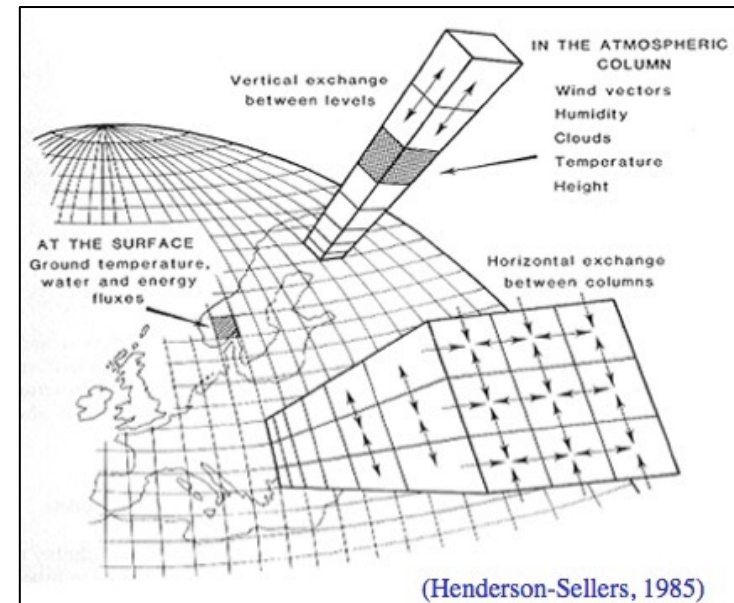
Knutson, T. R., Sirutis, J. J., Bender, M. A., & Tuleya, R. E. (2021). Dynamical Downscaling Projections of Late 21st Century US Landfalling Hurricane Activity. Climatic Change.



General Approaches to Capture Climate Effects on Hurricanes

3: Couple GCM environmental data outputs with hurricane track and wind field models

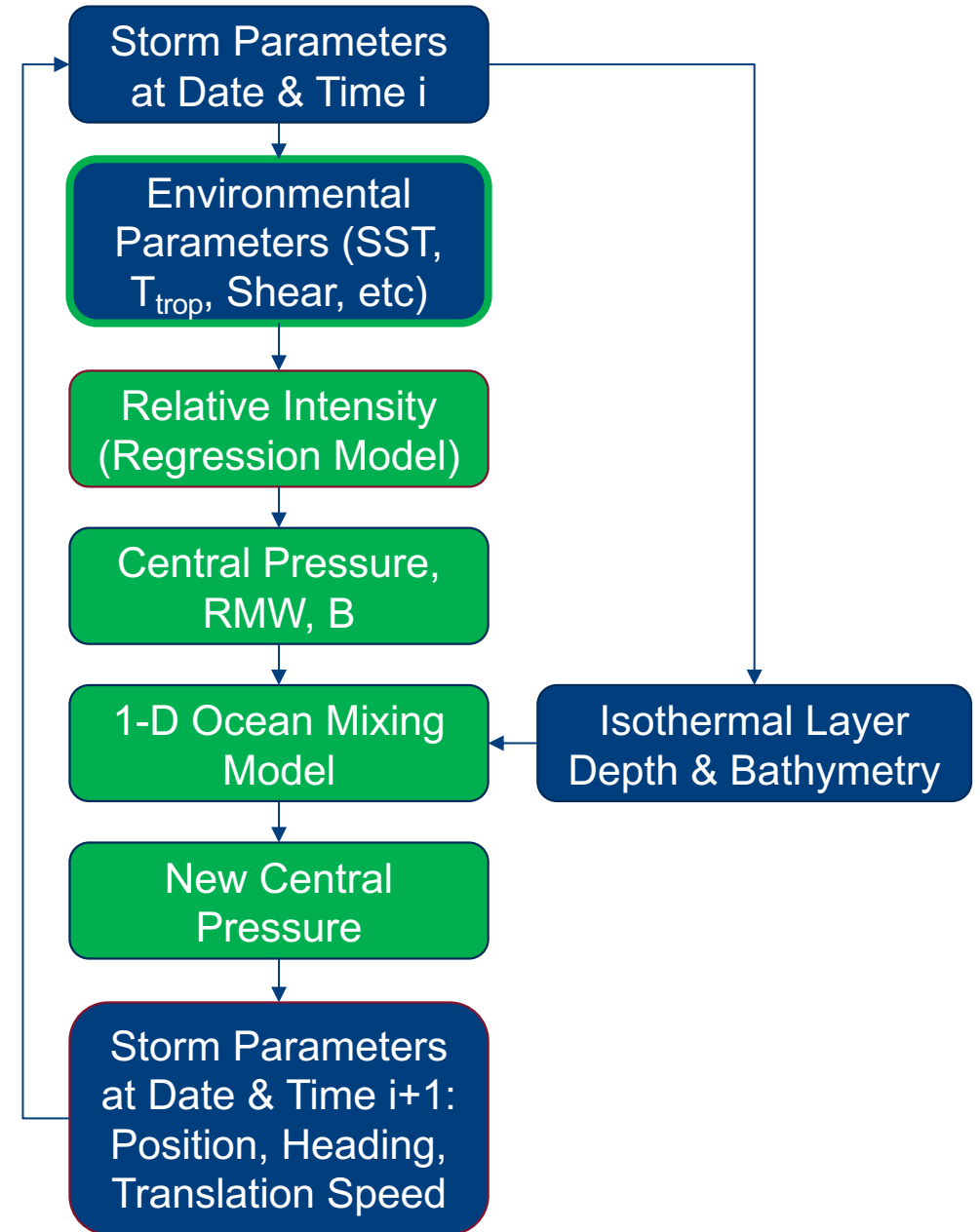
- Downscaling environmental parameters is more accurate and efficient than downscaling tracks
- Able to capture interactions of changes in multiple environmental parameters and effect on hurricane hazard
- Requires statistical/physical dependencies in the track model on key environmental parameters





Track Modeling + Climate Data

- ARA approach uses statistical/physical track model with climate dependencies in the intensity, size, and shape components of the model (Vickery et al., 2009b)
- The relative intensity components is a statistical model with physical climate dependencies based upon historical hurricane behavior
- Central pressure is modeled using the relative intensity concept and a 1-D ocean mixing model and is dependent upon thermodynamic and atmospheric environmental variables
- Regionally dependent statistical models of RMW and B were developed as a function of central pressure and sea surface temperature (SST)



Steve Jewson
CEO
Lambda Climate Research Ltd

Oasis Conference

May 4th 2023

Lambda Climate Research

Peer-reviewed, published research into cat risk, climate and statistics

Climate Modelling

Better methods for extracting climate model output

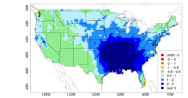
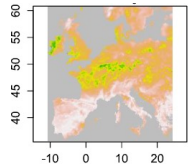
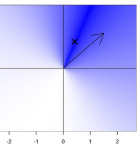
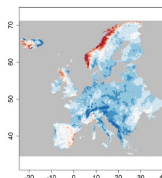
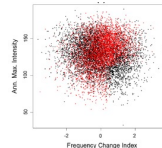
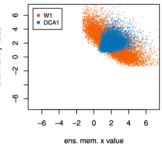
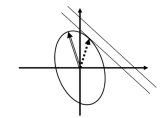
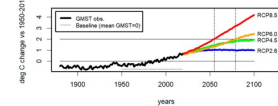
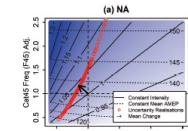


Figure 3. The two PCA spatial patterns for US summer rainfall anomalies. The patterns maximize explained variance.



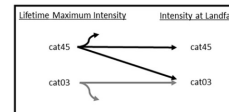
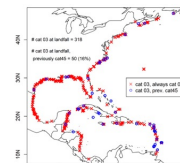
Statistical Modelling

New solutions for objective priors and frequentist prediction



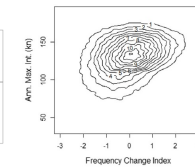
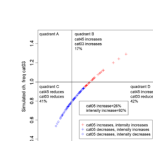
Hurricanes and TCs

Insights into climate change frequencies, intensities, correlations, distributions, landfall, damage, seasonal forecasts



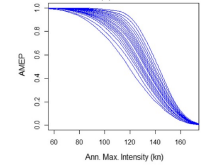
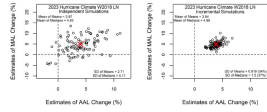
Decision making

New algorithms for decision making under uncertainty



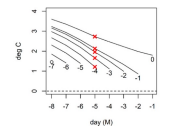
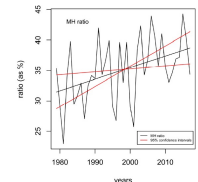
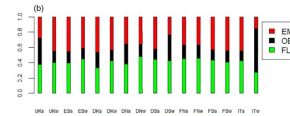
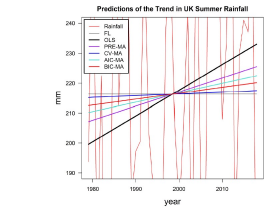
Cat Model Simulation

New algorithms for making adjustments and incorporating uncertainty



Trend Estimation

New algorithms for modelling trends in noisy data



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LCR Consortium Benefits

Early Access to research

Lambda Climate Research is funded by a consortium of insurance companies

Algorithms

Blogs

Software

Data-Sets

Discussions

For adjusting cat model output for climate change, seasonal forecasts

Review

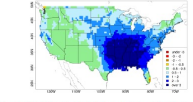
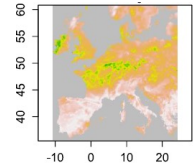
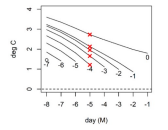
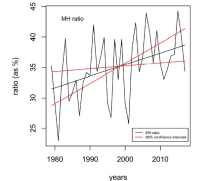
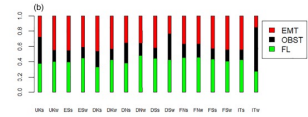
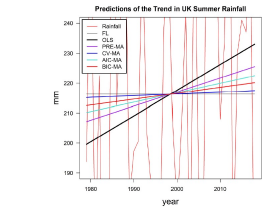
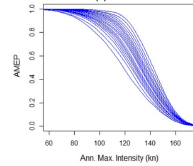
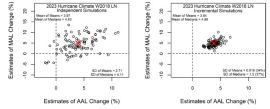
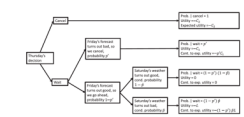
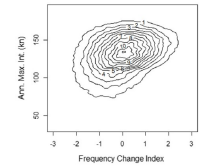
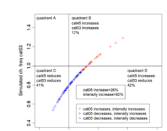
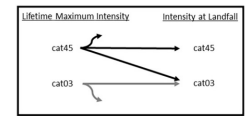
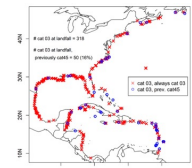
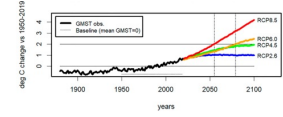
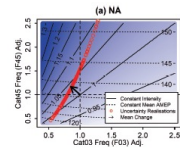
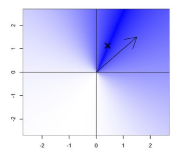
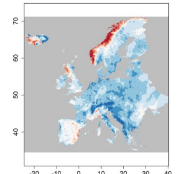
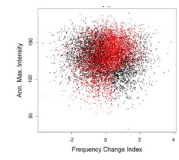
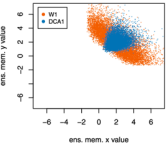
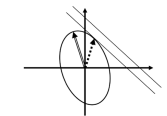
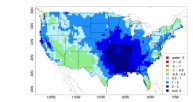


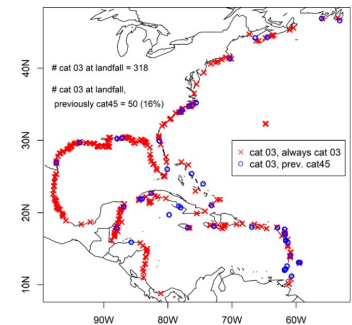
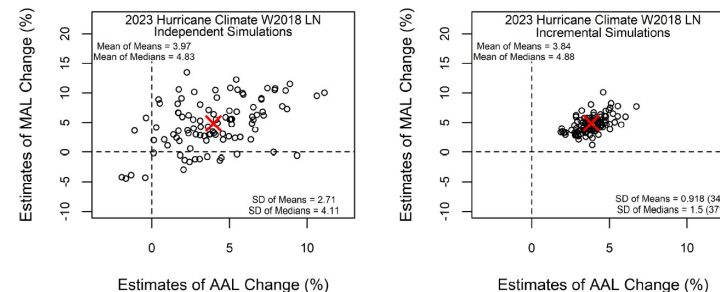
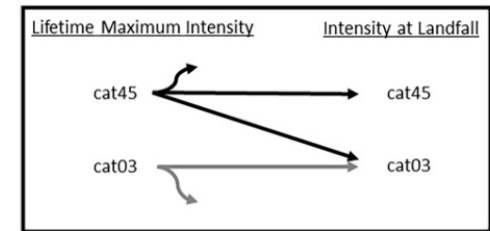
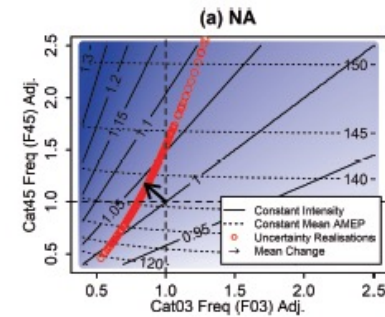
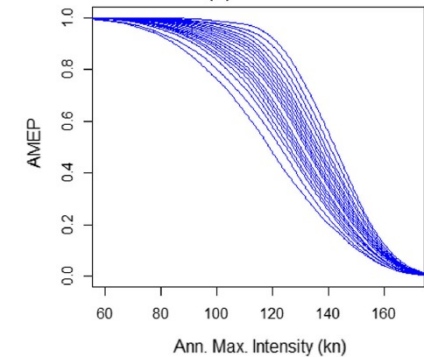
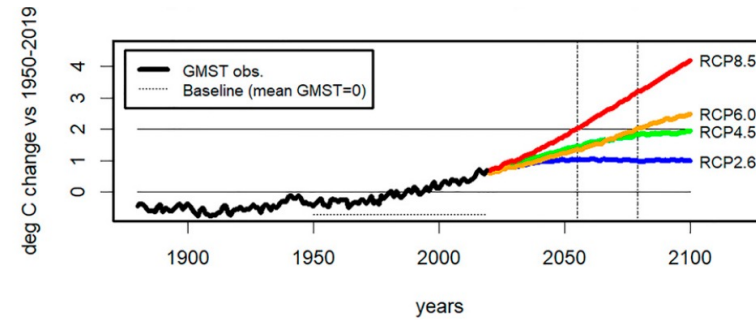
Figure 3. The first PCA spatial pattern for US summer rainfall anomalies. The pattern maximizes explained variance.



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7 Things to Know About Hurricanes and Climate Change

1. Make sure you understand your risk model baseline
2. Frequency and intensity changes are the same thing. Don't double count.
3. Climate change is uncertain. You should be applying changes as distributions.
4. To apply changes as distributions you probably need a new simulation algorithm.
5. To get accurate estimates of changes you probably need another new simulation algorithm.
6. Cat3 is likely not changing the same as cat0. Cat 5 is likely not changing the same as cat4.
7. Don't confuse basin and landfall intensity.
 1. Most climate models show that hurricane frequency is decreasing
 2. But the same models show that *landfall* hurricane frequency is *increasing*
 3. "few but more intense" should actually be "more and more intense"



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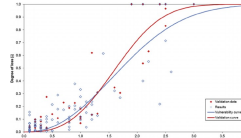
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**XL Insurance
Reinsurance**

**Cat Pigott, FIA
Head of Science & Natural Perils
AXA XL Risk Management**

Risk vs Climate Change



$$\text{Risk} = f(\text{Hazard}, \text{Exposure}, \text{Vulnerability})$$



Frequency & severity of a perilous event which can adversely impact exposure



Projection into the Future

- Natural Variability
- Climate Change



Asset(s) exposed to a hazard in a given space and time



- Population Growth
- Urbanization
- Urban Sprawl

~+4%
p.a.



Susceptibility or damageability of an exposed asset to a given intensity of the hazard



- Building Regulation
- Socio-Economic Development

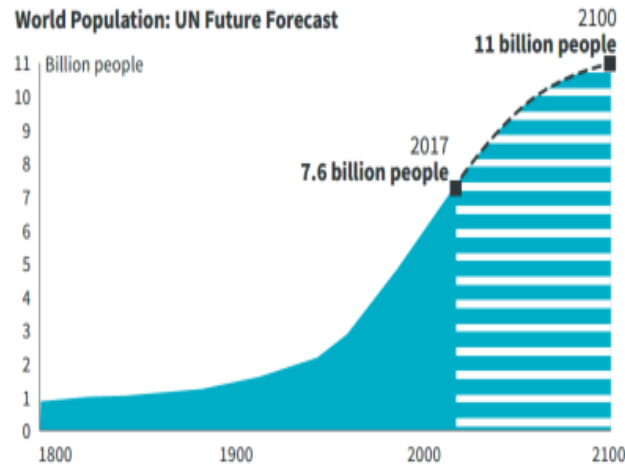
Prediction?

Short-term projection - Exposure may be most important player, while Vulnerability is most difficult to predict. Climate Change is only one component of the problem

Exposure Changes

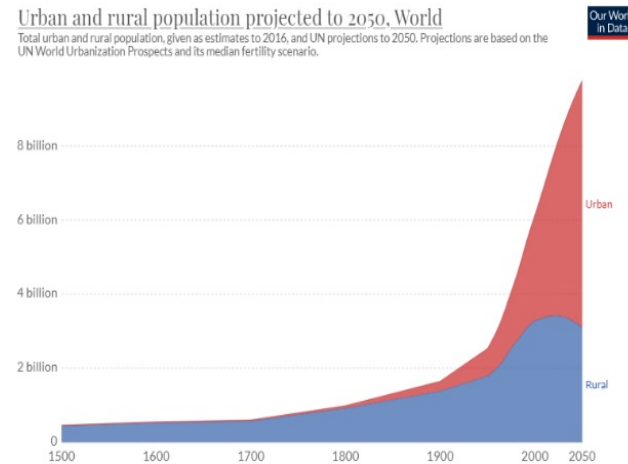
Population growth

- Increases as economic development has progressed
- More people, with more assets are at risk from perils
- Population growth forecast.



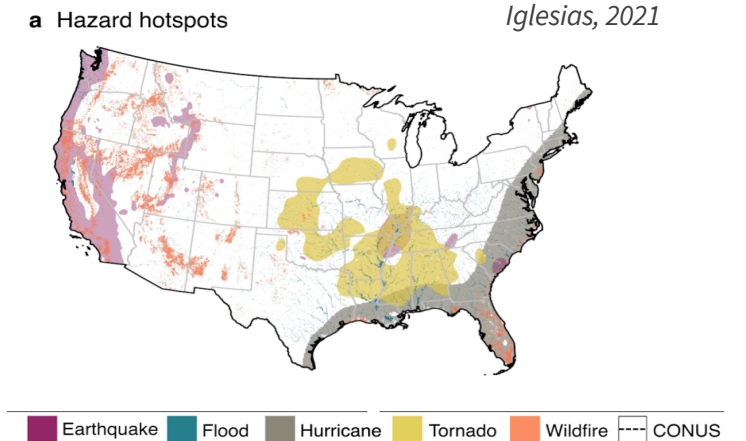
Increased urbanization

- Economic development results in a move from rural to urban areas
- Urban areas tend to be close to rivers or the coast
- Continued urbanization forecast.



Growing urban sprawl

- Number of people moving to urban areas will grow, but also expect urban areas to increase in size
- Demand for development has potential to put properties in high-risk areas (wildfires, risking sea-levels etc).



Growth in exposure driven by number of factors including population growth and urban sprawl.

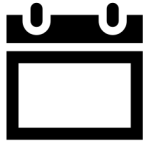
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Quantifying Climate Change Risk



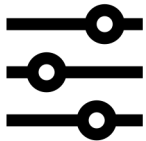
Peril-region materiality



Timescale



Science! (IPCC Interactive Atlas a great starting point)



Model Adjustments



SELECT VISUALIZATION

-  MAP  REGIONS  COMBINATIONS

AFRICA

- North Africa
- Sahara (SAH)
- Western Africa (WAF)
- Central Africa (CAF)
- North Eastern Africa (NEAF)
- South Eastern Africa (SEAF)
- West Southern Africa (WSAF)
- East Southern Africa (ESAF)
- Madagascar (MDG)

ASIA






- Arabian Peninsula (ARP)
- West Central Asia (WCA)
- West Siberia (WSB)
- East Siberia (ESB)
- Russian Far East (RFE)
- East Asia (EAS)
- East Central Asia (ECA)
- Tibetan Plateau (TIB)
- South Asia (SAS)
- South East Asia (SEA)

AUSTRALASIA

- Northern Australia (NAU)
- Central Australia (CAU)
- Eastern Australia (EAU)
- Southern Australia (SAU)
- New Zealand (NZ)

CENTER & SOUTH AMERICA

- Southern Central America (SCA)
- North-Western South America (NWS)
- Northern South America (NSA)
- South American Monsoon (SAM)
- North-Eastern South America (NES)
- South Western South America (SWSA)

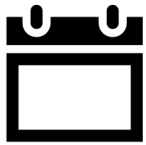
CID	FUTURE CHANGES	TREND / ATTRIBUTION
HEAT AND COLD 		
Mean surface temperature	▲ High confidence of increase	▲ Upward trend without attribution
Extreme heat	▲ High confidence of increase	▲ Upward trend with high confidence of attribution
Cold spell	▼ High confidence of decrease	▼ Downward trend with high confidence of attribution
WET AND DRY 		
Mean precipitation	▲ Medium confidence of increase	—
River flood	▲ Medium confidence of increase	—
Heavy precipitation and pluvial flood	▲ High confidence of increase	▲ Upward trend without attribution
Landslide	▲ Medium confidence of increase	—
WIND 		
Tropical cyclone	▲ Medium confidence of increase	▲ Upward trend without attribution
COASTAL 		
Relative sea level	▲ High confidence of increase	▲ Upward trend without attribution
Coastal flood	▲ High confidence of increase	—
Coastal erosion	▲ High confidence of increase	—
Marine heatwave	▲ High confidence of increase	▲ Upward trend without attribution
Ocean acidity	▲ High confidence of increase	—
OTHERS 		
Atmospheric CO ₂ at surface	▲ High confidence of increase	▲ Upward trend without attribution



Quantifying Climate Change Risk



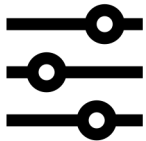
Peril-region materiality



Timescale



Science! (IPCC Interactive Atlas a great starting point)



Model Adjustments



Example Model Adjustment: Flood

- Water (or lack thereof) perils show the most confidence in climate change to date
- Test observed changes against baseline model assumptions – make adjustment on frequency/severity based on sensitivity testing
- Consider model uncertainty when considering model adjustments

