## Atlantic Hurricane Surge Threat

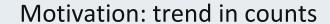
Tide gauge records and a projection

#### **Aslak Grinsted**

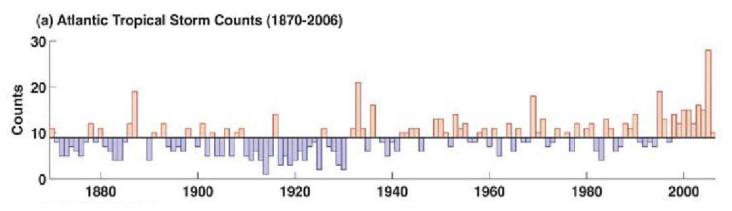
John Moore, Svetlana Jevrejeva

Centre for Ice and Climate, Niels Bohr Institute, University of Copenhagen College of Global Change and Earth System Science, Beijing Normal University PSMSL, National Oceanography Centre, United Kingdom

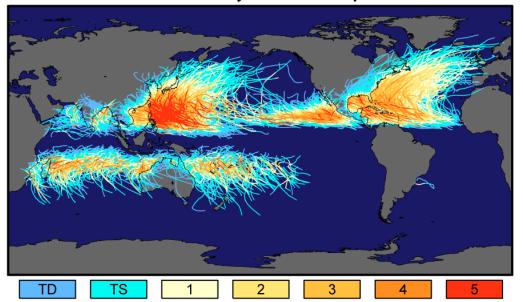








Tracks and Intensity of All Tropical Storms



 Apparent trend in storm counts



## Motivation: observational Bias



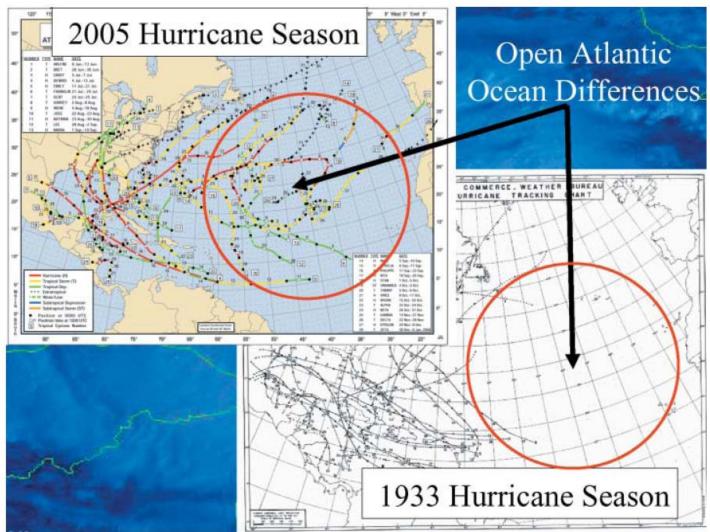


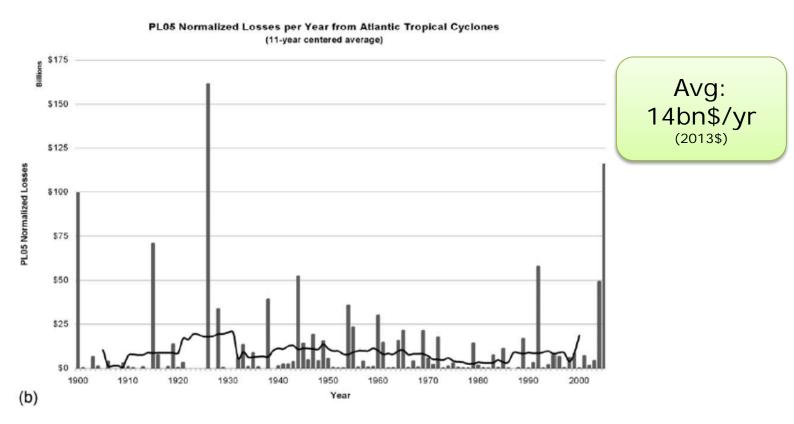
Fig. 1. Track maps of the Atlantic hurricane seasons of 2005 and 1933, the two busiest hurricane years on record for tropical cyclone frequency. The circles highlight large differences in activity that occurred over the open Atlantic Ocean.

Landsea, EOS2007



### Motivation: Normalized Hurricane Damage (NHD)





**Fig. 3.** U.S. Gulf and Atlantic hurricane damage 1900–2005 adjusted for inflation. Total United States tropical cyclone losses adjusted only for inflation to 2005 dollars. Upward trend in damages is clearly evident, but this is misleading since increased wealth, population, and housing units are not taken into account.



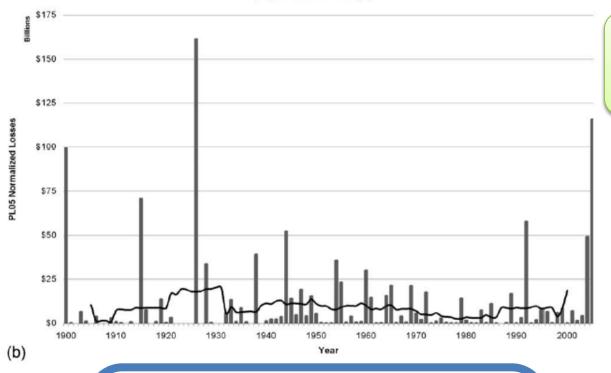
### Motivation: Normalized Hurricane Damage (NHD)



Avg:

14bn\$/yr





**Fig. 3.** U.S. Gulf and Atlantic hurrican inflation to 2005 dollars. Upward trend are not taken into account.

#### Corrected for "wealth at risk"

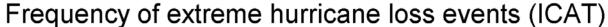
$$D_{2005} = D_{v} \times I_{v} \times \text{RWPC}_{v} \times P_{2005/v} \tag{1}$$

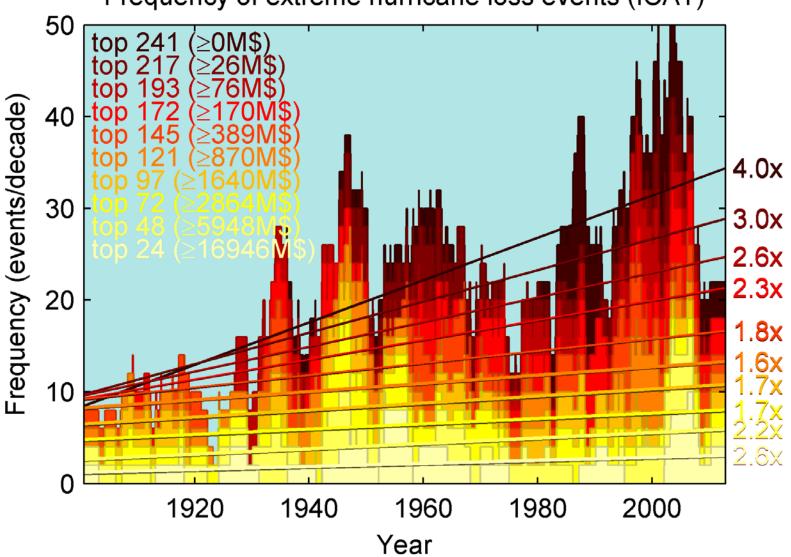
where  $D_{2005}=$ normalized damages in 2005 dollars;  $D_y=$ reported damages in current-year dollars;  $I_y=$ inflation adjustment; RWPC $_y=$ real wealth per capita adjustment; and  $P_{2005/y}=$ coastal county population adjustment.

cal cyclone losses adjusted only for ealth, population, and housing units

# Motivation: Hurricane damages (corrected for societal changes)







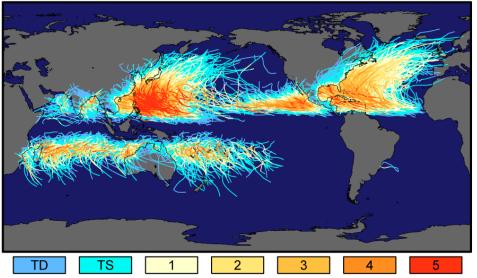


### Background

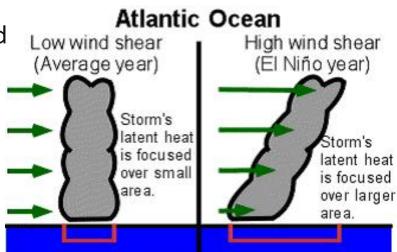


- Warmer sea surface temperatures (SST) are favourable to tropical cyclones.
- But warming may also increase vertical wind shear, which would be unfavourable.
- Relationship to warming is not trivial.

### Tracks and Intensity of All Tropical Storms



Saffir-Simpson Hurricane Intensity Scale







## REVIEW ARTICLE

## Box 1 | Summary of detection, attribution and projection assessmen

### Detection and attribution

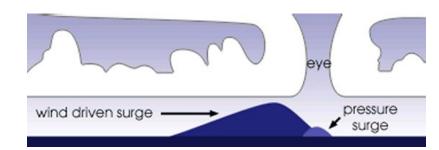
It remains uncertain whether past changes in any tropical cyclone activity (frequency, intensity, rainfall, and so on) exceed the variability expected through natural causes, after accounting for changes over time in observing capabilities.



#### **IDEA:** Use tide gauge records of storm surges



- The strong winds and intense low pressure associated with tropical cyclones generate storm surges.
- wherever tropical cyclones prevail they are the primary cause of storm surges.
- Storm surges are the most harmful aspect of tropical cyclones in the current climate
- A record of storm surge intensity would therefore be a useful measure of a major part of hurricane threat.

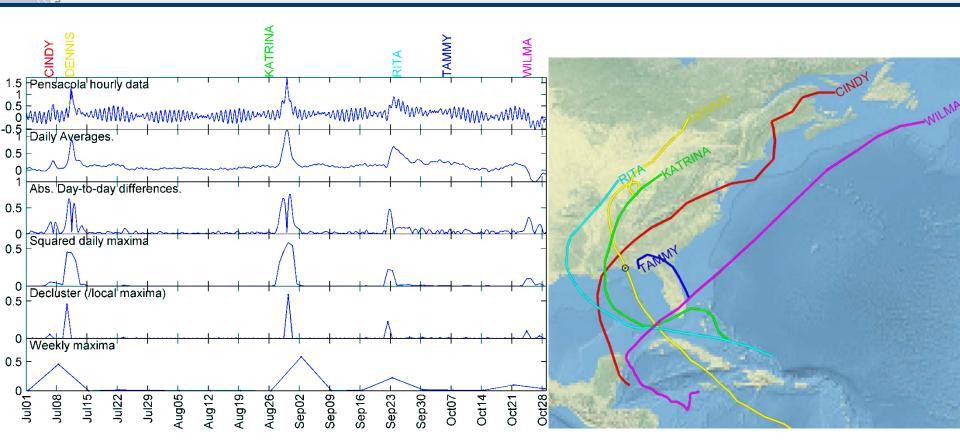






### Pre-Processing: Extracting the hurricane surge



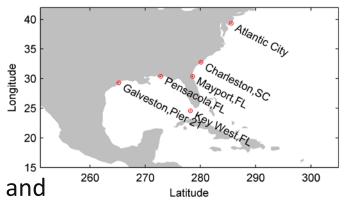


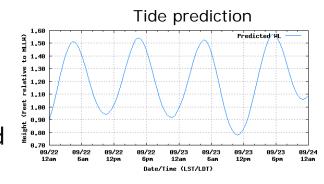


## Constructing an independent & <u>homogeneous</u> regional <u>Surge Index</u>



- We use 6 long tide gauge records in the tropical atlantic. (1923 onwards)
- Daily averages to minimize influence of wave dynamics, and instrument changes (incl. harbour development).
- Day to day differencing to remove the tidal signal and the influence from global sea level rise.
- Squared: The potential energy stored in a sea level perturbation is related to the square of the vertical displacement of the sea surface
- Normalize + Remove seasonal cycle from each record to make them comparable. (Local bathymetry may make some locations particular sensitive to storm surge).
- For each day choose the maximum squared-change from each of the records.

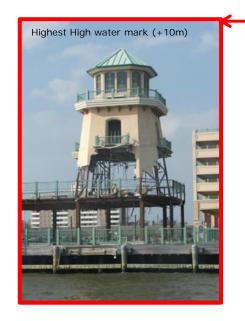


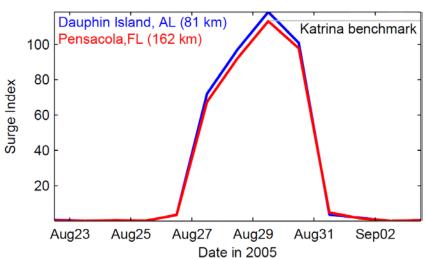


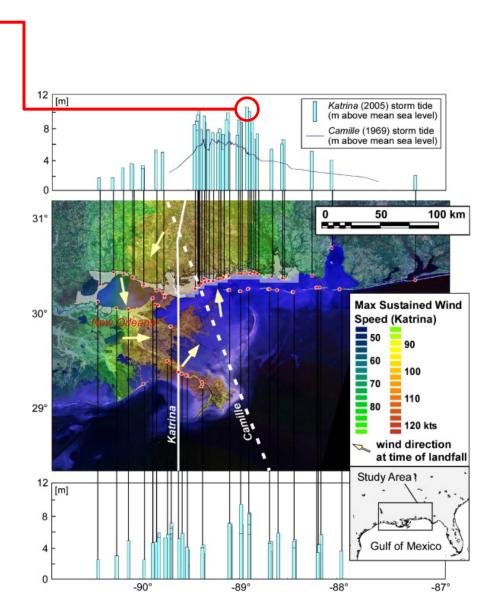
Criteria: long & almost complete

#### The definition of a Katrina Benchmark





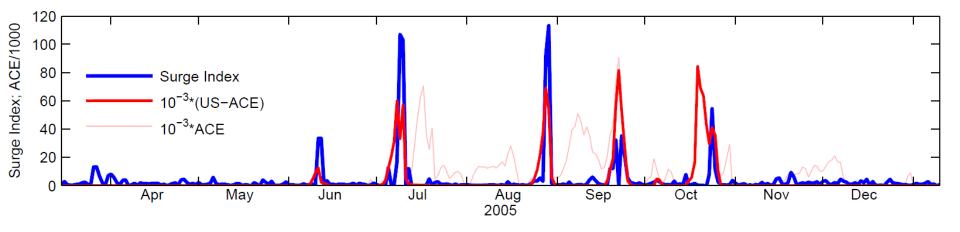




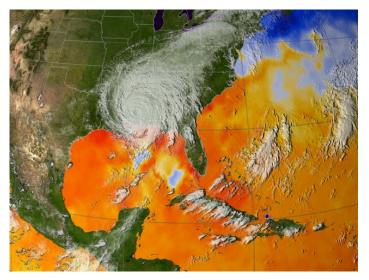


## Does the surge index really respond to hurricanes?





**ACE**: Accumulated Cyclone Energy (Wind<sup>2</sup>) **US-prefix**: calculation restricted to storms that made US-landfall.





### The surge index is a proxy for cyclone activity!



Table \$2 50 greatest events

Table S2.	50 greatest events					
Rank	Event date	Candidate storm (category)	Surge index	ACE	US-ACE	Wind,
1	Sept. 20, 1926	"Great Miami hurricane" (4)	283	422,098	228,174	125
2	July 25, 1934	Not named (1)	153	39,450	39,450	65
3	Sept. 19, 1947	Not named (5)	139	223,806	223,806	130
4	Sept. 10, 1961	Carla (5)	114	588,267	312,007	125
5	Aug. 30, 2005	Katrina (5)	113	189,274	167,424	110
6	July 10, 2005	Dennis (4)	107	207,799	188,024	120
7	Sept. 12, 2008	Ike (4)	104	146,499	143,599	100
8	Sept. 10, 1965	Betsy (4)	94	169,699	169,699	135
9	Sept. 1, 1932	Not named (1)	89	172,324	65,775	70
10	June 28, 1957	Audrey (4)	86	79,474	79,474	125
11	Sept. 27, 1998	Georges (4)	85	463,173	155,699	95
12	Sept. 1, 2008	Gustav (4)	70	326,423	300,849	125
13	Oct. 6, 1995	Opal (4)	59	180,099	91,975	110
14	Aug. 5, 1940	Not named (1)	57	117,449	117,449	70
15	Aug. 18, 1969	Camille (5)	57	362,419	217,996	165
16	Aug. 13, 1932	Not named (4)	55	64,600	64,600	125
17	Oct. 25, 2005	Wilma (5)	55	190,674	161,224	110
18	July 15, 2003	Claudette (1)	55	81,050	56,875	75
19	Oct. 4, 1964	Hilda (4)	53	166,994	166,994	83
20	Sept. 15, 2004	Ivan (5)	53	406,723	364,298	105
21	Aug. 17, 1983	Alicia (3)	52	68,500	68,500	100
22	Aug. 31, 1942	Not named (3)	49	162,324	93,275	70
23	Aug. 26, 1926	Not named (3)	48	110,974	110,974	95
24	Sept. 27, 2002	Isidore (3)	47	180,174	180,174	110
25	8-Sep-1974	Carmen (4)	47	168,899	124,474	120
26	Sept. 12, 1979	Frederic (4)	42	272,524	134,274	115
27	Sept. 25, 1941	Not named (1)	40	229,774	57,725	70
28	April 8, 1938		39			
29	Sept. 19, 1928	Not named (5)	39	152,974	152,974	140
30	Feb. 27, 1984		39			

### The surge index is a proxy for cyclone activity!



Wind,

125

65

130

125

110

120

100

125 Q 95

125

110

70

165

125

110

75

83

105

100

70

95

110

120

115

70

140

Satellite image by NASA of the superstorm on March

13, 1993, at 10:01 UTC.

March 11, 1993

Formed:

Cyclonic blizzard, Nor'easter

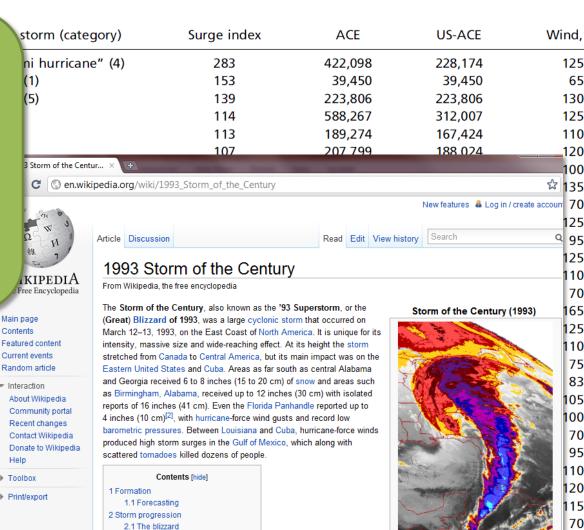
☆ 135

Table C2 50 grantest avants

42 of top-50: known tropical storms

remainder primarily severe winter storms.

Carrill
Not na
05 Wilma
)3 Claude
4 Hilda 🔍
004 Ivan (5
83 Alicia
Not na
Not na
002 Isidore
Carme
979 Freder
Not na
88
Not na
84



2.2 Subtropical derecho 2.3 Tornadoes spawned by the storm

3 Impact

5 See also 6 References

4 Storm amounts



## Comparisons with other measures of cyclone activity



Table 1. Correlations between July-November surge index and other measures of cyclone activity

Series	Period of overlap	Correlation full period	Correlation 1950–2005	High-frequency correlation	Low-frequency correlation
Cat 0-5	1923–2008	0.56	0.65	0.51	0.64
Cat 1-5	1923-2008	0.55	0.57	0.54	0.56
Cat 2-5	1923-2008	0.50	0.42	0.51	0.50
Cat 3-5	1923-2008	0.51	0.47	0.42	0.58
Cat 4-5	1923-2008	0.53	0.50	0.46	0.62
Cat 5	1923-2008	0.38	0.61	0.41	0.48
US cat 0-5	1923-2008	0.54	0.55	0.55	0.56
US cat 1-5	1923-2008	0.57	0.57	0.55	0.67
US cat 2-5	1923-2008	0.55	0.56	0.51	0.66
US cat 3-5	1923-2008	0.57	0.60	0.55	0.67
US cat 4-5	1923-2008	0.61	0.70	0.57	0.74
US cat 5	1923-2008	0.38	0.62	0.38	0.46
ACE	1923-2008	0.61	0.58	0.54	0.72
US ACE	1923-2008	0.58	0.58	0.51	0.77
NTC	1923-2006	0.58	0.55	0.48	0.54
PDI	1923-2008	0.60	0.58	0.53	0.73
US PDI	1923-2008	0.58	0.61	0.52	0.75
NHD	1923-2005	0.65	0.66	0.59	0.38

Low-frequency correlation is the correlation of the two series after a 5-y moving average. High-frequency correlation is the correlation of the residuals after subtracting this moving average. A US prefix indicates that the metric has been restricted to US-landfalling storms only. Cat, category.

Very good agreement with many other measures of cyclone activity.

Especially measures which emphasize large land-falling hurricanes.

Only notable exception is trend of Normalized Hurricane Damages (NHD) which has been subjected to heavy trend corrections.



## Comparisons with other measures of cyclone activity



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Cat 5	1923-2008	0.38	0.61	0.41	0.48
US cat 0-5	1923-2008	0.54	0.55	0.55	0.56
US cat 1-5	1923-2008	0.57	0.57	0.55	0.67
US cat 2-5	1923-2008	0.55	0.56	0.51	0.66
US cat 3-5	1923-2008	0.57	0.60	0.55	0.67
US cat 4-5	1923-2008	0.61	0.70	0.57	0.74
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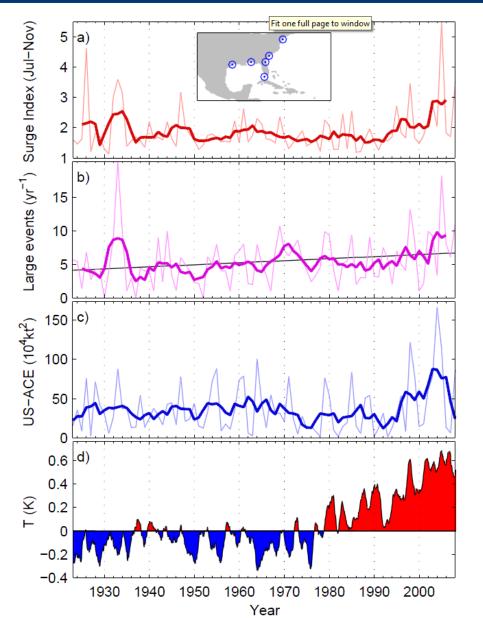
Especially measures which emphasize large land-falling

Only notable exception is trend of Normalized Hurrican which has been subjected to heavy trend corrections.

Interpretation: this is a record of Hurricane surge threat







Mean surge index over season

Frequency above surge index threshold

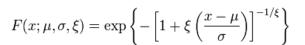
"accumulated cyclone energy" of landfalling cyclones

Global temperature (gistemp)

### Grouping according to global temperature...

as a dotted line.





ξ: shape

 $\sigma$ : scale

μ: location.

Surge index series is **not stationary** 

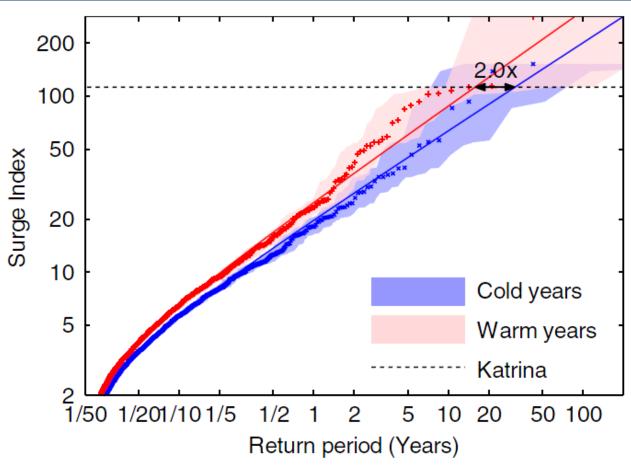


Fig. 3. Return period plot of surge index distribution for cold (blue) and warm (red) years separately (Fig. 1D). The crosses and shaded bands show return periods and confidence intervals estimated from the empirical cdf (Methods). Solid lines show best-fitting GEV distributions (SI Methods, section S3). The maximal surge index during hurricane Katrina in 2005 is shown



- It is non-stationary...
- We fit the surge index record with a non-stationary GEV distribution with parameters varying with a predictor as:

$$k = k_0 (1 + a_k T)$$

$$\sigma = e^{s_0 (1 + a_k T)}$$

$$\mu = \mu_0 (1 + a_\mu T)$$

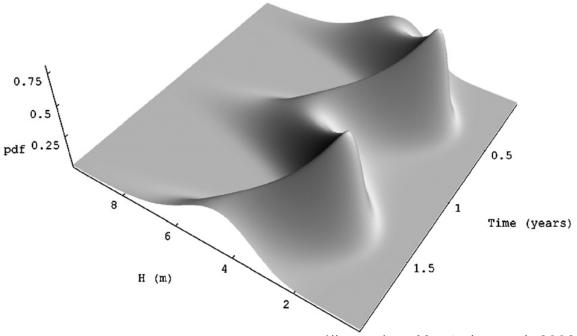
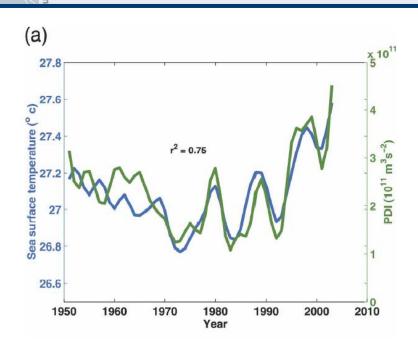


Illustration: Menéndez et al. 2009

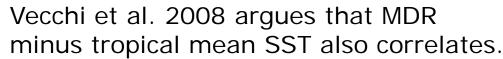


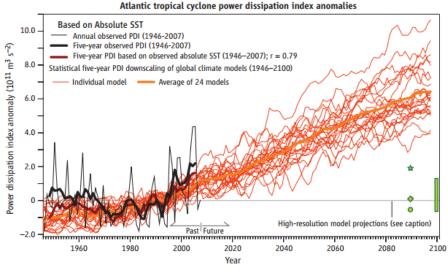
## Two potential predictors: MDR & rMDR

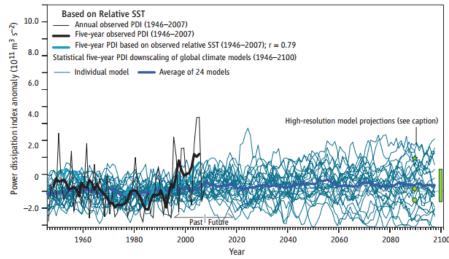




Emanuel 2005







Past and extrapolated changes in Atlantic hurricane activity. Observed PDI anomalies are regressed onto observed absolute and relative SST over the period from 1946 to 2007, and these regression models are used to build estimates of PDI from output of global climate models for historical and future conditions. Anomalies are shown relative to the 1981 to 2000 average (2.13 x 10<sup>11</sup> m³ s<sup>-2</sup>). The green bar denotes the approximate range of PDI anomaly predicted by the statistical/dynamical calculations of (12). The other green symbols denote the approximate values suggested by high-resolution dynamical models: circle (8), star (13) and diamond (15). SST indices are computed



# 3 potential predictors: MDR, rMDR & GlobalT



$$k = k_0 (1 + a_k T)$$

$$\sigma = e^{s_0 (1 + a_s T)}$$

$$\mu = \mu_0 (1 + a_\mu T)$$

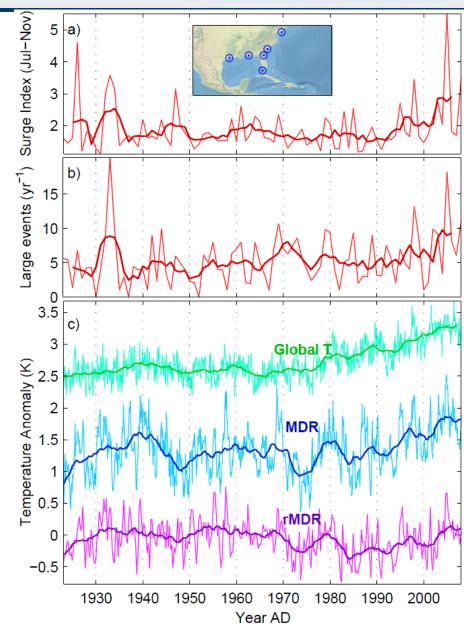




Table 1. Model parameters with confidence intervals for the non-stationary GEV distribution using global average temperature (23) as predictor.

	k <sub>o</sub>	s <sub>0</sub>	μο	a <sub>k</sub>	as	aμ
				_===		
5%	0.51	0.44	2.36	0.04	0.26	0.05
16%	0.52	0.45	2.38	0.11	0.35	0.08
Best guess	0.54	0.48	2.41	0.22	0.49	0.13
84%	0.56	0.5	2.45	0.33	0.62	0.18
95%	0.57	0.51	2.47	0.39	0.71	0.21

$$k = k_0 (1 + a_k T)$$

$$\sigma = e^{s_0(1+a_sT)}$$

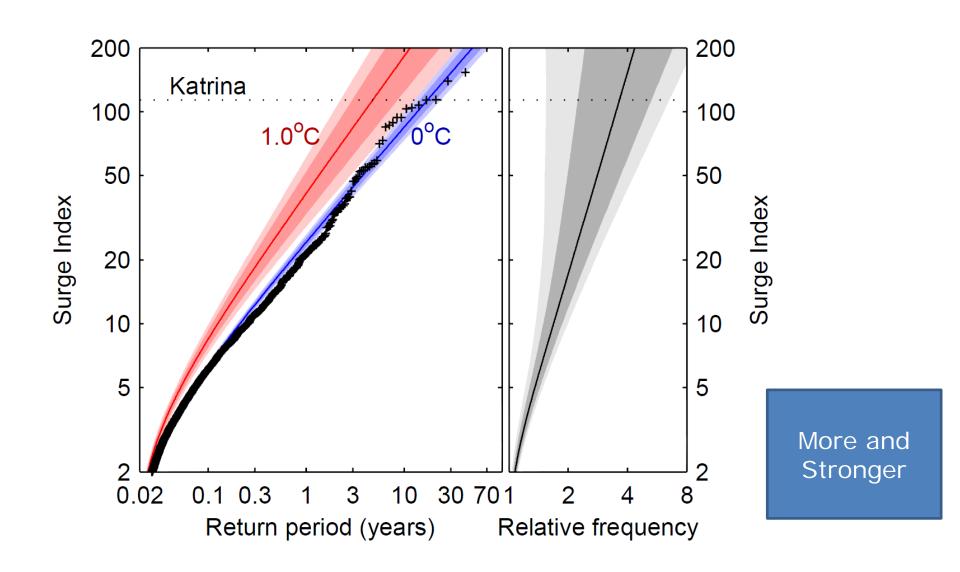
$$\mu = \mu_0(1+a_\mu T)$$

Non-stat params:

**All Positive** 

### 1 degC global warming







#### Which models fit best?



Table 2. : Performance of alternative models expressed as an odds ratio relative to the model using global average temperature as the predictor.

Predictor	Katrina Sensitivity	Odds
Gridded temperatures (23)	2.1x-6.6x	4:1
MDR SST (24)	1.8x-5.5x	3:1
Global T (23)	1.5x-6.6x	1:1
Linear increase	1.3x-4.7x	1:5
Radiative Forcing (25)		1:10
rMDR (24)	1.8x-10x	1:75
Pacific Decadal Oscillation (26)		1:400
Quasi-Biennial Oscillation (27)		1:600
Southern Oscillation Index (28)		1:700
North Atlantic Oscillation (29,30)		1:800
Sahel Rainfall Index (31)		1:1200

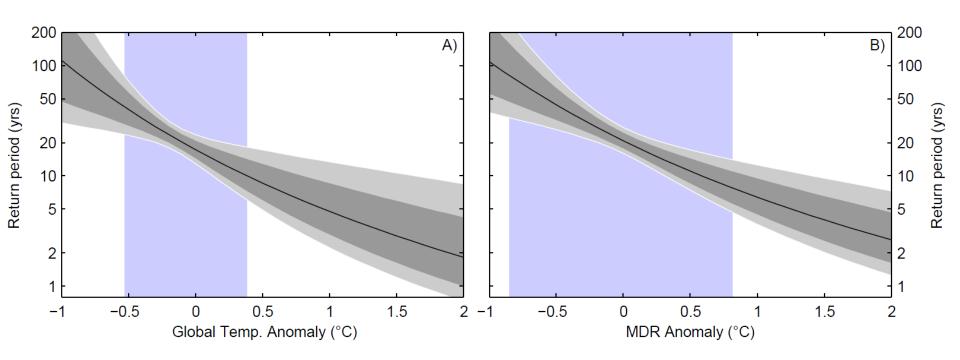
The average likelihood of each hypothesis is calculated from entire sample of models from the MCMC, while ensuring that the likelihood is calculated over the same time interval in the numerator and denominator of the ratio. The Katrina Sensitivity is expressed as the relative frequency increase of Katrinas [5-95%] per °C. The linear trend sensitivity is given per century.

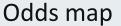
- MDR SST best simple model
- Global T also really good.
- rMDR worse than a linear trend.
- Trend is so large that it can explain more than the natural variations such as ENSO.
- Quite high sensitivity



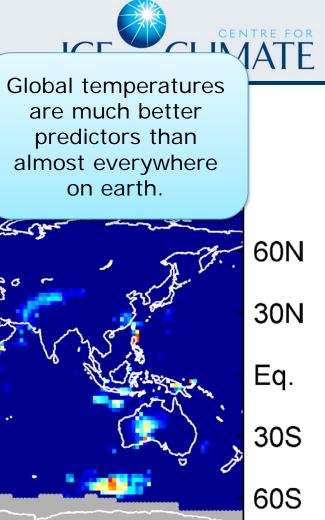


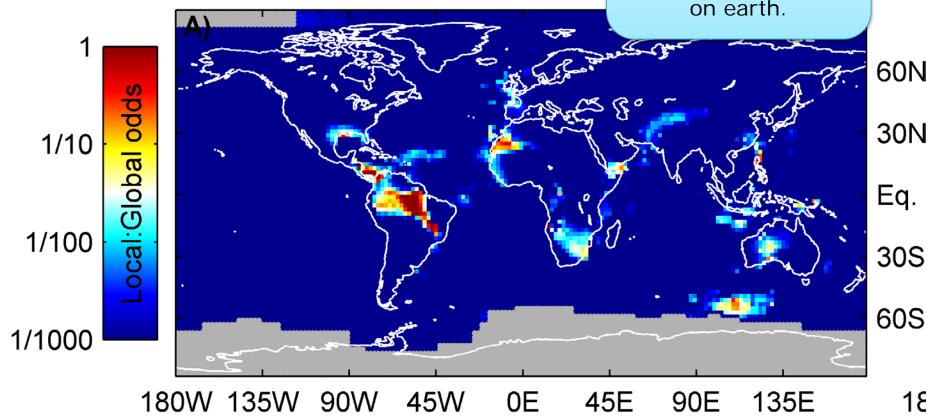


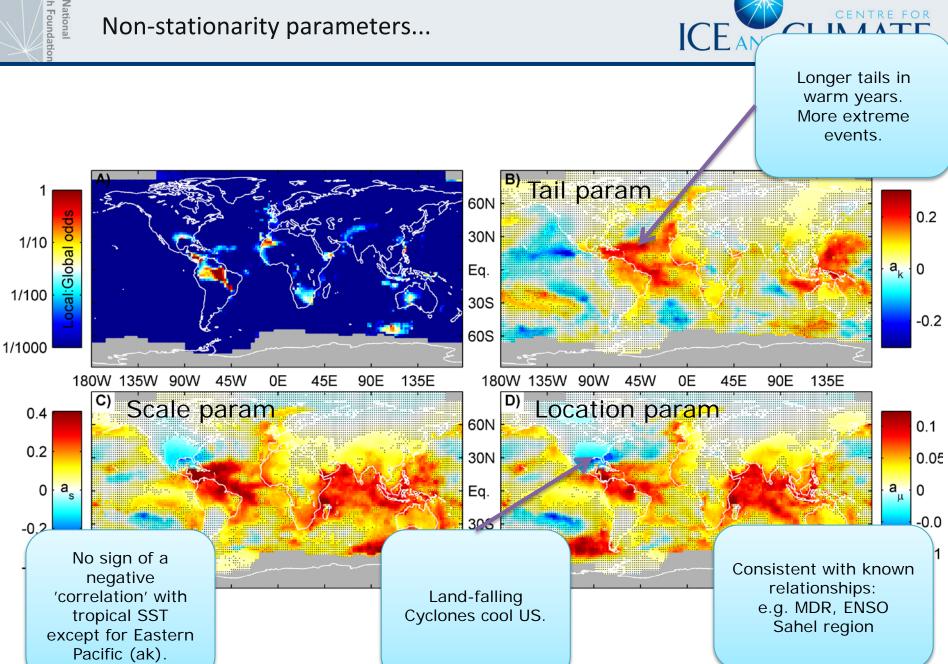


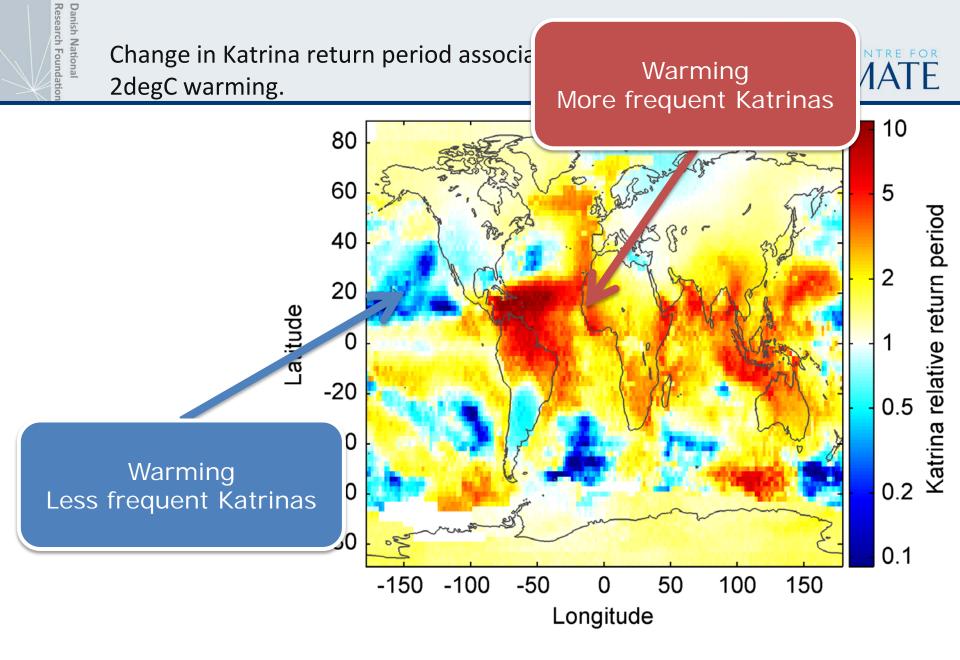


How good are surface temperatures as surge index distribution preditors?

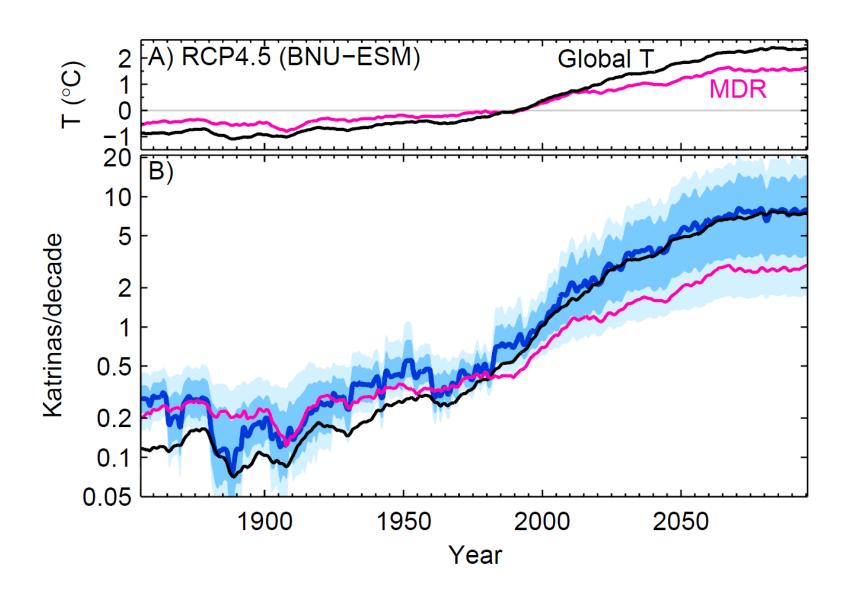














#### **Results:**



- Constructed a <u>homogeneous</u> record of hurricane surge threat since 1923
- Katrinas are twice as frequent in globally warm years compared to cold.
- Found that temperatures are much better predictors than rMDR.
- GlobalT is a very good predictor. (surprisingly perhaps)
- ~0.4°C global warming → halving of Katrina return period.
  - This is less than the warming over the 20<sup>th</sup> century.
- Arguably: We are crossing the threshold where large hurricane surges are more likely 'caused' by global warming than not. (or indeed have crossed)





## Projected Atlantic hurricane surge threat from rising temperatures

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## Homogeneous record of Atlantic hurricane surge threat since 1923

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State Key Laboratory of Earth Surface Processes and Resource Ecology, College of Global Change and Earth System Science, Beijing Normal University, Beijing 100875, China; Arctic Centre, University of Lapland, FI-96101 Rovaniemi, Finland; Department of Earth Sciences, Uppsala University, SE-75236 Uppsala, Sweden; and Mational Creanoporanby Centre Liverpool; LS DA University Kingdom