# **Classification of Radial Wind Profiles for Gulf of Mexico Tropical Cyclones**

Andrew T. Cox Oceanweather Inc. Cos Cob, CT, USA

14<sup>th</sup> International Workshop on Wave Hindcasting and Forecasting Key West, Florida November 8-13 2015

# Overview

- 1. Approach to the analysis of tropical cyclone winds for ocean response models
- 2. Model inputs for fitting the radial wind and pressure profile
- 3. Prior work on storm classification
- 4. Classification system for radial wind profiles
- 5. Summary of results

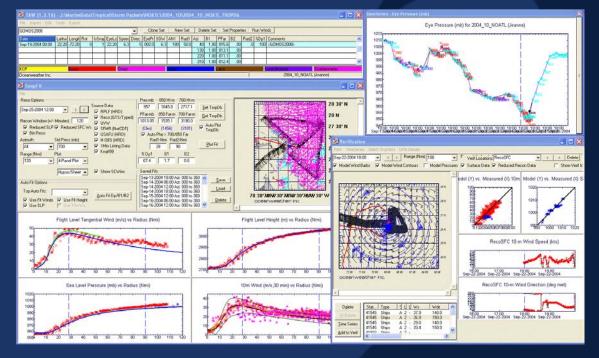
# Approach to the analysis of tropical cyclone winds for ocean response models

Analysis of tropical cyclone wind and pressure fields applies a GUI interface to the OWI Tropical Planetary Boundary Layer Model

Available track/intensity, fix data, aircraft reconnaissance, in-situ and satellite data are applied in the determination of model inputs and validation of results

#### Basic steps:

- Evaluation of basic storm parameters: track, intensity, speed/direction, environmental conditions
- 2. Fitting of radial pressure profiles at snapshot times
- 3. Review 10 m wind output with available validation data
- 4. Repeat process and impose time continuity in model inputs



#### TAWS – Tropical Analyst WorkStation

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## OWI Tropical PBL Inputs

Pressure field is prescribed with a Holland profile

Storm Position – Latitude/Longitude

Storm Motion – Speed/Direction

Po - Central Pressure of Storm

 $P(r) = Po + \sum_{i=1}^{n} dp_i e^{-\frac{1}{2}}$ 

Available from standard sources such as HURDAT but we reexamine these as well

 $Rp_i$  – Scale Pressure Radius

 $Dp_i$  – Total Pressure Drop (*Pfar-Po*)

Related to the Radius of Maximum Wind (RMW) expressed as an inner and outer radii

Pfar may be derived from synoptic maps or atmospheric model output, however the % associated with each Rp<sub>i</sub> must be determined

 $B_i$  – Holland's B associated with each  $Rp_i$ 

Controls the peakedness of the pressure and resultant wind profile

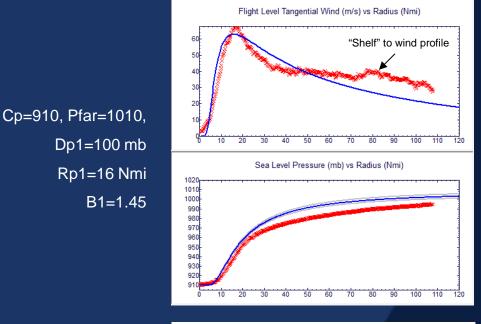
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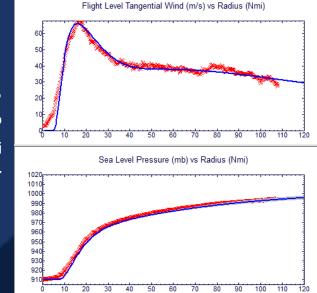
Specification of a single Rp1/B1 combination can work for many storm wind/pressure profiles, but cannot describe more complex shapes

Figures to the right depict flight level tangential winds and estimated sea level pressure data (red) measured during Katrina 2005 on Aug-28-2005 12:00 UTC

Model fits using a single exponential profile (top) and double exponential profile are shown in blue – both result in the same maximum wind and radius of maximum winds but the resultant wind profiles differ greatly

Cp=910, Pfar=1010, Dp1=70 mb Dp2=30 mb Rp1=16 Nmi Rp2=80 Nmi B1=2.1 B2 = 1.7





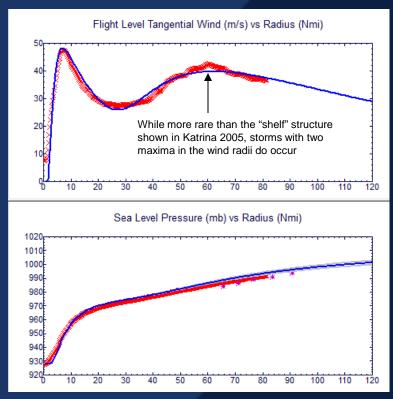
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While application of the double exponential fit can better describe complex wind profiles – including those with two wind maxima like Allen 1980 (right) – it increases the number of model parameters from 3 (Dp1, Rp1 and B1) to 6 (Dp1, Dp2, Rp1, Rp2, B1, B2)

In Joint Probability Method (JPM) or synthetic storm generation the increased number of parameters can lead to a large set of storms to be run, plus statistical relationships applied for Rp1/B1 are even more difficult for the expanded parameter set

Can this complexity be better described through an analysis of the resultant wind profile rather than in the raw model inputs?

The Gulf of Mexico Meteorological and Oceanographic (GOMOS) hindcast provides over 4,000 profile fits in 396 storms for the period 1900-2011 to evaluate tropical radial wind profiles in the Gulf of Mexico



Wind/Pressure profile measurements (red) and model fit (blue) during Allen 1980

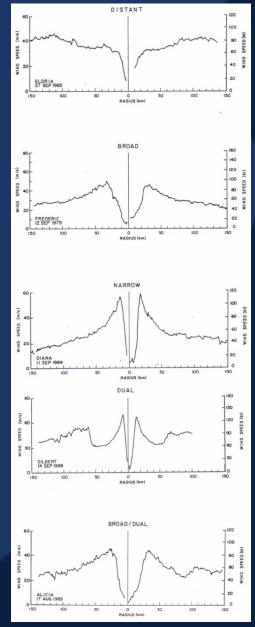
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# Prior Classifications for Profile Shape

Descriptions of the radial wind profile are not new!

- Colon (1963) describes wind profiles as resembling Daisy 1958 (small eye, narrow) or Helene 1958 (large eye, broad)
- Merrill (1984) looked at tropical cyclone size in North Atlantic and North Pacific storms
- Samsury and Rappaport (1991) developed a five class wind profile classification system (figure, right)
- Chen (2010) developed a size index for North Pacific typhoons in which systems were deemed "compact" or "incompact"

The goal of most of the prior work was to relate cyclone size to intensity changes to aid in forecasting



From Samsury and Rappaport (1991)

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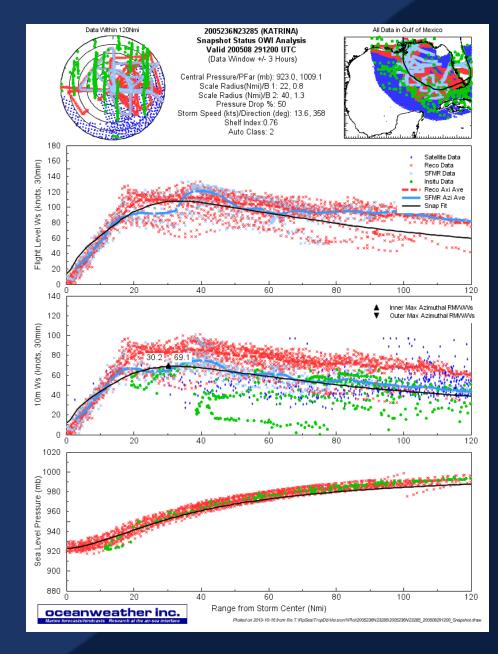
# Diagnostic Plots for All Profile Fits

To aid in the development of wind profile classes diagnostic plots of the PBL inputs, measured data, and resultant model fit were produced.

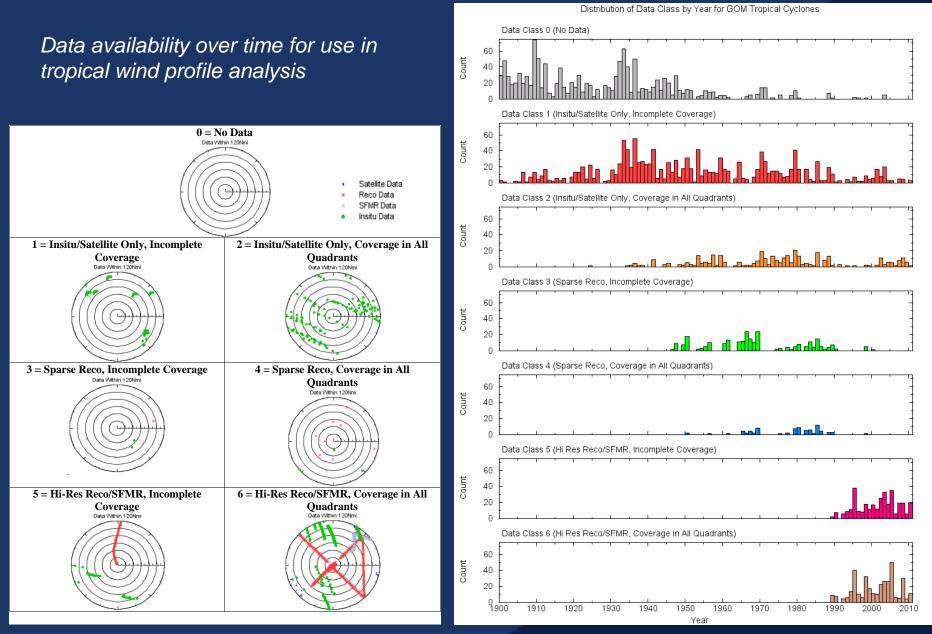
This figure is during Katrina 2005 valid on Aug-29-2005 at 12:00 UTC

Analyzed model data are shown as azimuthally averaged black lines and can be directly compared to azimuthally averaged Aircraft/SFMR dashed lines

Other data (satellite, recon, in-situ) are not azimuthally averaged and show the variation of the measurements by quadrant of the storm



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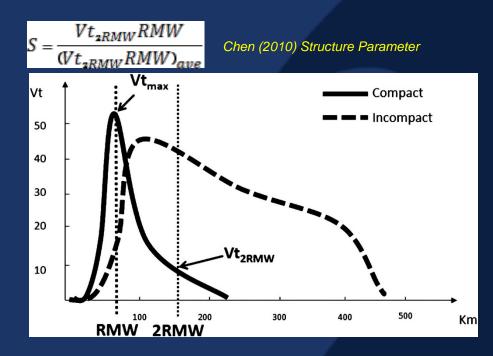
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# The "Shelfy" Index

Manual inspection of diagnostic profiles indicated that a classification on just the tropical inputs (Rp 1/2, B 1/2, Dp) would be difficult – a descriptor of the shape of the wind profile was needed

Chen (2010) applied a simple structure parameter S which was the ratio of the tangential wind speed at twice the RMW to the average value. Values of S < 1 were deemed "incompact" and S>1 "compact"

This led to the development of  $S_{GOM}$  parameter which applied the ratio of RMW and pressure deficit to the average GOM storm (45 mb).



$$S_{GOM} = \frac{V t_{4RMW}}{V t_{RMW}} \propto \sqrt{\frac{\Delta p}{\Delta p_{ave}}}$$

Gulf of Mexico Shelf Index

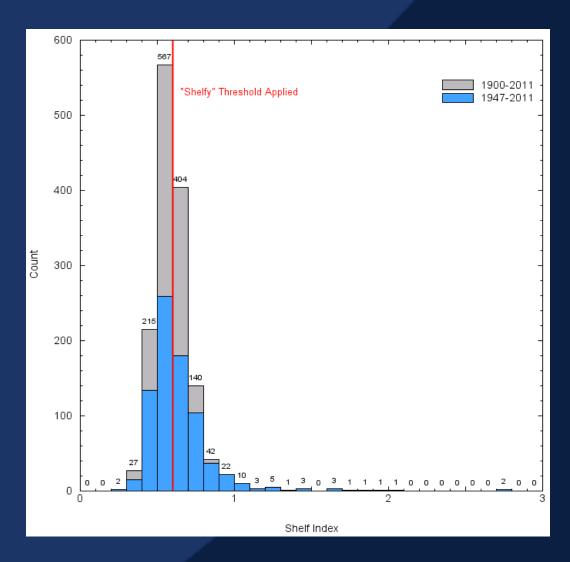
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# The "Shelfy" Index

A  $S_{GOM}$  index of 0.6 was found to be a good threshold between simple profiles and those with shelf or dual radii structure

Population of GOM snapshots show are near even split of storms 56% below and 44% above

Nearly all fits with high  $S_{GOM}$  (large shelf or dual radii) are from the post 1947 period which indicates the need for in-situ data to fit properly



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Using  $S_{GOM}$  and a subset of model inputs, a profile classification system was developed and applied in 4,043 snapshots from GOM storms 1900-2011 in 396 individual storms

			Radius	В
Class	Description	S <sub>GOM</sub>	Criteria	Criteria
1 CSPN	Compact Single Peaked Negligible Shelfiness	≤0.6	RMW<24	B1 > 1
2 CSPS	Compact Single Peaked Shelfy Outer Core	>0.6	RMW<24	-
3 BSPN	Broad Single Peaked Negligible Shelfiness	≤0.6	RMW≥24	-
4 BSPS	Broad Single Peaked Shelfy Outer Core	>0.6	RMW≥24	-
5 MPID	Multi Peaked – Inner Dominant	RMW_In	$Ws \ge RMW$	_Out_Ws
6 MPOD	Multi Peaked – Outer Dominant	RMW_In	_Ws < RMW	_Out_Ws
7 SDNP	Shelf Dominant No Peaks	Flat Profile	e – Manually I	Determined

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Class conforms most closely to Colon's "Daisy" type and S&R's "Narrow" type

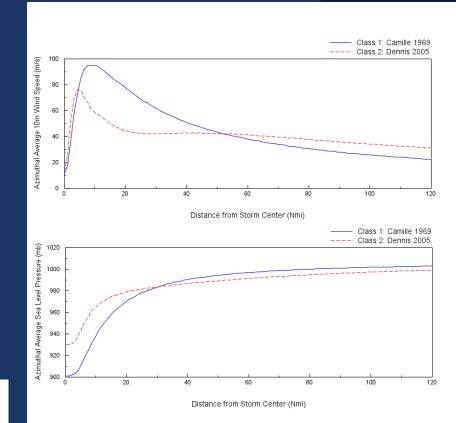
Notable example: Camille 1969

Class #2 CSPS Compact Single Peaked Shelfy Outer Core

Stronger (954/945mb) on average than CSPN (980/977 mb)

## Notable example: Dennis 2005

Profile Class	Exponential Fit	Count	Average EyePres (mb)	Average Rad1 (Nm)	Average Rad2 (Nm)	Average Dp%	Average B1	Average B2	Average Pfar	Average Shelf Index
1 (CSPN)	Single	362	980	19		100	1.10		1013	0.54
	Double	42	977	16	49	58	1.70	1.30	1014	0.50
2 (CSPS)	Single	293	954	18		100	1.20		1012	0.68
	Double	109	945	16	65	66	1.80	1.30	1013	0.77
3 (BSPN)	Single	384	979	31		100	1.20		1013	0.50
	Double	35	972	32	82	66	1.50	1.50	1012	0.52
4 (BSPS)	Single	96	956	33		100	1.20		1013	0.71
	Double	26	955	31	96	69	1.40	1.30	1012	0.70
5 (MPID)	Single	0								
	Double	42	946	11	85	63	1.80	1.50	1012	0.78
6 (MPOD)	Single	0								
	Double	39	968	15	63	50	1.10	1.80	1012	0.94
7 (SDNP)	Single	10	988	144		100	1.10		1011	0.81
	Double	12	981	25	100	53	0.70	0.70	1010	0.65



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Class #3 BSPN Broad Single Peaked Negligible Shelfiness

Class conforms most closely to Colon's "Helene" type and S&R's "Broad" type

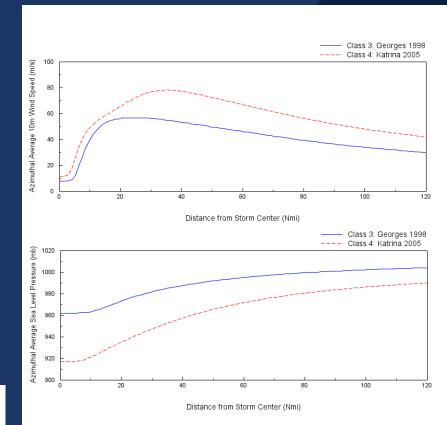
Notable example: Georges 1998

Class #4 BSPS Broad Single Peaked Shelfy Outer Core

The shelfy counter part to BSPN –stronger (956/955mb) on average than BSPN (979/972 mb)

Notable example: Katrina 2005

Profile Class	Exponential Fit	Count	Average EyePres (mb)	Average Rad1 (Nm)	Average Rad2 (Nm)	Average Dp%	Average B1	Average B2	Average Pfar	Average Shelf Index
1 (CSPN)	Single	362	980	19		100	1.10		1013	0.54
	Double	42	977	16	49	58	1.70	1.30	1014	0.50
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# Class #5 MPID Multi Peaked Inner Dominant

Two wind maxima seen in wind profile – inner maxima stronger, can only be fit using double exponential

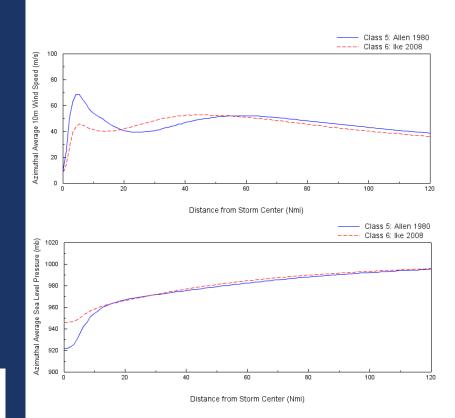
Notable example: Allen 1980

Class #6 MPOD Multi Peaked Outer Dominant

Two wind maxima seen in wind profile – outer maxima stronger, can only be fit using double exponential

Notable example: Ike 2008

Exponential Fit Single	Count 362	Average EyePres (mb) 980	Average Rad1 (Nm) 19	Average Rad2 (Nm)	Average Dp% 100	Average B1 1.10	Average B2	Average Pfar 1013	Average Shelf Index 0.54
Double	42	977	16	49	58	1.70	1.30	1014	0.50
Single	293	954	18		100	1.20		1012	0.68
Double	109	945	16	65	66	1.80	1.30	1013	0.77
Single	384	979	31		100	1.20		1013	0.50
Double	35	972	32	82	66	1.50	1.50	1012	0.52
Single	96	956	33		100	1.20		1013	0.71
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Single	10	988	144		100	1.10		1011	0.81
	12	981	25	100	53	0.70	0.70	1010	0.65
-	Fit Single Double Single Double Single Double Single Double Single Double Single	FitCountSingle362Double42Single293Double109Single384Double35Single96Double26Single0Double42Single0Double39Single10	Exponential Fit  ExpPres Count  ExpPres (mb)    Single  362  980    Double  42  977    Single  293  954    Double  109  945    Single  384  979    Double  35  972    Single  96  956    Double  26  955    Single  0  945    Double  26  956    Double  26  946    Single  0  945    Double  32  946    Single  0  968    Single  39  968    Single  10  988	Exponential Fit  EyePres Count  EyePres (mb)  Rad1 (Nm)    Single  362  980  19    Double  42  977  16    Single  293  954  18    Double  109  945  16    Single  384  979  31    Double  35  972  32    Single  96  956  33    Double  26  955  31    Single  0	Exponential Fit  EyePres Count  Rad1 (mb)  Rad1 (Nm)  Rad2 (Nm)    Single  362  980  19    Double  42  977  16  49    Single  293  954  18  980    Double  109  945  16  65    Single  384  979  31  96    Double  35  972  32  82    Single  96  956  33  96    Double  26  955  31  96    Single  0  7  7  7    Double  42  946  11  85    Single  0  7  63  63    Double  39  968  15  63    Single  10  988  144  74	Exponential Fit  EyePres Count (mb)  Rad1 (Nm)  Rad2 (Nm)  Average Dp%    Single  362  980  19  100    Double  42  977  16  49  58    Single  293  954  18  100    Double  109  945  16  65  66    Single  384  979  31  100    Double  35  972  32  82  66    Single  96  956  33  100    Double  26  955  31  96  69    Single  0	Exponential Fit  EyePres (mb)  Rad1 (Nm)  Rad2 (Nm)  Average Dp%  Average B1    Single  362  980  19  100  1.10    Double  42  977  16  49  58  1.70    Single  293  954  18  100  1.20    Double  109  945  16  65  66  1.80    Single  384  979  31  100  1.20    Double  35  972  32  82  66  1.50    Single  96  956  33  100  1.20    Double  26  955  31  96  69  1.40    Single  0  1.20  1.20  1.20  1.20  1.20    Double  35  972  32  82  66  1.50    Single  0  1.20  1.20  1.20  1.20    Double  42  946  11  8	Exponential Fit  EyePres (mb)  Rad1 (Nm)  Rad2 (Nm)  Average Dp%  Average B1  Average B2    Single  362  980  19  100  1.10    Double  42  977  16  49  58  1.70  1.30    Single  293  954  18  100  1.20  1.30    Double  109  945  16  65  66  1.80  1.30    Single  384  979  31  100  1.20  1.50    Double  35  972  32  82  66  1.50  1.50    Single  96  956  33  100  1.20  1.30    Double  26  955  31  96  69  1.40  1.30    Single  0  1.20  1.40  1.30  1.50  1.50  1.50    Single  0  1.20  1.40  1.50  1.50  1.50    Single  0<	Exponential Fit  EyePres (mb)  Rad1 (Nm)  Rad2 (Nm)  Average Dp%  Average B1  Average B2  Average Pfar    Single  362  980  19  100  1.10  1013    Double  42  977  16  49  58  1.70  1.30  1014    Single  293  954  18  100  1.20  1012  1013    Double  109  945  16  65  66  1.80  1.30  1013    Single  384  979  31  100  1.20  1013    Double  35  972  32  82  66  1.50  1.50  1012    Single  96  956  33  100  1.20  1013  1013    Double  26  955  31  96  69  1.40  1.30  1012    Single  0  11  85  63  1.80  1.50  1012    Single



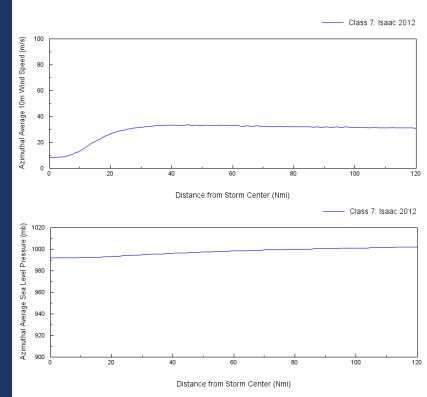
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# Class #7 SDNP Shelf Dominant No Peak

Flat wind profile associated with weakest storm class

Notable example: Isaac 2012

Profile Class	Exponential Fit	Count	Average EyePres (mb)	Average Rad1 (Nm)	Average Rad2 (Nm)	Average Dp%	Average B1	Average B2	Average Pfar	Average Shelf Index
1 (CSPN)	Single	362	980	19		100	1.10		1013	0.54
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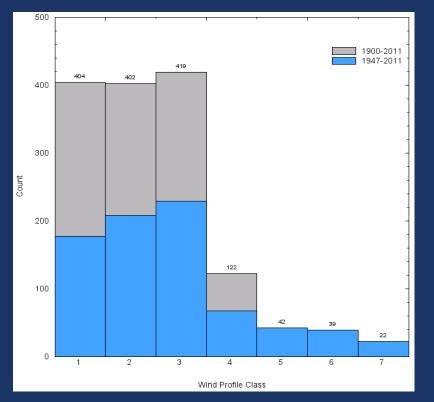


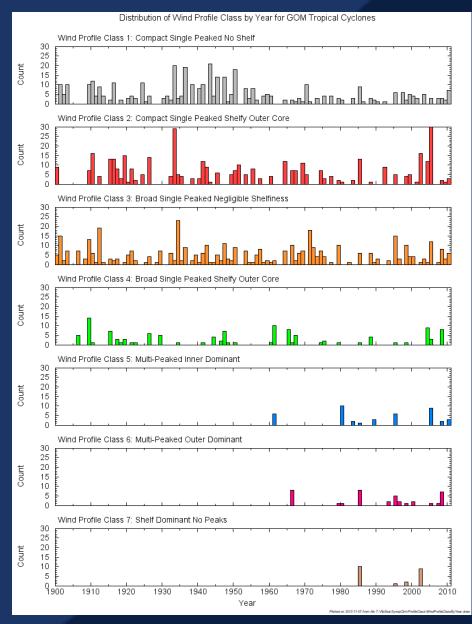
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# Distribution of storm profile classes

Single wind peak Class 1-4 found throughout time period

Double wind peak Classes 5/6 and shelf dominant Class 7 storms only analyzed when reconnaissance is available

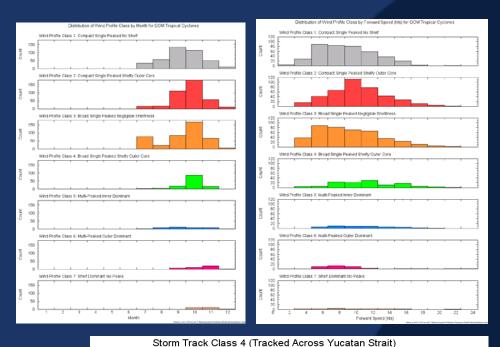


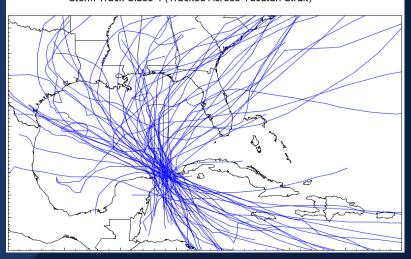


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# Other relationships explored

- Seasonal dependence on profile class?
- Dependence on other model inputs (Vf)?
- Association with track history/origin of storm in Gulf of Mexico?
- How long does a storm maintain a single profile class? Are there preferences from one class to another?





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# Synoptic Classification – Notable Results

• Storms which depict a shelf like structure ( $S_{gom} >= 0.6$ ) to the radial wind profile make up 44% of the storm population 1900-2011 and 48% of the population during the aircraft recon period of 1947-2011

 Most "shelfy" storms exhibit a single wind maxima in the radial wind profile. Storms with a second radial wind maxima (Class 5/6) make up just 5.6% of the total population

• While "shelfy" storms are found in the full 1900-2011 storm population, storms with a second radial wind maxima (Class 5/6) were only analyzed post 1960 – highlighting the need for aircraft recon to diagnose

• Storms which form in the GOM have the highest occurrence (77%) of wind profile classes associated with negligible shelfiness (Class 1 & 3)

• The strongest storms were typically analyzed with a double exponential pressure profile fit in Class 2 (Compact with Shelf, 945mb/16Nmi average central pressure/RMW) and Class 5 (Multiple Peak Inner Dominant, 946mb/11Nmi average central pressure/RMW)

 58% of storms exhibited multiple wind profile classes while in the GOM. Wind profile classes associated with no shelf (Class 1 CSPN) or negligible shelfiness (Class 3) were the most likely to retain a single wind profile class for the entire GOM lifetime

• On average, storms retained the same wind profile 70-85% of the time for adjacent 6-hourly synoptic snapshots. When the wind profile class does change, some classes exhibit preferences. For instance, Class 5 storms (Multiple Peaks) had zero occurrences of transitioning to a Class 1 (Compact Single) profile.

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# Summary

Synoptic classification was performed as part of a Research Partnership to Secure Energy for America (RpSea) project 10121-4801-01 - Ultra-Deepwater Synthetic Hurricane Risk Model for Gulf of Mexico

More information: <u>http://www.rpsea.org/projects/10121-4801-01/</u>

Primary Contractor: Applied Research Associates (Peter Vickery and Lauren Mudd) Sub-Contractors: Oceanweather Inc. and UCAR (James Done and Greg Holland)

Work is underway on the application of the double exponential fits in a synthetic hurricane generation model

Questions?

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