

Asia Wind
Energy Association



IN PARTNERSHIP WITH

StormGeo

AWEA WEBINAR SERIES 2020 - TECHNICAL SESSION

Managing Weather Risks for Offshore Wind Projects in Asia-Pacific

SPEAKERS:



GARD HAUGE
Chief Data Officer - StormGeo



ANNA HILDEN
Global Industry Manager Offshore Wind - StormGeo



ANTONI THERATTIL
Forecast Manager - StormGeo

TUESDAY, 15 SEPTEMBER 2020 - 3 PM SGT



The Asia Wind Energy Association was established in December 2016 to become the leading trade association for the wind energy sector in Asia Pacific.

The association acts as the regional platform for all wind power industry stakeholders to collectively promote the best interests of the wind power sector.

The Asia Wind Energy Association is supported by a wide variety of stakeholders from the offshore and onshore wind industry.

Information



www.asiawind.org



[@asiawindenergy](https://twitter.com/asiawindenergy)



[Asia Wind Energy Association](https://www.linkedin.com/company/asia-wind-energy-association/)



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Asia Wind Energy Association Corporate Partners



Asia Wind Energy Association Corporate Members



Asia Wind Energy Association Partner Organizations



AWEA WEBINAR SERIES 2020 - TECHNICAL SESSION

Managing Weather Risks for Offshore Wind Projects in Asia-Pacific

Managing Weather Risks for Offshore Wind Projects in Asia-Pacific

26~27일 태풍영향 매우 강한 바람

제주도, 남해안,
서해안 중심



매우 강한 바람,
많은 비 유의

27일 새벽: 황해도 연안 상륙

26일 밤~27일 새벽: 서해상 경유

27일 오후: 제주도 서쪽 해상

arirang

NEWS

강풍 (최대순간풍속)

- 40~60 m/s
- 35 m/s 이상
- 20 m/s 이상



Anna Hilden

Global Industry Manager Offshore Wind StormGeo

With over a decade of industry experience, Anna provides advanced meteorological services to clients in the renewable energy sector for safer and more efficient offshore operations. With a background of working in meteorology, as well as experience from a leading wind turbine OEM, Anna is well placed to find the right services for our clients in the renewable energy sector. She has experience from all parts of the value chain, from programming through project and product management, through to sales. Anna co-ordinates StormGeo's offshore wind team, providing clients in offshore wind with services for wind forecasting, helicopter logistics, and metocean forecasting – contributing to safer and more efficient offshore operations.



Antoni Therattil

Forecast Manager StormGeo

With over three decades of experience in the Asian Oceans and weather, Antoni joined StormGeo 12 years ago and is the Forecast Manager for Asia Pacific, Middle East & Africa. Qualifications in MSc Maths, MSc Meteorology, PgDip Oceanography, and Naval Meteorologist and Oceanographer (served as the Joint Director of Meteorology and Oceanography).



Gard Hauge

Chief Data Officer

StormGeo

Leads an agile team focused on growing existing and future business areas for StormGeo. Holds a strong technology and analytic background with a focus on how weather and data science influences people and complex decisions. An expert in understanding how weather influences complex operations and how advanced services can help to safeguard critical operations.



Managing Weather Risks for Offshore Wind Projects in Asia-Pacific

AWEA Webinar Series 2020 – Technical Session

StormGeo
Freedom to Perform



StormGeo
Navigate tomorrow – today

Speakers:



Gard Hauge
Chief Data Officer, StormGeo



Nina Winther-Kaland
Research Director, StormGeo



Anna Hilden
Global Industry Manager
Offshore Wind, StormGeo



Antoni Therattil
Forecast Manager, StormGeo



// Outline

- StormGeo – a short introduction
- Weather challenges for offshore wind in Asia
- Typhoons and tropical storms
 - climatology and characteristics
- Recent systems
- StormGeo decision support tools

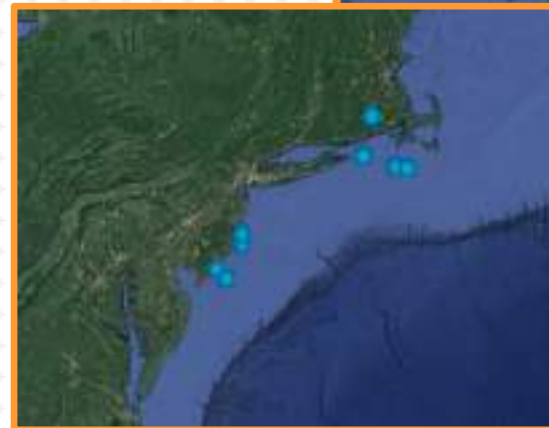
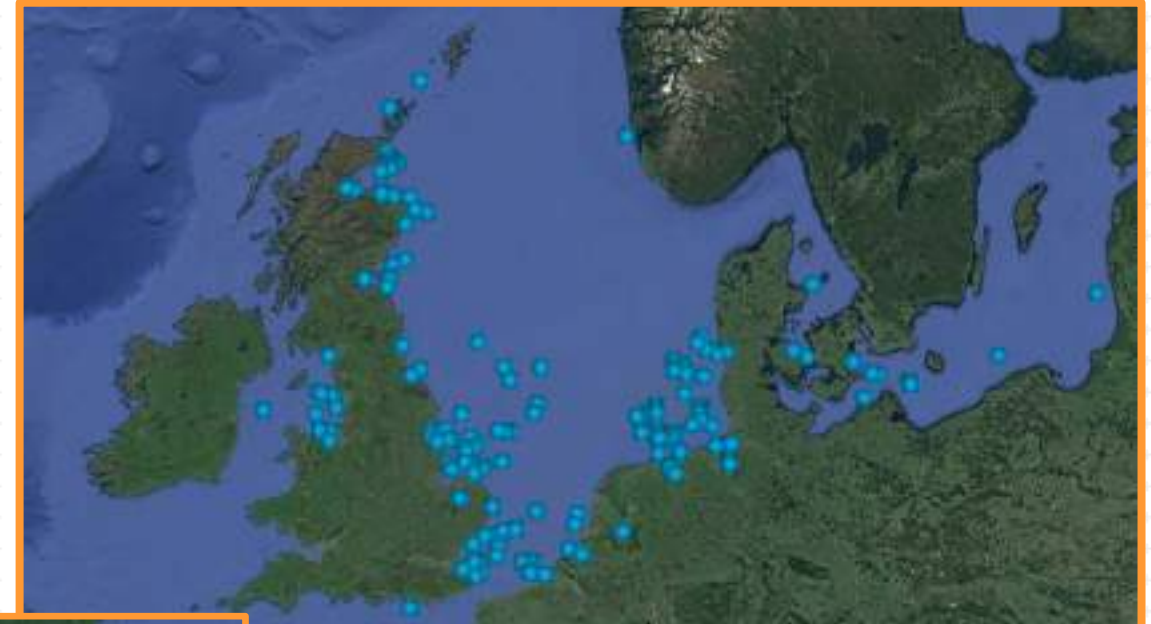
// StormGeo – a short introduction

StormGeo – weather information to weather sensitive industries worldwide

- // Established 1997
- // 24 offices in 19 countries - China, Japan, South Korea, ...
- // Shipping, Oil&Gas, Renewables, Cross Industry, Media
- // 24/7/365

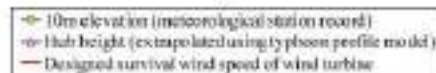
Offshore wind at StormGeo

- // More than 100 project references
- // Europe, Asia, USA
- // Metocean and tropical forecasting
- // Finescale modelling
- // Wind resource modelling



// Outline

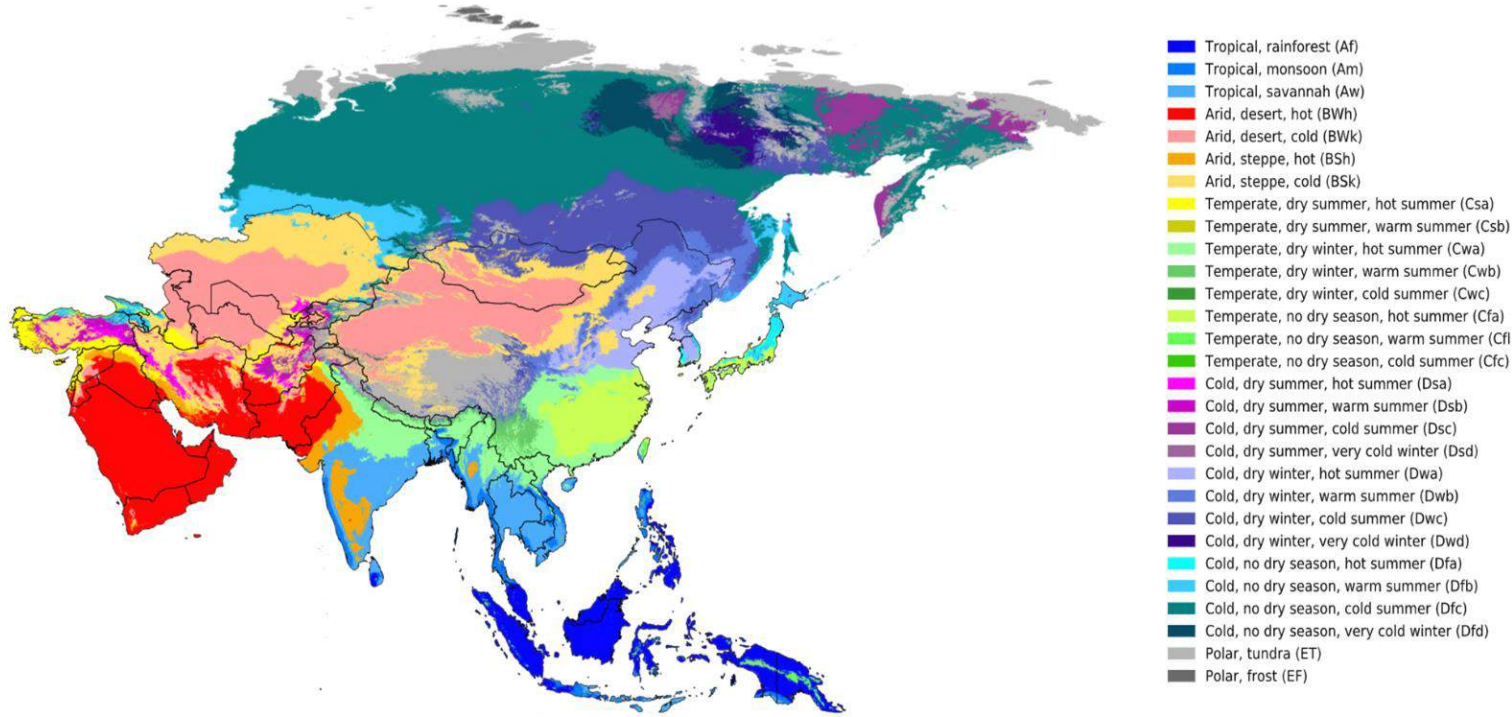
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Representative structural failure of wind turbines caused by Usagi. (a) Typical failure in the wind farm. (b) Blade fracture. (c) Survived WT with different blade pitches (d) WT with abnormal pitch angles. (e) Local buckling of tower at shell wall thickness transition region.

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Latest IPCC assessment report:

Extreme weather events are increasing in Asia

- Heat waves
- **Extratropical and tropical cyclones**
- Droughts
- Intense rainfall
- Thunderstorms
- Snow avalanches
- Dust storms

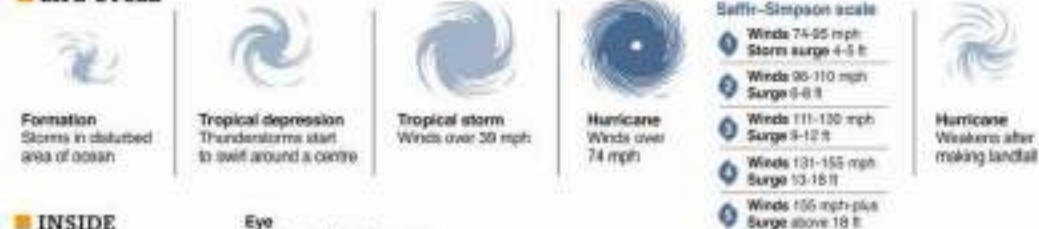
	1st	2nd	3rd
A (Tropical)		f (Rainforest)	
		m (Monsoon)	
		w (Savanna, Dry winter)	
		s (Savanna, Dry summer)	
B (Arid)		W (Desert)	
		S (Steppe)	
			h (Hot)
			k (Cold)
C (Temperate)		w (Dry winter)	
		f (No dry season)	
		s (Dry summer)	
			a (Hot summer)
			b (Warm summer)
			c (Cold summer)
D (Continental)		w (Dry winter)	
		f (No dry season)	
		s (Dry summer)	
			a (Hot summer)
			b (Warm summer)
			c (Cold summer)
E (Polar)			d (Very cold winter)
		T (Tundra)	
		F (Eternal frost (ice cap))	

// Tropical cyclones

- Among the costliest types of natural disaster
 - Climate models: Increase in extreme rainfall and winds associated to these events most parts of Asia.
 - Disruption to transportation, energy, and telecommunication
 - Coastal erosion, increasing the risk of assets along coastlines
 - Flooding increases the probability of landslides and mudslides, affecting transportation infrastructure and power lines.
 - sufficiently warm sea surface temperatures
 - atmospheric instability
 - high humidity in the lower to middle levels of the troposphere
 - enough Coriolis force to sustain a low pressure center
 - a preexisting low level focus or disturbance, and low vertical wind shear.
- While these conditions are necessary for tropical cyclone formation, they do not guarantee that a tropical cyclone will form.



LIFE CYCLE



INSIDE



IMD Tropical Cyclone Strength Classification

Wind speed (3-min) Knots (km/h)

<27 (<51)

28-33 (52-61)

34-47 (62-87)

48-63 (88-117)

64-119 (118-221)

<120 (<222)

Category

Depression

Deep Depression

Cyclonic Storm

Severe Cyclonic Storm

Very Cyclonic Storm

Super Cyclonic Storm

Saffir-Simpson Scale Hurricane

TROPICAL DEPRESSION

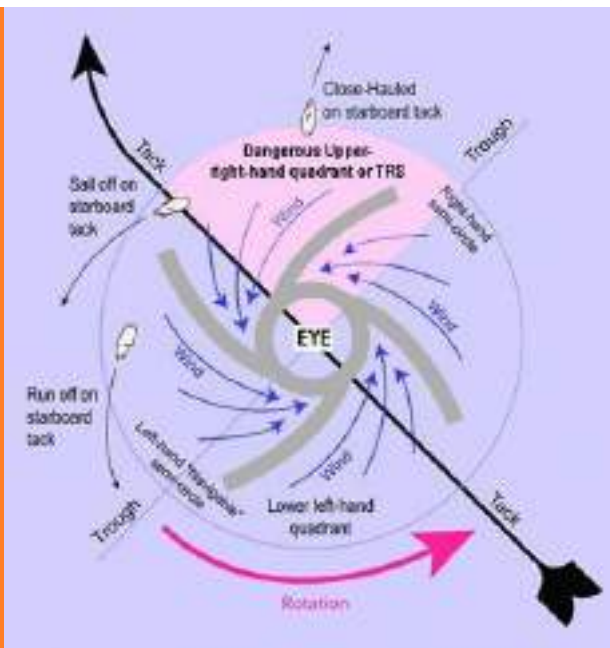
TROPICAL DEPRESSION

TROPICAL STORM

CATEGORY 1 - 2
HURRICANE

CATEGORY 3 - 4
HURRICANE

CATEGORY 5
MAJOR HURRICANE

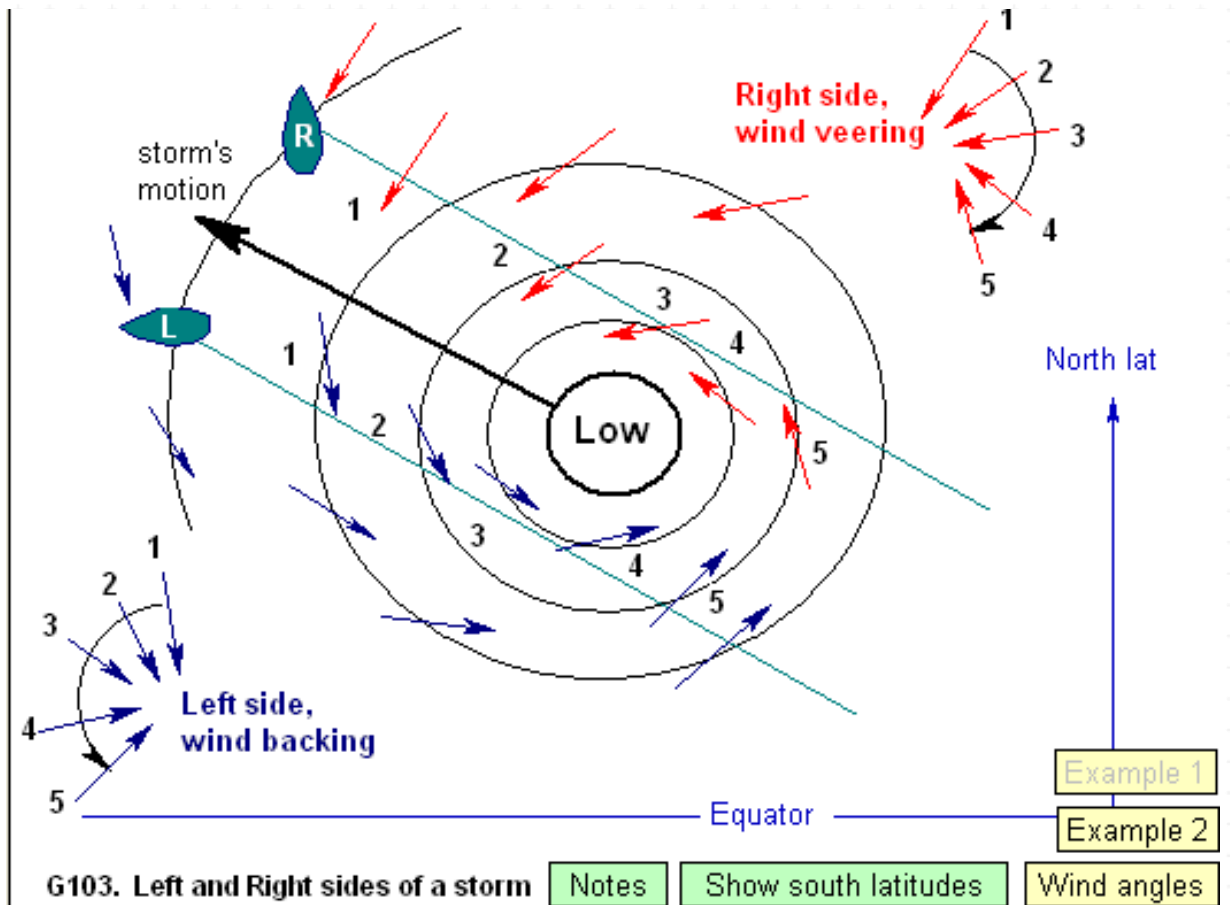
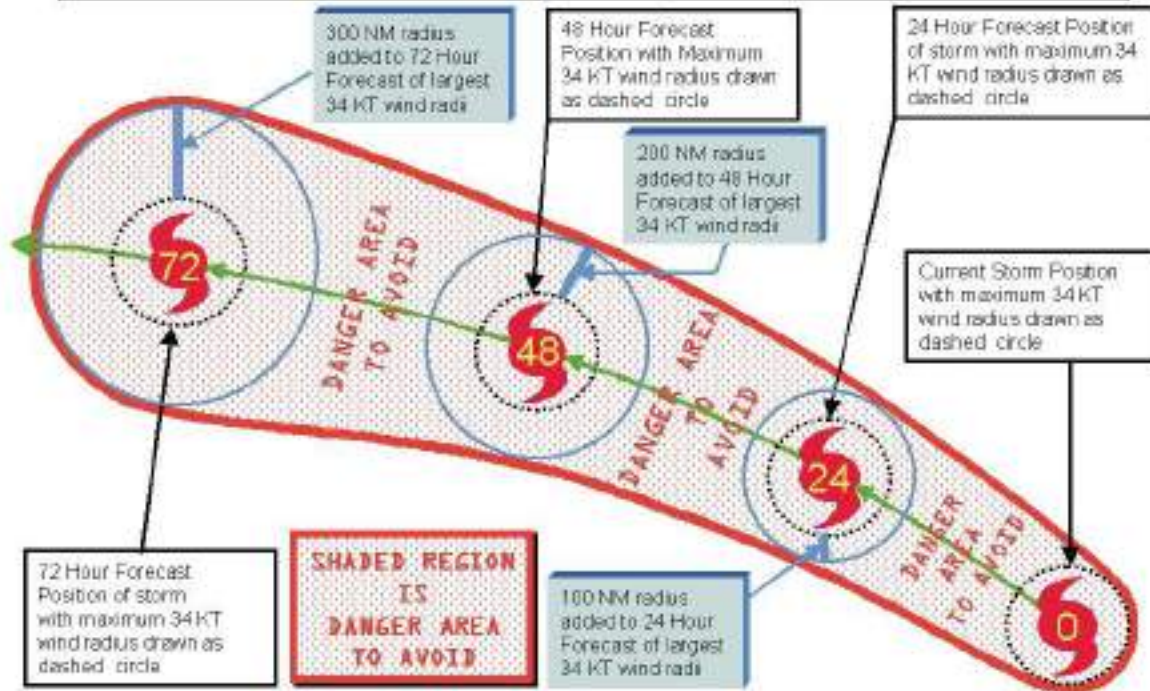


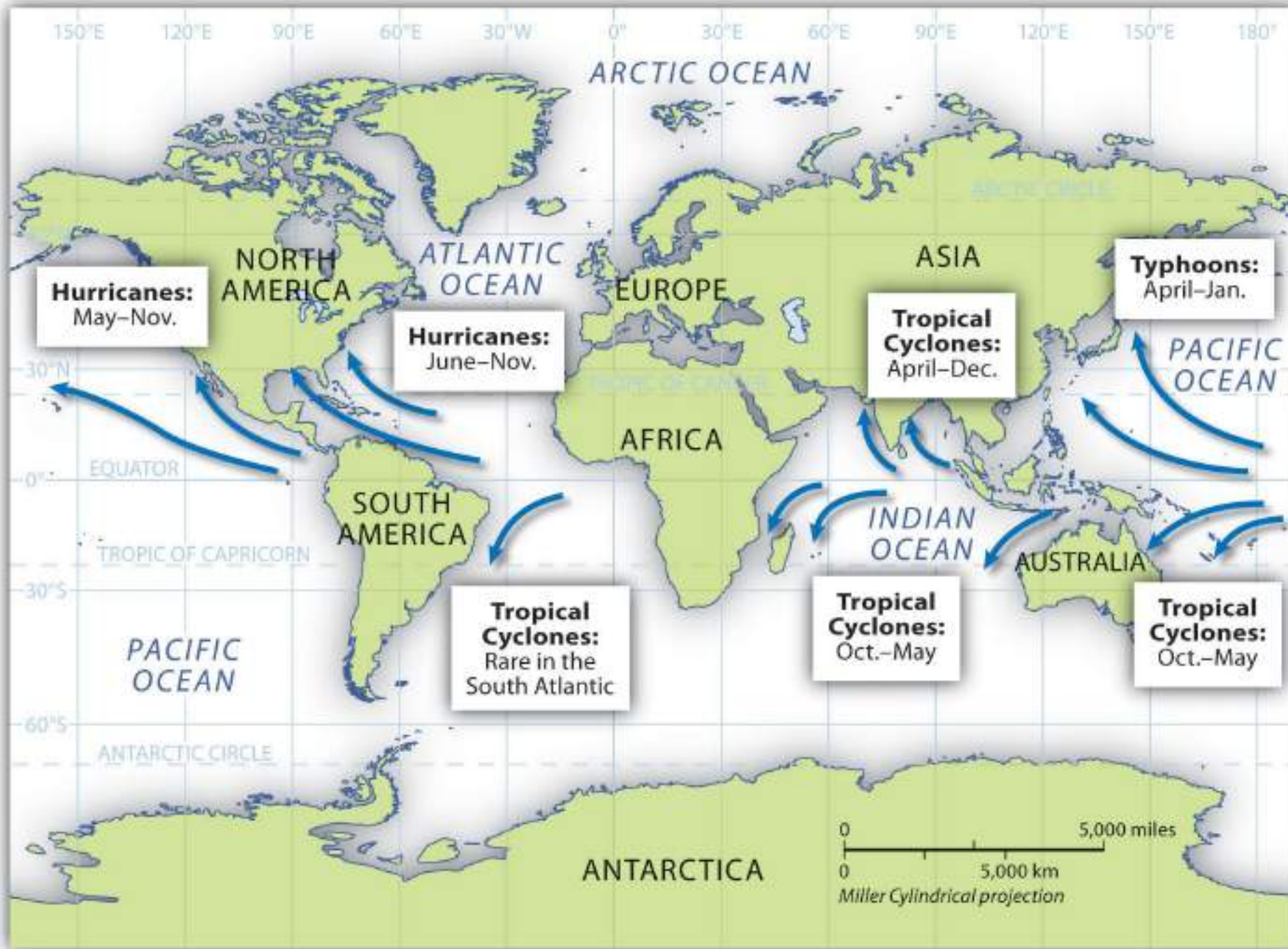
List of Western Pacific tropical cyclone names

List	Contributing nation													
	Cambodia	China	North Korea	Hong Kong	Japan	Laos	Macau	Malaysia	Micronesia	Philippines	South Korea	Thailand	United States	Vietnam
1	Damrey	Hailui	Kirogi	Yun-yeung	Koinu	Bolaven	Sanba	Jelawat	Ewinar	Maliksi	Gaemi	Prapiroon	Maria	Son-Tinh
	Ampil	Wukong	Jongdari	Shanshan	Yagi	Leepi	Debinca	Pulasan	Soulik	Cimaron	Jebi	Krathon	Benjari	Trami
2	Kong-rey	Yubu ^(1b 1)	Toraji	Man-yi	Usagi	Pabuk	Wutip	Sepat	Mun	Danas	Nari	Wipha	Francisco	Lekima ^(1b 2)
	Krosa	Bailu	Podul	Lingling	Kajiki	Faxai ^(1b 3)	Peipah	Tapah	Mitag	Hagibis ^(1b 4)	Neoguri	Bualoi	Matmo	Halong
3	Nakri	Fengshen	Kalmaegi	Fung-wong	Kammun ^(1b 5)	Phanfone ^(1b 6)	Vongfong	Nuri	Sinlaku	Hagupit	Jangmi	Mekkhala	Higos	Bavi
	Maysak	Hai-shen	Noui	Dolphin	Kujira	Chan-hom	Linta	Nangka	Saudel	Molave	Goni	Atsani	Etai	Vamco
4	Krovanh	Dujuan	Sungae	Choi-wan	Koguma	Champi	In-fa	Cempaka	Nepartak	Lupit	Minnae	Nida	Omali	Conson
	Chanthu	Dianmu	Mindulle	Lionrock	Kompasu	Namiheun	Malou	Nyaloh	Rai	Malakas	Megi	Chaba	Aere	Songda
5	Trases	Mulan	Meari	Ma-on	Tokage	Hinnamnor	Mufia	Merbok	Nanmadol	Talas	Norji	Kulap	Roke	Sonca
	Nesat	Haitang	Nalgae	Baryan	Yamaneko	Pakhar	Samru	Mawar	Guchol	Talim	Doksuri	Khanun	Lan	Santa

Diagram of the 1-2-3 Rule

The danger area to avoid is the area inscribed by the connecting tangent lines of the outer most radius of 34 knot winds plus a safety margin derived from the ten year average Atlantic tropical cyclone position errors at the 24, 48, and 72 hour forecast positions. Adding 100 NM at 24 hour forecast, 200 NM at 48 hour forecast, and 300 NM at the 72 hour forecast positions.

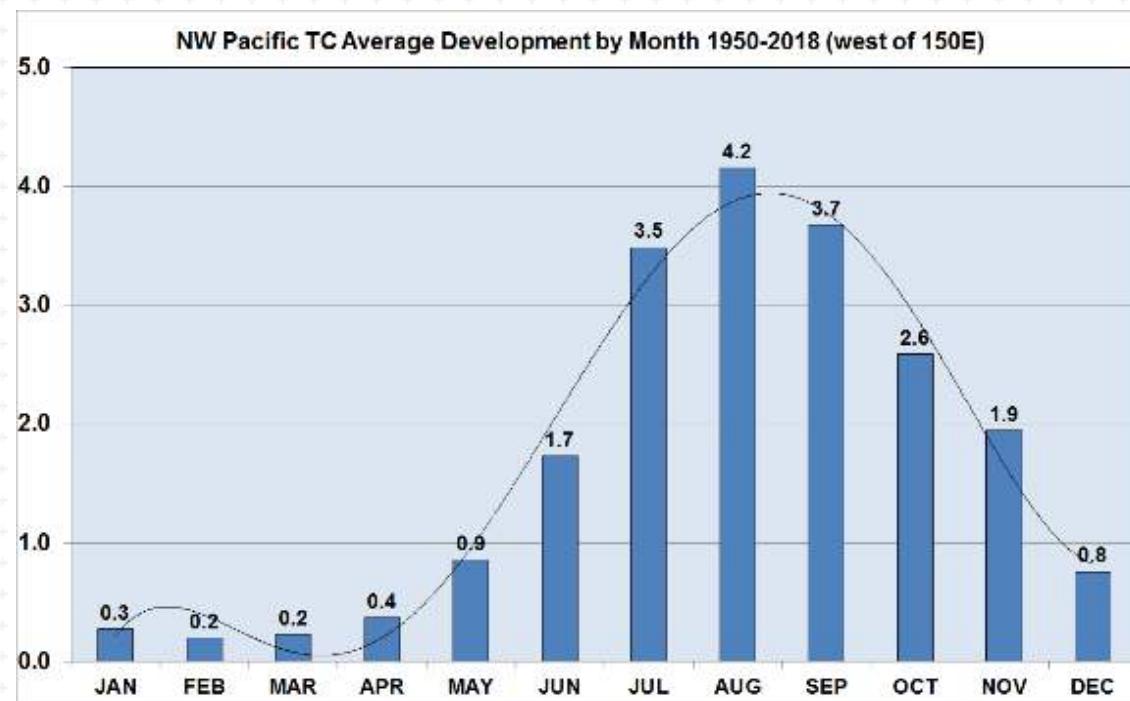
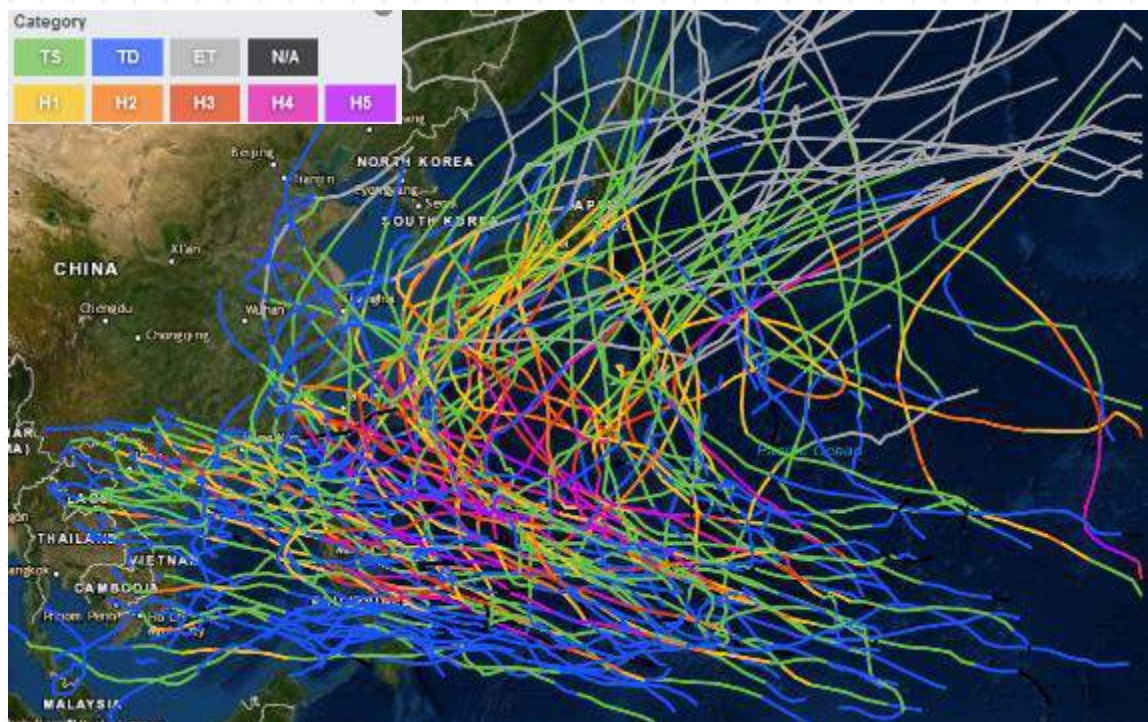




// NW Pacific – the world's most active tropical cyclone basin

// 161 named tropical cyclones last 5 years

// Activity peaks in August but tropical cyclones can occur in any month



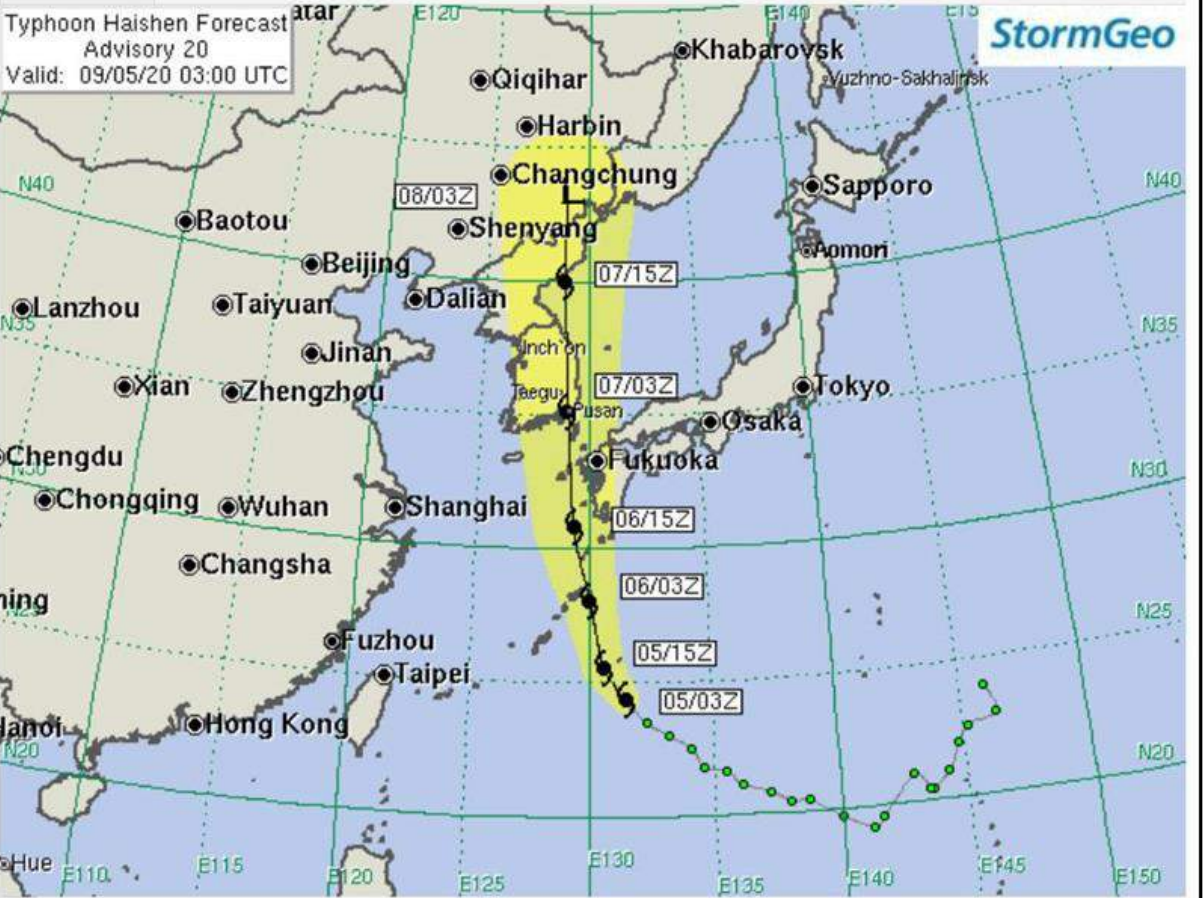
// Outline

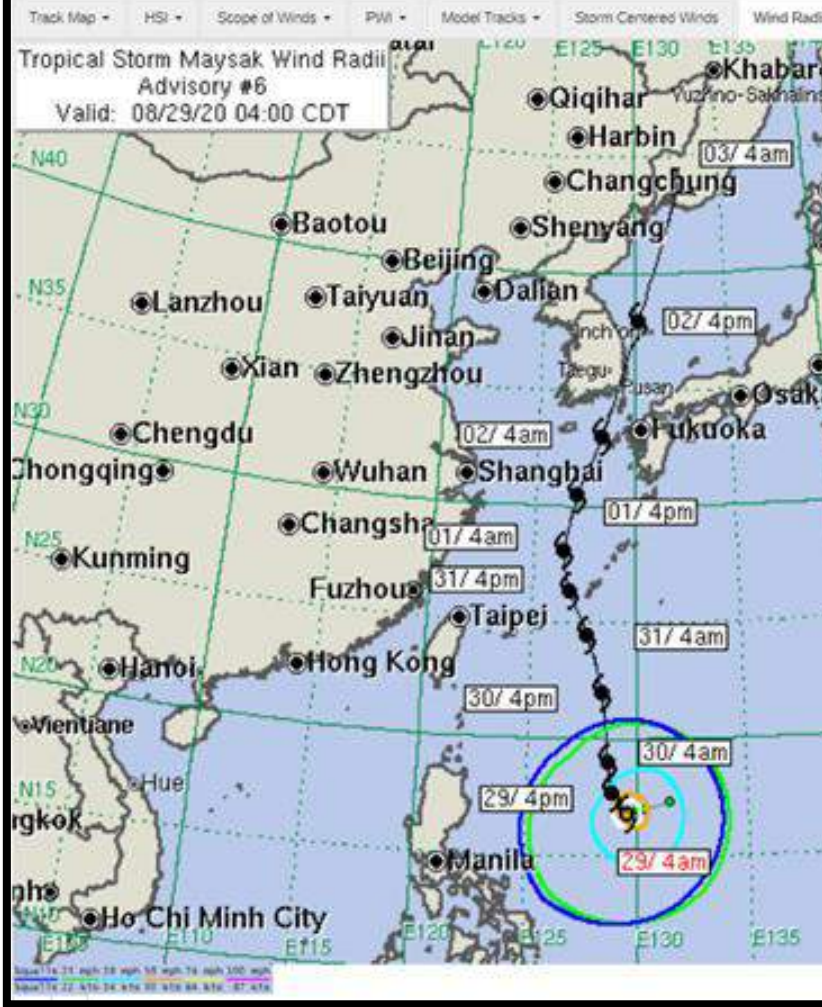
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Tropical Storm Maysak Wind Radii
Advisory #6
Valid: 08/29/20 04:00 CDT



Typhoon Haishen Forecast
Advisory 20
Valid: 09/05/20 03:00 UTC








MarineTraffic

@MarineTraffic

5 facts about the Gulf Livestock 1

- Last position received via AIS was 48 hours ago
- Recent port calls before Napier: Gladstone & Manila
- This was the 1st time she made this journey in 2020
- Distance travelled: approx 35,000 NM this year
- The ship was built in 2002 & is 134.06 m



MarineTraffic

@MarineTraffic

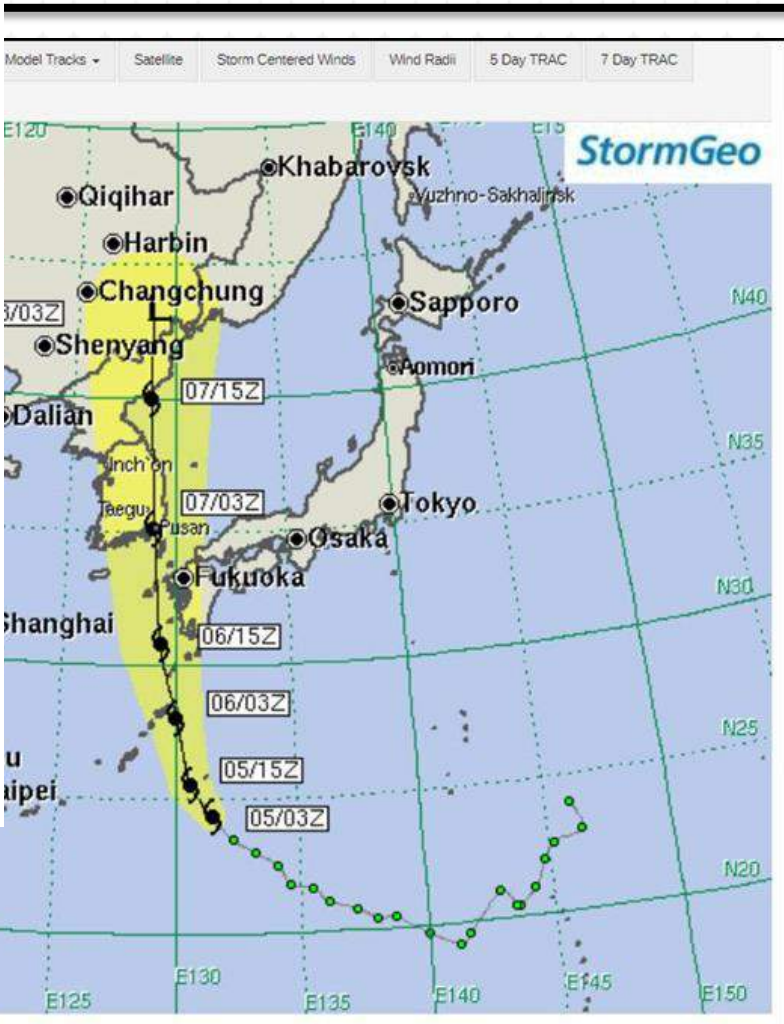
Livestock carrier goes missing in the East China Sea

The GULF LIVESTOCK 1 has disappeared, probably hit by high waves & strong winds caused by typhoon #MAYSAK, our data shows. The search for the livestock carrier in load began as concern for the safety of 43 crew onboard rises



12:43 PM - Sep 3, 2020

35 28 people are Tweeting about this



Video

<https://vimeo.com/457735519/e222697da6>



ImpactWeather Storm Archive



2020

Atlantic

 Arthur
 Bertha
 Cristobal
 Dolly
 Edouard
 Fay
 Gonzalo
 Hanna
 Iselle
 Tami
 Josephine
 Kyle
 Laura
 Marco
 Omar
 Nana

Arabian Sea

 2
 Firozga

Bay of Bengal

Amphan

East Pacific

 One-a
 Amanda
 Boris
 Four-G-HH
 Founa
 Cristina
 Sox-E
 Seven-E
 Douglas
 Rida
 Ten-E
 Paulo
 Debra
 Monica

sa

One

South Indian Ocean

 Blake
 Claudia
 Diana
 Eschin
 Damien
 Francisco
 Gabriela
 Esther
 Ferdinand
 S
 Harold
 Brenda
 Jenita
 S

South Pacific

 Tico
 S
 Juan
 Vicky
 Viki
 Greta
 Harold

West Pacific

 Yongfeng
 Nan
 7
 Srikaku
 Hagushi
 Jangmi
 Manthala
 11
 Higgs
 Bawi
 Miyako

Tropical Depression 23

30/06/2020 05:00 UTC

Current Location	24.0N, 146.0E
Geographic Reference	900 miles south-southeast of Tokyo, Japan
Movement	South-southwest at 5 mph
Max Winds	35 mph gusting to 45 mph
Current Radius of Tropical Storm-Force Winds	0 miles
Max Predicted Radius of Tropical Storm-Force Winds	140 miles
Organizational Trend	Increasing
Forecast Confidence	Average
Estimated Central Pressure	1005 mb

StormGeo Advisory 1

Key Points

1. Tropical Depression 23 will likely be a large and strong typhoon when it reaches Japan this weekend.
2. Destructive winds, tidal surges, and heavy rainfall are expected.

Our Forecast

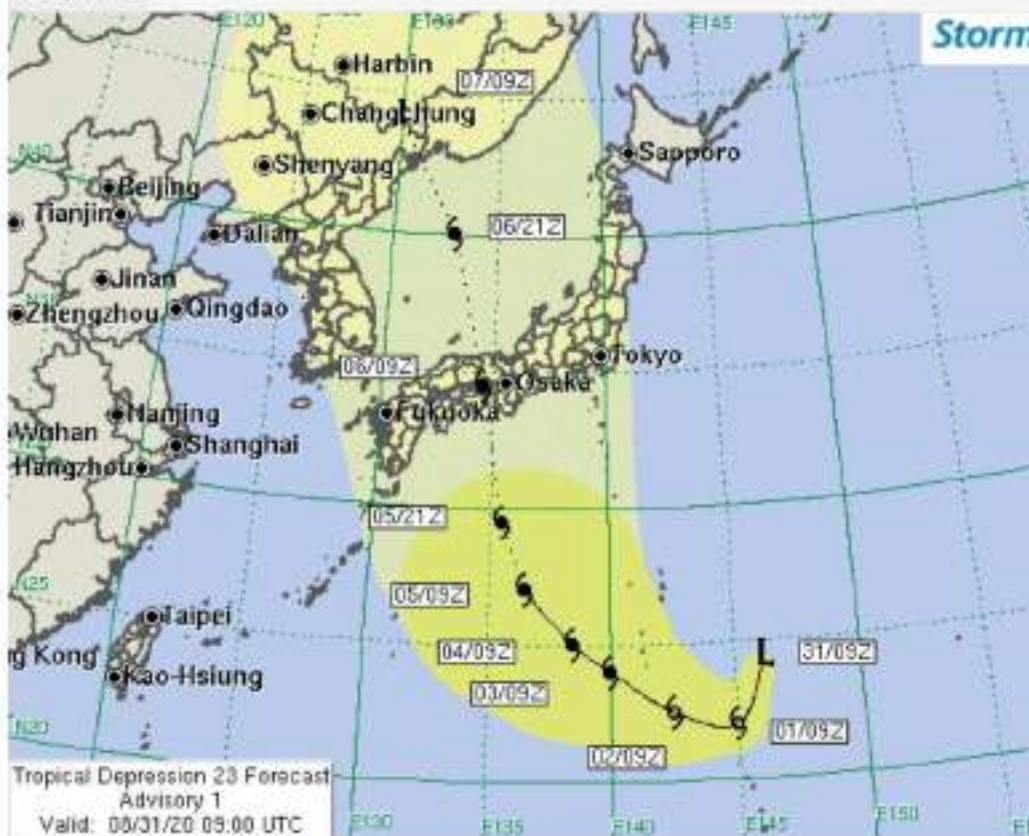
Disturbance 23 has been upgraded to a tropical depression by the Japanese Meteorological Agency. Conditions are forecast to be favorable for intensification over the next several days. The depression will likely become a tropical storm over the next 24 hours, and a typhoon by Thursday. As for the track, a motion towards the southwest is expected into tomorrow, with a turn more towards the northwest likely occurring by Wednesday. The northwesterward motion should continue through the weekend taking the system across Japan. The latest model guidance is indicating that the system will be a large and strong typhoon by this time. After impacting Japan, the typhoon is expected to transition into an extratropical cyclone by the time it reaches northeastern China next Monday.

Our next advisory will be issued by 1500 UTC.

Meteorologist, Justin Penuska

[Track Map](#)
[HS](#)
[Scope of Winds](#)
[FWS](#)
[Model Tracks](#)
[Satellite](#)
[Storm-Centered Winds](#)
[Wind Radii](#)
[1 Day TRAC](#)
[7 Day TRAC](#)

Advisory 1 Satellite



Typhoon Haishen

05/05/20 03:00 UTC	
Current Location	34.3N, 133.5E
Geographic Reference	450 miles South of the southern tip of Kyushu
Movement	Northwest at 10 mph
Max Winds	144 mph gusting to 166 mph
Current Radius of Tropical Storm Force Winds	315 miles
Max Predicted Radius of Tropical Storm Force Winds	345 miles
Organizational Trend	Temporarily Decreasing
Forecast Confidence	Average
Estimated Central Pressure	928 mb

StormGeo Advisory 20

Key Points

- 1. Haishen is significantly larger than previously analyzed.
- 2. Severe impacts are expected for the Ryukyu Islands.
- 3. Destructive winds, tidal surges, and heavy rainfall are expected to occur for western Kyushu and eastern South Korea.

Our Forecast

Haishen is somewhat weaker based upon recent satellite estimates. Winds are now estimated at 144 mph. However, satellite data indicate that Haishen is significantly larger than previously analyzed. Winds of tropical storm force extend more than 300 miles from the center. Winds are likely at tropical storm force north of the Ryukyu Islands. There could be a late intensification during the next 12 to 24 hours. Typhoon Haishen moves through the Ryukyu Islands. Thereafter, gradual weakening is expected as it passes near western Kyushu and moves into Korea. Winds at the exposed Korean peninsula are forecast to be 245 mph. Rapid weakening is expected after landfall, along with a transition into an extratropical storm.

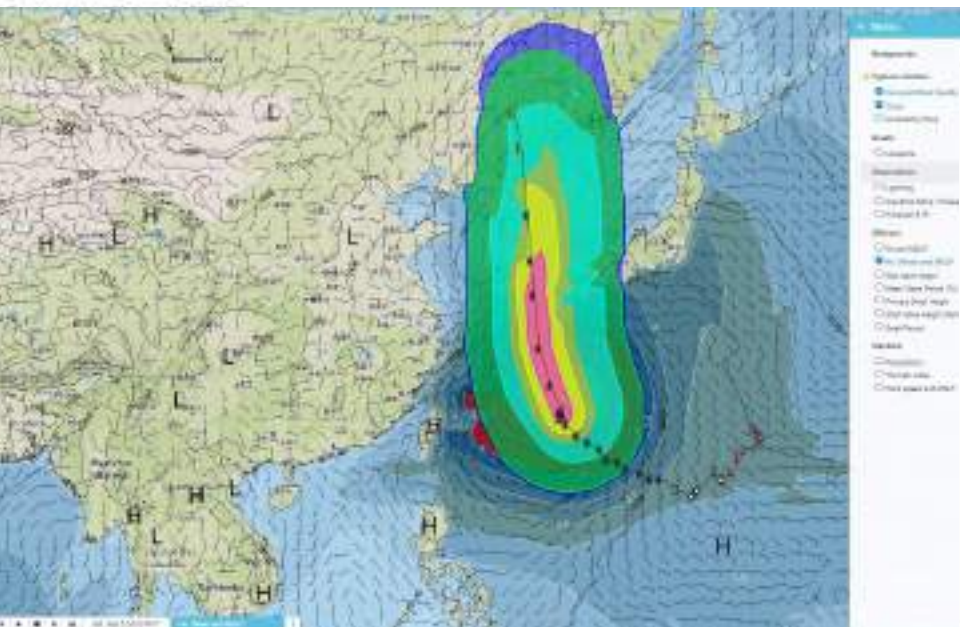
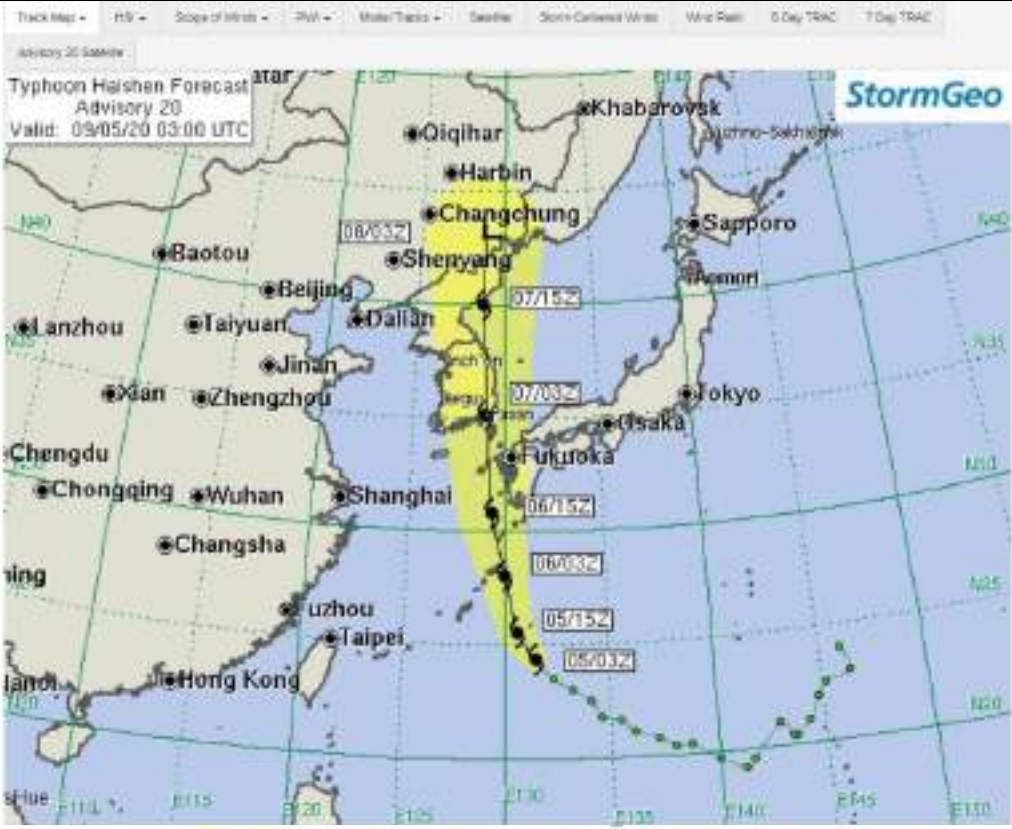
There remains a very high risk of major flooding for the Korean Peninsula due to the recent passage of Maesik.

Expected Impacts on Land

Ryukyu Islands:
Significant wind and total surge damage is likely for the central and northern Ryukyu Islands. Much flooding and mudslides are also likely.

Western Kyushu:
Significant damage from wind and total surge is likely. In addition, some damage due to fast flooding and mudslides is likely.

Korea:
Any already existing issues as a result of the previous wind from Maesik and sea may be exacerbated by another round of heavy rainfall and strong, damaging winds from Haishen. Severe wind flooding that results in widespread damage is possible.



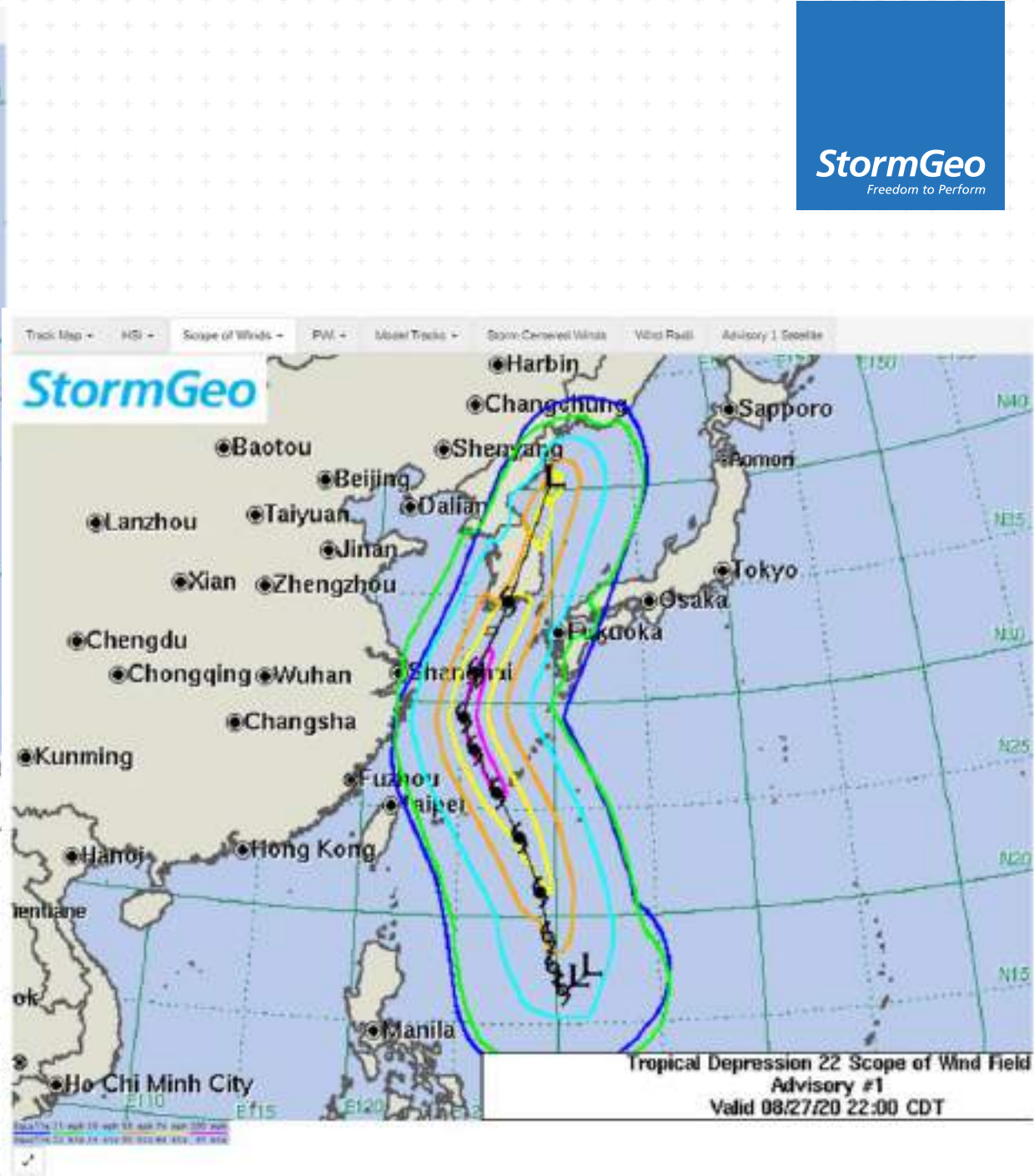
PO Box 10000, Irvine, CA 92614
T: +1 949 267 8257 F: +1 949 267 8045

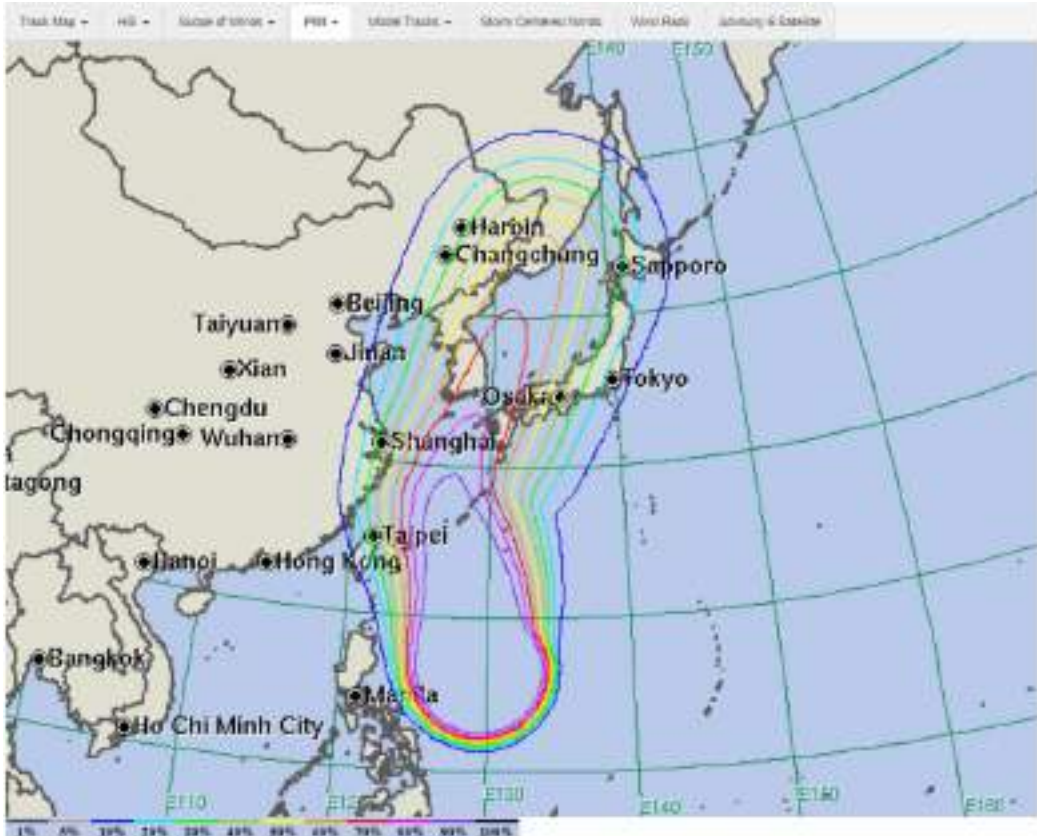
Email: info@stormgeo.com
Web: www.stormgeo.com

Storm Distance: Storm Distance

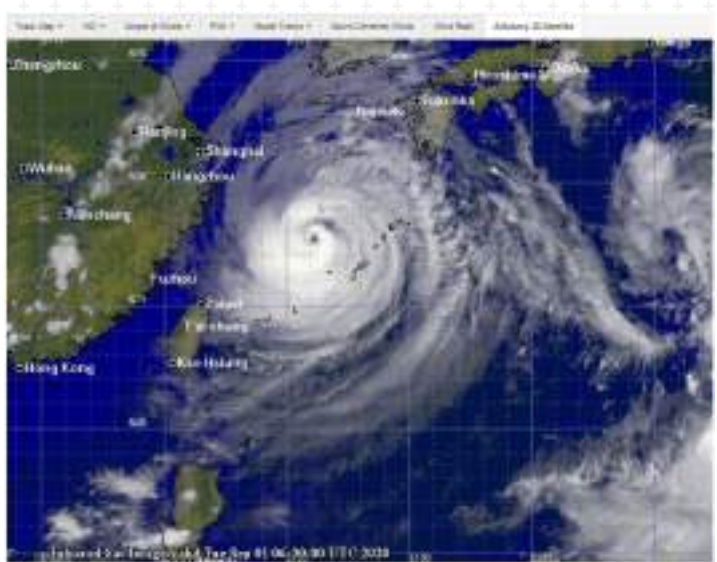
Typhoon Haishen (Issued on 05 Sep 20 03:00 UTC)

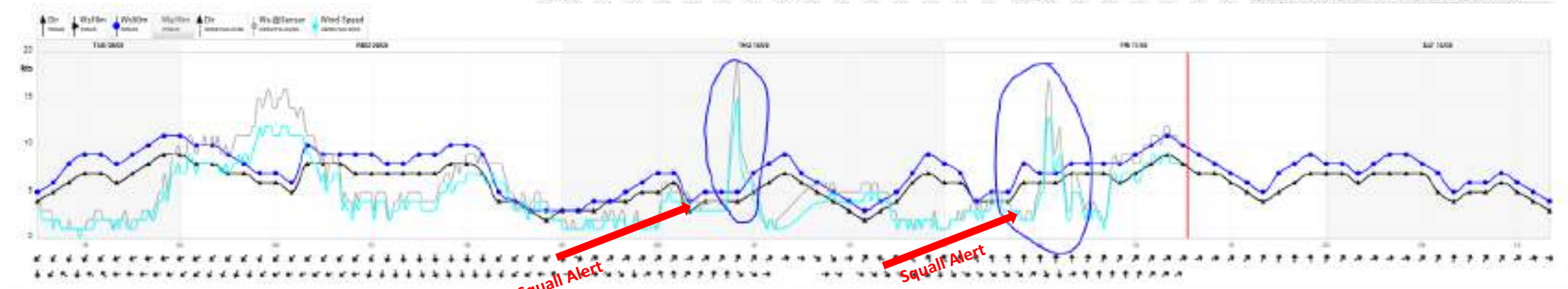
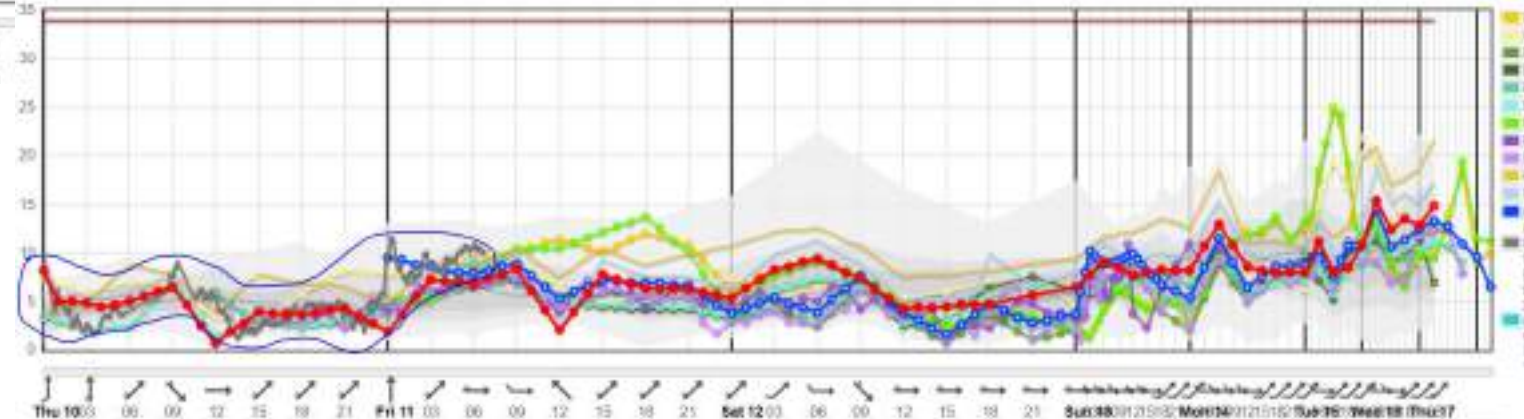
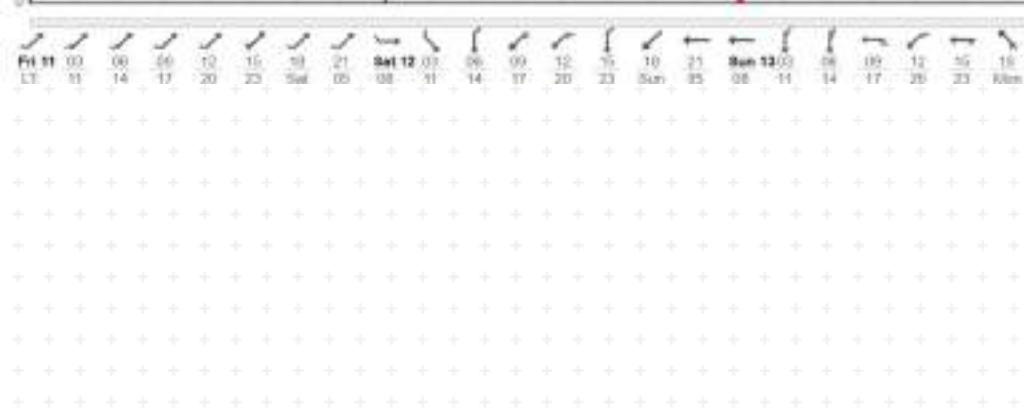
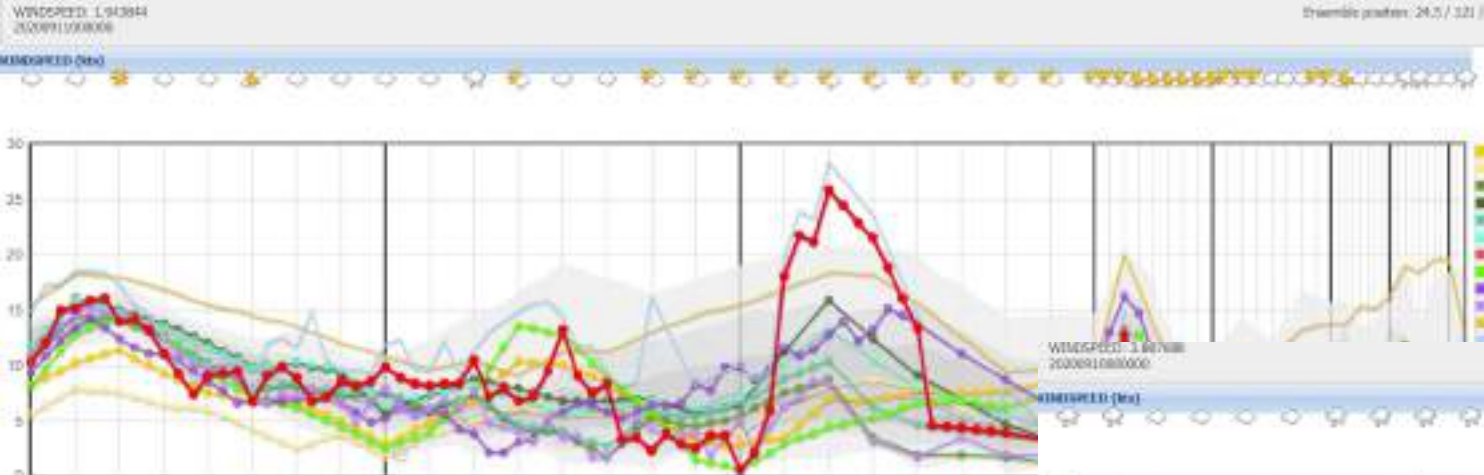
Time	05 SEP 20 03:00 UTC	
	200 to 400 km	400 to 1000 km
05 Sep 20 03:00 UTC	300	400
06 Sep 20 11:00 UTC	310	410
06 Sep 20 13:00 UTC	320	420
06 Sep 20 15:00 UTC	330	430
06 Sep 20 17:00 UTC	340	440
06 Sep 20 19:00 UTC	350	450
06 Sep 20 21:00 UTC	360	460
07 Sep 20 03:00 UTC	370	470
07 Sep 20 05:00 UTC	380	480
07 Sep 20 07:00 UTC	390	490
07 Sep 20 09:00 UTC	400	500
07 Sep 20 11:00 UTC	410	510
07 Sep 20 13:00 UTC	420	520
07 Sep 20 15:00 UTC	430	530
07 Sep 20 17:00 UTC	440	540
07 Sep 20 19:00 UTC	450	550
07 Sep 20 21:00 UTC	460	560
08 Sep 20 03:00 UTC	470	570
08 Sep 20 05:00 UTC	480	580
08 Sep 20 07:00 UTC	490	590
08 Sep 20 09:00 UTC	500	600
08 Sep 20 11:00 UTC	510	610
08 Sep 20 13:00 UTC	520	620
08 Sep 20 15:00 UTC	530	630
08 Sep 20 17:00 UTC	540	640
08 Sep 20 19:00 UTC	550	650

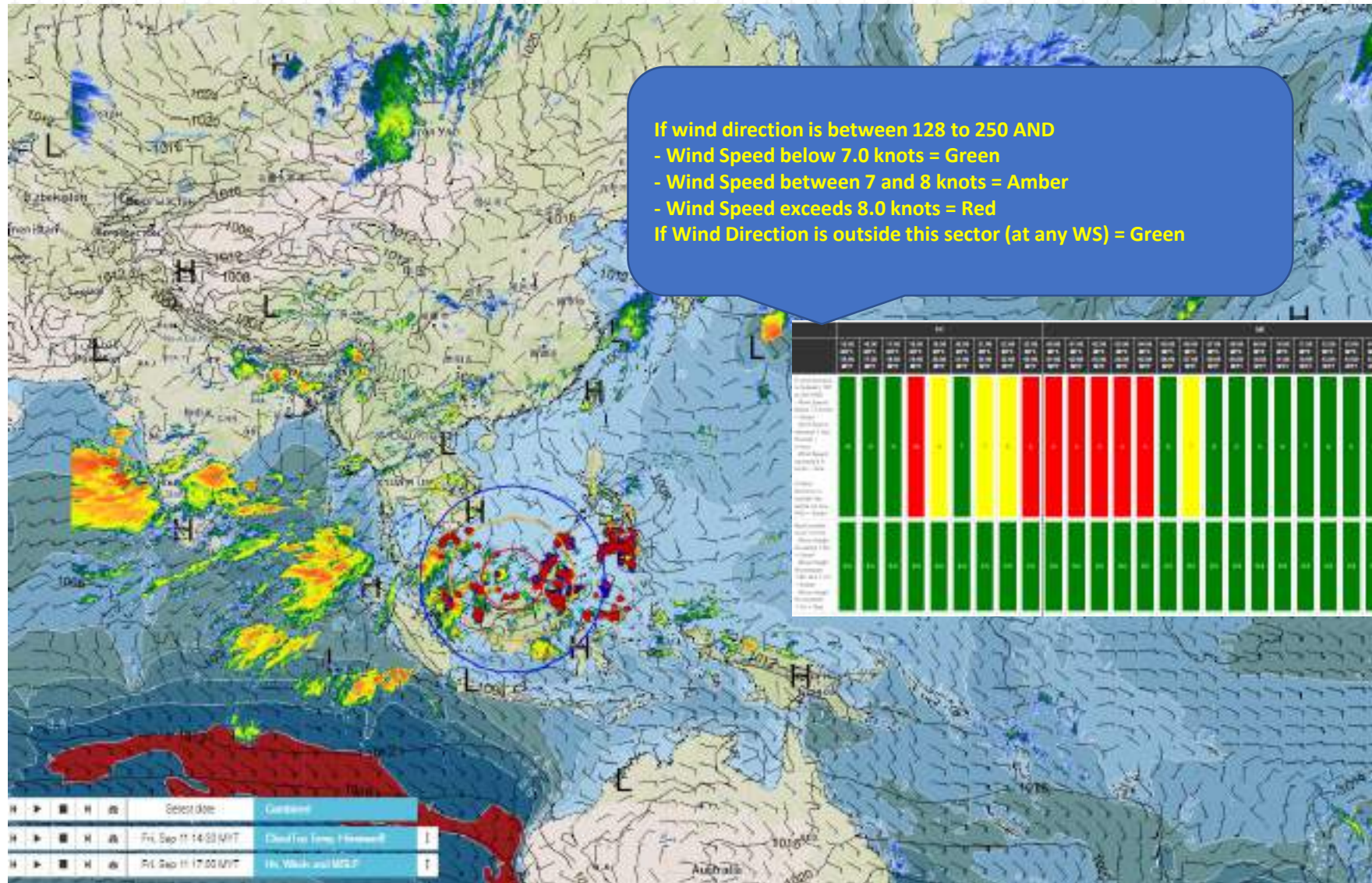




StormGeo
Freedom to Perform







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- StormGeo – a short introduction
- Weather challenges for offshore wind in Asia
- Typhoons and tropical storms
 - climatology and characteristics
- Recent systems
- **StormGeo decision support tools**

// Decision support 1/4

Storm Advisory - up to 7 days ahead

Tropical Storm Hagupit

8/2/2020 10:07 PM GMT+2

Current Location	25N, 123.1E
Geographic Reference	87 nautical miles east of Taipei, T
Movement	Northwest at 10 kts
Max Winds	60 kts gusting to 75 kts
Current Radius of Tropical Storm-Force Winds	74 nautical miles
Max Predicted Radius of Tropical Storm-Force Winds	78 nautical miles
Organizational Trend	Increasing
Forecast Confidence	Average
Estimated Central Pressure	990 mb

StormGeo Advisory 9

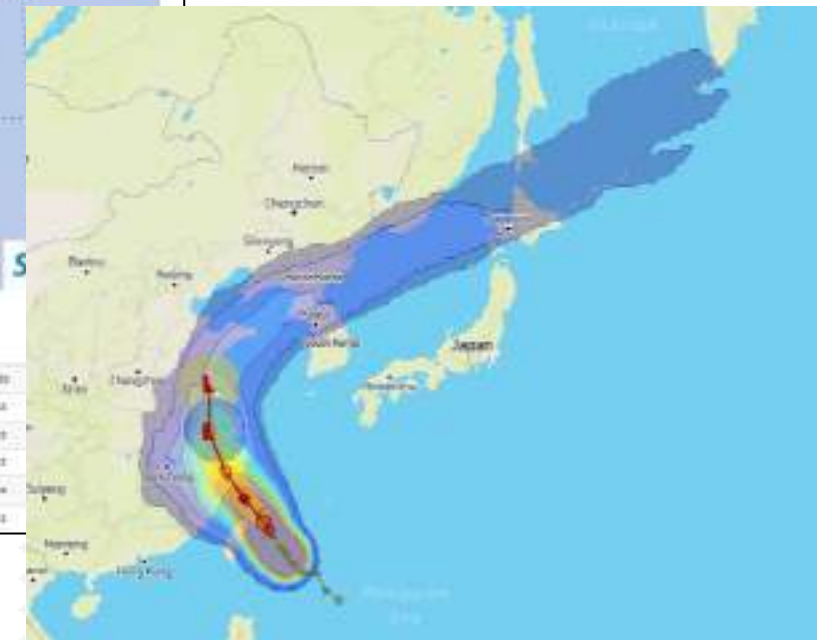
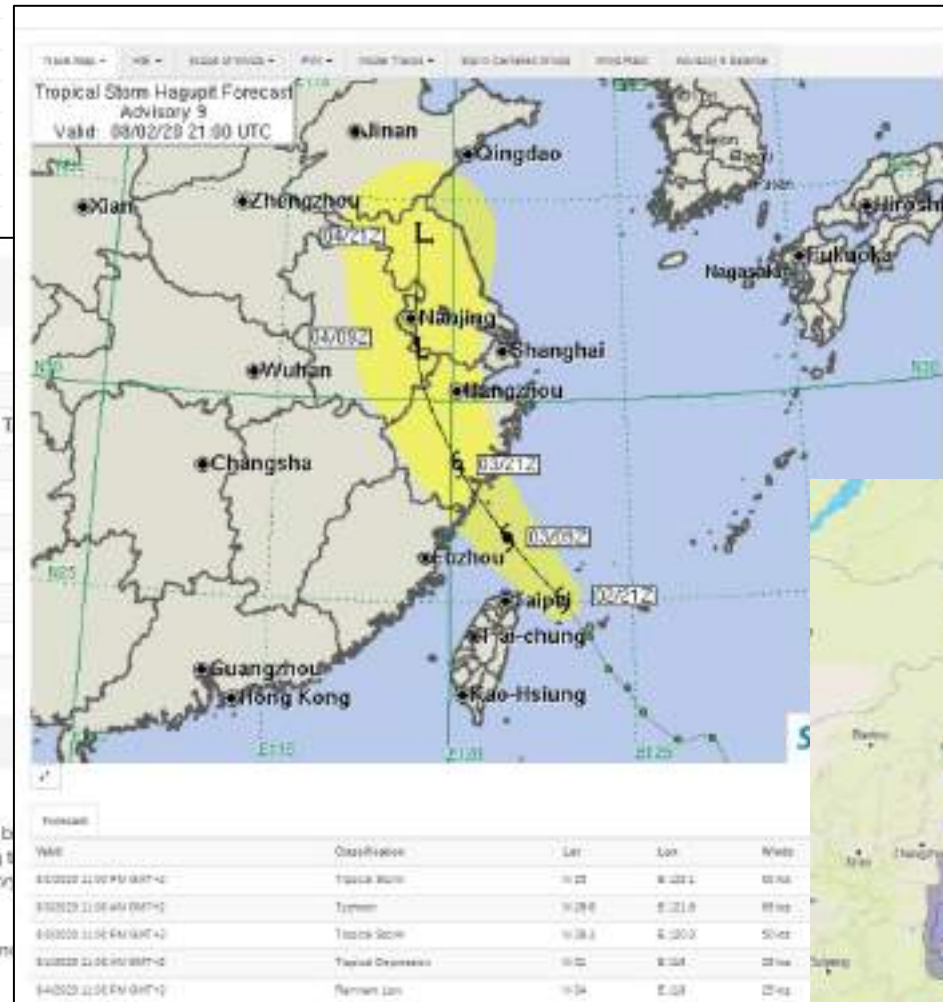
Our Forecast

Tropical Storm Hagupit continues to strengthen. It will pass north of Taiwan over the next few hours. We think it will be a typhoon while passing to the north of Taiwan. Landfall is forecast to occur in eastern China late Monday as a strong typhoon. If the center moves inland, it should quickly weaken to a remnant low pressure area. The primary concern will be heavy flooding on the east side of the storm.

The heaviest squalls and strongest winds will be located on the north and east side of the track, so impacts across the Taiwan Strait should be minimal.

Our next advisory will be issued by 0300 UTC.

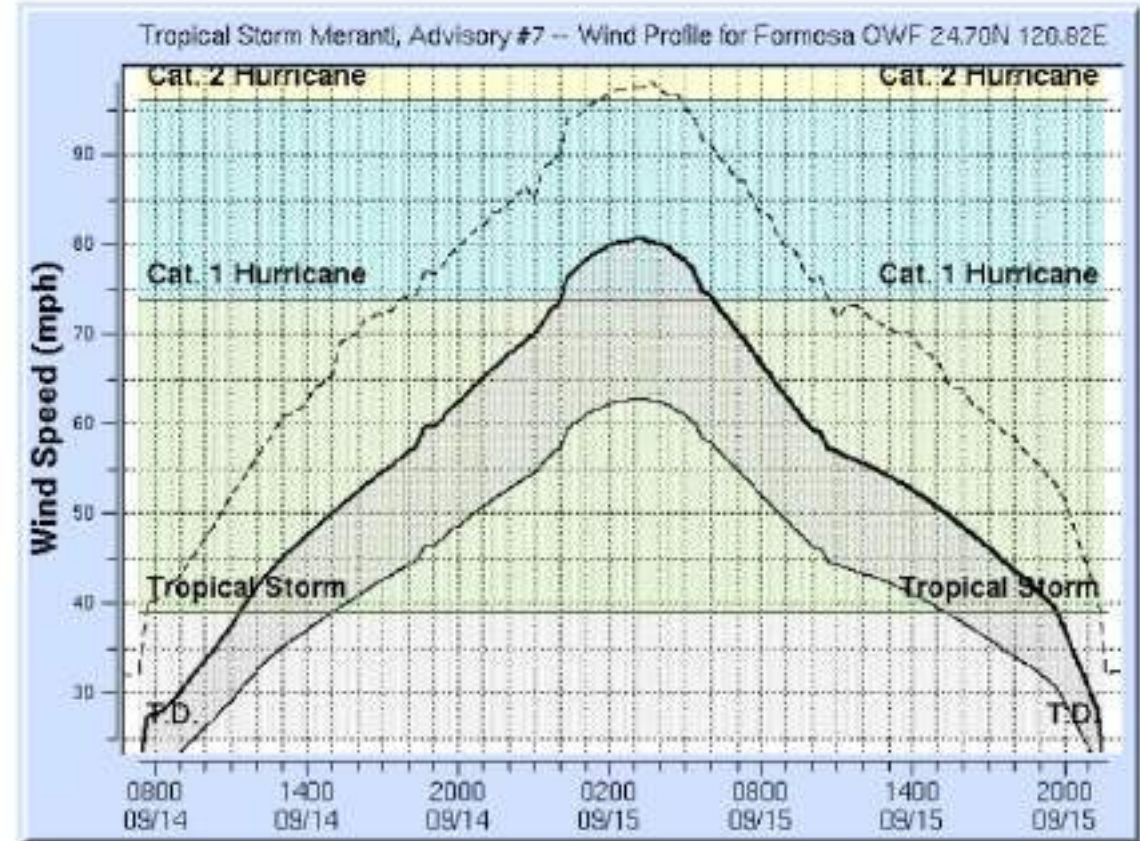
Meteorologist, Cameron Self



// Decision support 2/4

Site Forecast – details the effects of a storm at your site

- // Wind
- // Waves – *via coupling to metocean forecast*
- // Precipitation
- // Storm surge
- // Flooding



Tropical Storm Meranti, Advisory #7 Site Forecast for Formosa OWF, Formosa OWF 24.70N 120.82E

Valid: 11:00 PM CST 10 Sep, 2016

Discussion: Tropical Storm Meranti is expected to strengthen into a 140 mph typhoon before making landfall on southern Taiwan Wednesday. The highest winds and heaviest squalls will occur across central and southern Taiwan. Some heavy squalls and tropical storm force winds are possible across northern Taiwan on the current forecast track.

On our current track, the Hsinchu City would experience winds of 60-75 mph and isolated squalls with winds gusts to 90 mph on Wednesday. This would result in widespread power outages and minor damage to structures.

General Rainfall Amounts:

Rainfall totals may possibly reach the 4-6 inch range on our current track. This would result in widespread flooding of streets.

Expected First Onset and Duration of Sustained Winds

Date / Time	Duration	End Date / Time
0732 CST	37 hours, 56 minutes	15/2128 CST
1114 CST	32 hours, 34 minutes	15/1948 CST
1820 CST	16 hours, 17 minutes	15/1037 CST
0859 CST	6 hours, 11 minutes	15/0611 CST

Point of Closest Approach of Center:

0200 CST – 48 miles at Azimuth 260.0 degrees (SW)

Current Storm Distance and Direction

Direction
Azimuth 120 degrees (SE)

- // Issued as soon as new alert level reached
- // Explains what triggered new alert level
- // States expected time to next alert level



General	<p>The storm is about 30 miles southwest of Freeport, Texas, early Saturday morning as a borderline Category 3-d hurricane. Once inland, Ike should turn northward and begin to accelerate off to the north and northeast on Saturday afternoon and Sunday.</p>
---------	---

// Decision support 4/4

Our TropicsWatch team is there for you

- // Call or email anytime 24/7/365 to discuss potential threats to your assets or operations
- // Schedule a conference call with one of our specialists



// Concluding remarks

- // Tropical cyclones can affect offshore wind farm assets and operations severely
- // Detailed and accurate weather forecasting essential for managing the risks
- // StormGeo's Advisories provide detailed guidance up to 7 days ahead
- // Site Forecasts and Trigger Reports enable rational decision making before and during storms
- // 24/7 hotline to TropicsWatch team ensures optimal expert support throughout event



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// Thank you!

Best chance of above-normal impacts into Japan/Korea and farther south through the Philippines to Vietnam



30-yr Average

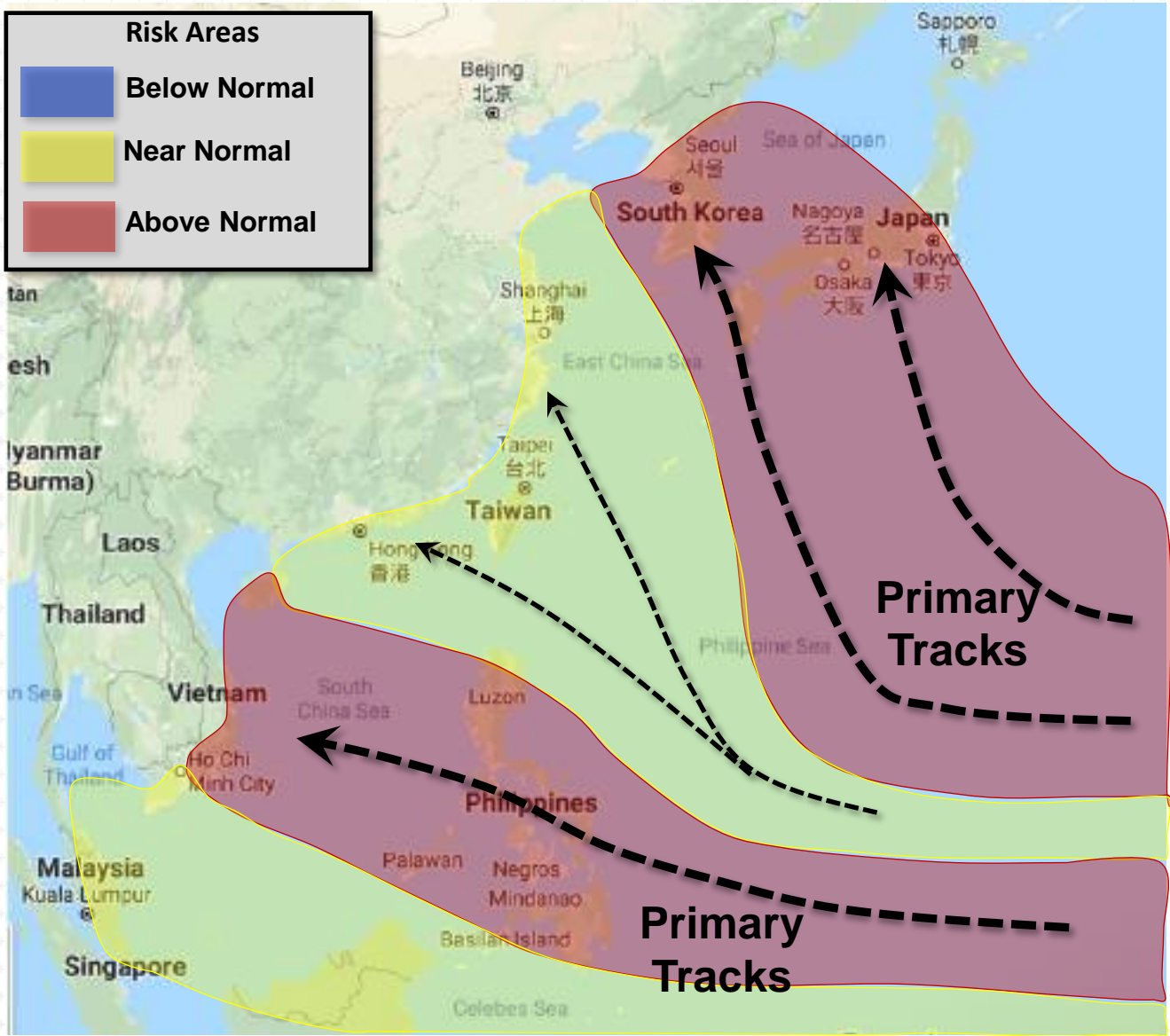
26 Named Storms

13 Typhoons

2020 Forecast

28 Named Storms (+)

15 Typhoons (+)





Safer and more efficient wind farms with advanced weather analytics

StormGeo
Navigating tomorrow - today

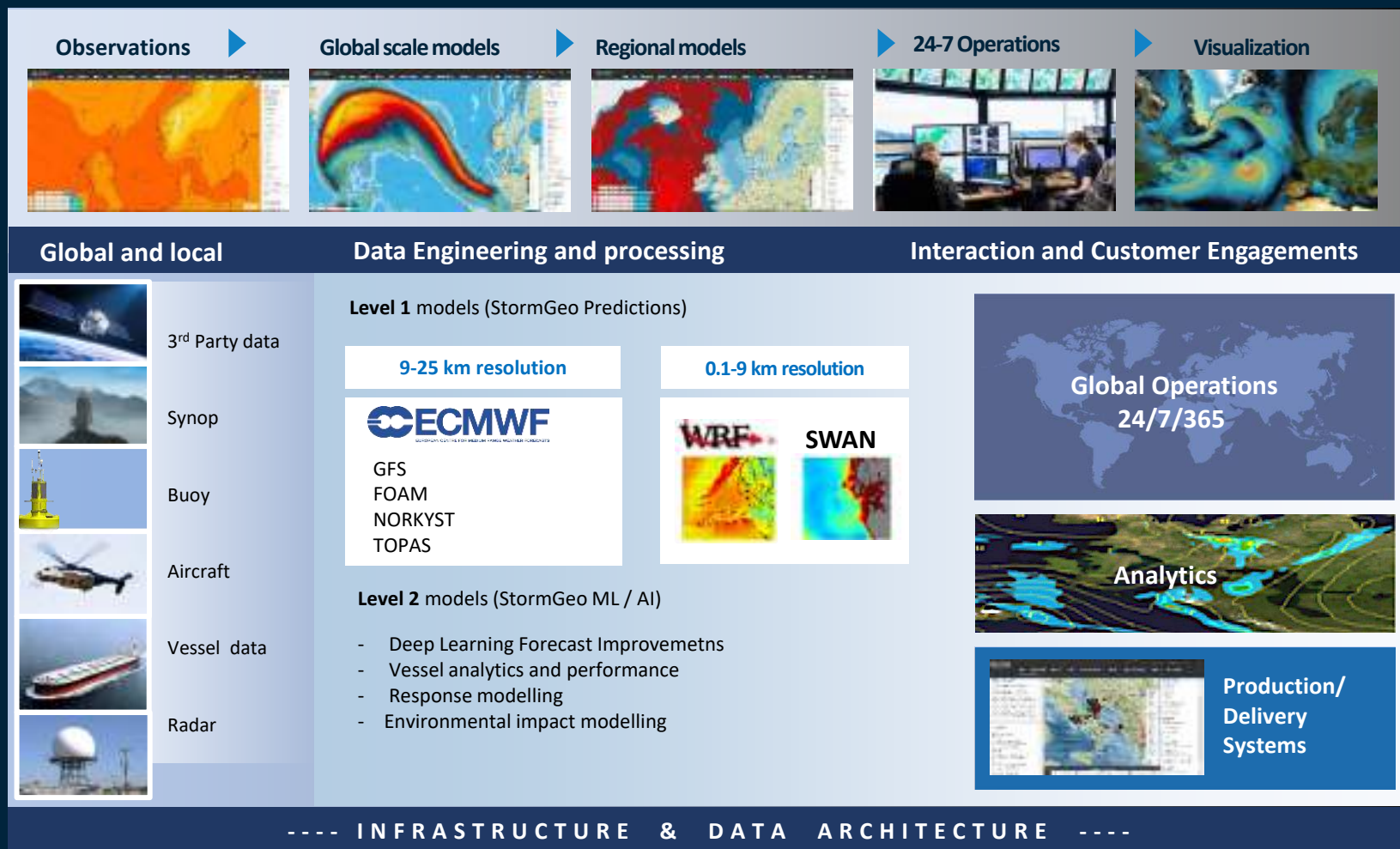
Gard Hauge, PhD
CTO StormGeo

Dr Nina Winther-Kaland, PhD
Research Director StormGeo



StormGeo has more than 20 years of experience in handling of complex big data optimized for advanced decision support

StormGeo
Navigating tomorrow - today



Products & Services



SHIPPING



OCEAN



ENERGY MARKETS



TERRA

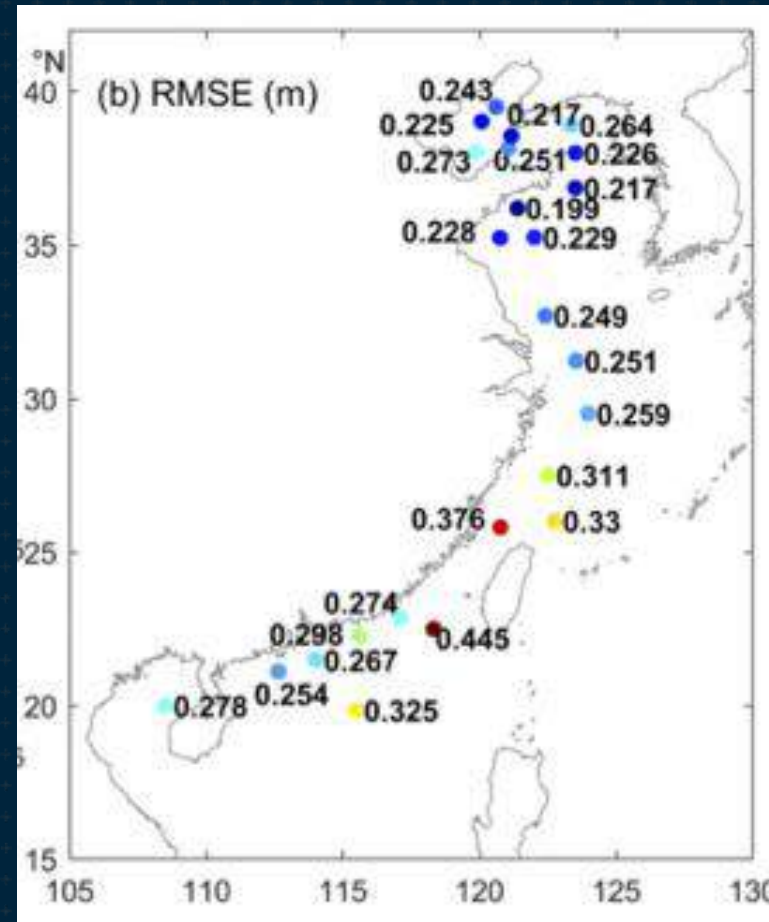
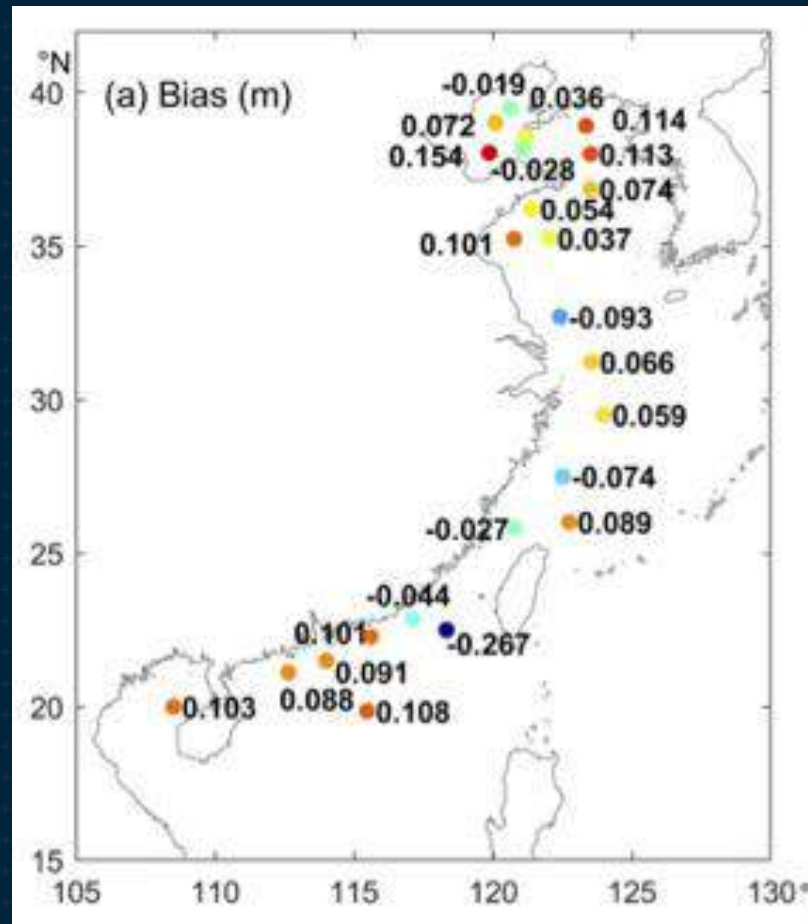


MEDIA

Weather Insights

Performance of global wave model

// Global scale ECMWF model has quality challenges in the Taiwan strait

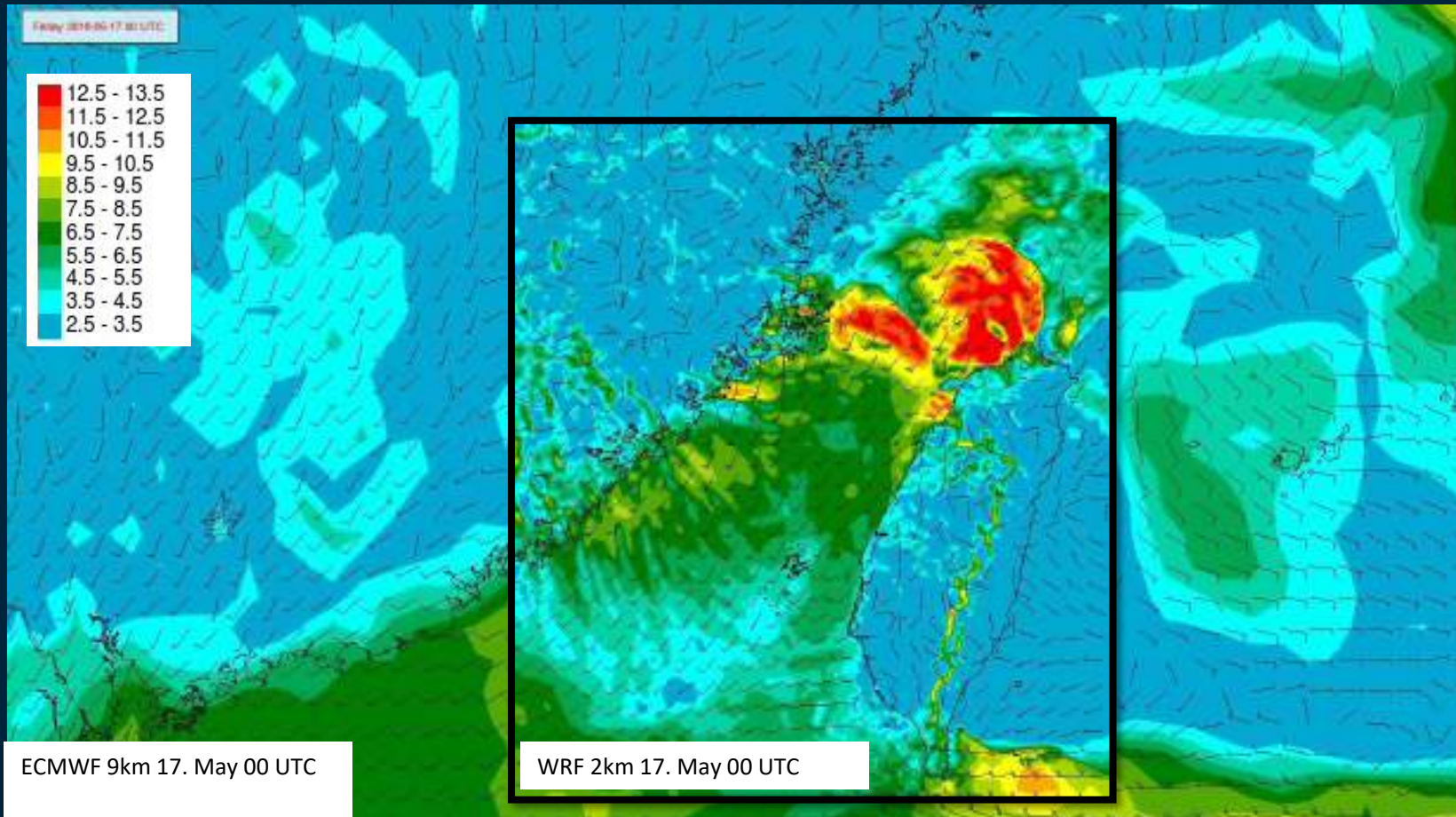


Forecasting quality is challenged by

- the complex sea state generated by two seasonal monsoons with prevailing wind directions from northeast and southwest depending on season. A mix of wind sea and swell systems, contributing to a wide range of wave ages from very young waves to mature waves.
- AND, lack of observations in the area to calibrate the models



WRF improves accuracy and skill on short term wind predictions



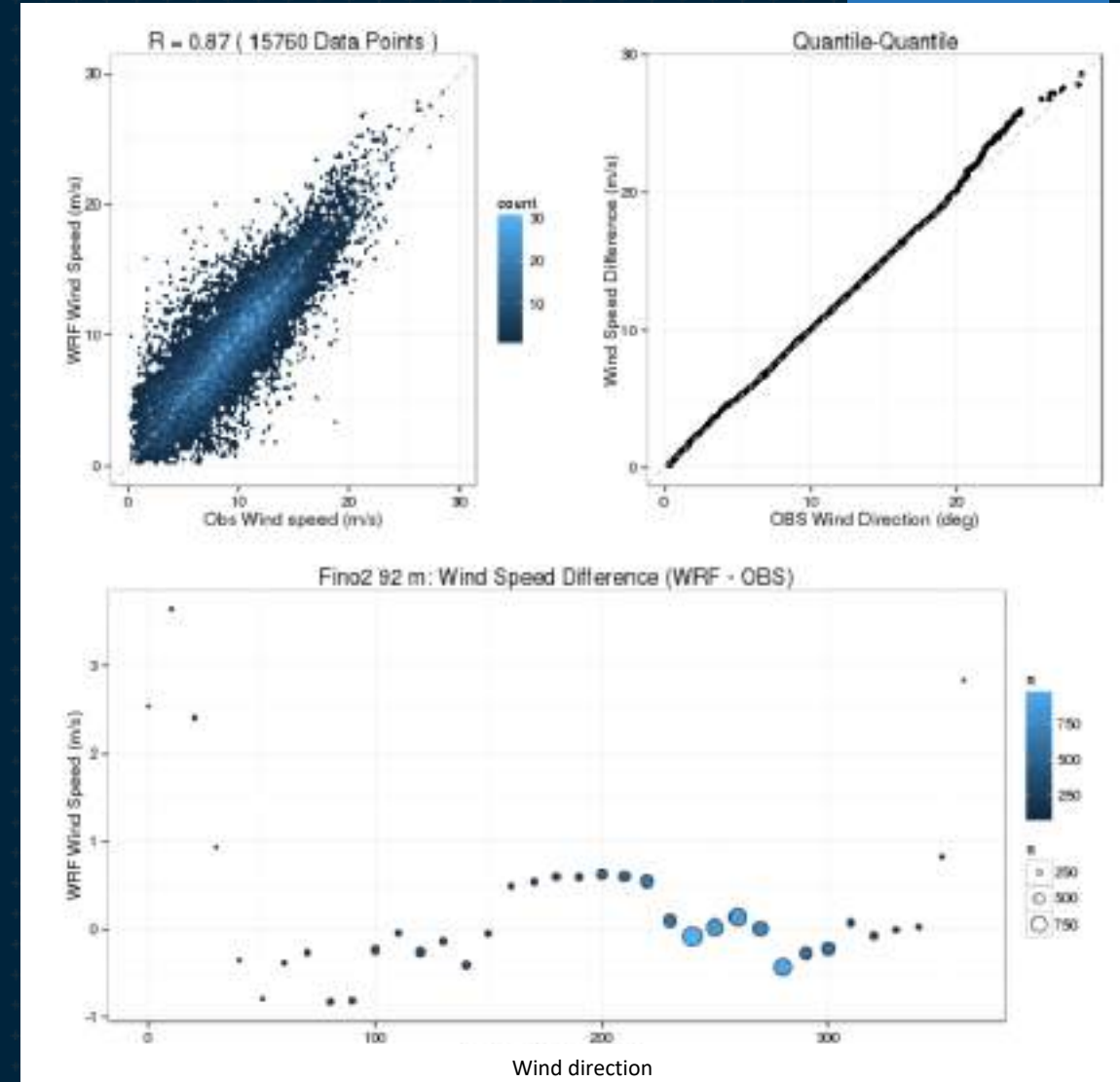
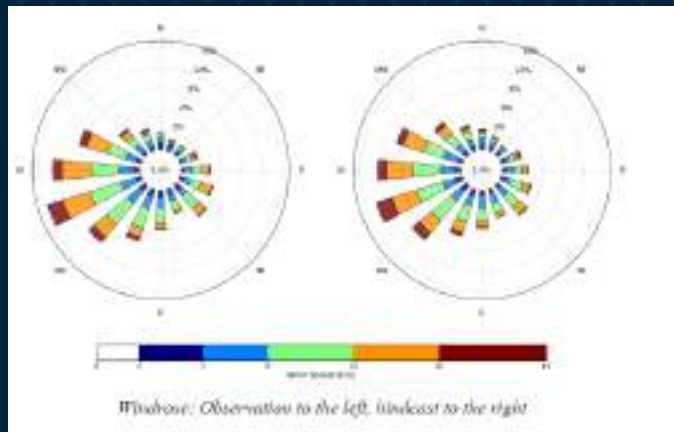
- Boundary and initial conditions from ECMWF operational global forecast
- 36 vertical levels
- Hourly model output

// Finescale hindcast modelling

StormGeo - modelling experts since 2003

- Dedicated in-house modelling specialists
- Hybrid Infrastructure (in-house + cloud) - scalable
- Global coverage
- 1-5 km resolution (typically)
- Independently validated by 3rd-party experts

World-class data for wind resource screening and assessment



WRF 1 km vs FINO2 92 m, 2 years of data

// Data Science in StormGeo

StormGeo
Navigating tomorrow - today



Public & Private

Processing, Cleaning and Integration

Interaction and Customer Engagements



3rd Party data

Synop

Buoy

Aircraft

Ship data

Radar

DeepStorm

Data Lake

Data Engineering

Cleaning of Data &
Quality control

Ingestion

Integration

Public Data Sources

Private Data sources



UNSUPERVISED
LEARNING



SUPERVISED
LEARNING

**MACHINE
LEARNING**

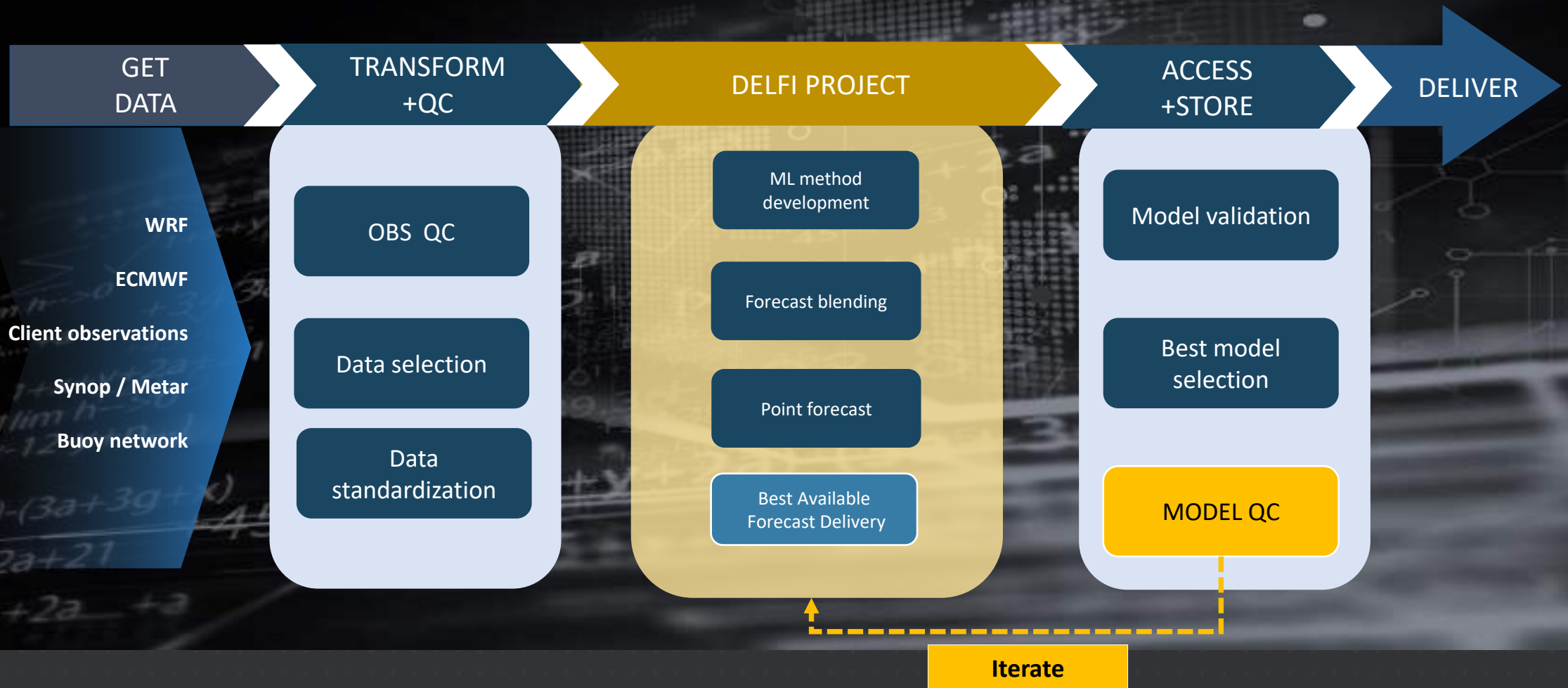


REINFORCEMENT
LEARNING

- Data and how you connect your data to internal and external sources is critical for success
- Data science is a team effort that requires different skillsets across the team for successful algorithm development.
- 80 % to 90 % of is spent gathering and cleaning the data NOT building algorithms and models. Revising system to improve this.

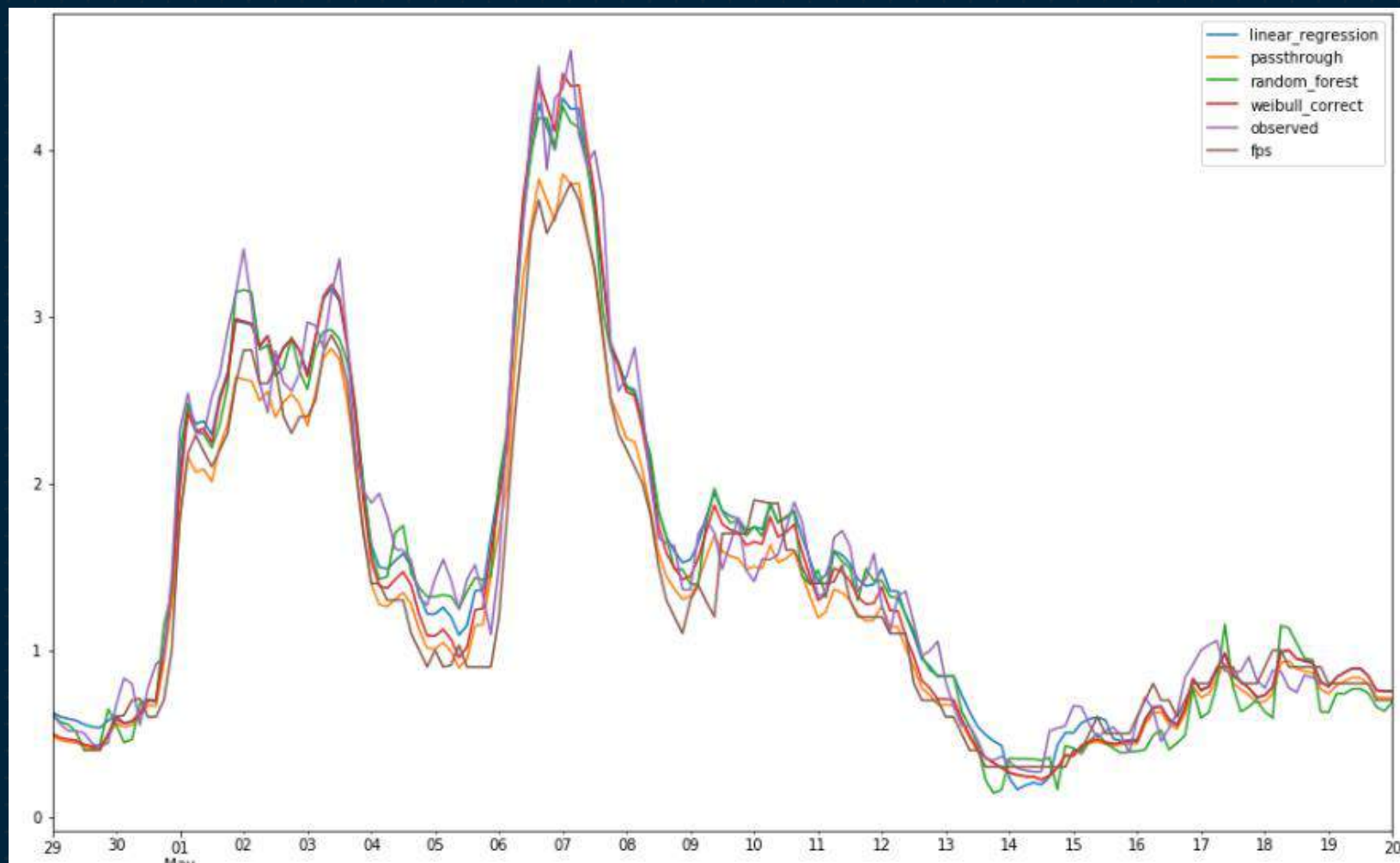
// DEep Learning Forecasting Improvements – DELFI

a ML framework to improve predictive skill





Changhua location – test of different ML approaches



StormGeo base forecast

ME	0.21
MAE	0.23

Linear regression

ME	0.01
MAE	0.14

Random forrest

ME	0.05
MAE	0.17

Weibull correction

ME	0.06
MAE	0.15

Training data: 20.11.2018 - 20.04.2019

Test data: 29.04.2019 - 20.05.2019



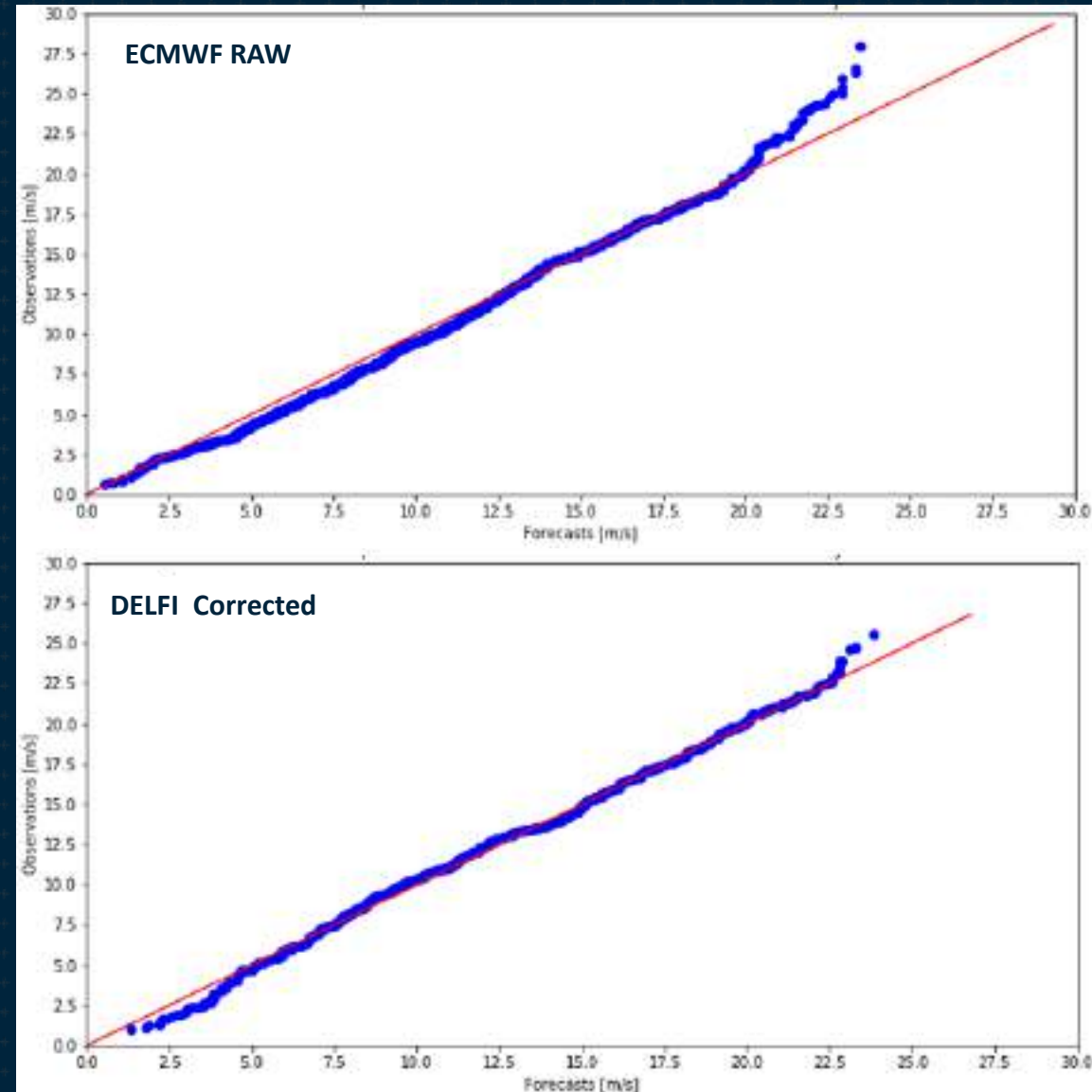
Forecast improvement using ML for 100 meter winds

SET-UP:

- Based on wind turbine observations and ECMWF hourly, 0.1° forecasts
- Inputs 2-m temperature and 10-m and 100-m zonal and meridional wind speeds and directions to output 90-m and 99-m wind speeds

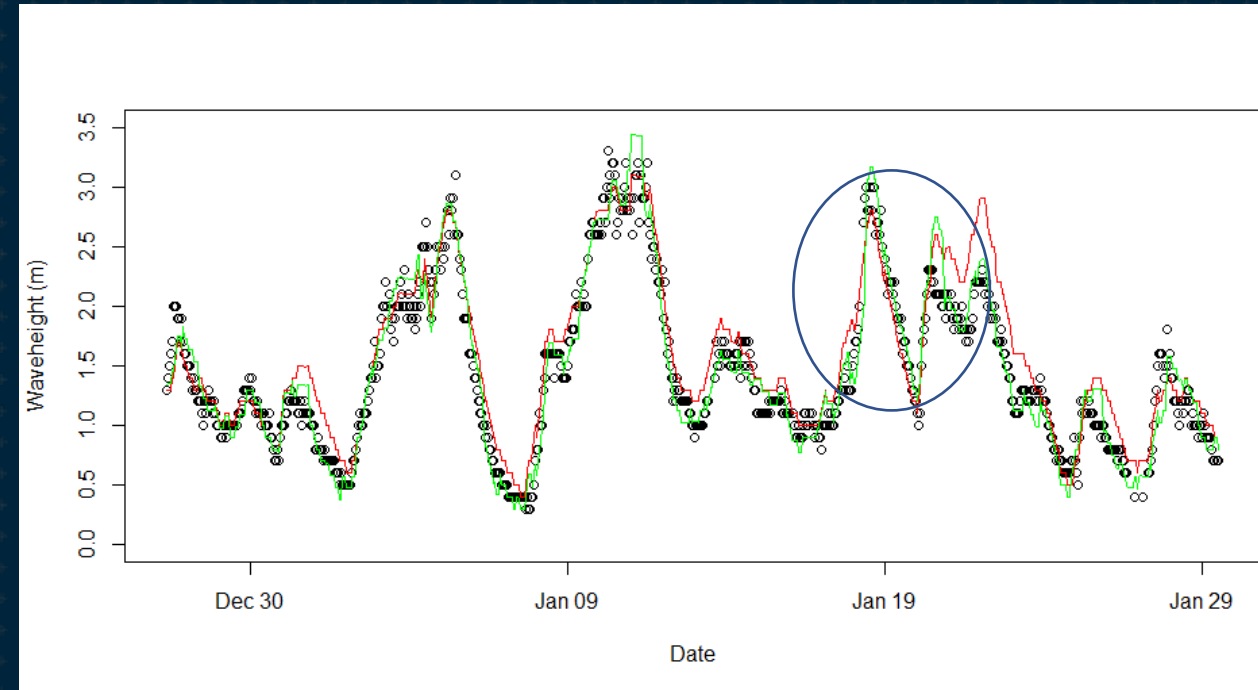
RESULTS:

- Weibull correction improved the upper level winds forecast even with limited observations available

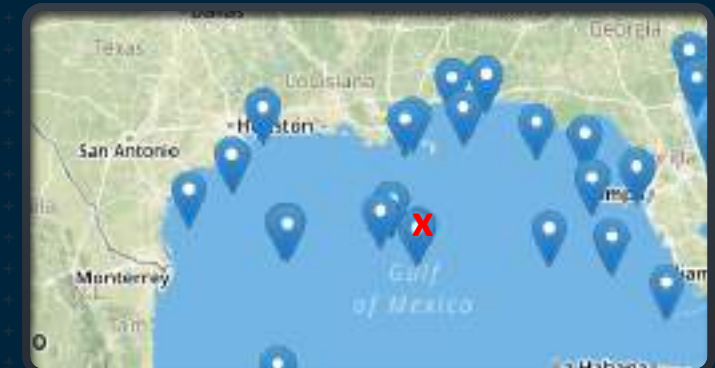


// More advanced models reduces errors more that simple models if suficcient observations are available

- The graph shows the improvements that can be achieved for one particular location by taking the persistence of model-errors into account.
- This is an ARIMA model, and the improvement in MAE compared to raw EC is about 25%, while the improvement of linear regression for this location was < 10%.



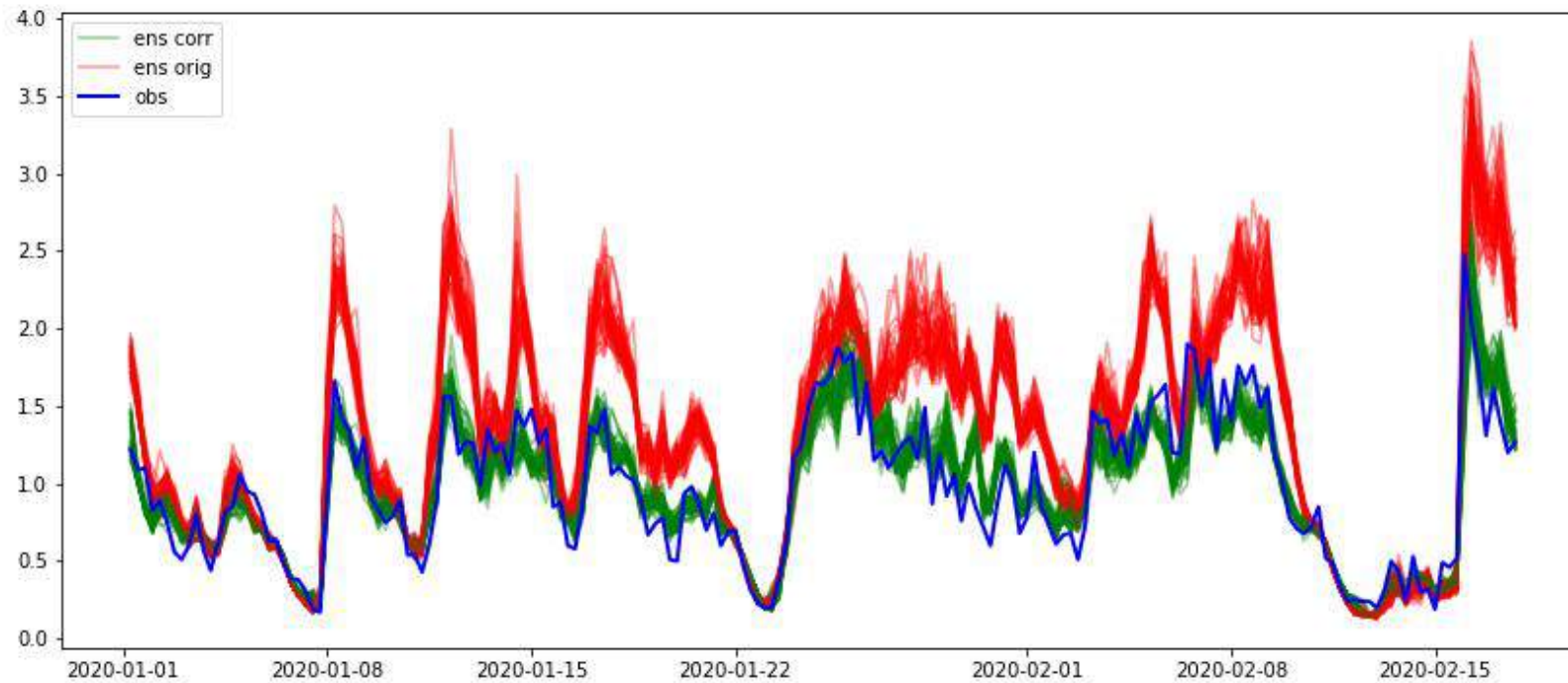
Obs – black
EC raw model – red
DELFI ARIMA - green





ENSEMBLE FORECAST to account for uncertainty

ML approach to bias correct individual ensemble members



Calibration of ensemble allows for better estimation of uncertainties during critical operations

// Summary

- **Observations are key** to improve forecast quality
- StormGeo forecast system consist of a mix of global models, local area models and machine learning methods
- Knowledge about our clients operating limits is of high importance

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Managing Weather Risks for Offshore Wind Projects in Asia-Pacific

Q & A Session

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Question 1

What is your forecast for typhoons for the rest of the year?

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Question 2

**Are developers in Asia-Pacific aware of
the weather risks?**

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Question 3

**Have you already seen weather
related damages in Asia-Pacific?**

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Question 4

Do you expect typhoon intensity to increase due to climate change?

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Question 5

Does ENSO have any direct relation with predicting a cyclone/ typhoon? For example, for an El Nino year can we expect more cyclones in a region?

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Question 6

Out of the four main offshore wind markets (China, Taiwan, Japan and South Korea) which is the most affected by weather related issues?

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Question 7

**When do you (Stormgeo) typically get engaged by wind farm developers / operators?
(Pre-construction, during construction, after commissioning)?**

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Question 8

**Do you have a view on weather conditions
for upcoming offshore wind developments
in Vietnam and Australia?**

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Question 9

**How do you combine your great know-how
with earthquake (Tsunami) risks?**

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Question 10

Could the Site Forecast service be used to assist generate a financial model acceptable to Lenders ?

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Question 11

Do you (Stormgeo) have a public online tools to evaluate the project site belongs to storm surge or typhoon or other natural perils?

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Question 12

**Do you see weather events hindering
the development of the offshore
wind industry in APAC?**

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Closing

Information



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Upcoming Webinars



The banner features a background image of several wind turbines on a hill under a blue sky with light clouds. The text is overlaid on the right side of the image.

Asia Wind Energy Association

WIND PIONEERS

ANEMOS

IN PARTNERSHIP WITH SIEMENS Gamesa

AWEA WEBINAR SERIES 2020 - TECHNICAL SESSION

Developing onshore wind farms for the next generation of huge turbines

TUESDAY, 22 SEPTEMBER 2020 - 3 PM SGT



The banner features a background image of a person's hands pointing at a document with a pen, with a wind turbine visible in the background through a window. The text is overlaid on the right side of the image.

Asia Wind Energy Association

IN PARTNERSHIP WITH WORLD FORUM OFFSHORE WIND

AWEA WEBINAR SERIES 2020 - MARKET SESSION

Highlights of WFO's Global Offshore Wind Report 1H2020

TUESDAY, 29 SEPTEMBER 2020 - 3 PM SGT

AWEA WEBINAR SERIES 2020 - TECHNICAL SESSION

Managing Weather Risks for Offshore Wind Projects in Asia-Pacific

Thank You!