

Shell Exploration & Production

# Estimating extreme wave design criteria incorporating directionality

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# Overview

- **Motivation**
- **Data**
- **Directional extremal model**
- **Estimating omni-directional extremes**
- **Design criteria for directional extremes**
- **Conclusions**

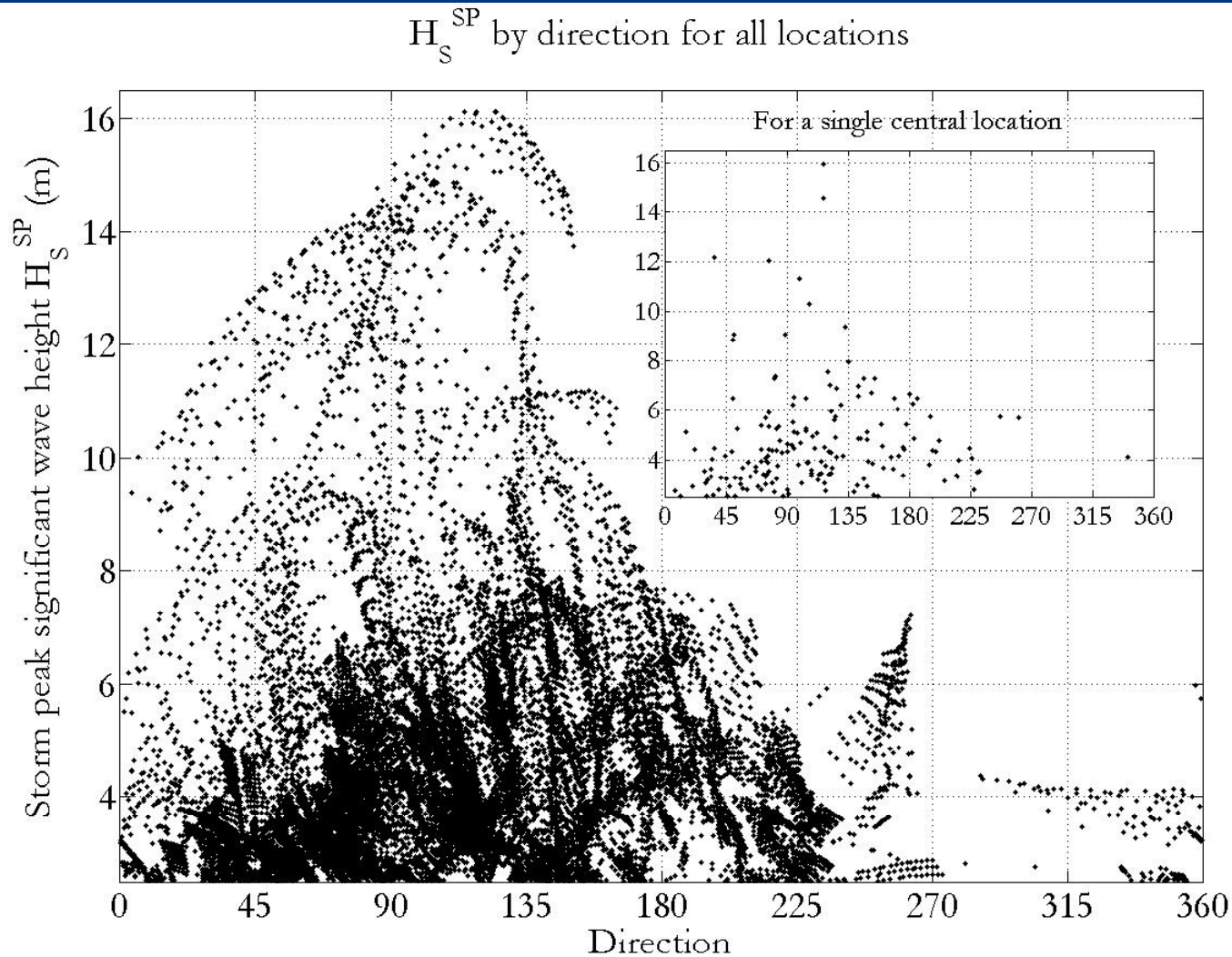
# Motivation

- In most regions, but particularly hurricane-dominated regions (e.g. Gulf of Mexico), and in regions where extra-tropical storms prevail (e.g. Northern North Sea), the extremal properties of storms are also highly dependent on storm direction
- Sea state design criteria for offshore facilities are frequently provided by direction to optimise engineering facilities
- Important that these criteria be consistent so that the probability of exceedance of a given wave height from any direction derived from the directional values is the same as for the omni-directional value.
- No consensus on how the criteria should be specified

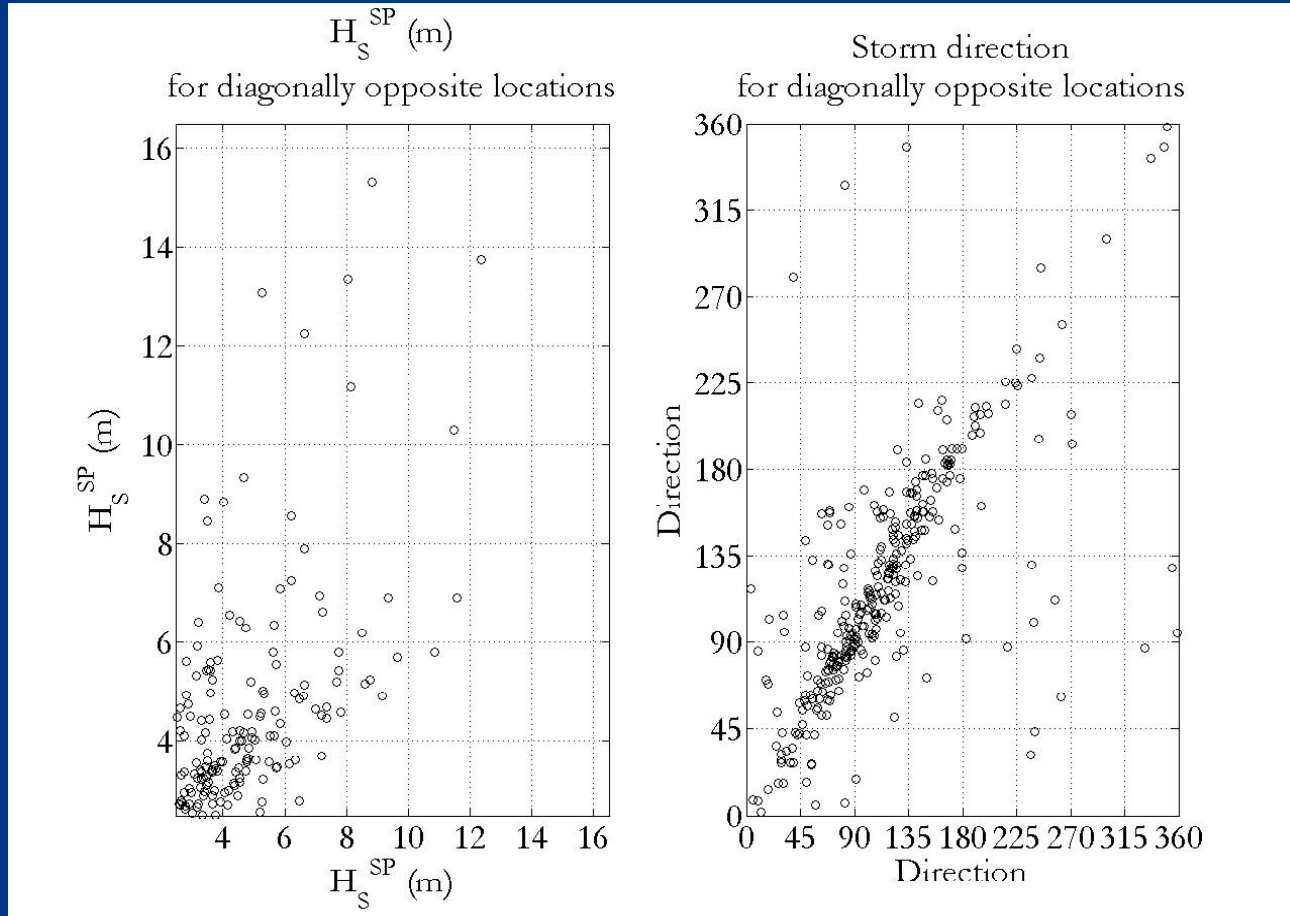
# The GOMOS data

- $H_s$  values from GOMOS Gulf of Mexico hindcast study (Oceanweather, 2005)
- September 1900 to September 2005 inclusive
- 30 minute sampling intervals
- 120 grid points on a  $15 \times 12$  rectangular lattice with spacing 0.125 (14 km)
- For each storm period for each grid point, we isolated a storm peak significant wave height  $H_s^{sp}$  and associated direction  $\theta_i$
- 315 storms per grid point

# The GOMOS data



# The GOMOS data



These locations are 250 km apart

# The directional extremal model

CDF: 
$$F_{X_i|\theta_i,u}(x) = P(X_i \leq x | \theta_i, u) = 1 - \left( 1 + \frac{\gamma(\theta_i)}{\sigma(\theta_i)}(x - u) \right)_+^{-\frac{1}{\gamma(\theta_i)}}$$

$\gamma(\theta_i)$  shape parameter  
or tail index

$\sigma(\theta_i)$  scale parameter

$u$  threshold  
(assumed constant  
with direction)

Parameters characterised by Fourier series expansion  
(e.g. Robinson & Tawn, 1997)

$$\gamma(\theta) = \sum_{k=0}^p \left[ A_{11k} (\cos(k\theta)) + A_{12k} (\sin(k\theta)) \right]$$

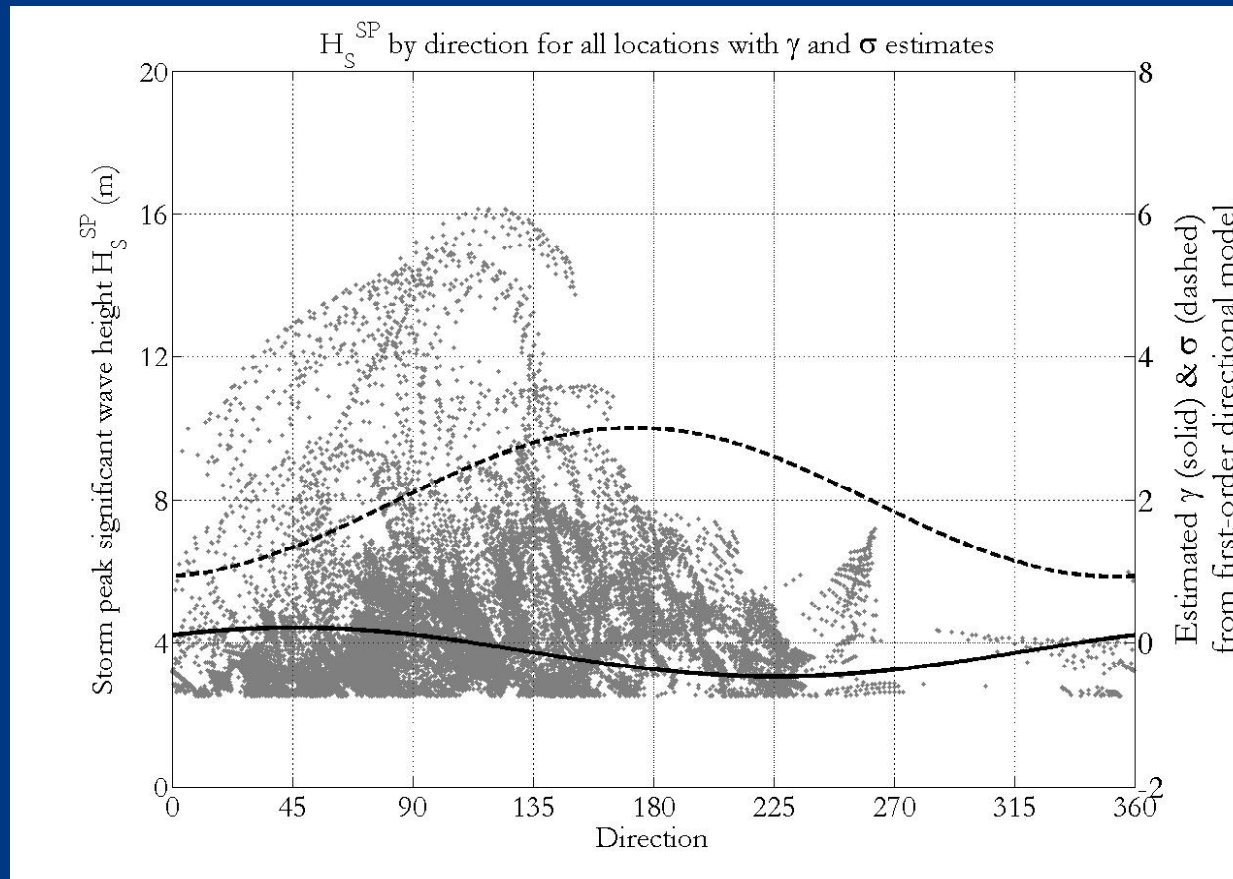
$$\sigma(\theta) = \sum_{k=0}^p \left[ A_{21k} (\cos(k\theta)) + A_{22k} (\sin(k\theta)) \right]$$

Parameters estimated by maximum likelihood

# The GOMOS first-order directional model

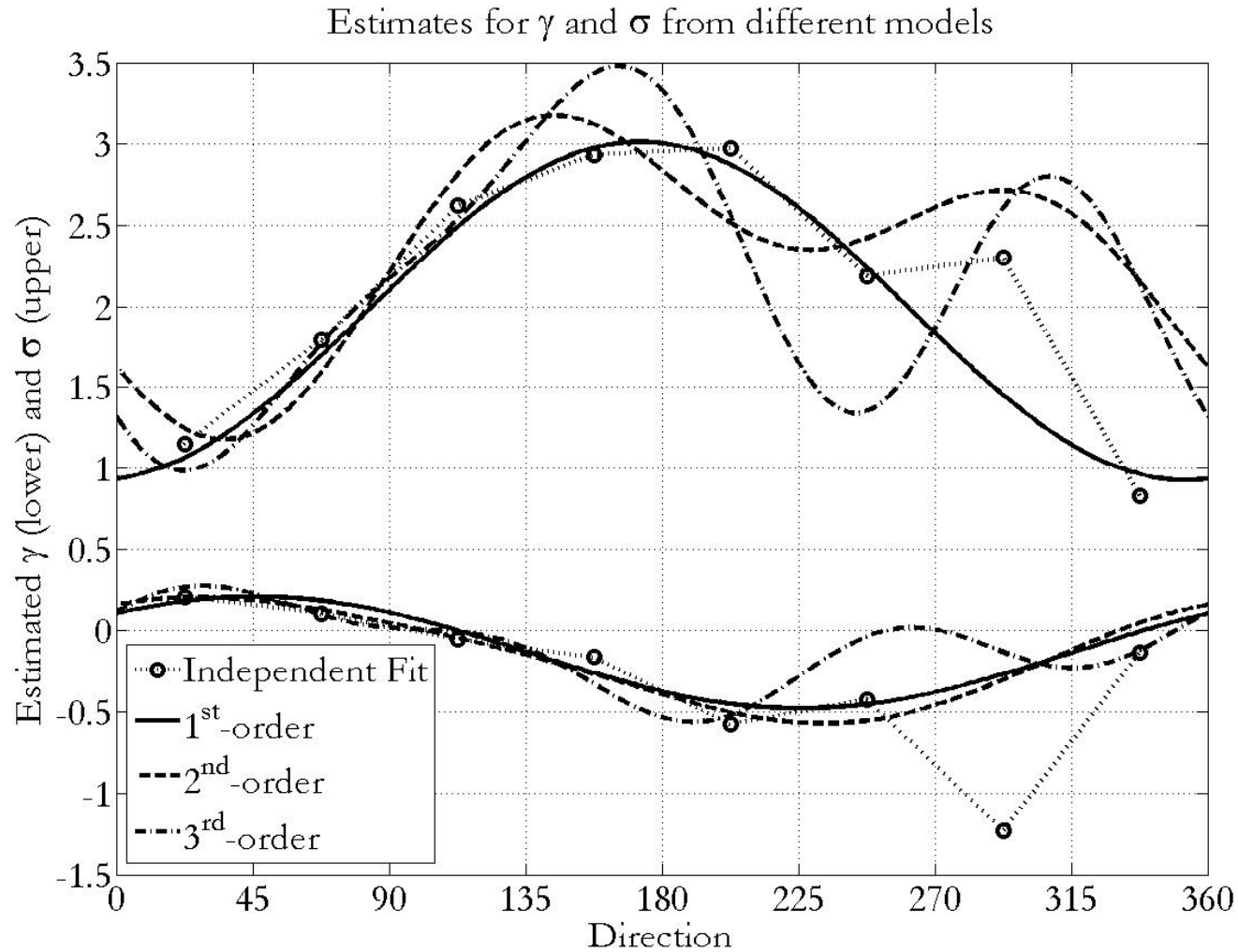
$$\gamma = -0.13 + 0.24 \cos(\theta) + 0.24 \sin(\theta)$$

$$\sigma = 1.97 - 1.04 \cos(\theta) + 0.14 \sin(\theta)$$

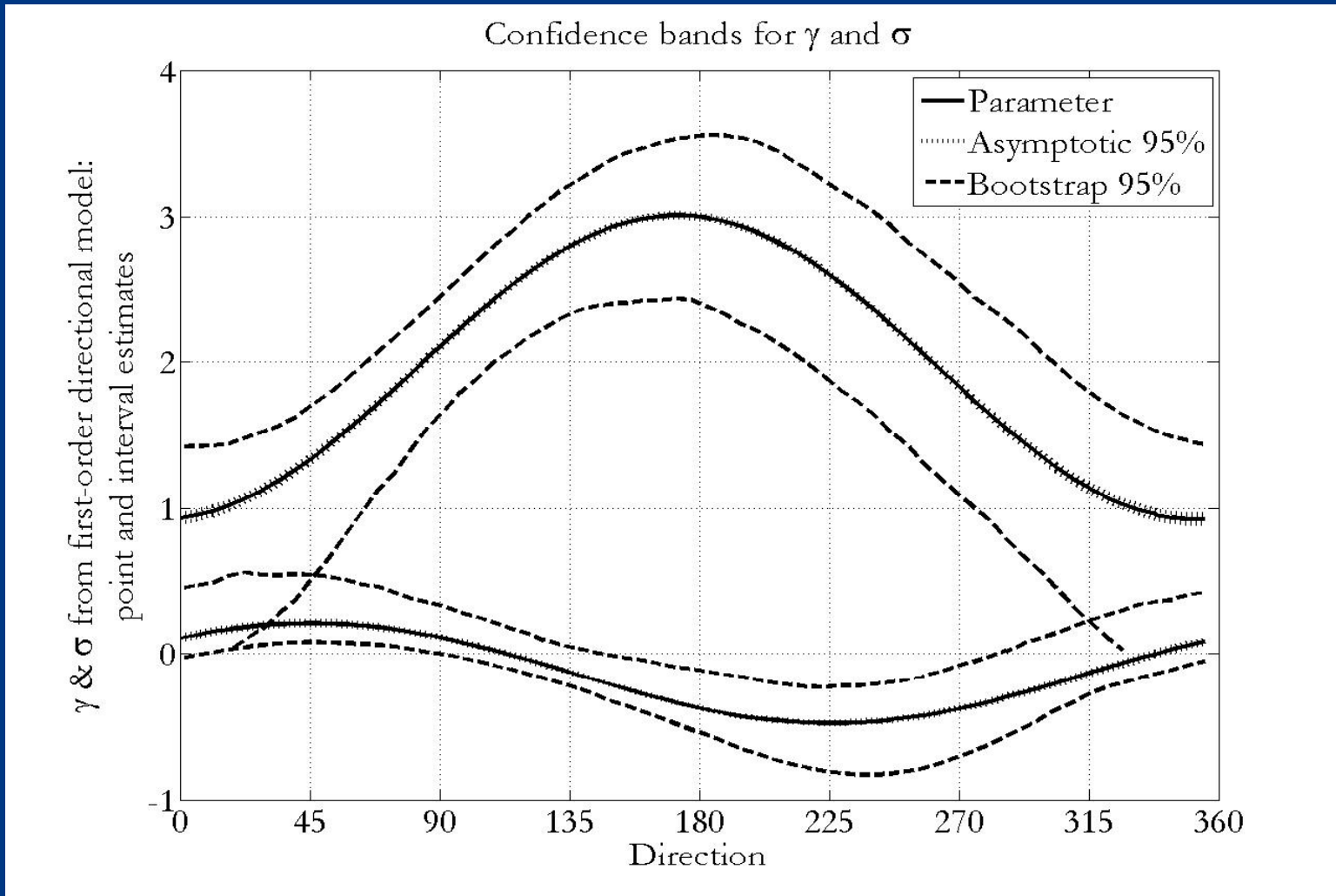




# Comparison of higher order models



# First-order model confidence bands



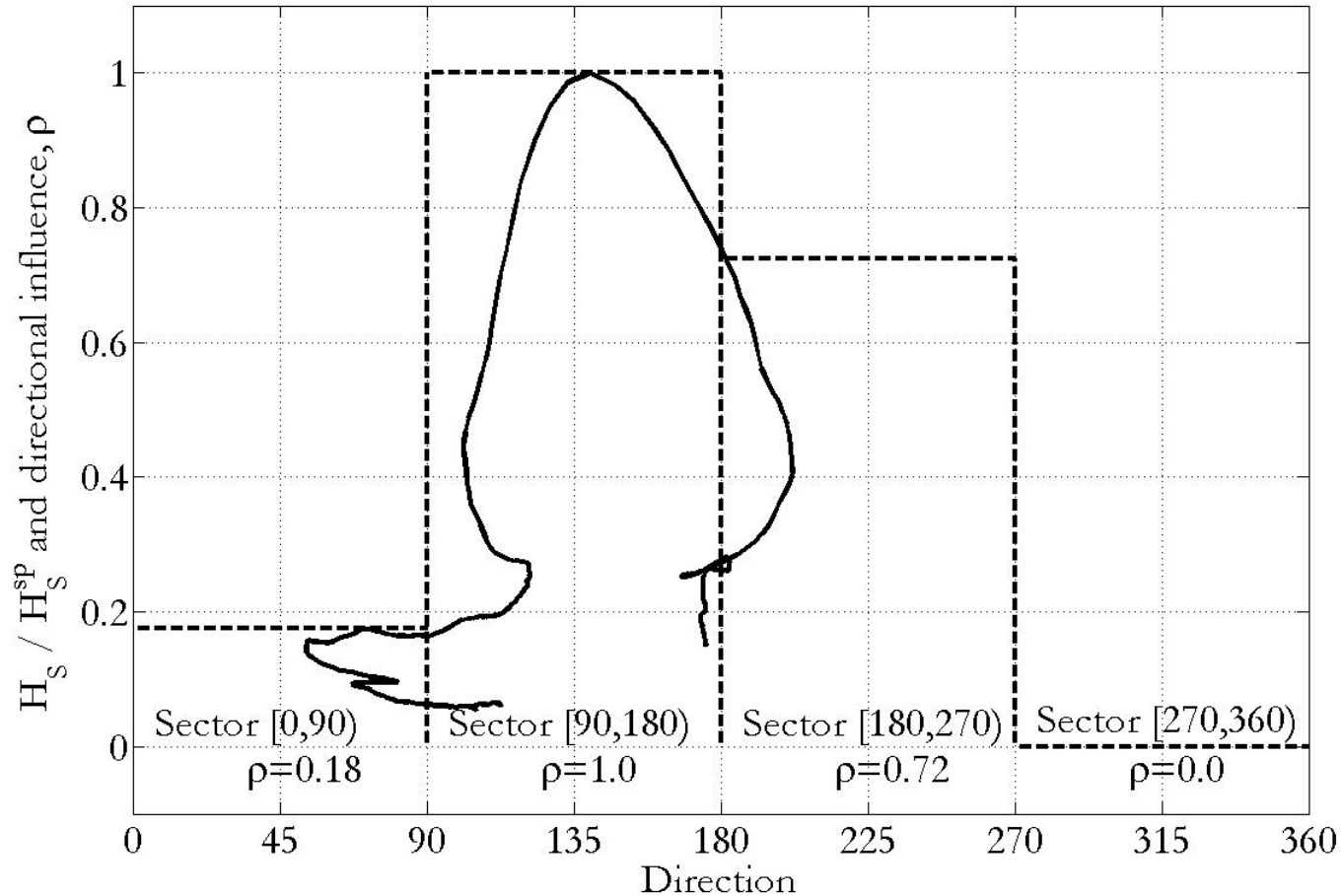
# Estimation of omni-direction Extremes

## Assume

- Given storm peak direction,  $\theta_i$ , storm peak  $H_s$  above  $u$  follows GPD with parameters  $\gamma(\theta_i)$  and  $\sigma(\theta_i)$
- Storm occurrences are independent Poisson events with expectation  $1/P_0$  per annum per storm
- Storm peak directions for any period  $P$  are restricted to  $\{\theta_i\}_{i=1}^n$

# Estimation of omni-direction extremes

$H_S / H_S^{sp}$  with wave direction for sea states of a typical storm  
and directional influence,  $\rho$ , on the four quadrants



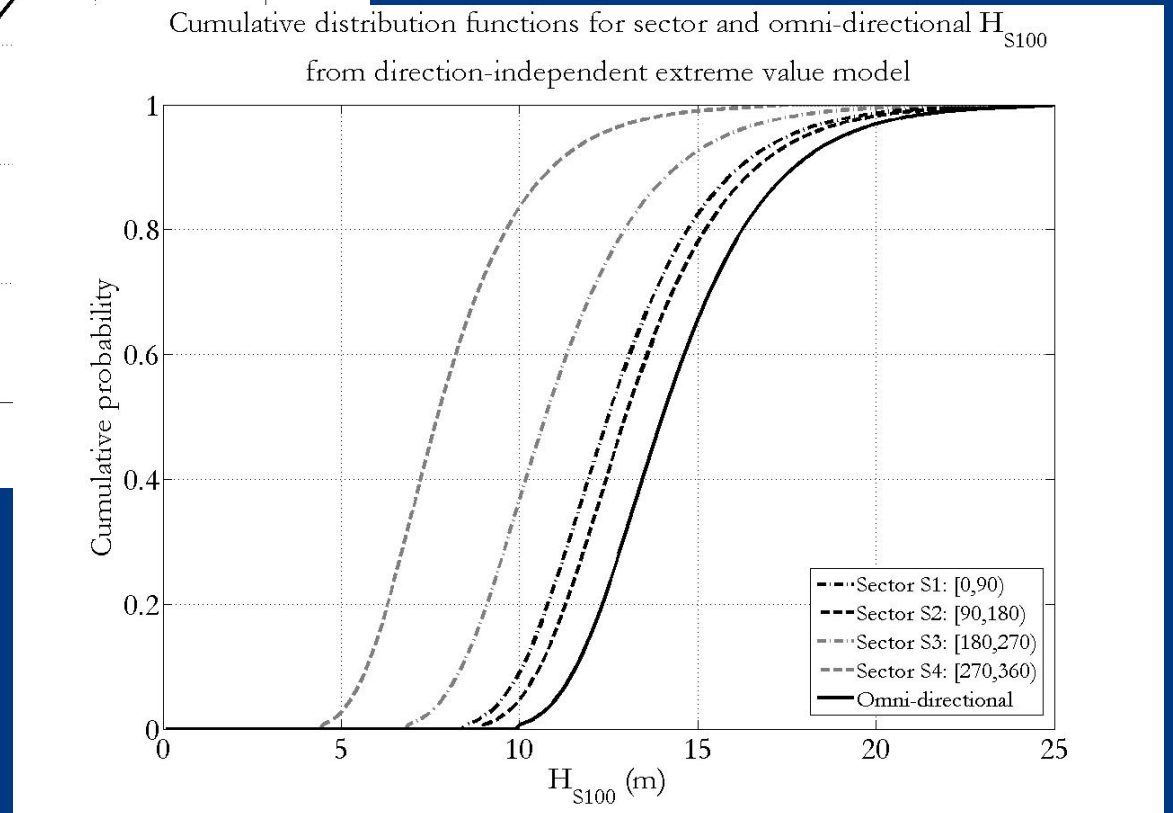
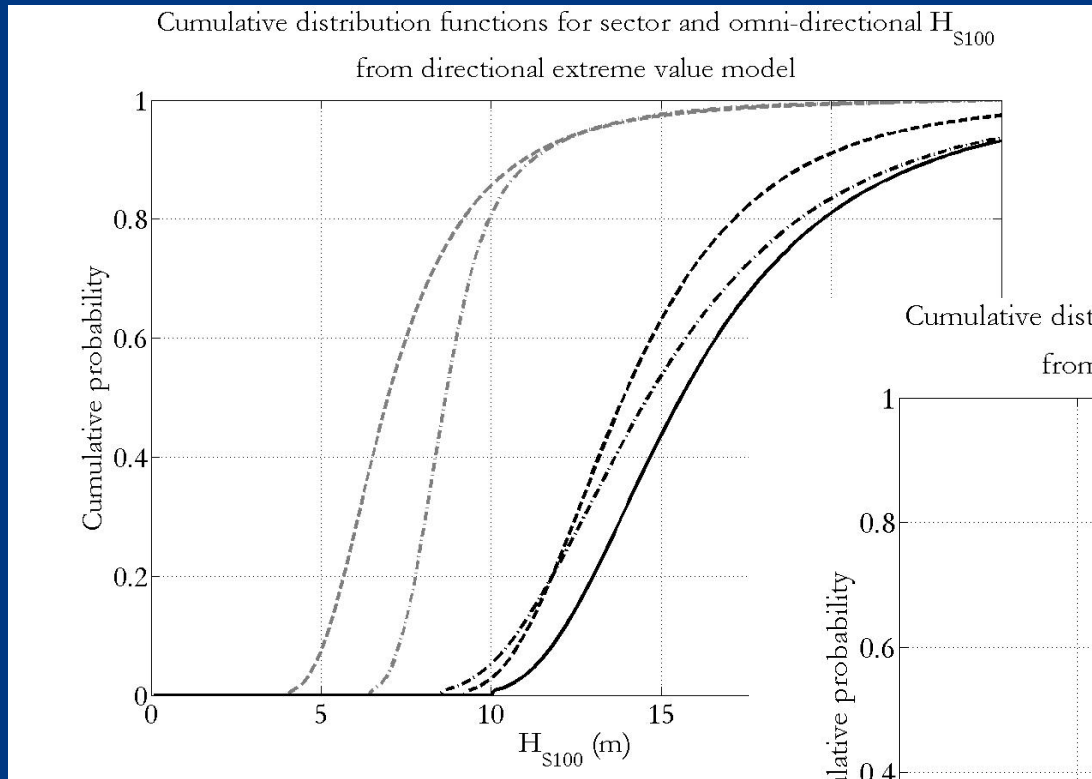
# Estimation of omni-direction extremes

Distribution of the maximum storm  $H_s$  within a given sector  $S$  in a given period  $P$  is given by:

$$\begin{aligned} F_{X_{\max S}}(x) &= P(X_{\max S} \leq x \mid X_i > u \forall i, i \in [1, 2, \dots, n]) \\ &= \prod_{i=1}^n \left\{ \sum_{k=0}^{\infty} P(\rho_i(S) X_i \leq x \mid X_i > u, M_i = k) P(M_i = k) \right\} \\ &= \exp \left\{ -m \sum_{i=1}^n \left( 1 + \frac{\gamma(\theta_i)}{\sigma(\theta_i)} \left( \frac{x}{\rho_i(S)} - u \right) \right)^{-\frac{1}{\gamma(\theta_i)}} \right\} \end{aligned}$$

where  $m = \frac{P}{P_0}$  is the expected value of the number of occurrences of storm which is assumed to follow a Poisson distribution

# GOMOS quadrant & omni extremes



# Design criteria for directional extremes

Omni-directional 100-yr maximum cumulative probability

$$P(X_{\max 100Omni} \leq x) = \prod_{i=1}^m P(X_{\max 100S_i} \leq x)$$

where  $P(X_{\max 100S_j} \leq x)$  is cumulative probability for the maximum in the sectors  $\{S_i\}_{i=1}^m$  in a 100-yr period

The 100-yr design  $H_s$  can be calculated for a particular non-exceedance probability  $q_{100Omni}$  from

$$q_{100Omni} = P(X_{\max 100Omni} \leq x_{100Omni})$$

Specification of  $q_{100Omni}$  does not allow unique values of the sector 100-yr design  $H_s$

# Design criteria for directional extremes

## CASE I: All but one sectors have negative shape parameter

Each sector with negative shape parameter has an upper limit of storm peak  $H_s$

Set design values for each of these sectors to the maximum, with  $q_{100S_i} = 1$

and

$$q_{100O_{mni}} = \prod_{i=1}^m q_{100S_i} = q_{100S^*}$$

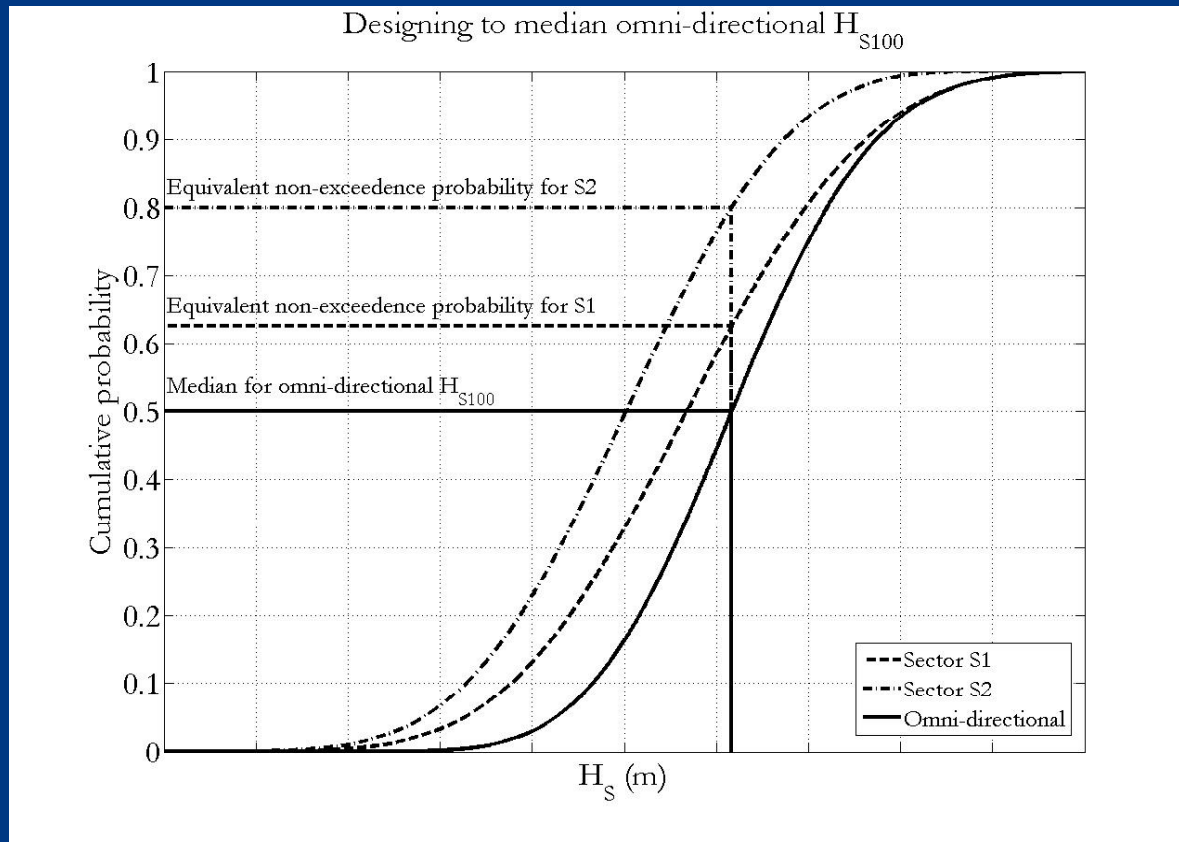
where  $S^*$  is the remaining sector with positive shape parameter



# Design criteria for directional extremes

**CASE II: All sectors set to omni-direction**  $H_{s100Omni}$

set  $q_{100S_i} = P\left(X_{\max 100S_i} \leq x_{100Omni}\right) \quad \forall i$

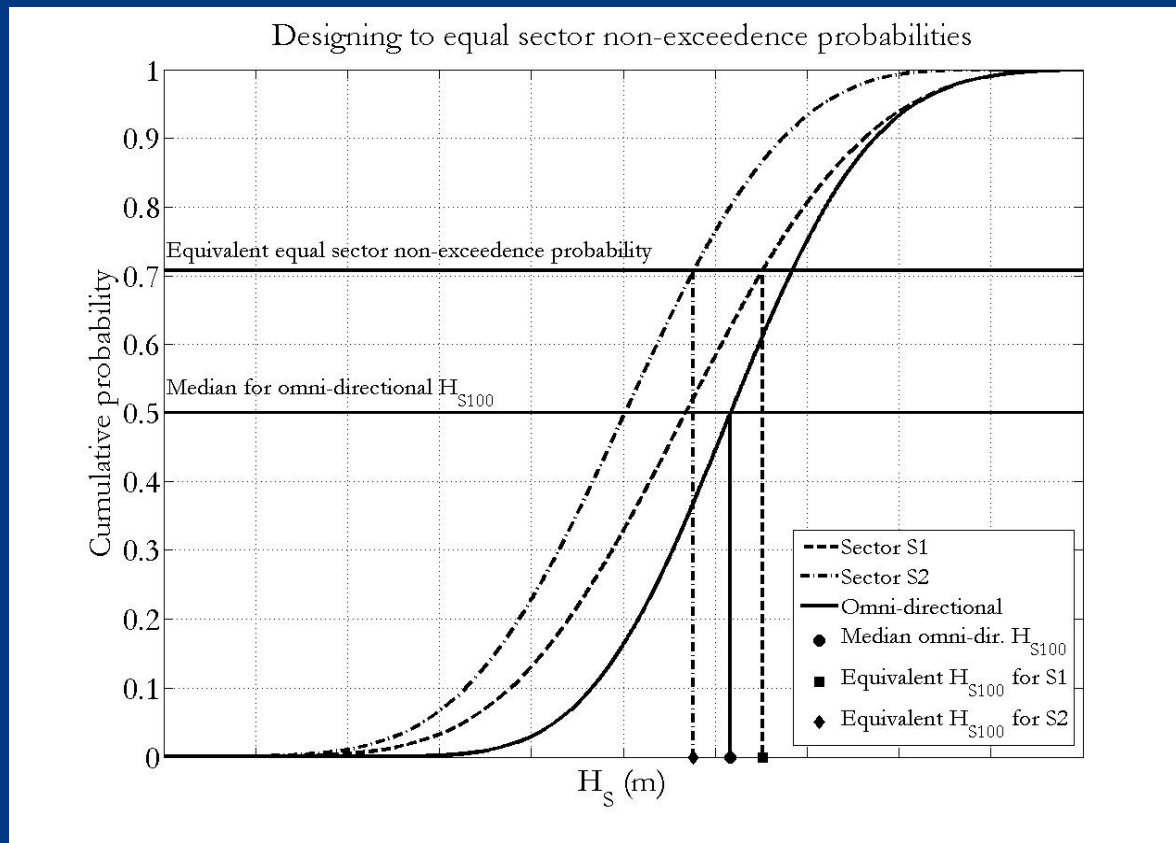


- non-exceedance probabilities different for each sector
- non-exceedance probability for most severe sector less than less severe
- non-exceedance probability for most severe at least as large as omni-direction

# Design criteria for directional extremes

## CASE III: All sectors have equal non-exceedance probability

set  $q_{100Omni} = \prod_{i=1}^m q_{100S} = (q_{100S})^m$  where  $q_{100S} = (q_{100Omni})^{\frac{1}{m}}$



- sets  $100m$  return-period levels for each sector
- most severe sector higher  $H_{s100S_i}$  than omni-direction value
- setting the most extreme sector to  $100m$ -year level might be “over-conservative”

# Design criteria for directional extremes

## Risk-cost method

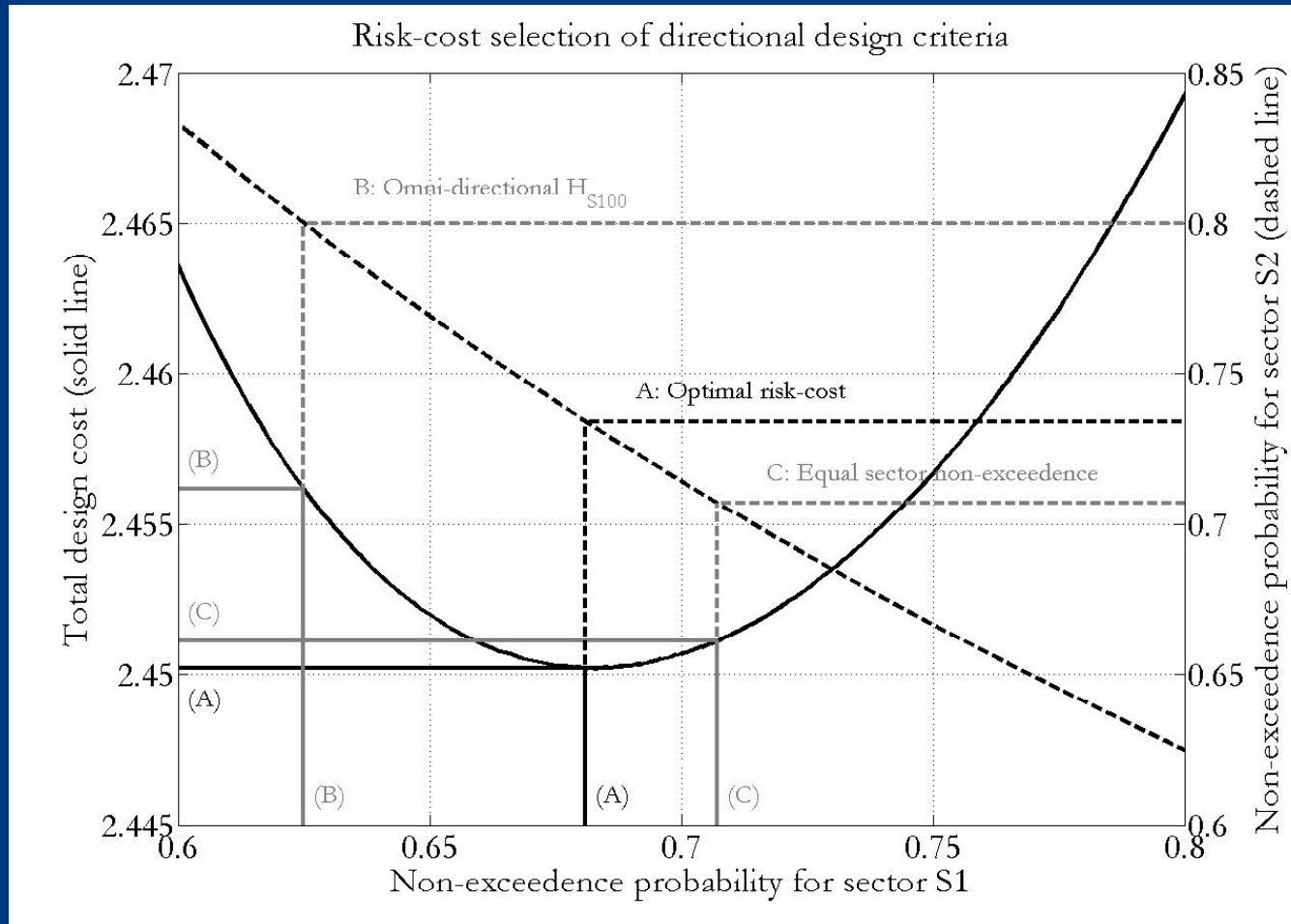
Suppose  $c(x)$  is the cost of designing to a storm peak  $H_s$

The overall cost of design is: 
$$RC = \sum_{i=1}^m c(x_{100S_i})$$

The optimal design is that which minimises  $RC$  subject to  $q_{100Omni} = \prod_{i=1}^m q_{100S_i}$

# Design criteria for directional extremes

Risk-cost method – two sector example  $c(x) = 0.001x^2$



- total design cost for  $q_{100Omni} = 0.5$
- optimal design cost balance between “omni-directional design” and “equal non-exceedances design”

# Design criteria for directional extremes

Design criteria based on median omni-directional  $H_{s100Omni}$

		Risk-cost optimal			Omni-direction			Equal sector non-exceedance		
	Sector	RC	$x_{100S_i}$	$q_{100S_i}$	RC	$x_{100S_i}$	$q_{100S_i}$	RC	$x_{100S_i}$	$q_{100S_i}$
Directional Model	[0,90)	8.78	18.03	0.75	9.73	15.60	0.59	9.29	20.20	0.84
	[90,180)	8.78	17.40	0.81	9.73	15.60	0.69	9.29	17.90	0.84
	[180,270)	8.78	11.44	0.91	9.73	15.60	0.98	9.29	10.30	0.84
	[270,360)	8.78	10.90	0.90	9.73	15.60	0.98	9.29	9.70	0.84
Direction-independent model	[0,90)	7.56	15.00	0.82	7.84	14.00	0.72	7.59	15.20	0.84
	[90,180)	7.56	15.40	0.82	7.84	14.00	0.66	7.59	15.70	0.84
	[180,270)	7.56	13.41	0.84	7.84	14.00	0.88	7.59	13.40	0.84
	[270,360)	7.56	10.67	0.89	7.84	14.00	0.98	7.59	10.10	0.84

- Directional model design values > Direction independent values
- RC model avoids large range of  $q_{100S_i}$  and  $x_{100S_i}$  of other two methods
- RC model design based on directional EV model is preferable

# Conclusions

- Strong general case for adopting directional extreme model to storm peak [unless it can be demonstrated statistically that a direction free model is no less appropriate].
- A directional extremes model [e.g. Fourier series expansion] allows directionally consistent extreme values to be derived.
- Important to consider directionality of sea states when developing design  $H_s$  criteria [omni-directional extremes from directional data can be significantly different from a direction-independent derivation].
  - Even when the extremal characteristics of storm peak  $H_s$  are direction independent rate of occurrence of storms is dependent on storm direction – the distribution of  $H_{s100}$  will have directional dependence in general.
- Risk-cost method is an objective approach to optimise directional criteria, while preserving overall reliability [RC method avoids more extreme properties of other design methods].