

# Characterising extreme sea state severity using absolute spatial dependence

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## Background

- Extreme waves in tropical cyclone (TC) dominated region *rare*
- Estimates of 100-year significant wave height (SWH) using data from a single location have large epistemic uncertainty
- Using *spatial information* can reduce this uncertainty
- Key modelling idea is to characterise (1) peak storm severity (STM) and (2) its absolute spatial dependence (ASD)

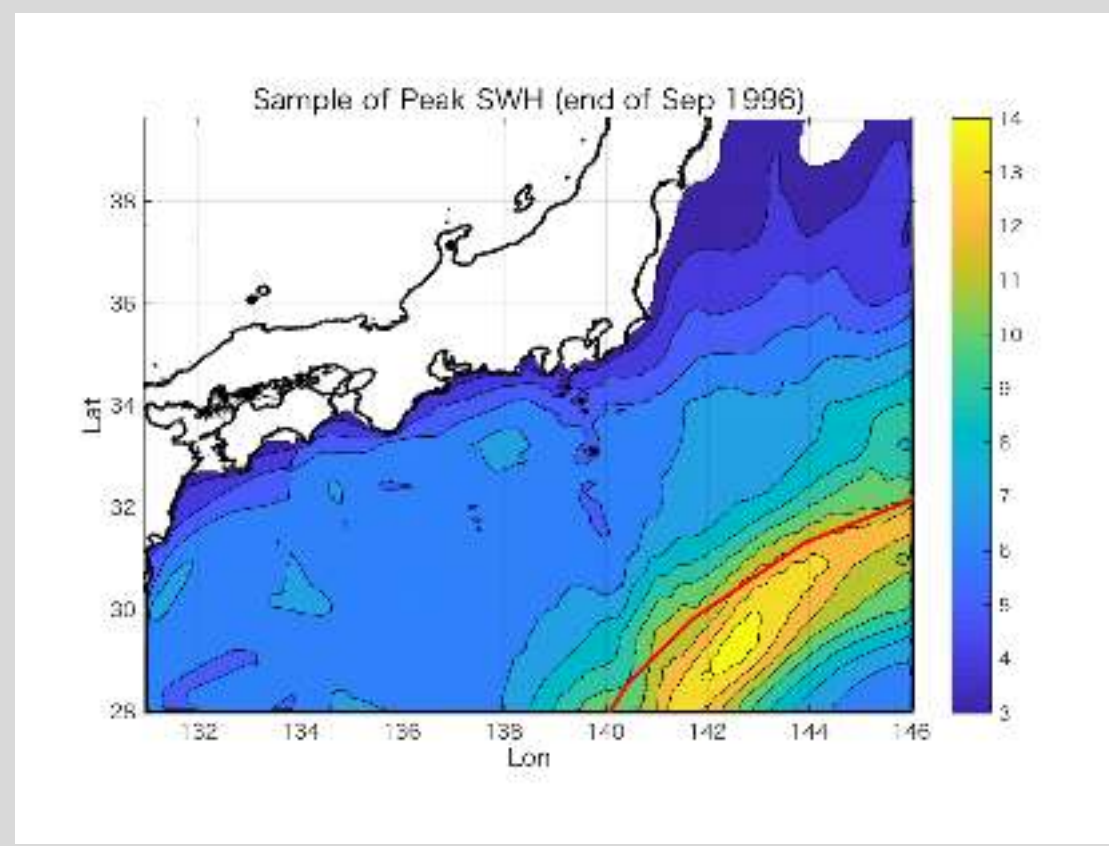
## Methodology

- **Space-time maximum (STM):** The maximum value of SWH at any location in the region for any time during a TC event.
- **Absolute spatial dependence (ASD):** For each location on a fixed spatial grid over the region, and a TC, ASD gives the maximum value of SWH for any time during the TC as a fraction of STM for that TC.
- **Assumptions:** (1) STM is spatially stationary (i.e. its distribution does not depend on location), and (2) STM and ASD are independent.

## Purpose of Study

- TO** improve accuracy of extreme wave estimation  
**BY** deriving a novel stochastic method  
**USING** ideas of spatial statistics

## Extreme wave during a TC event

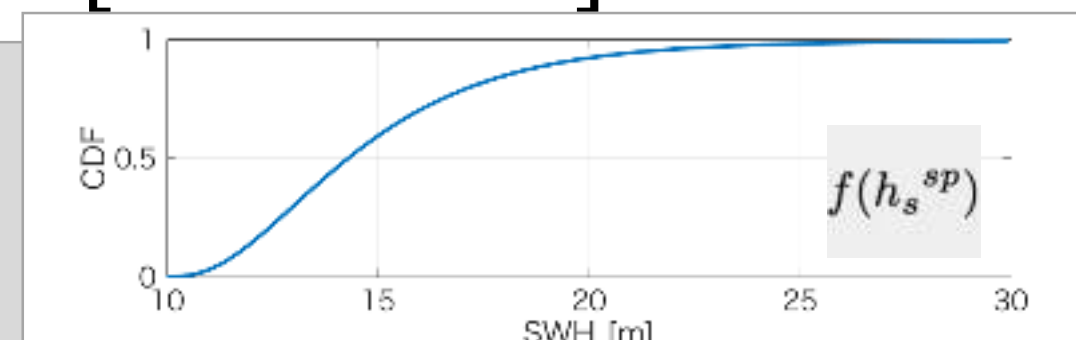


Ex) TC in Sep. 1996 largest SWH during TC event

## Space-time maximum (STM)

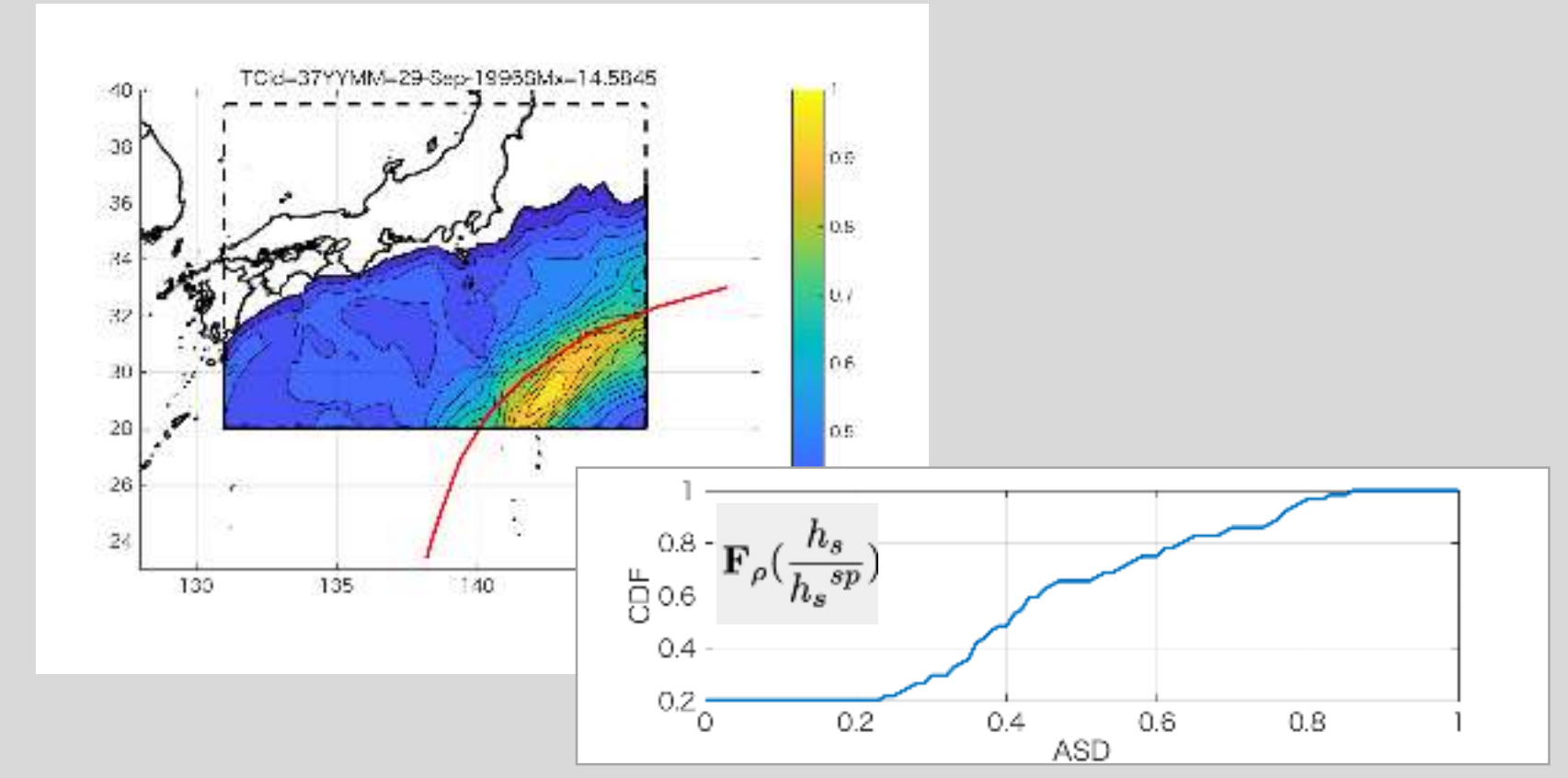
Extreme value distribution of storm peak is modelled with General pareto distribution for POT

$$F(x) = 1 - \left[ 1 + \frac{\xi(x - \mu)}{\sigma} \right]^{-1/\xi}$$



Extreme value estimation = Extrapolation in time (LWM<sup>[1]</sup>)

## Absolute spatial dependence (ASD)



Spatial Dependence = Empirical based on TC events

Extreme distribution for each TC event

$$P(\rho H s^{sp} \leq h_s) = \int F_{\rho} \left( \frac{h_s}{h_s^{sp}} \right) f(h_s^{sp}) dh_s^{sp}$$

Extreme distribution for N-year event

$$P_{N\text{years}}(\rho H s^{sp} \leq h_s) = \sum_{k=0}^{\infty} \frac{\lambda^k e^{-\lambda}}{k!} P^k(\rho H s^{sp} \leq h_s) = \exp(-\lambda(1 - P(\rho H s^{sp} \leq h_s)))$$

## Application to North West Pacific using hindcast wave dataset

### Data

Wave Hindcast: Todai Wavewatch 3 [2]

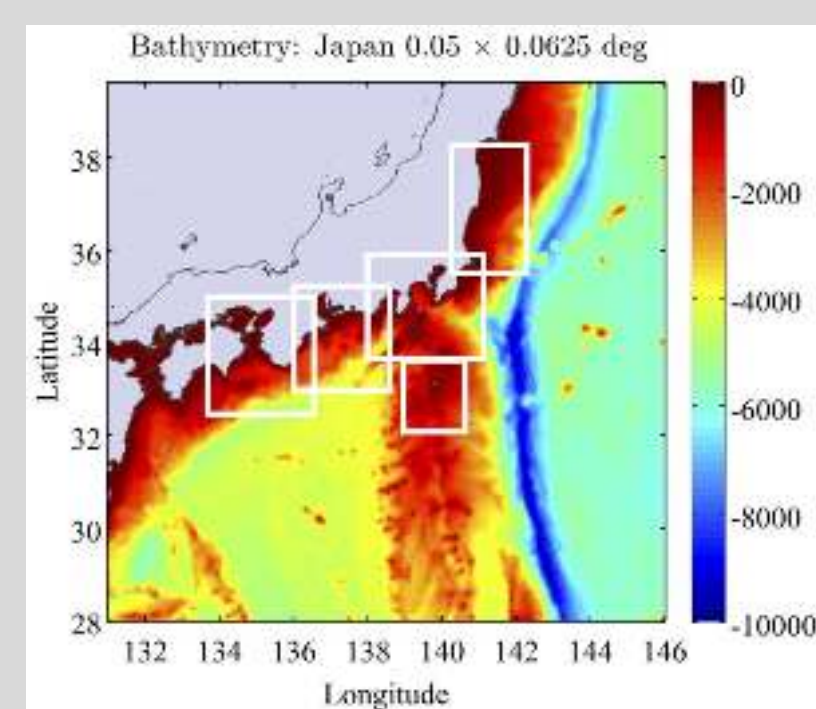
- ✓ 21-year (1994-2014) hindcast
- ✓ High resolution (0.01degree) grid

Tropical cyclone tracks: IBTrACS [3]

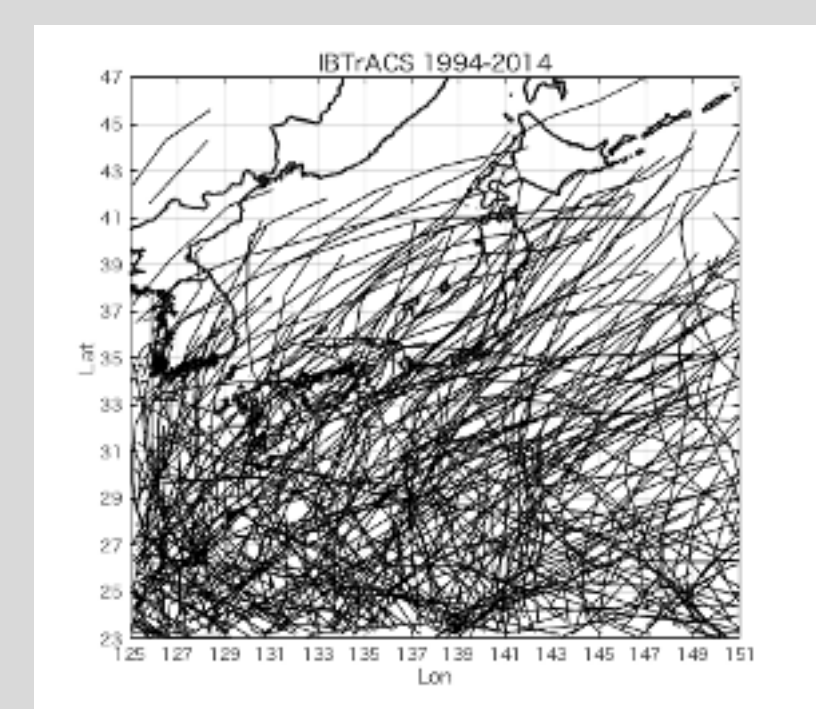
- ✓ Track data merged from many agencies
- ✓ Indicates storm center location

Storm peak extraction

- ✓ 10m threshold for storm peak SWH
- ✓ 63 TCs during 1994-2014 (3 per year)
  - > STM data peak per storm
  - > ASD data per storm per location



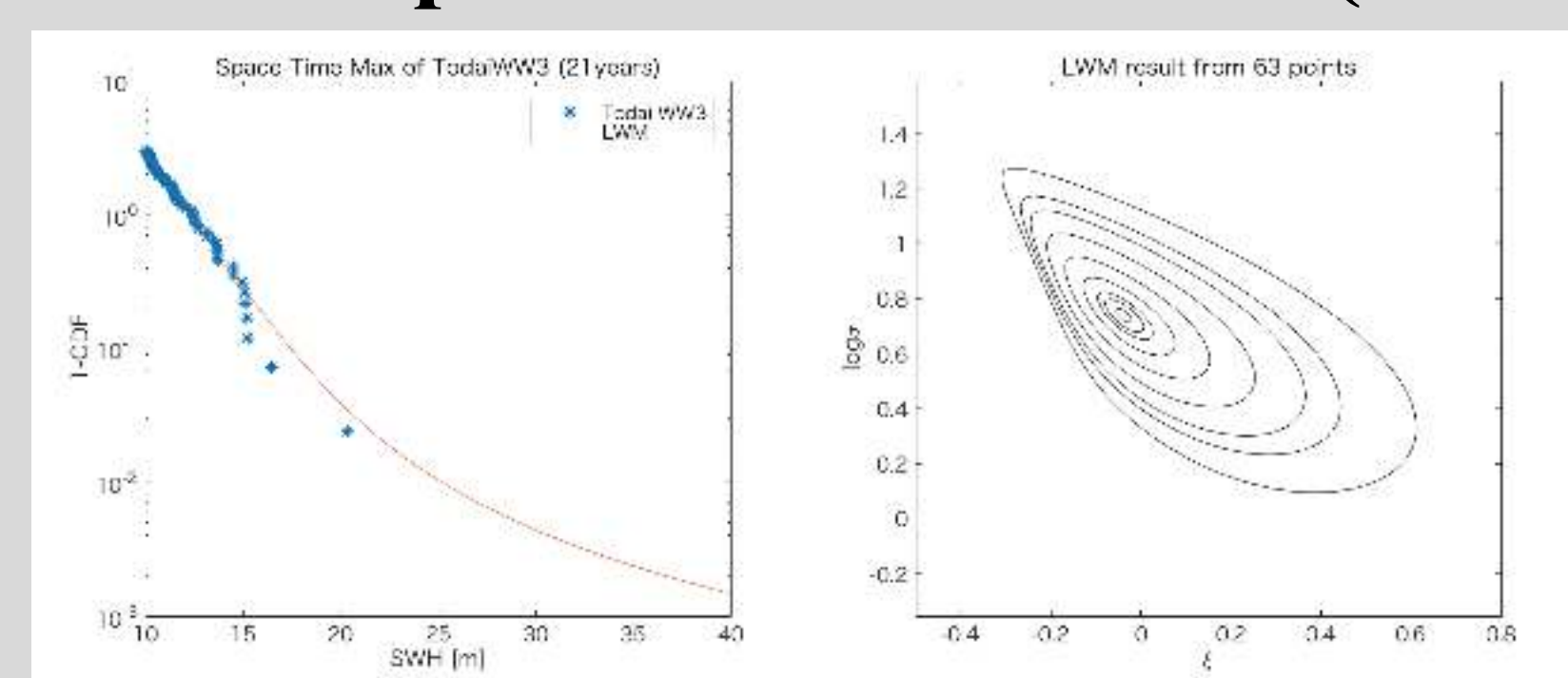
Todai WW3 (region J02)



TC tracks during 1994-2014 (IBTrACS)

### Results

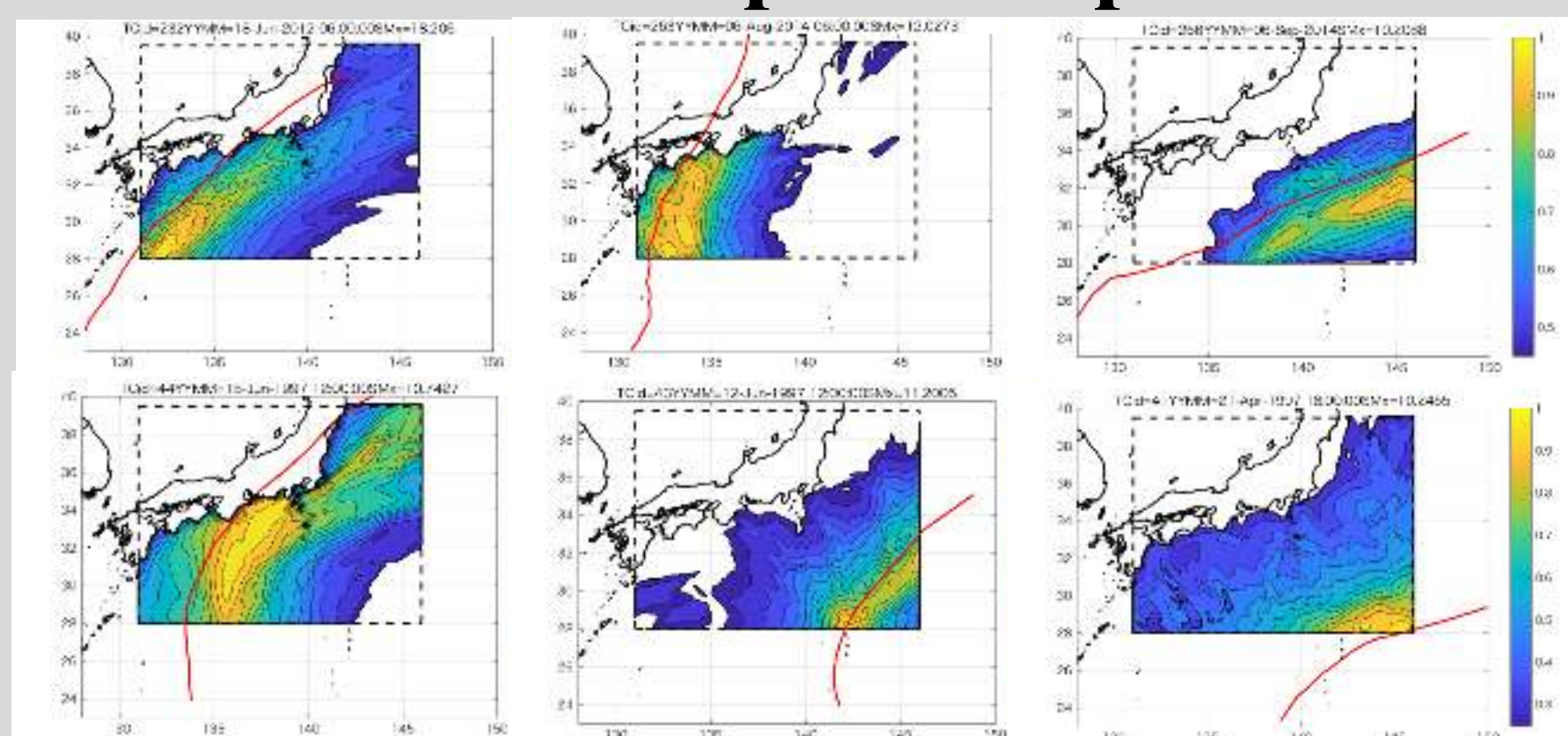
#### CDF of space-time maximum (STM)



#### Extreme of STM

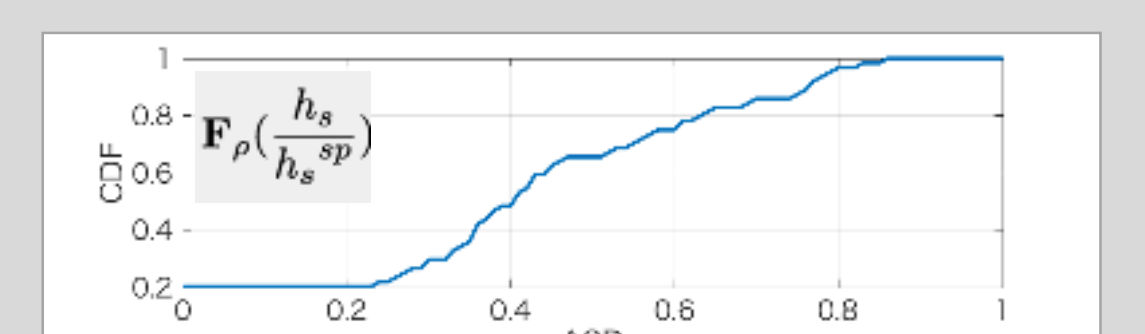
- 100 yr RP is around 33m
- Shape param. is  $\xi = -0.02$  at maximum likelihood
- Still has large uncertainty from 63 TCs

#### CDF of absolute spatial dependence



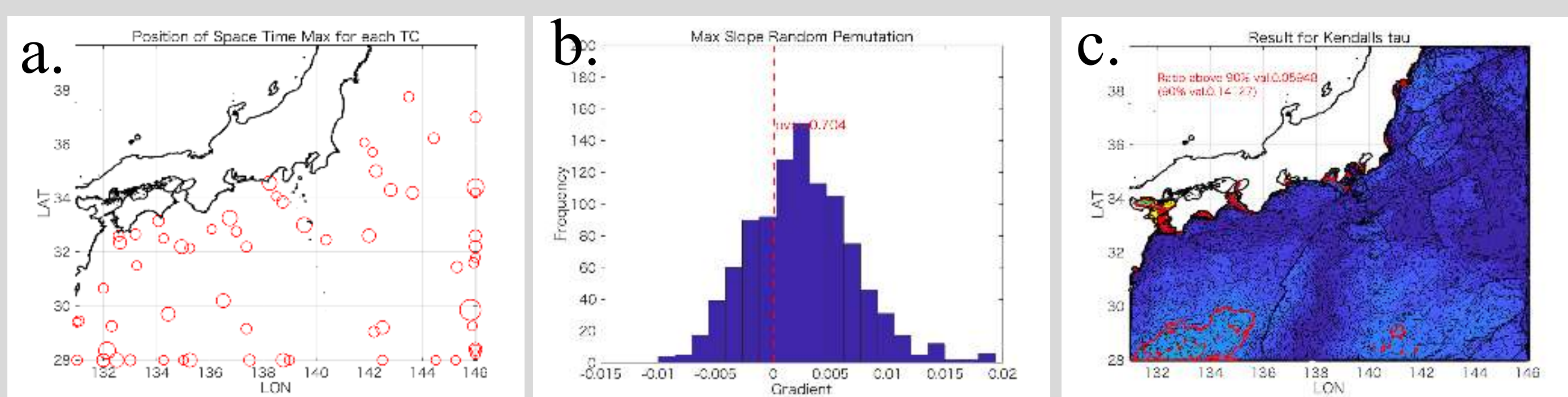
#### Typical storm track

- Moves towards North East
- Waves are larger on the right of storm track due to stronger wind forcing

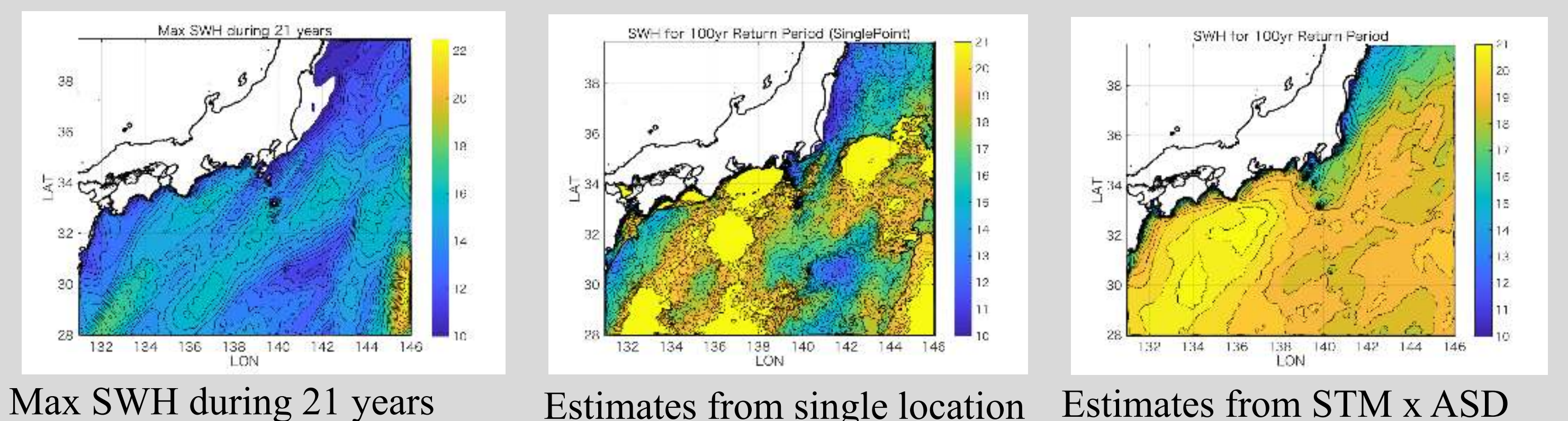


## Justification of modelling assumptions

- Location and magnitude of STM value
- Random permutation result for spatial linear trend for STM
- Kendall's rank test for exchangeability for STM and ASD

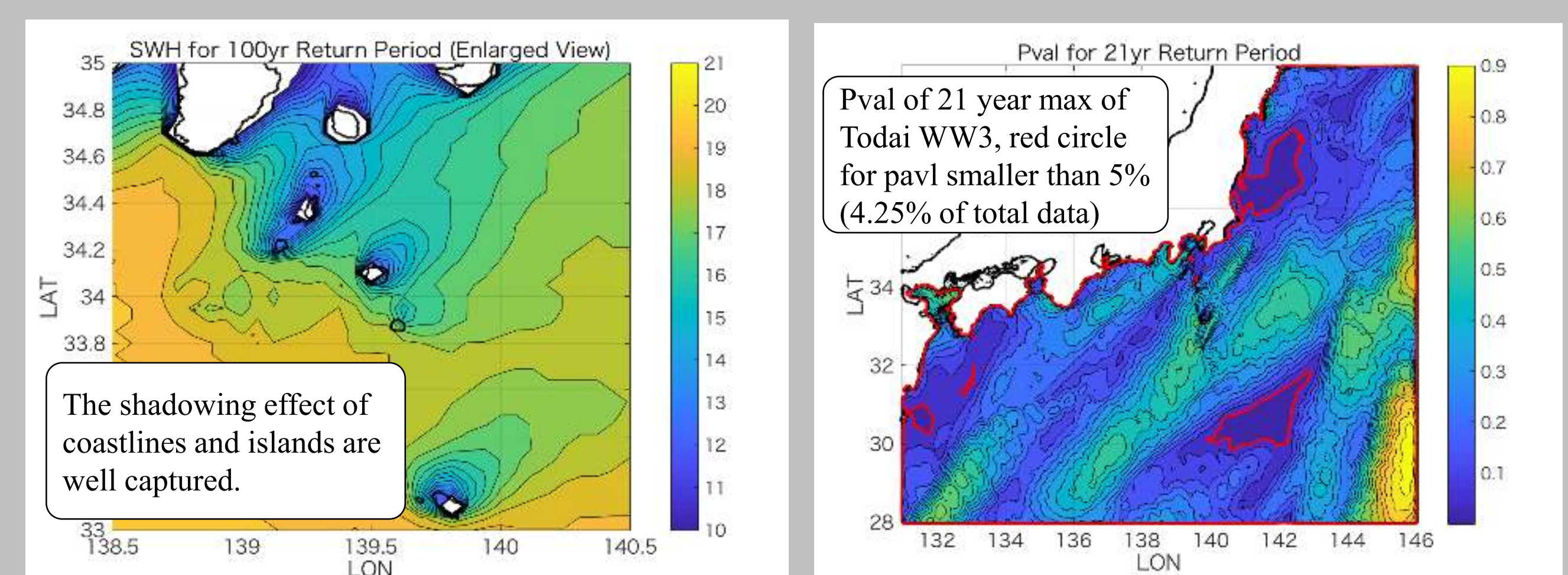


## Comparison: Single point estimation vs spatial inference



## Discussion

- Novel approach to estimation of return values for SWH in TC regions.
- Key assumptions, consistent with data for the current application, are that STM is spatially stationary, and that STM and ASD are independent.
- Improved description compared with location-by-location analysis, reflecting e.g. land-shadow effects clearly.
- Further applications currently under way, and article in preparation.



Reference. [1] Wada, R., Waseda, T., & Jonathan, P. (2016). Extreme value estimation using the likelihood-weighted method. *Ocean Engineering*, 124, 241-251. [2] Webb, A., Waseda, T., & Kiyomatsu, K. (2016, February). A 20-Year High-Resolution Wave Resource Assessment of Japan with Wave-Current Interactions. In *AGU Fall Meeting Abstracts*. [3] Knapp, K. R., Kruk, M. C., Levinson, D. H., Diamond, H. J., & Neumann, C. J. (2010). The international best track archive for climate stewardship (IBTrACS) unifying tropical cyclone data. *Bulletin of the American Meteorological Society*, 91(3), 363-376.