

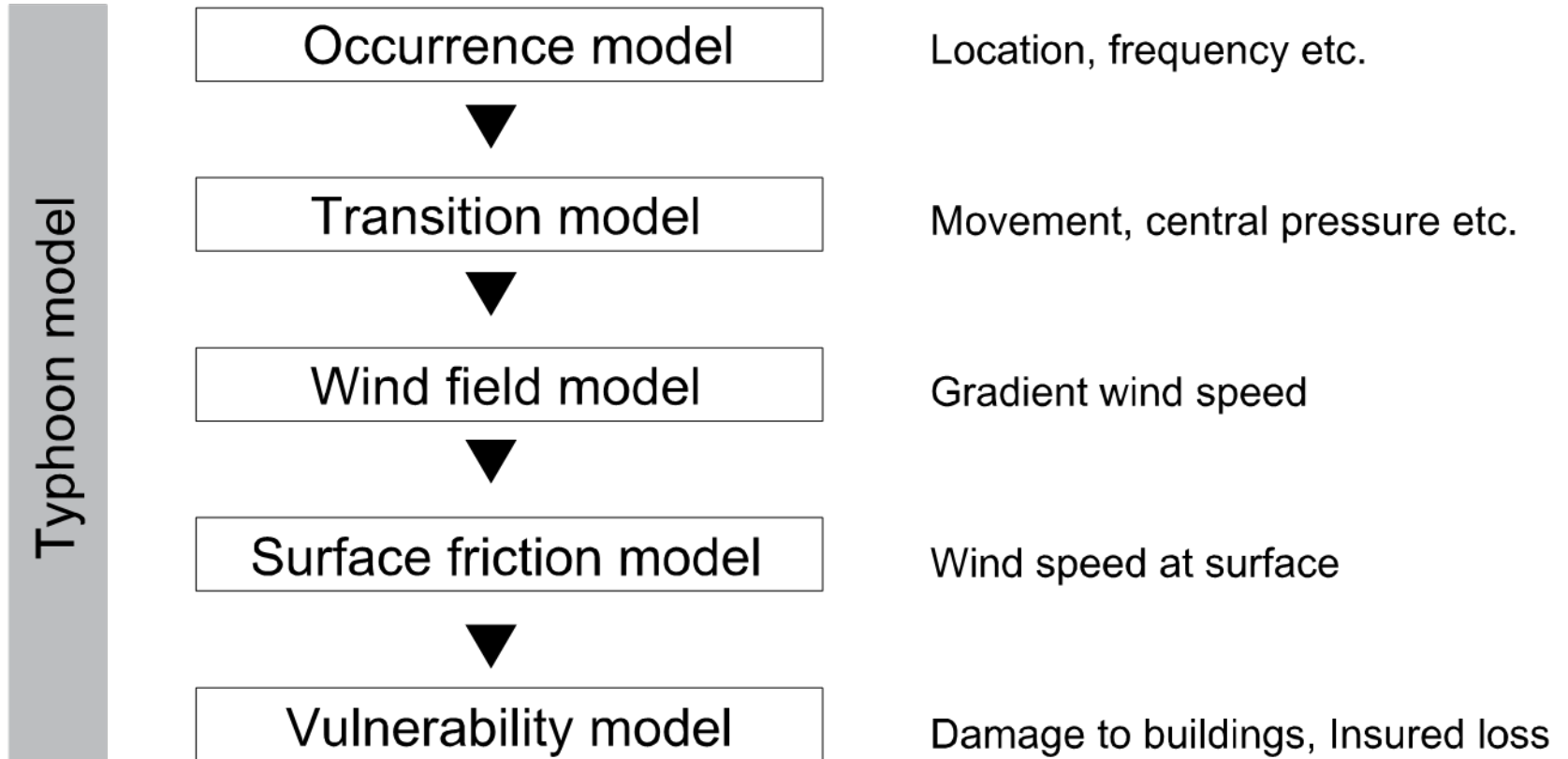
# Typhoon risk modeling for north west pacific

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# Typhoon model

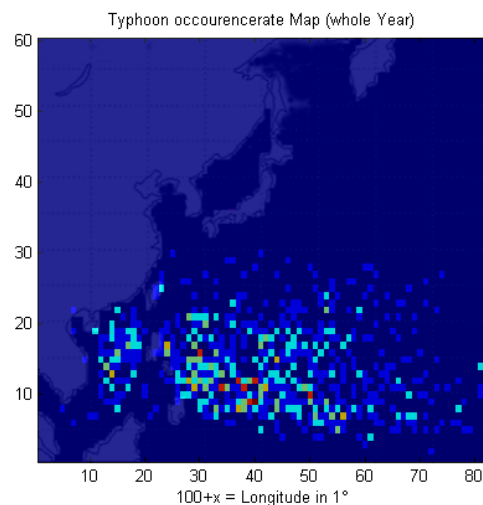
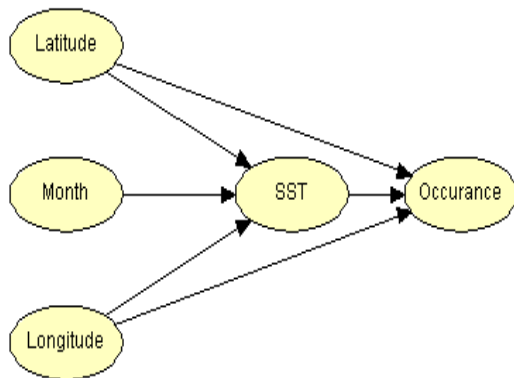
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# Occurrence model

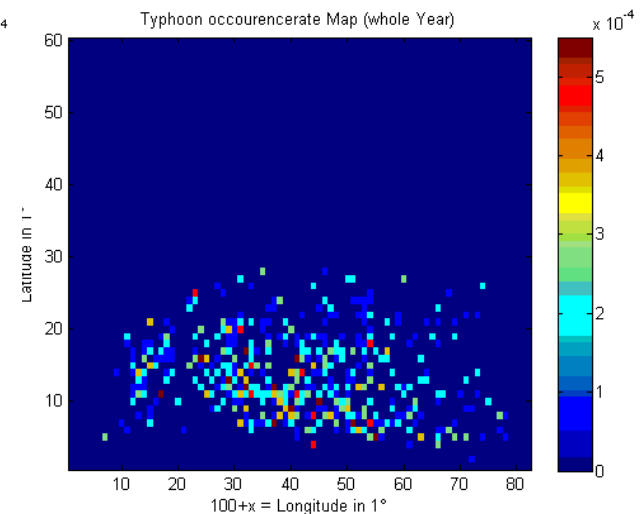
- Number and locations of occurrence

$$p(\text{occurrence} \mid \text{SST}, \text{Latitude}, \text{Longitude})$$



Structure of Bayesian network which represents occurrence model.

Spatial distribution of historical typhoon occurrences.



Spatial distribution of typhoon occurrences using the model.

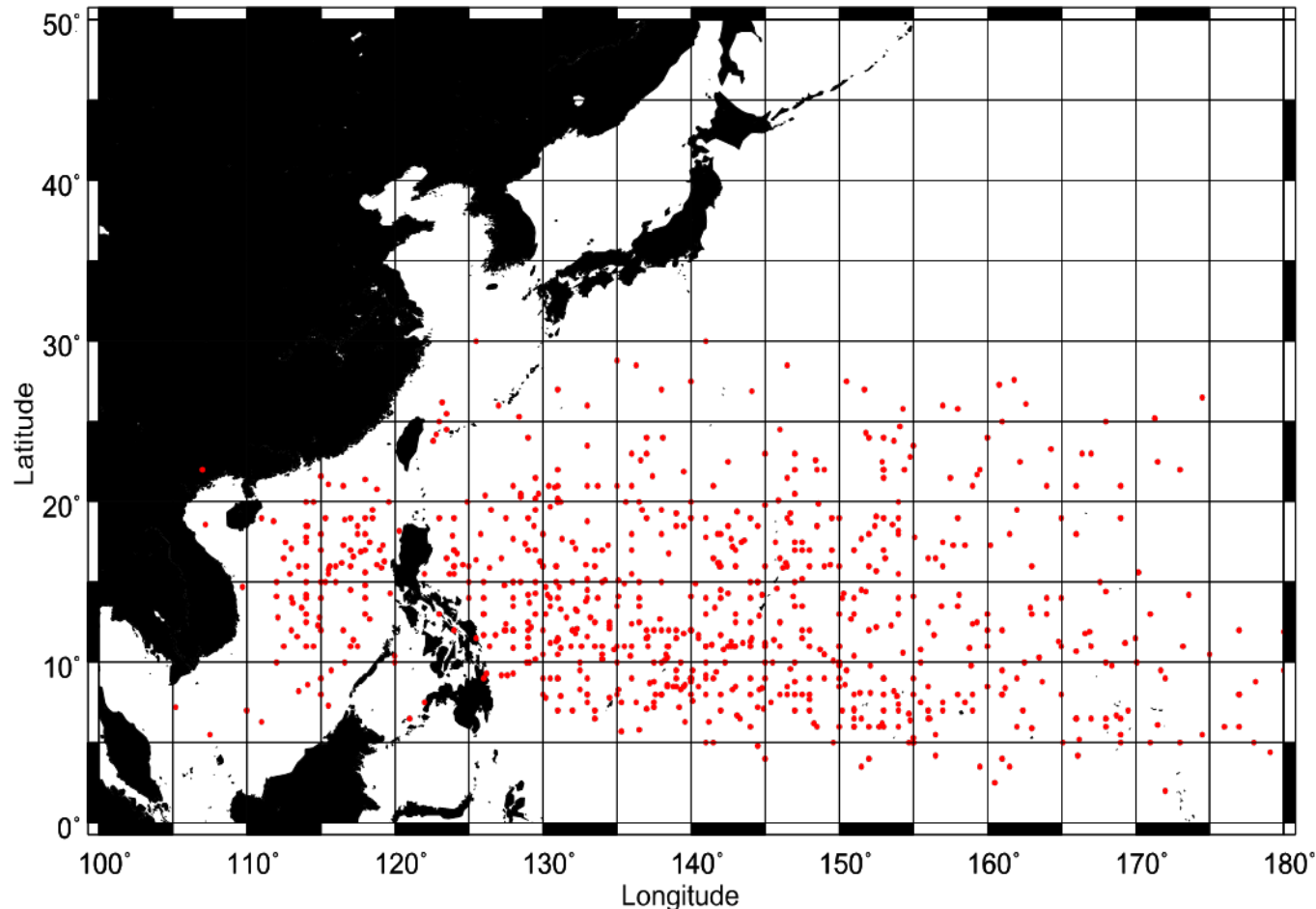
- Initial parameters:

Translation speed and angle, central pressure

# Occurrence model

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- Historical occurrence locations  
(Defined when the central pressure of a storm goes first time below 1000hPa)



## Transition model

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Estimation of the position of the typhoon at time step  $i+1$  :

$$\Delta \ln V_i = a_1 + a_2 \ln V_i + a_3 \Phi_i + \varepsilon_V$$

$$\Delta \Phi_i = b_1 + b_2 V_i + b_3 \Phi_i + b_4 \Phi_{i-1} + \varepsilon_\Phi$$

$V_i$  = translation speed [ $m / s$ ] at time step  $i$

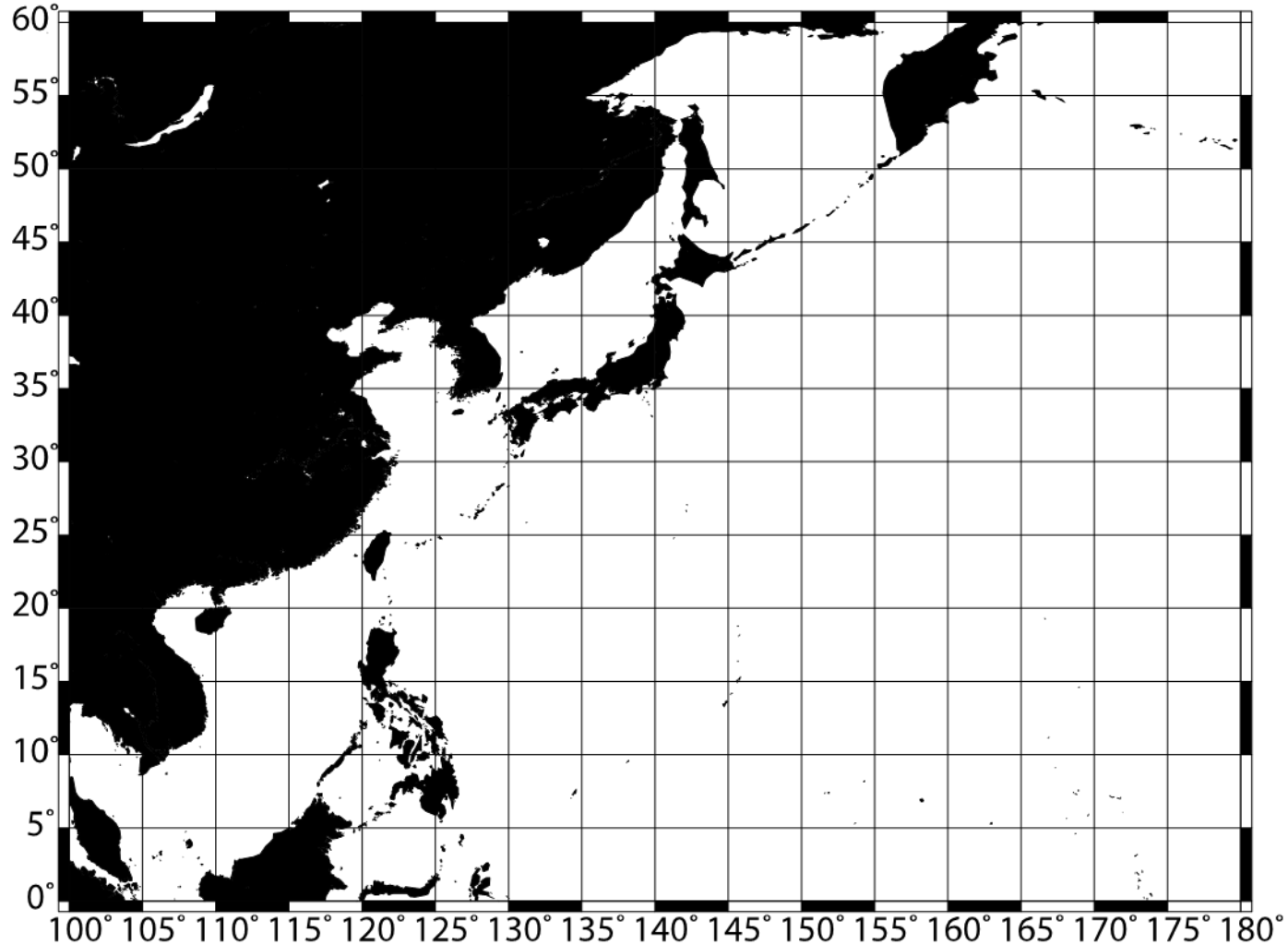
$\Phi_i$  = translation angle [ $^\circ$ ] at time step  $i$

Best track data was used to establish for each month and for each  $5^\circ$  by  $5^\circ$  grid the coefficients

# Transition model

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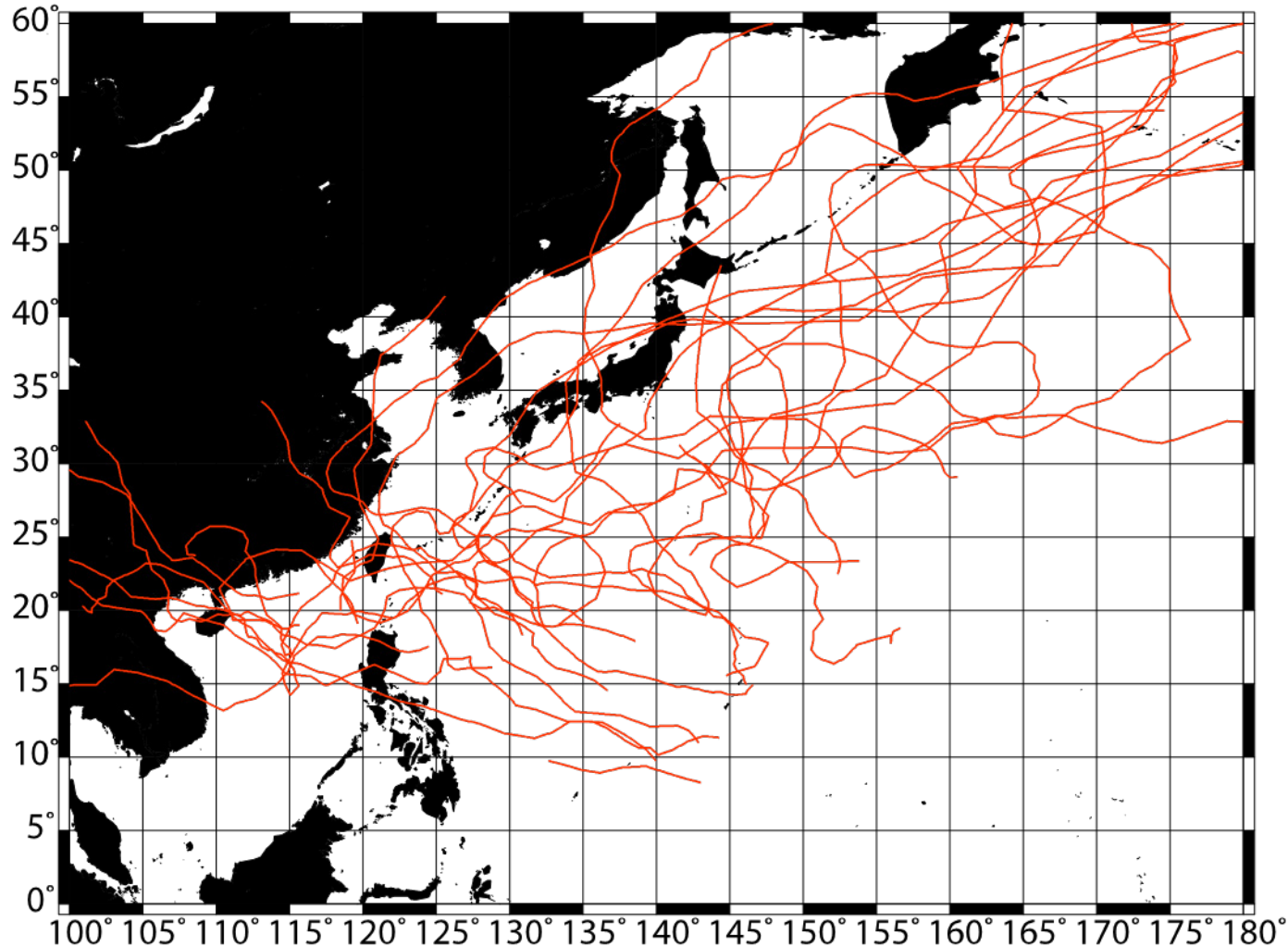
## Map of the north west pacific



# Transition model

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Map of the north west pacific with 30 tracks (August)



## **Transition model (Pressure)**

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The central pressure at time step  $i+1$  is estimated from:

At sea:

$$P_{i+1} = c_1 + c_2 P_i + c_3 P_{i-1} + c_4 P_{i-2} + c_5 T_i + c_6 \Delta T_i + \varepsilon_P$$

$P_i$  = Central pressure [ $hPa$ ] at time step  $i$

$T_i$  = Sea surface temperature [ $^{\circ}$ ] at time step  $i$



## **Transition model (Pressure)**

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The central pressure at time step  $i+1$  is estimated from:

At land (filling model):

$$\Delta P_t = \Delta P_0 \cdot \exp\left(-\left(d_1 + d_2 \Delta P_0\right)t\right)$$

$\Delta P_t$  = Peripheral pressure (1013 hPa) - central pressure at time  $t$  [h] after landfall

$\Delta P_0$  = Peripheral pressure (1013 hPa) - central pressure at landfall

# Wind field model

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Pressure field (Schloemer):

$$p(r) = p_C + \Delta p \cdot \exp\left(-\frac{r_M}{r}\right)$$

$r_M$  = Radius of maximum wind speed

$r$  = Distance

$p(r)$  = Pressure at distance  $r$

$p_C$  = Central pressure

$\Delta p$  = Peripheral pressure (1013 hPa) - central pressure

# Wind field model

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Wind field:

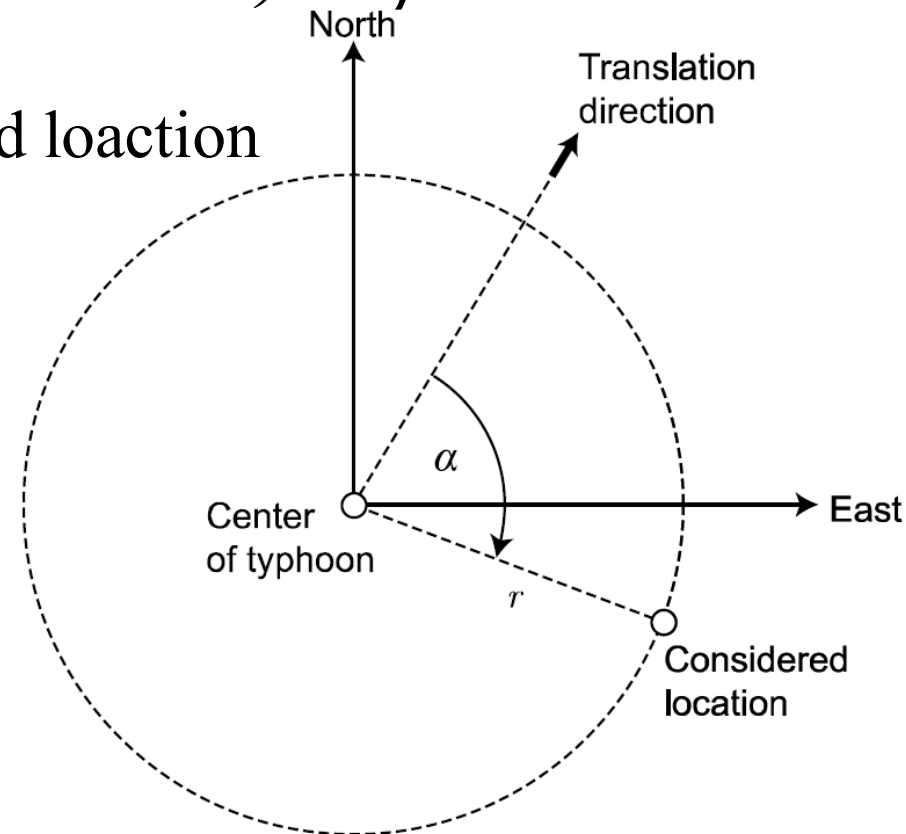
$$\tilde{u}(r, \alpha) = \frac{V \sin \alpha - fr}{2} + \sqrt{\left(\frac{V \sin \alpha - fr}{2}\right)^2 + \frac{r}{\rho} \frac{\partial p(r)}{\partial r}}$$

$\tilde{u}(r, \alpha)$  = Wind speed at considered location

$V$  = Translation speed

$f$  = Coriolis parameter

$\rho$  = Air density

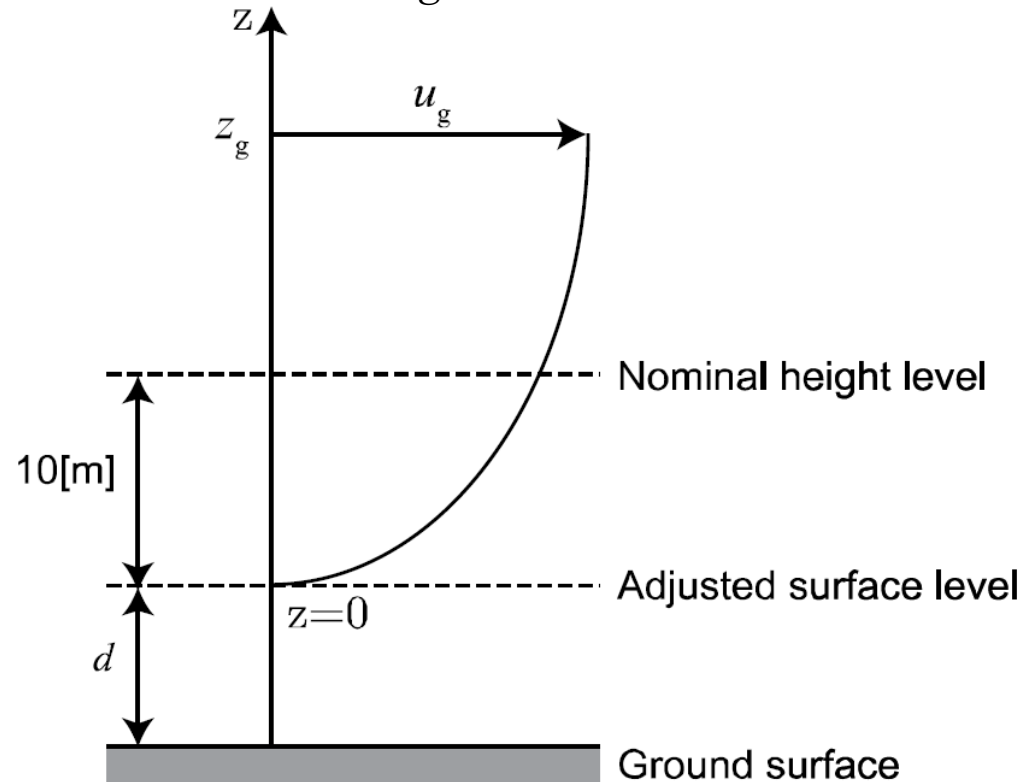


# Surface friction model

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Converting wind speed at gradient  $u_g$  height to wind speed at surface  $u(z)$

$$u(z) = u_g \left( \frac{z}{z_g} \right)^\alpha$$



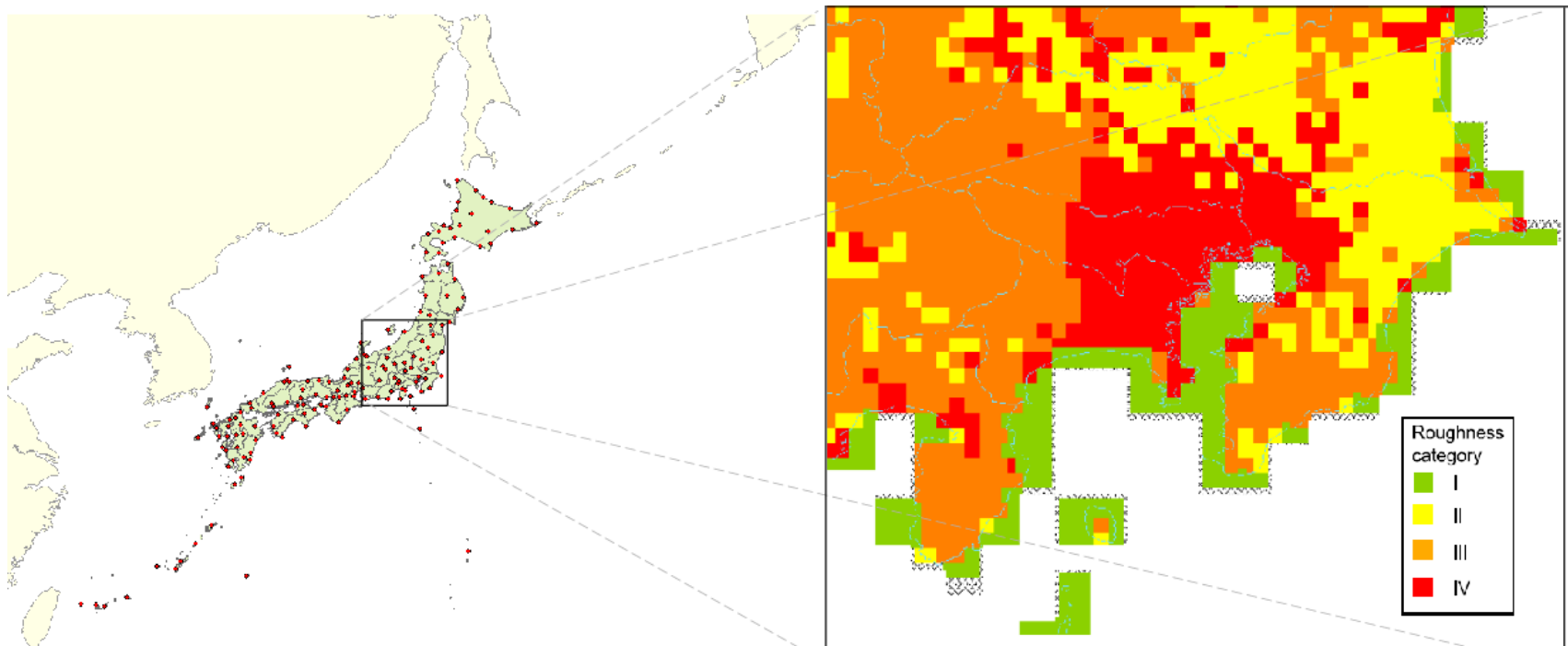
$$\alpha = 0.27 + 0.09 \log z_0 + 0.018 (\log z_0)^2 + 0.0016 (\log z_0)^3$$

$z_0$  = roughness length

# Surface friction model

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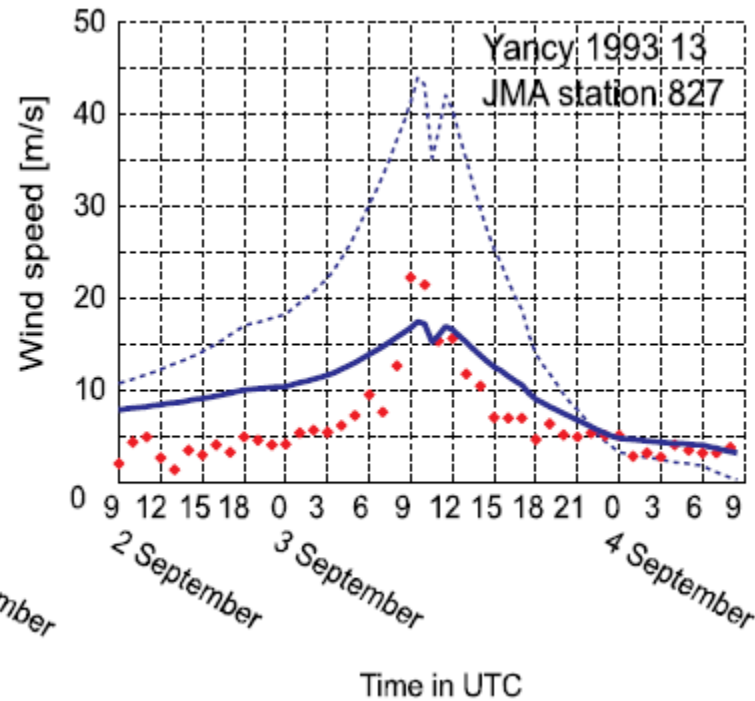
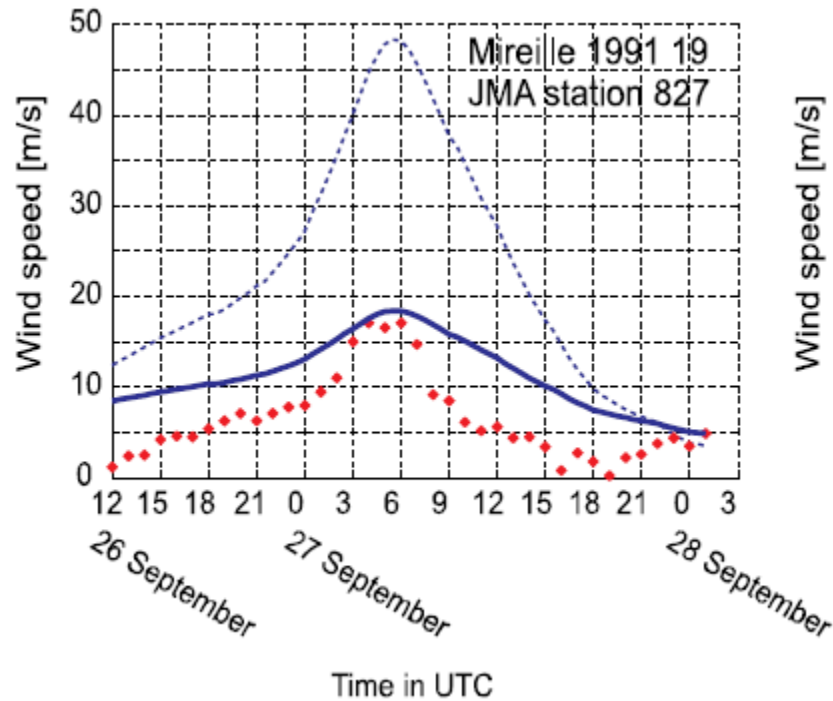
## Identification of the roughness length $z_0$



Roughness category	Terrain type	Roughness length [m]
I	Very flat terrain	0.003
II	Open terrain (grassland, few trees)	0.03
III	Suburban terrain (buildings, 3-5 [m])	0.3
IV	Dense urban (buildings, 10-30 [m])	3

# Surface friction model

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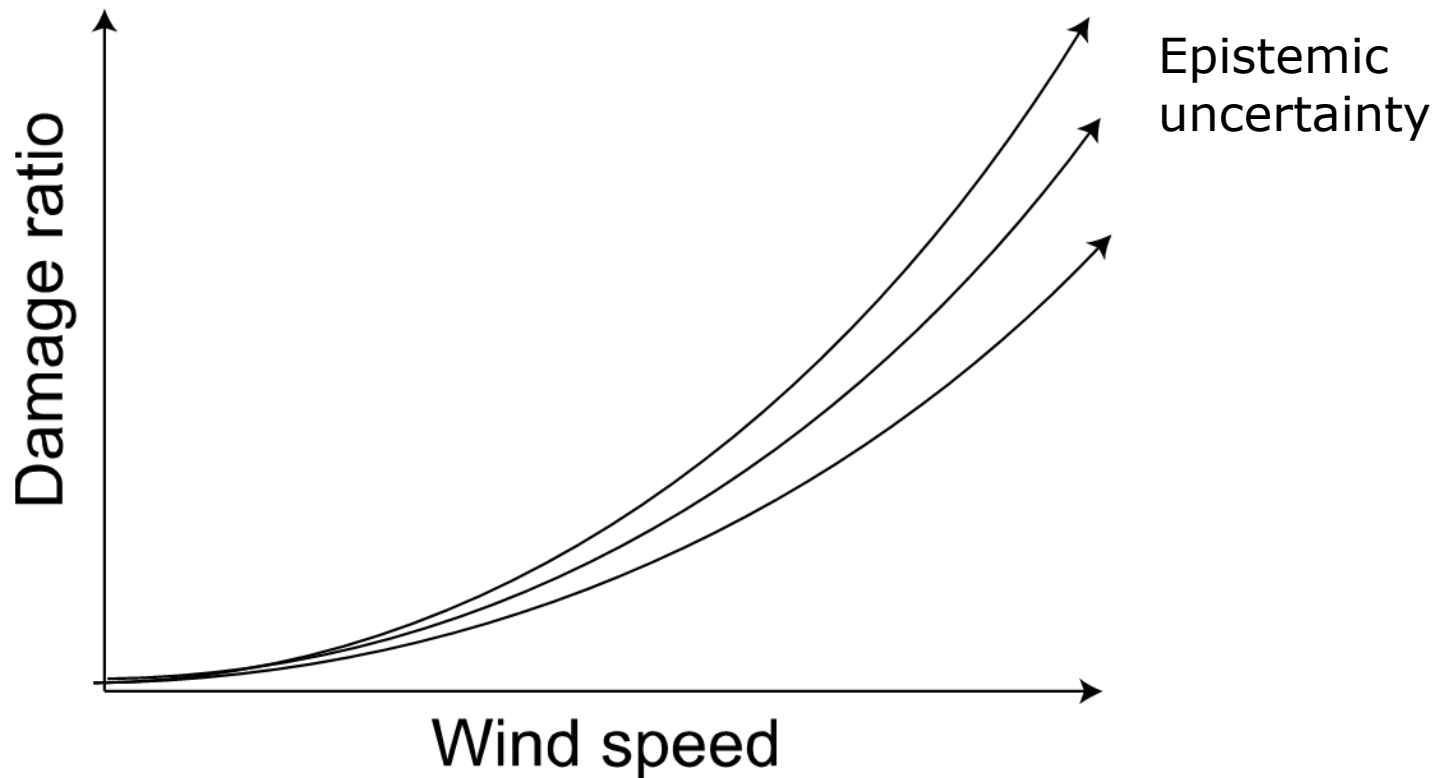
- Reproduced wind speeds at gradient height
- Reproduced wind speeds converted at the height of the location of the measurement device at each station
- ◆ Observed wind speeds

# Vulnerability model

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Relation between wind speed and damage

- Combining loss data from insurance companies with reproduced wind speed from historical data

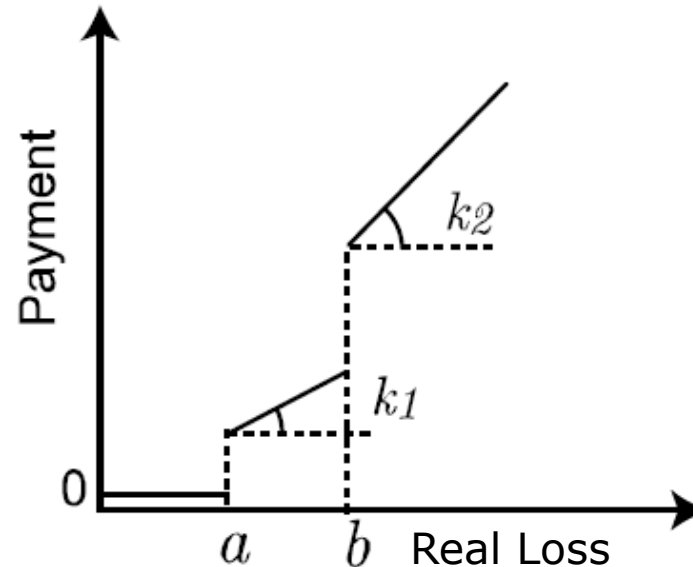
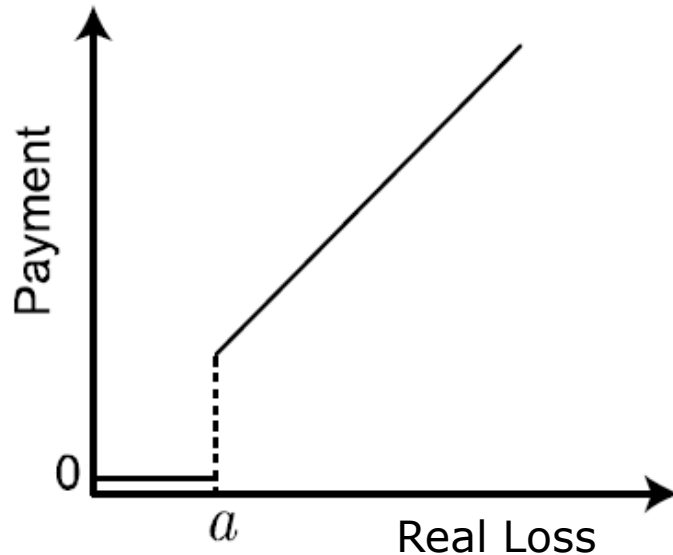


# Vulnerability model

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Risk assessment for portfolios losses

- Transform real loss to insurance payment





# **Application for portfolio risk assessment**

# Disaggregation of portfolios

