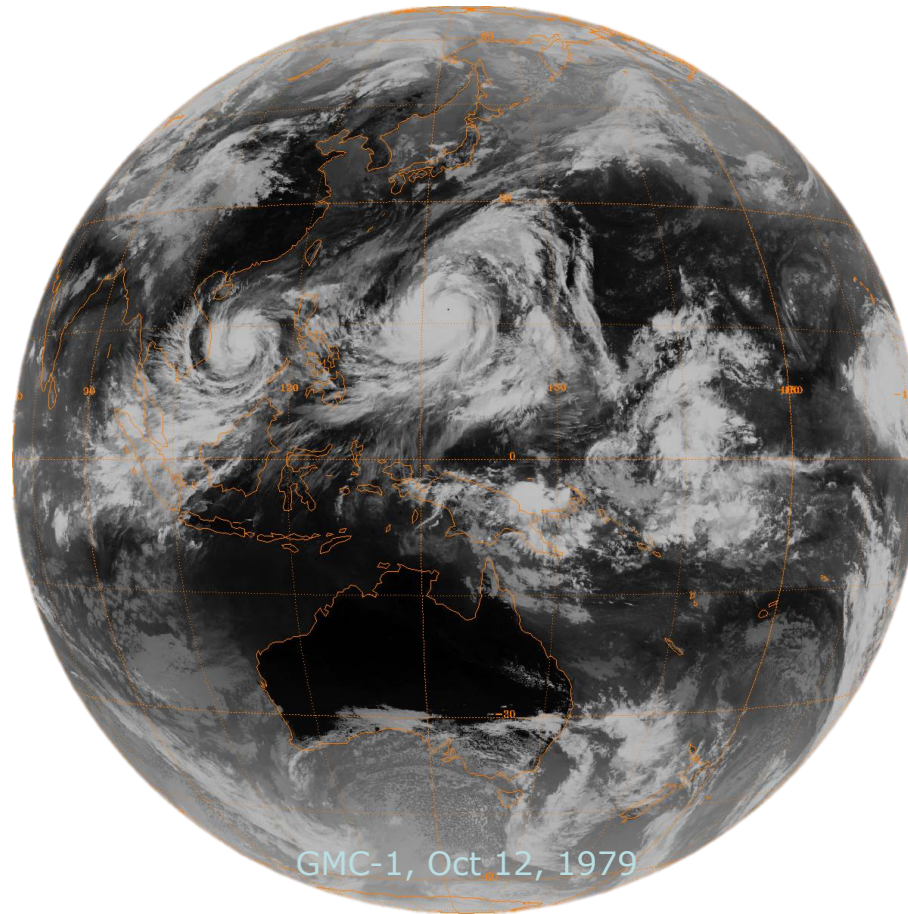


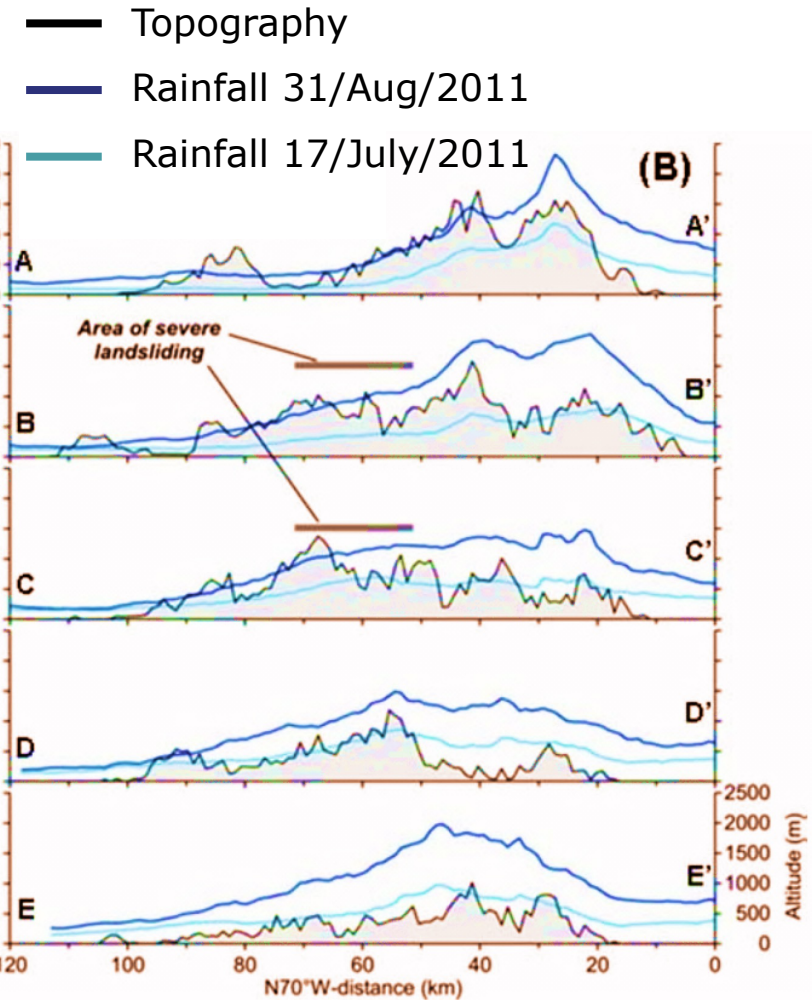
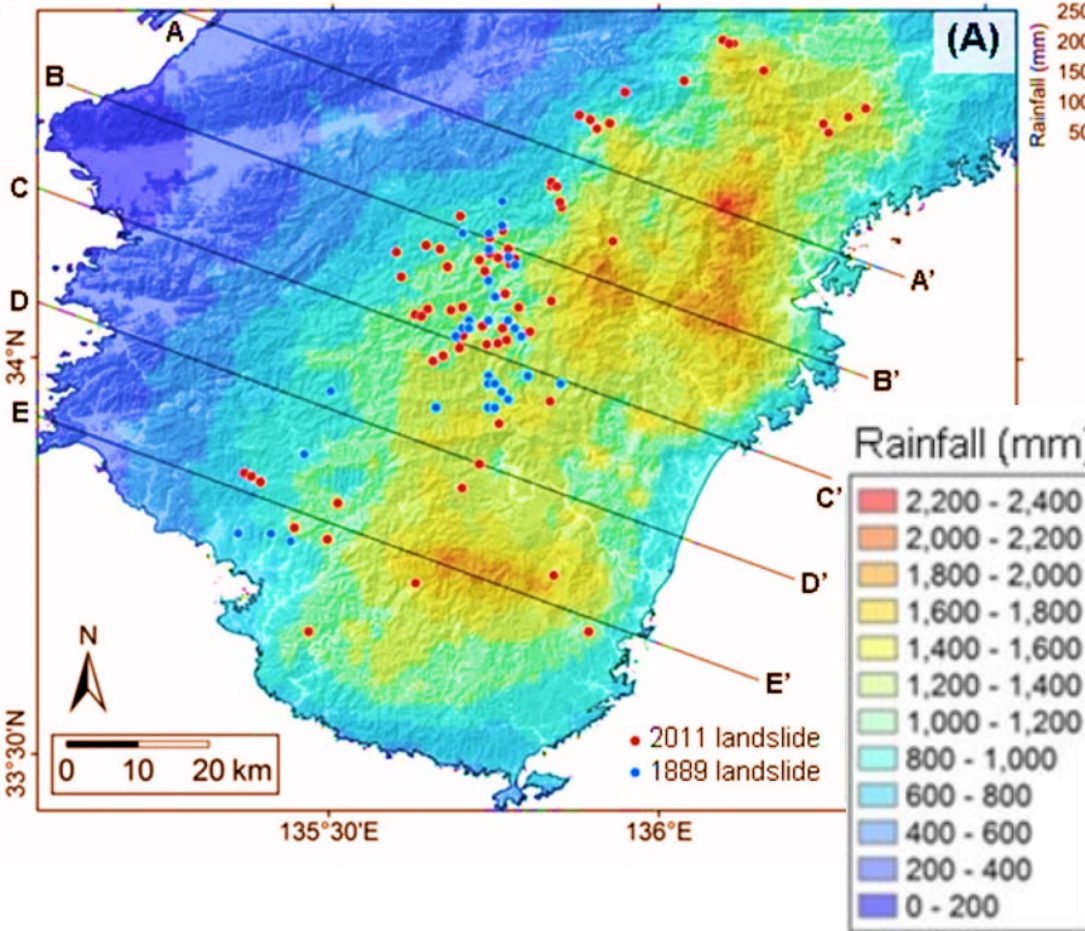
Tracking Tropical and Frontal Storms Driven Extreme Rainfalls over Japan Using Complex Networks



UGUR ÖZTÜRK

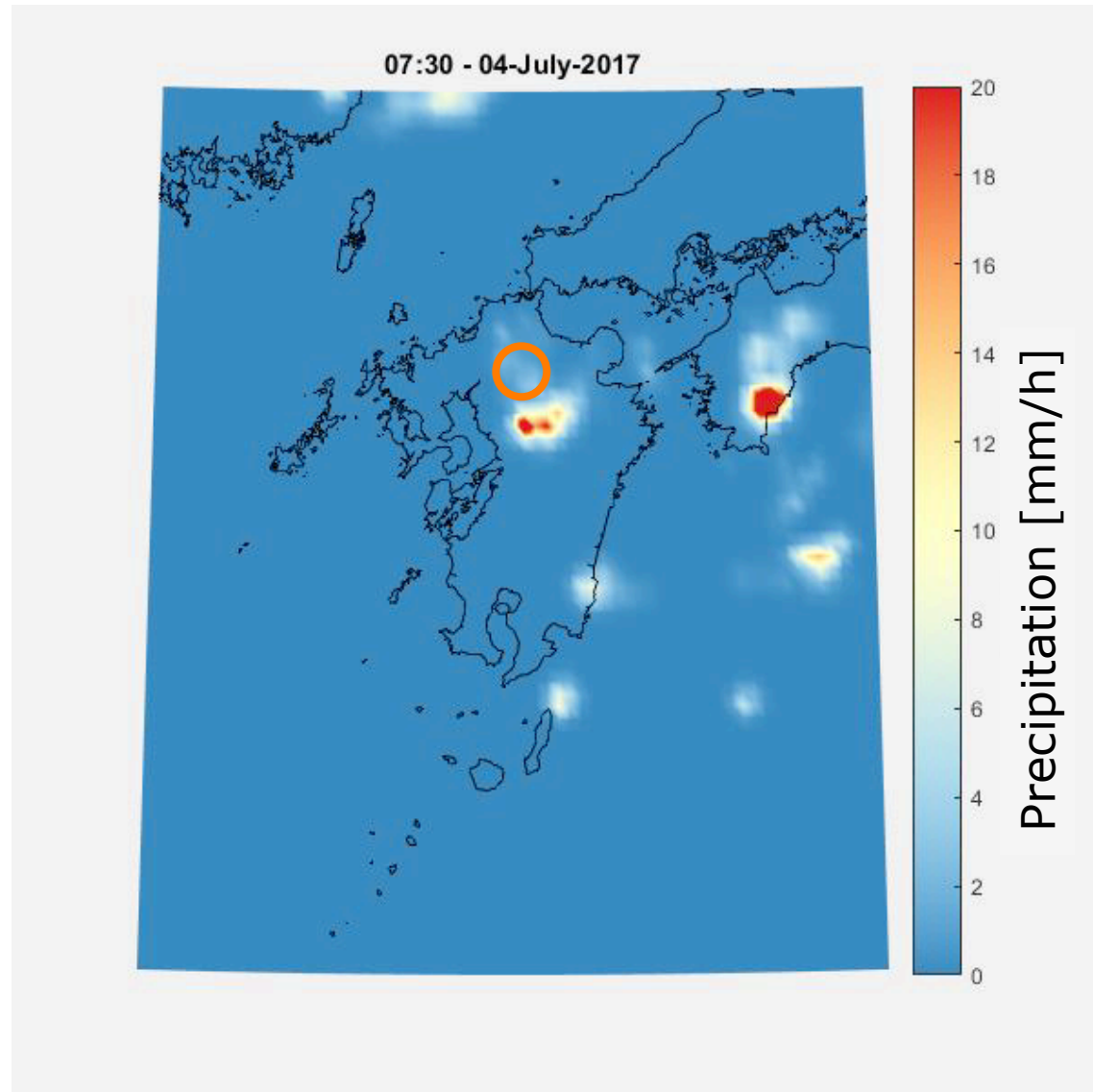
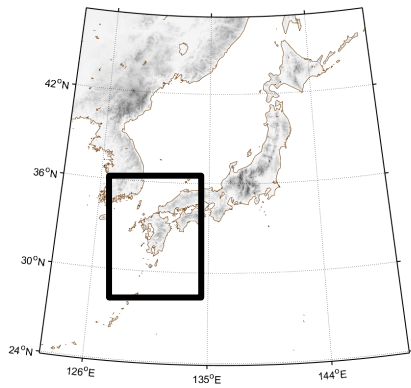
RAINFALL INDUCED LANDSLIDES

Kii peninsula, Central Japan

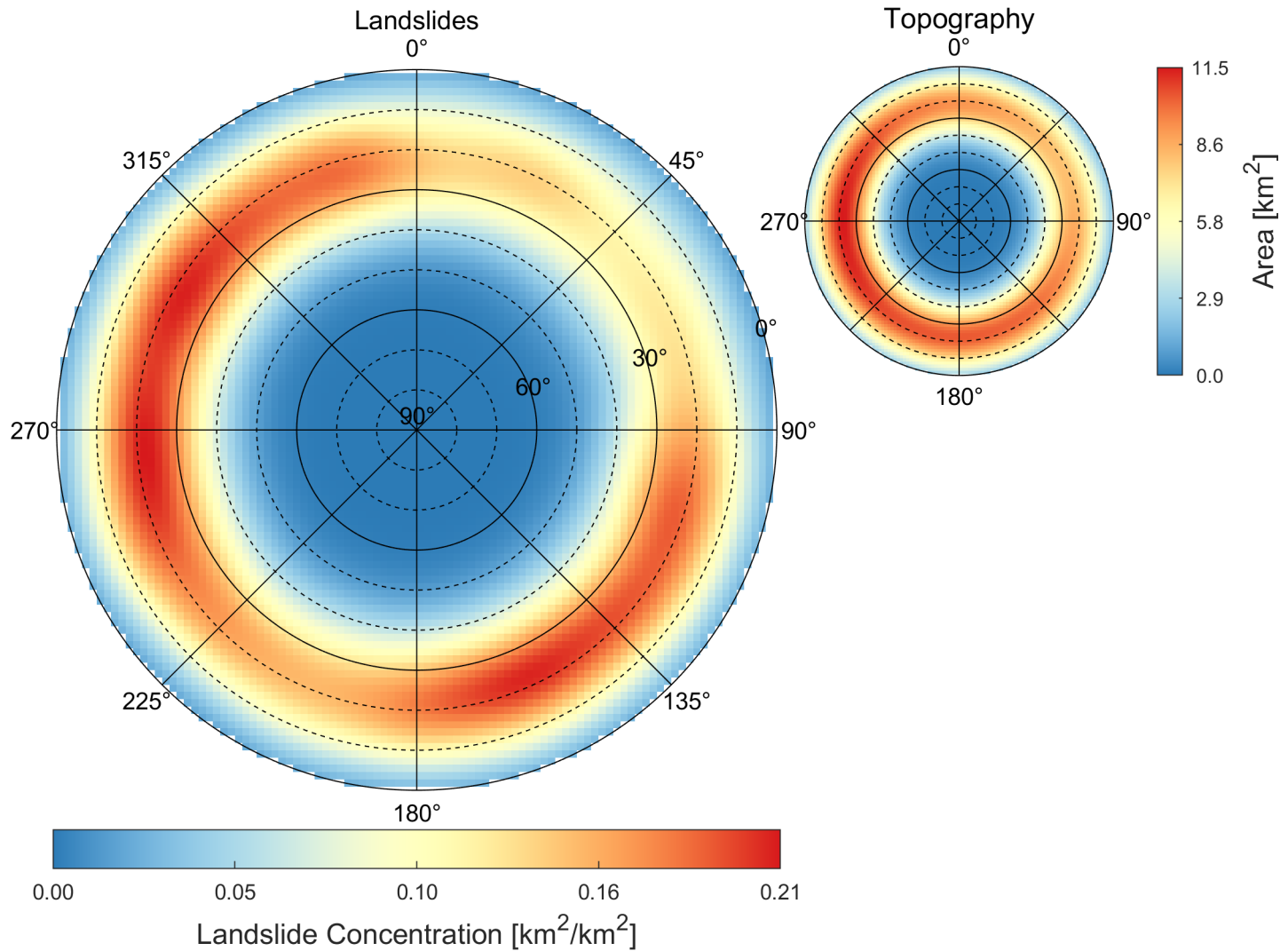


Matsushi et al., 2014

EXTREME RAINFALL (e.g. KYUSHU)



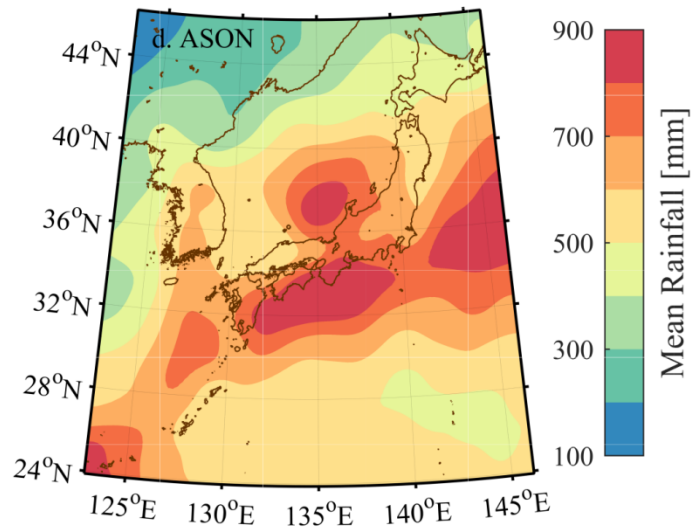
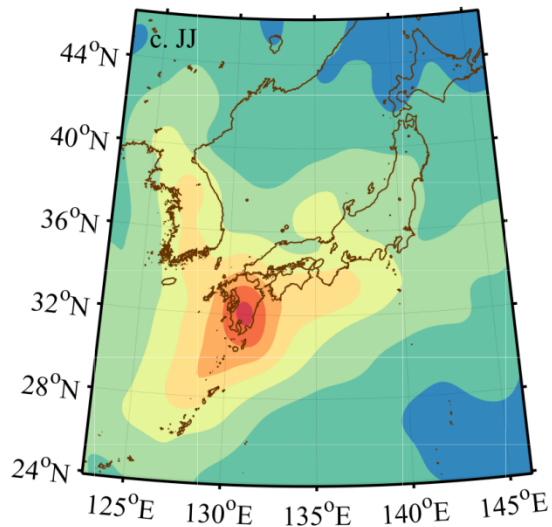
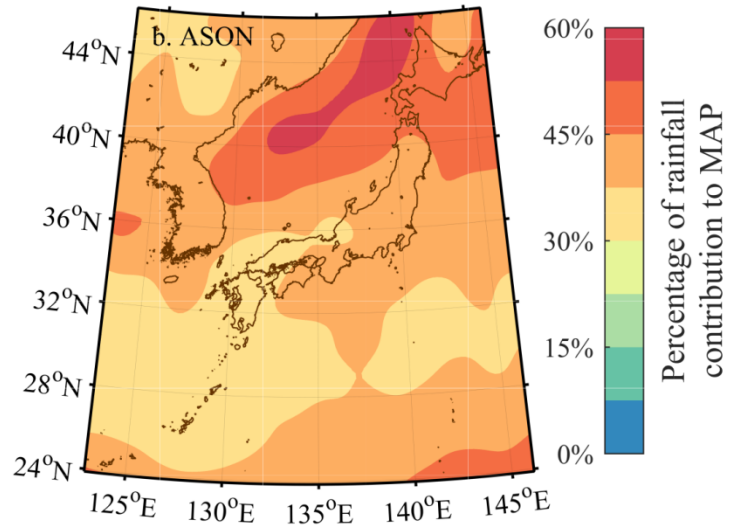
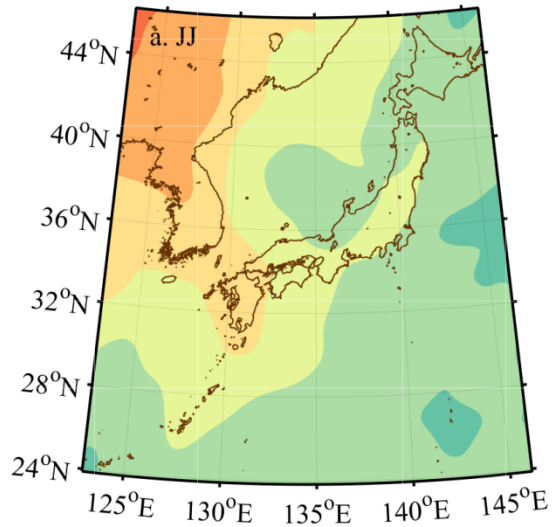
LANDSLIDES AWAY FROM THE STREAMS



DAILY TRMM DATA (1998-2015)

(Baiu Season) June – July

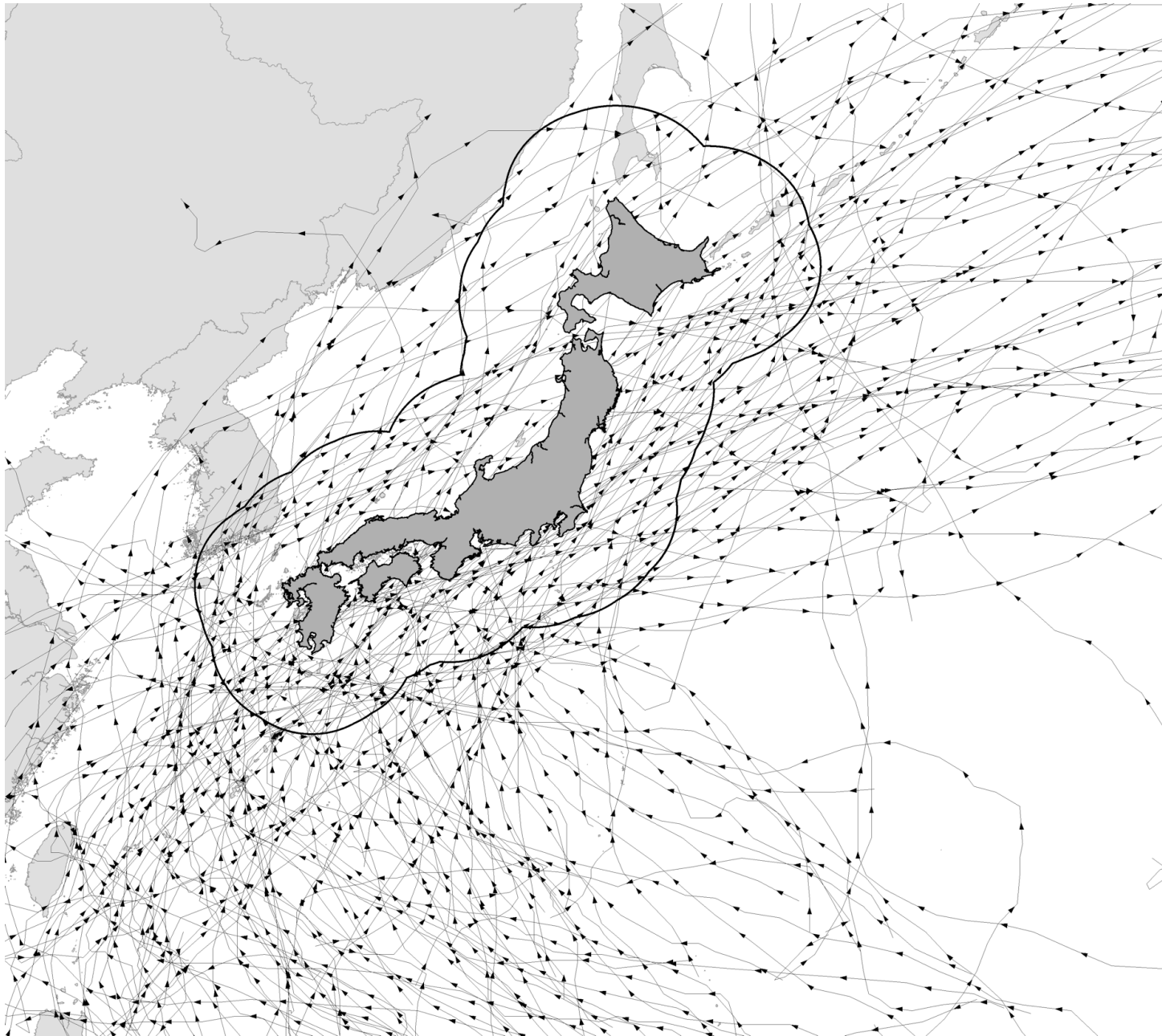
August – November (Typhoon Season)



Based on daily TRMM Data (1998-2015)

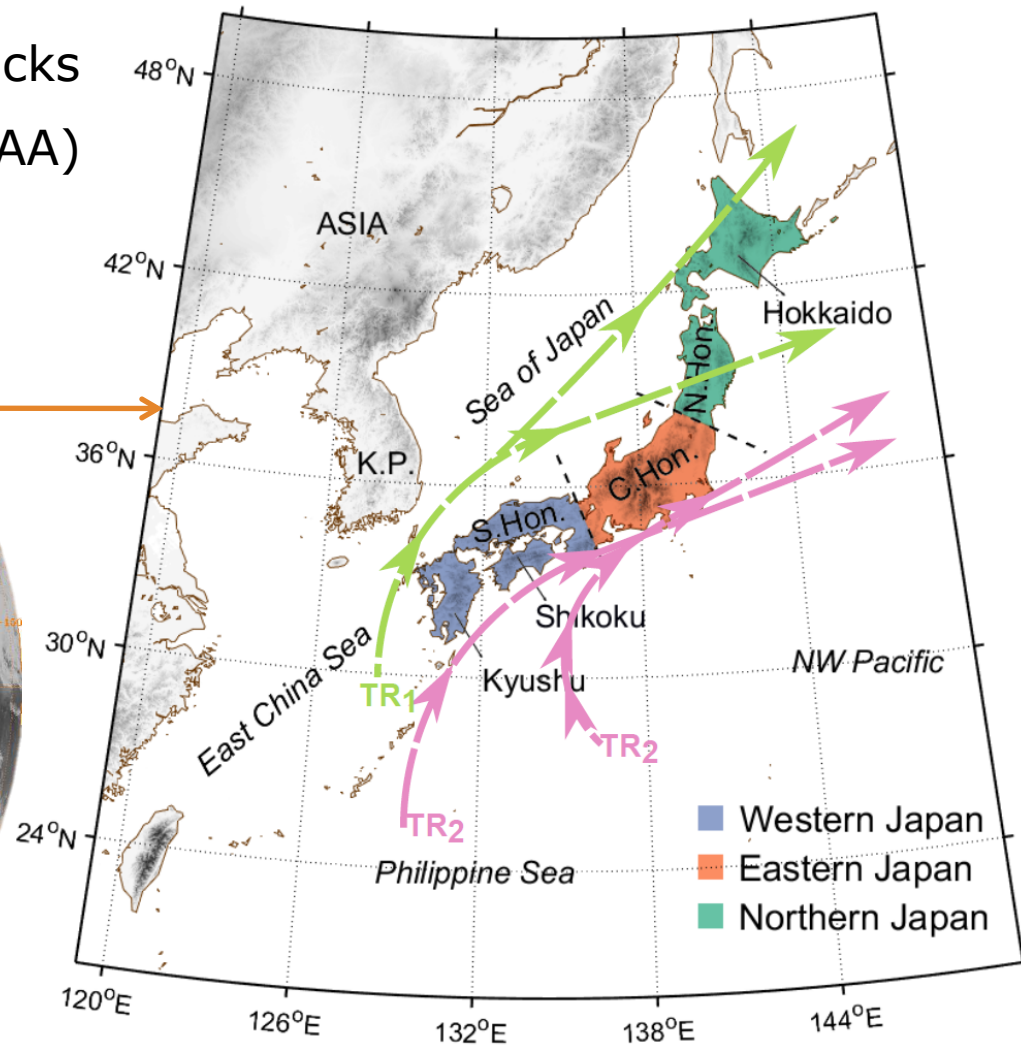
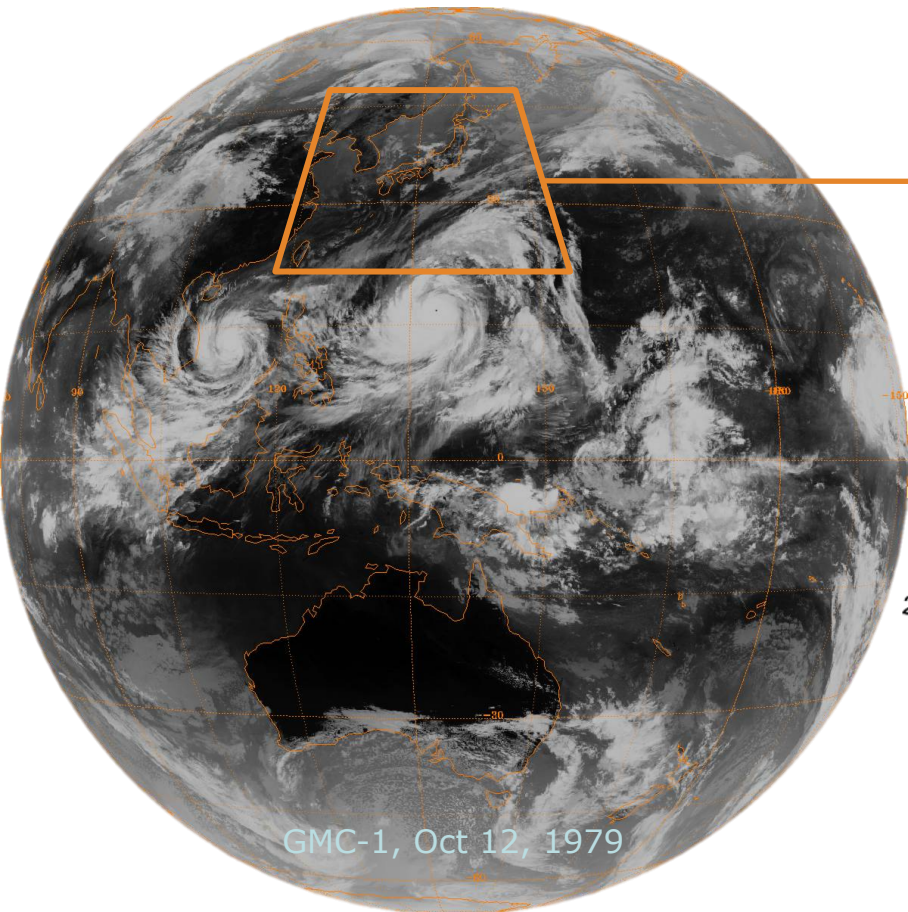
Ozturk et al., 2019, *Climate Dynamics*

TYPHOON TRACKS



TYPHOON SEASON

Generalized Typhoon Tracks
based on IBTrACS (NOAA)



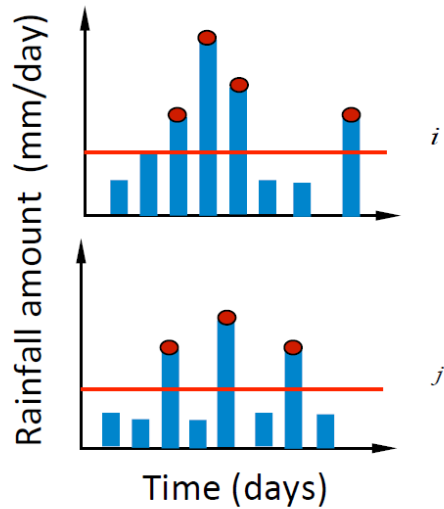
Ozturk et al., 2019, Climate Dynamics

EVENT SYNCHRONIZATION

Picking the Extremes

Compare events

Construct the network

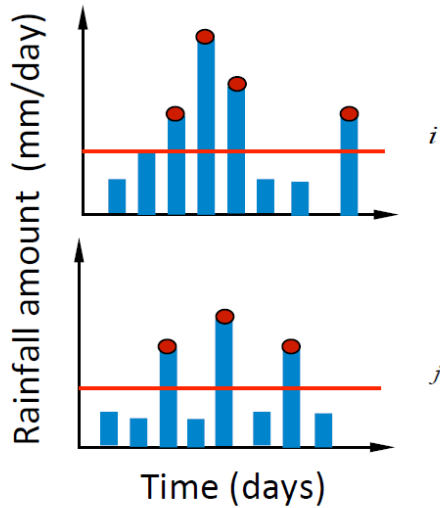


Quian Quiroga, 2002

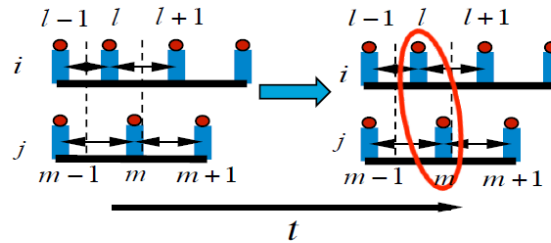
Malik et al., 2010

EVENT SYNCHRONIZATION

Picking the Extremes



Compare events



Construct the network

$$Q_{ij} = \frac{c(i|j) + c(j|i)}{\sqrt{(s_i - 2) \cdot (s_j - 2)}}$$

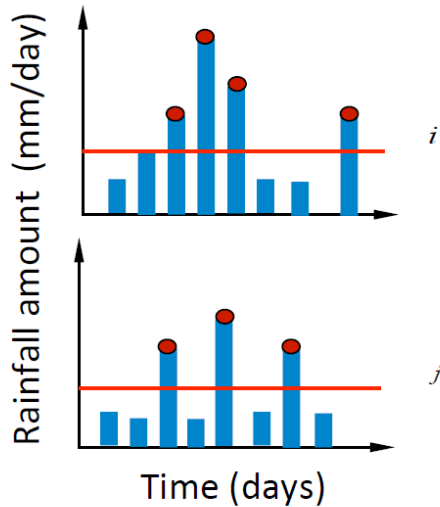
Quian Quiroga, 2002

Malik et al., 2010

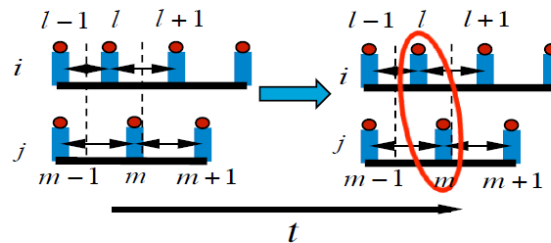
EVENT SYNCHRONIZATION

Network Construction (Stolbova, Pers. Comm., 2015)

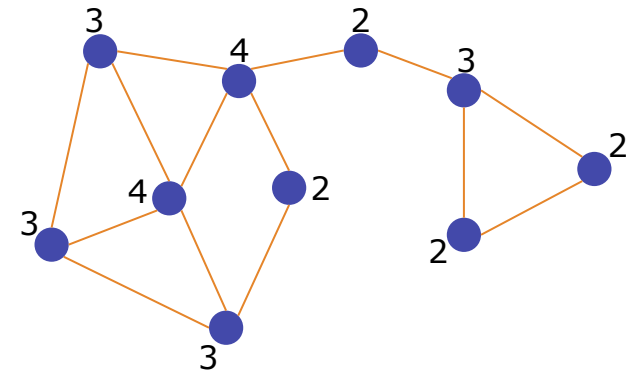
Picking the Extremes



Compare events



Construct the network



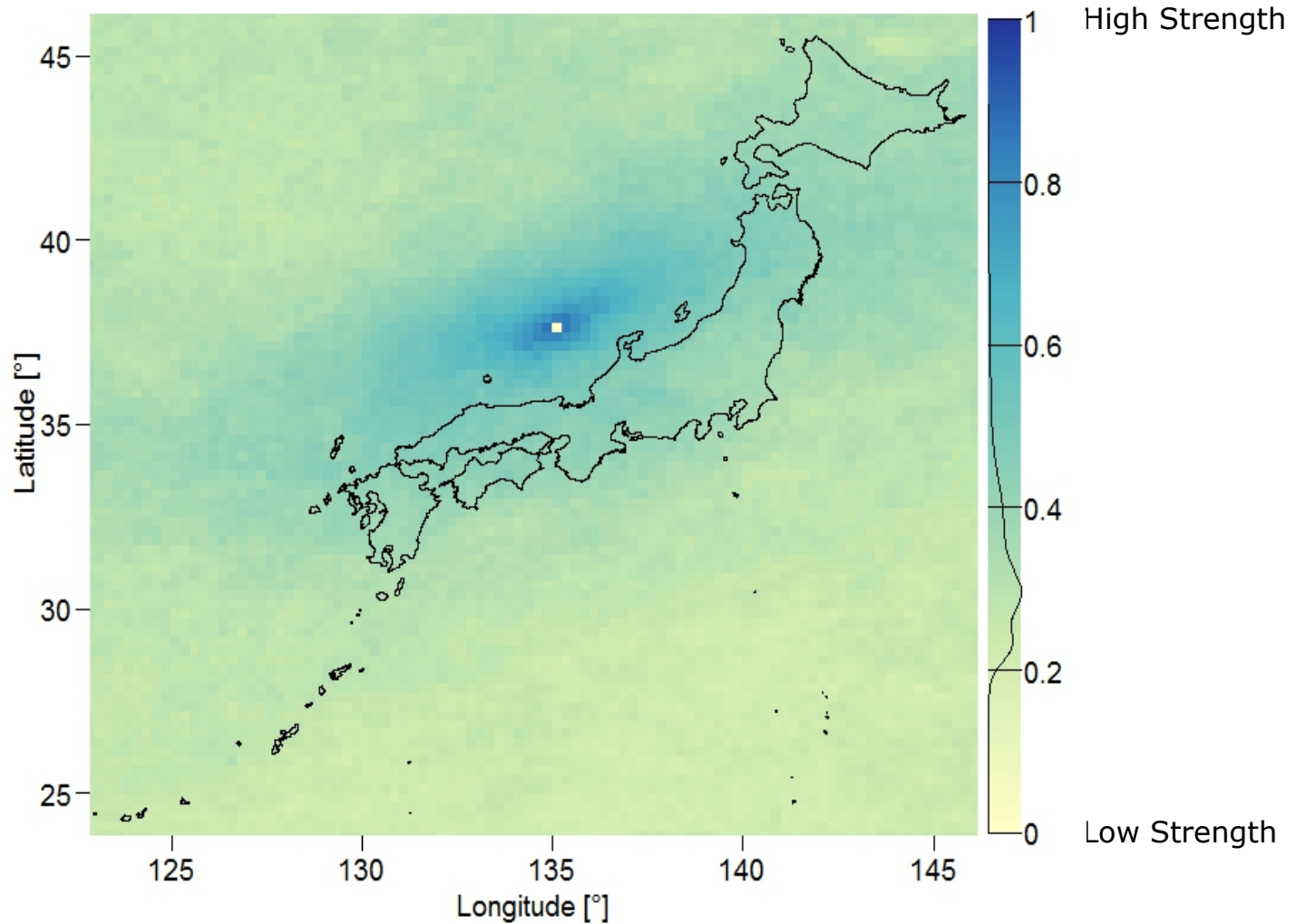
$$Q_{ij} = \frac{c(i|j) + c(j|i)}{\sqrt{(s_i - 2) \cdot (s_j - 2)}}$$

Quian Quiroga, 2002

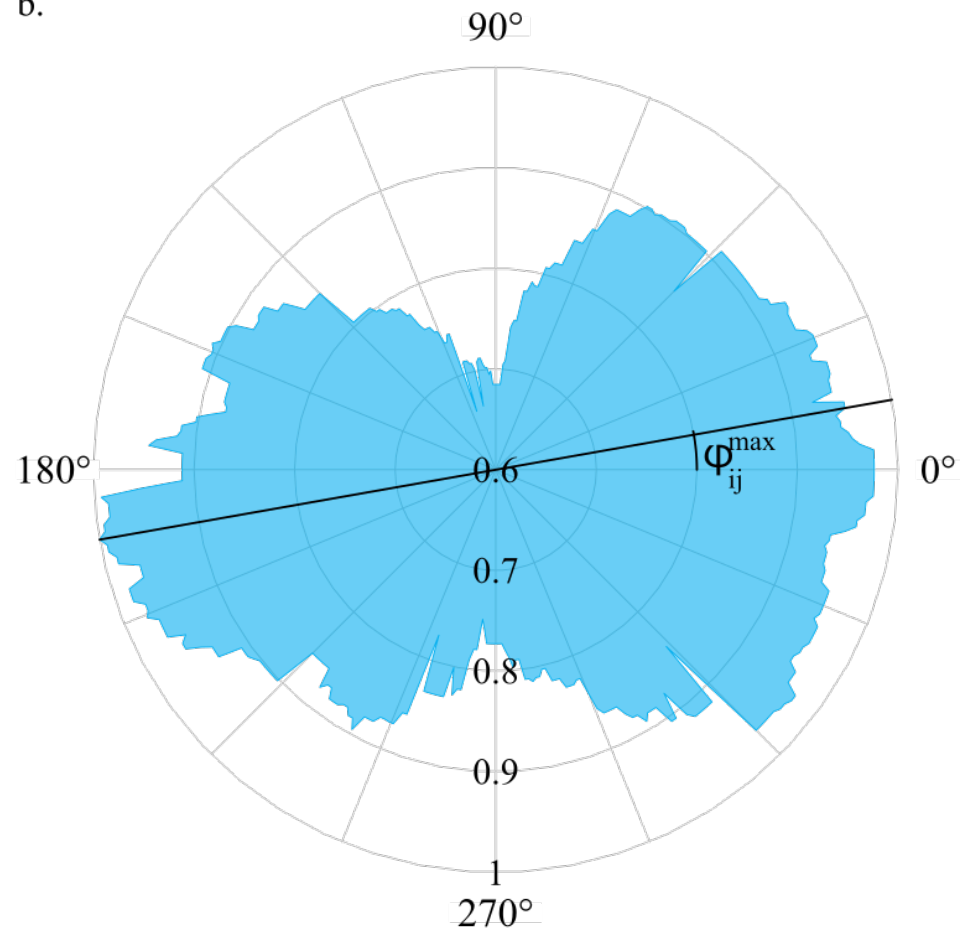
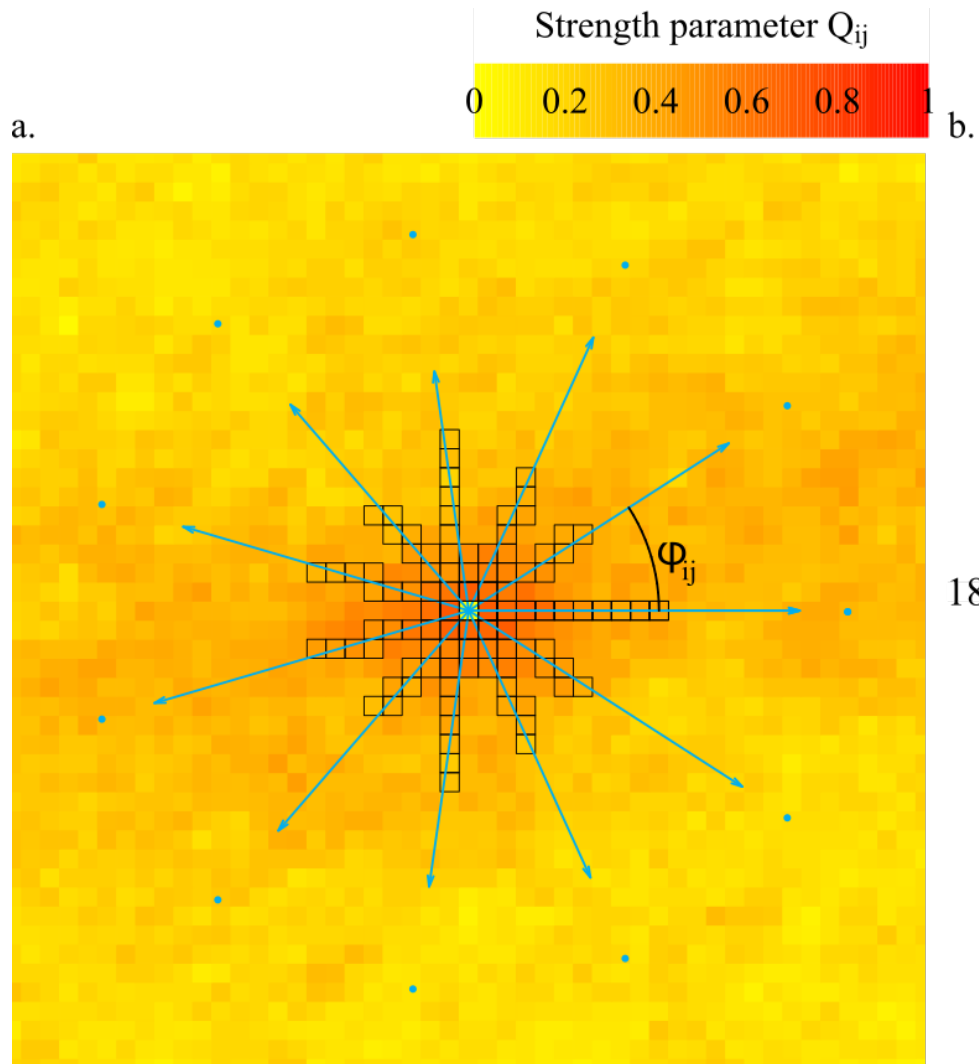
Malik et al., 2010

Q MATRIX

Spatial projection of a single row



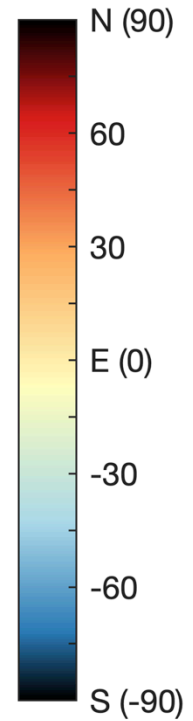
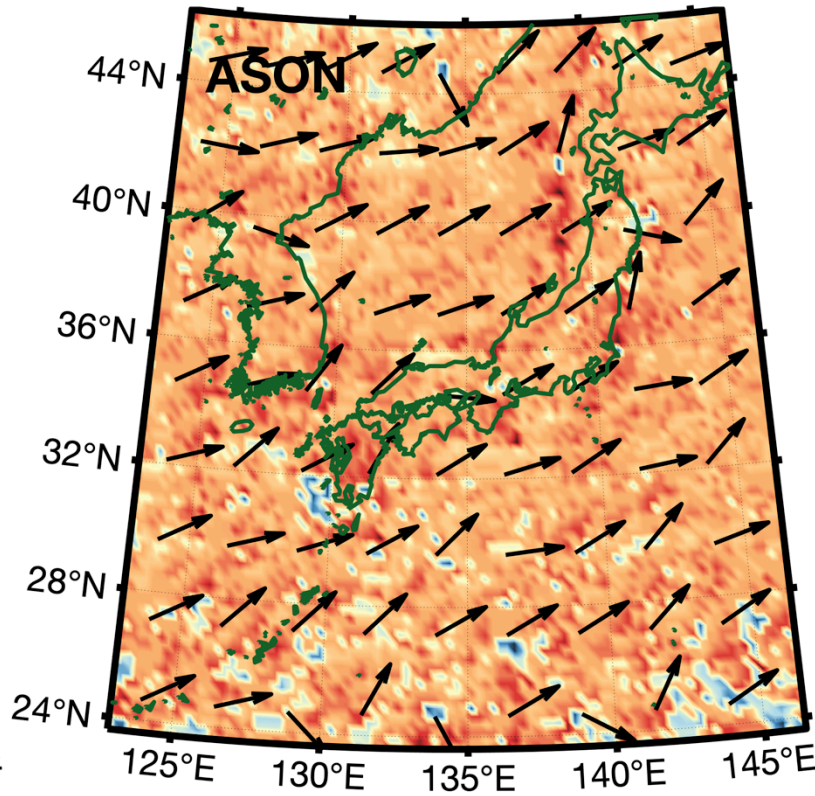
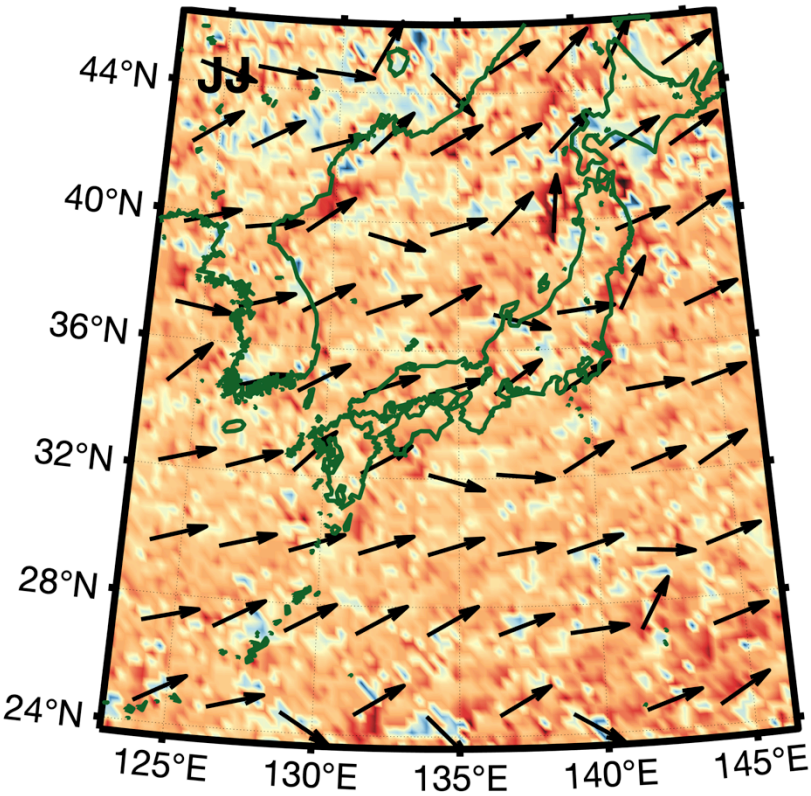
RADIAL RANKS



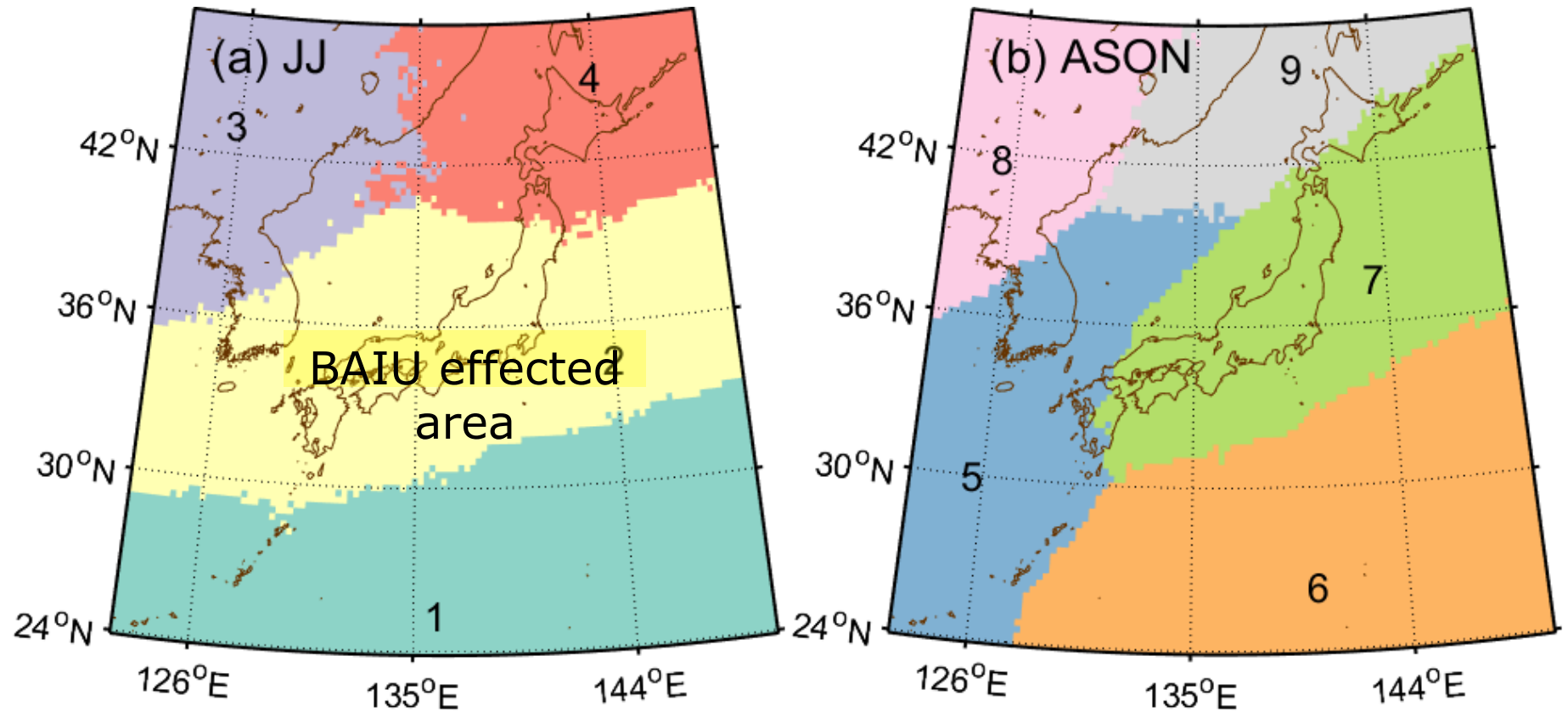
RADIAL RANKS

June-July

August-November

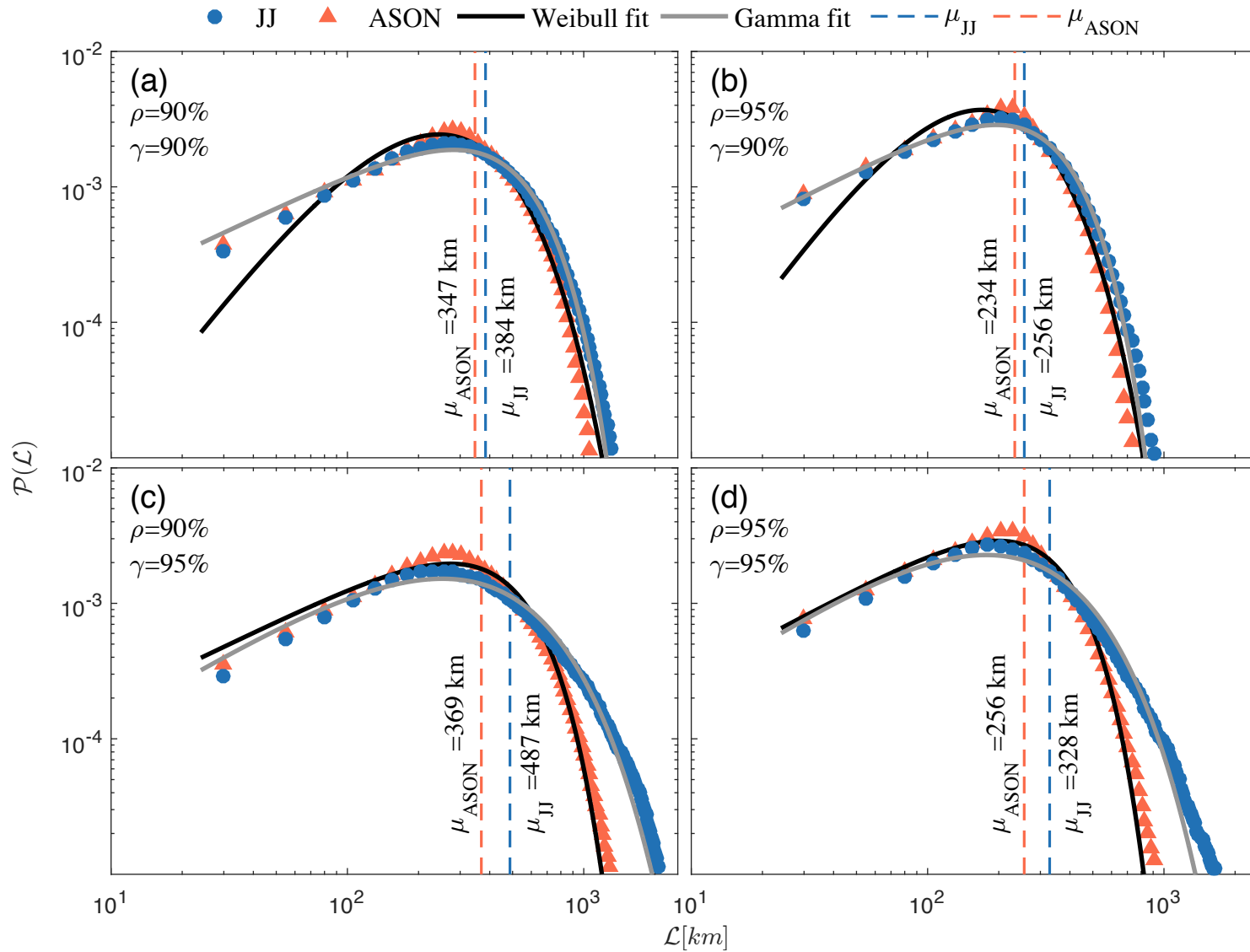


COMMUNITIES



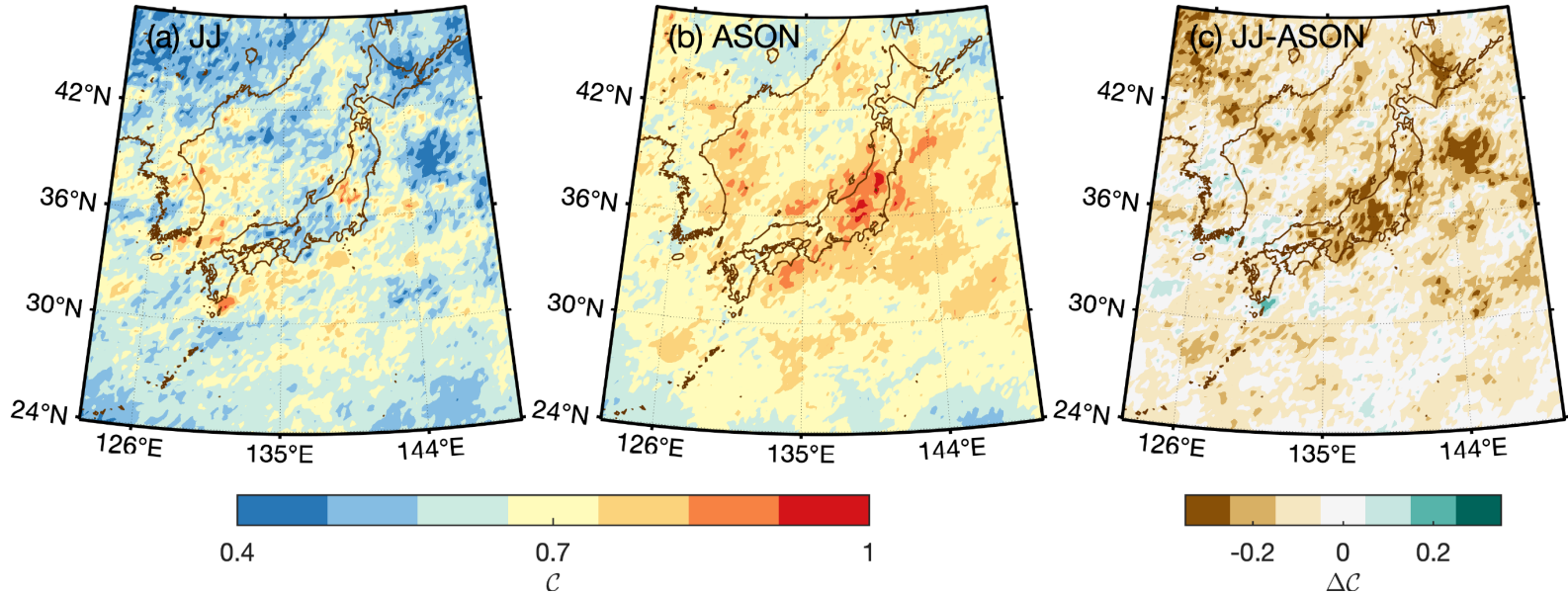
Ozturk et al., 2019, *Climate Dynamics*

LINK-LENGTH DISTRIBUTION

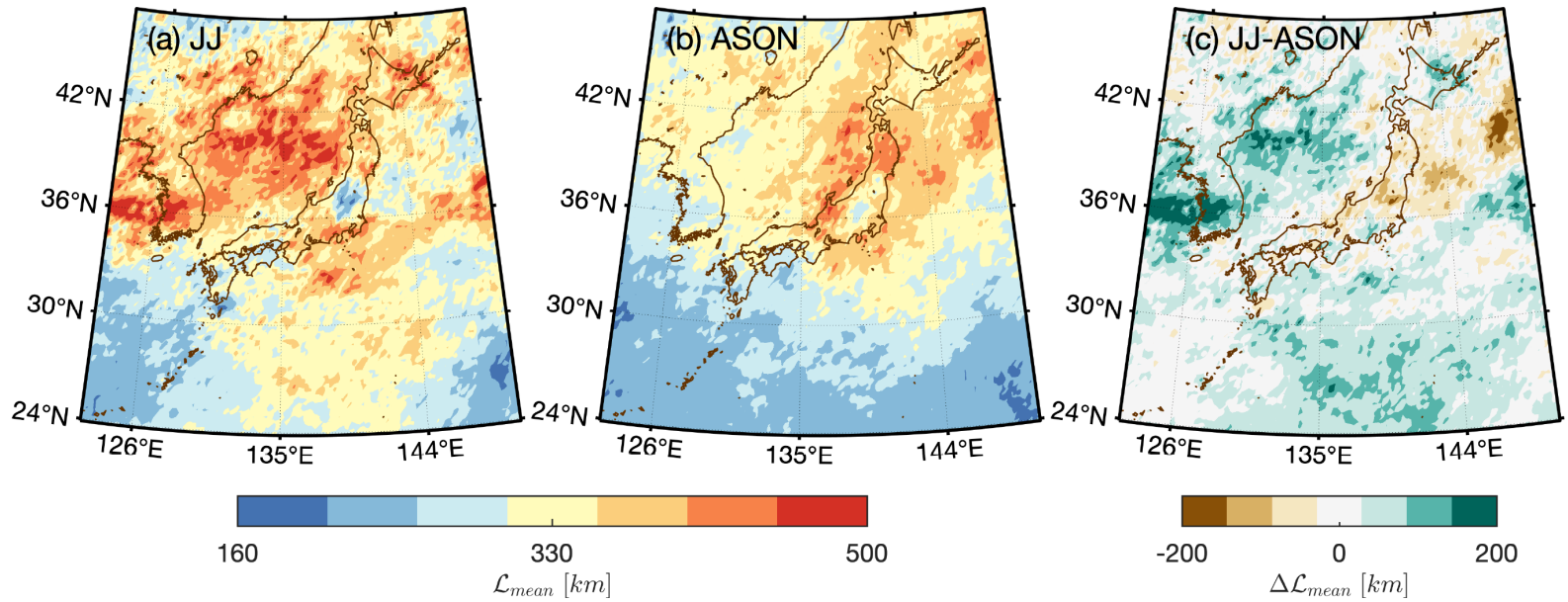


CENTRALITY

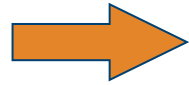
Clustering



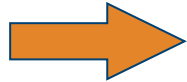
Mean Edge Length



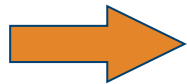
CONCLUSIONS



Network Theory + Radial Ranks
= Extreme rainfall trajectories



Seasonality (Baiu, Typhoon)



Landslide early warning

Ozturk, U., Malik, N., Cheung, K., Marwan, N., Kurths, J. (2019) A network-based comparative study of extreme tropical and frontal storm rainfall over Japan, *Climate Dynamics*.

Ozturk, U., Marwan, N., Korup, O., Saito, H., Agarwal, A., Grossman, M. J., Zaiki, M., Kurths, J. (2018). Complex networks for tracking extreme rainfall during typhoons, *Chaos*.

Chaos

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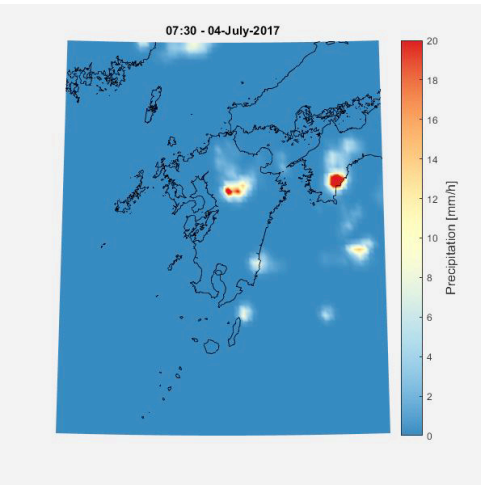
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REFERENCES

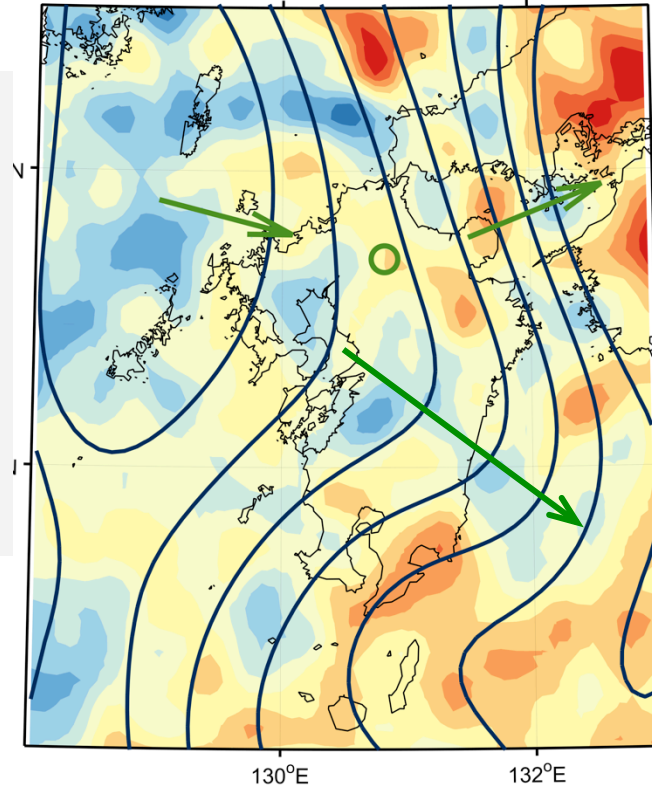
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NETWORK DIVERGENCE

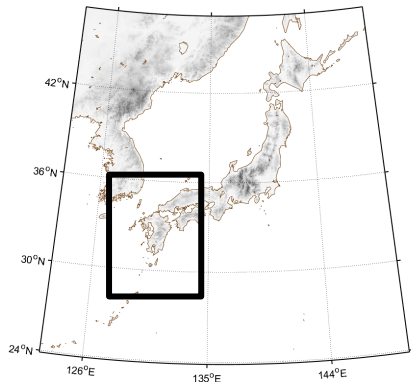
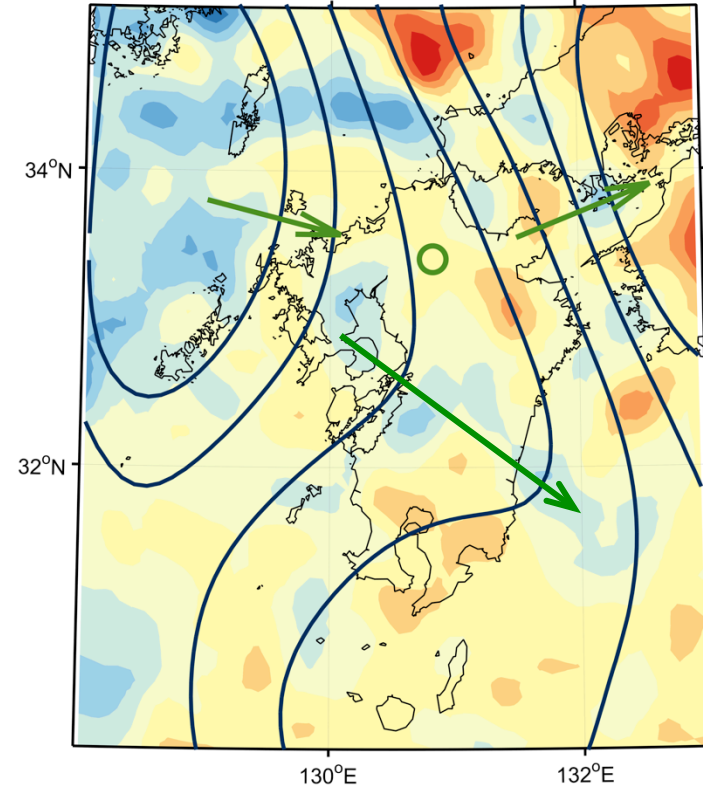
Introduction - | - Topography & Lithology - | - **Rainfall Direction** - | - Radial Ranks



Divergence ($\gamma=90\%$) May July



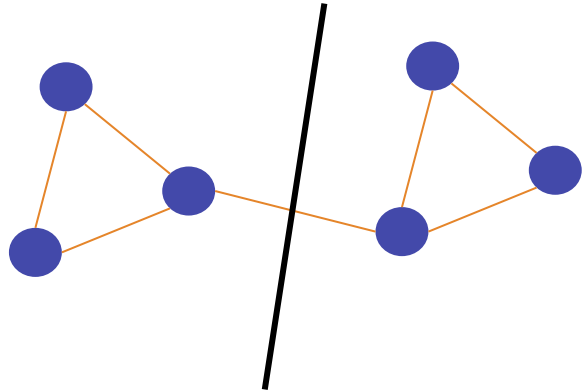
Divergence ($\gamma=95\%$) May July



$$\Delta k_i = k_i^{in} - k_i^{out}$$

$$k_i = \sum_{j=1}^n A_{ij}$$

MODULARITY



$$M \rightarrow \sum_{C=1}^{N_C} \left[\frac{l_s}{L} - \left(\frac{d_s}{2L} \right)^2 \right]$$

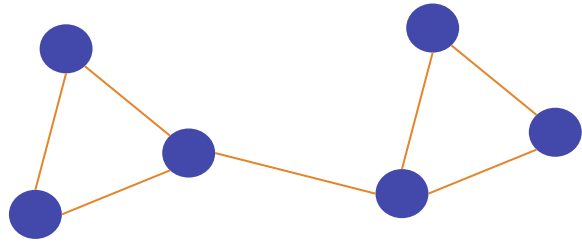
l_s → observed links in a selected community

L → total number of links in the network

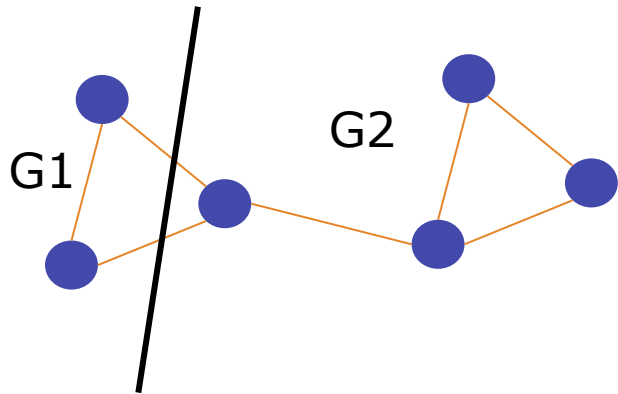
N_C → total number of communities

d_s → observed degree in the selected community

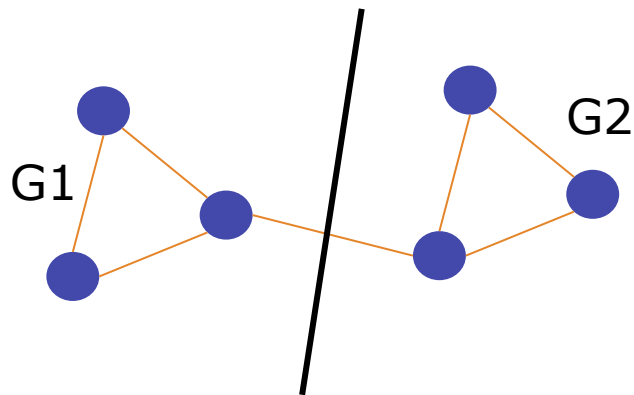
MODULARITY



$$M \rightarrow \sum_{C=1}^{N_C} \left[\frac{l_s}{L} - \left(\frac{d_s}{2L} \right)^2 \right]$$



$$M = \overbrace{\left[\frac{1}{7} - \left(\frac{4}{2 \cdot 7} \right)^2 \right]}^{C=1} + \overbrace{\left[\frac{4}{7} - \left(\frac{10}{2 \cdot 7} \right)^2 \right]}^{C=2} = 0.06 + 0.06 = 0.12$$

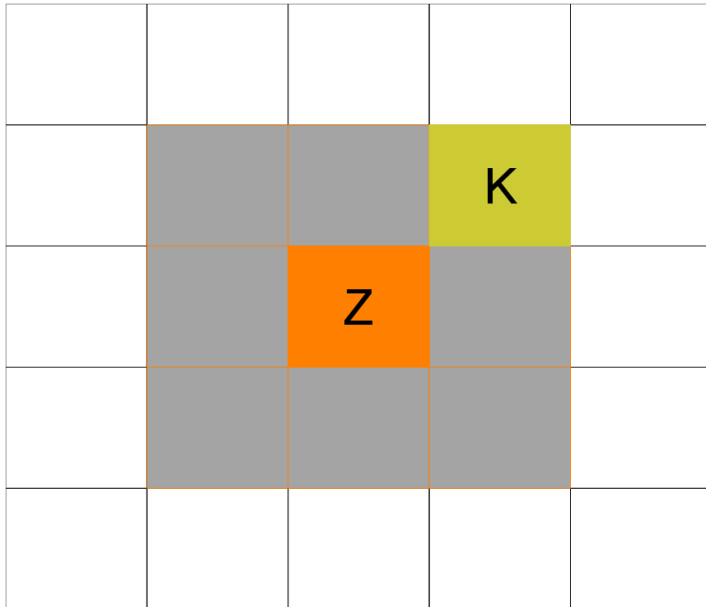


$$M = \overbrace{\left[\frac{3}{7} - \left(\frac{7}{2 \cdot 7} \right)^2 \right]}^{C=1} + \overbrace{\left[\frac{3}{7} - \left(\frac{7}{2 \cdot 7} \right)^2 \right]}^{C=2} = 0.18 + 0.18 = 0.36$$

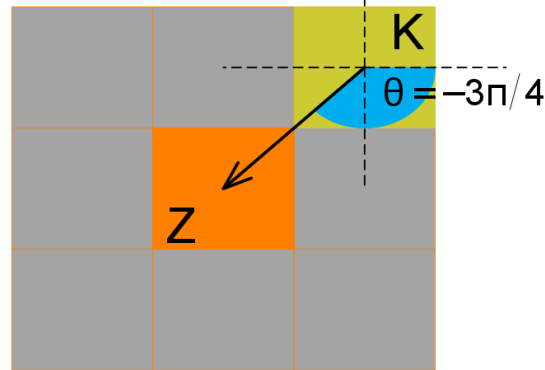
„q“ Matrix

Directions Based on „q“ MATRIX (Malik et al., 2010)

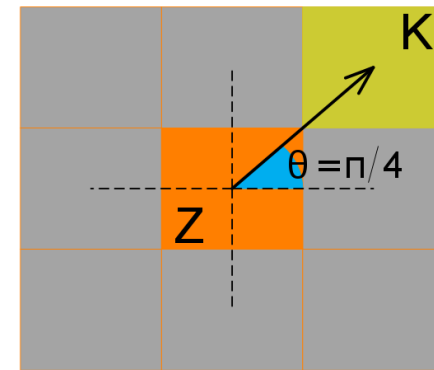
Longitude



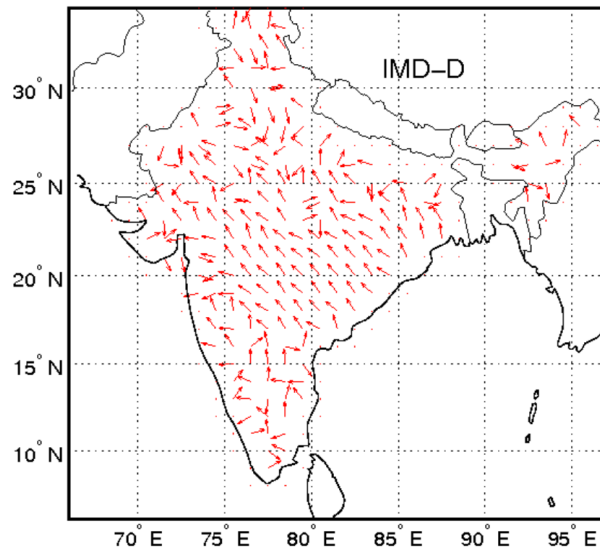
Event K occurs first



Event Z occurs first



- Event Z in the i Time-Series
- Event K in the j Time-Series
- Neighbours of the grid i



PEARSON - LINEAR CORRELATION

$$\rho_{X,Y} = \frac{\text{cov}(X, Y)}{\sigma_X \cdot \sigma_Y}$$

applied to a **population**

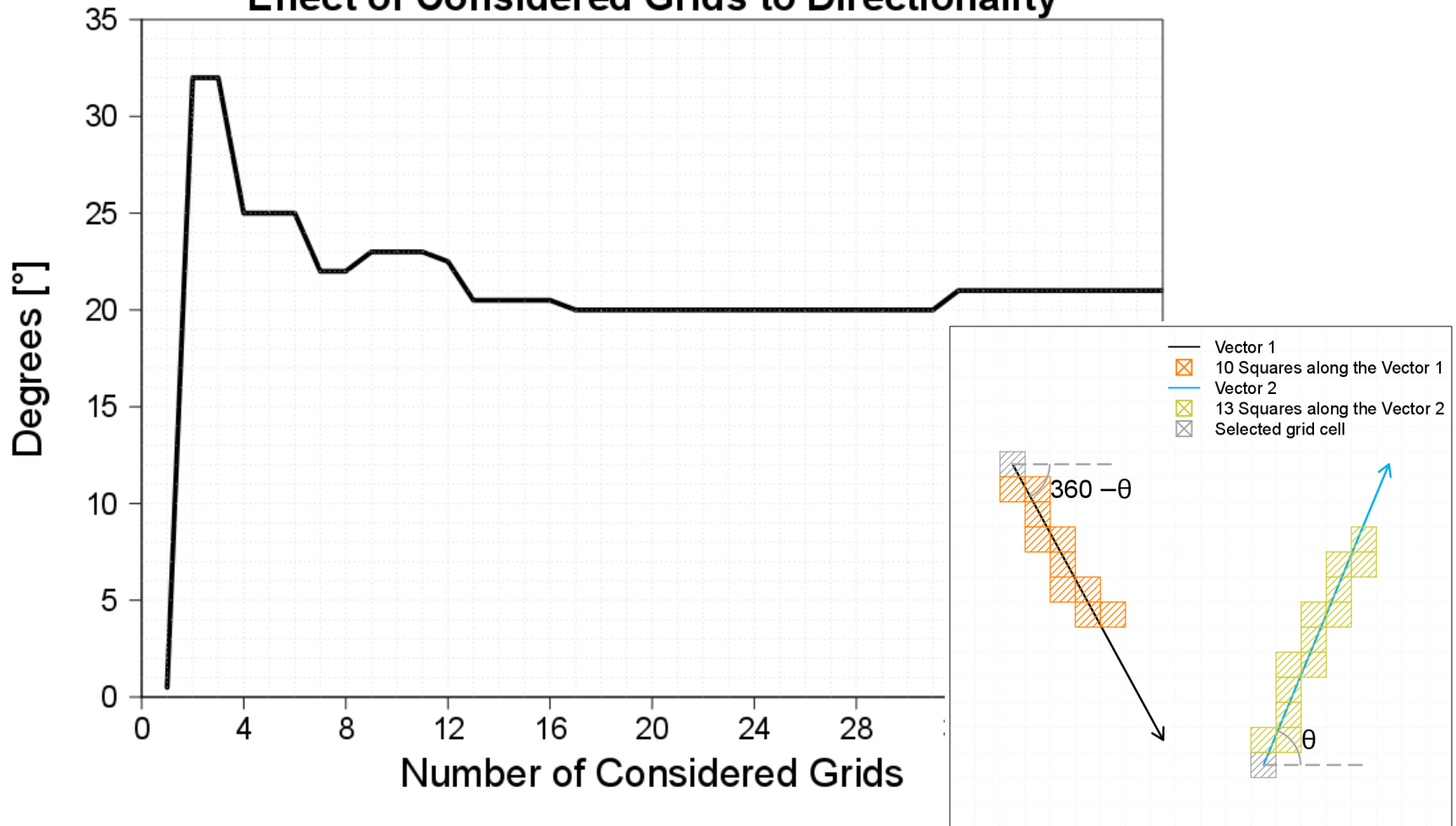
$$r_{xy} = \frac{\sum[(x_i - \bar{x}) \cdot (y_i - \bar{y})]}{\sqrt{\sum(x_i - \bar{x})^2 \cdot \sum(y_i - \bar{y})^2}}$$

applied to a **sample**

RADIAL RANKING OF „Q“ MATRIX

Radial Ranking of „Q“ Matrix

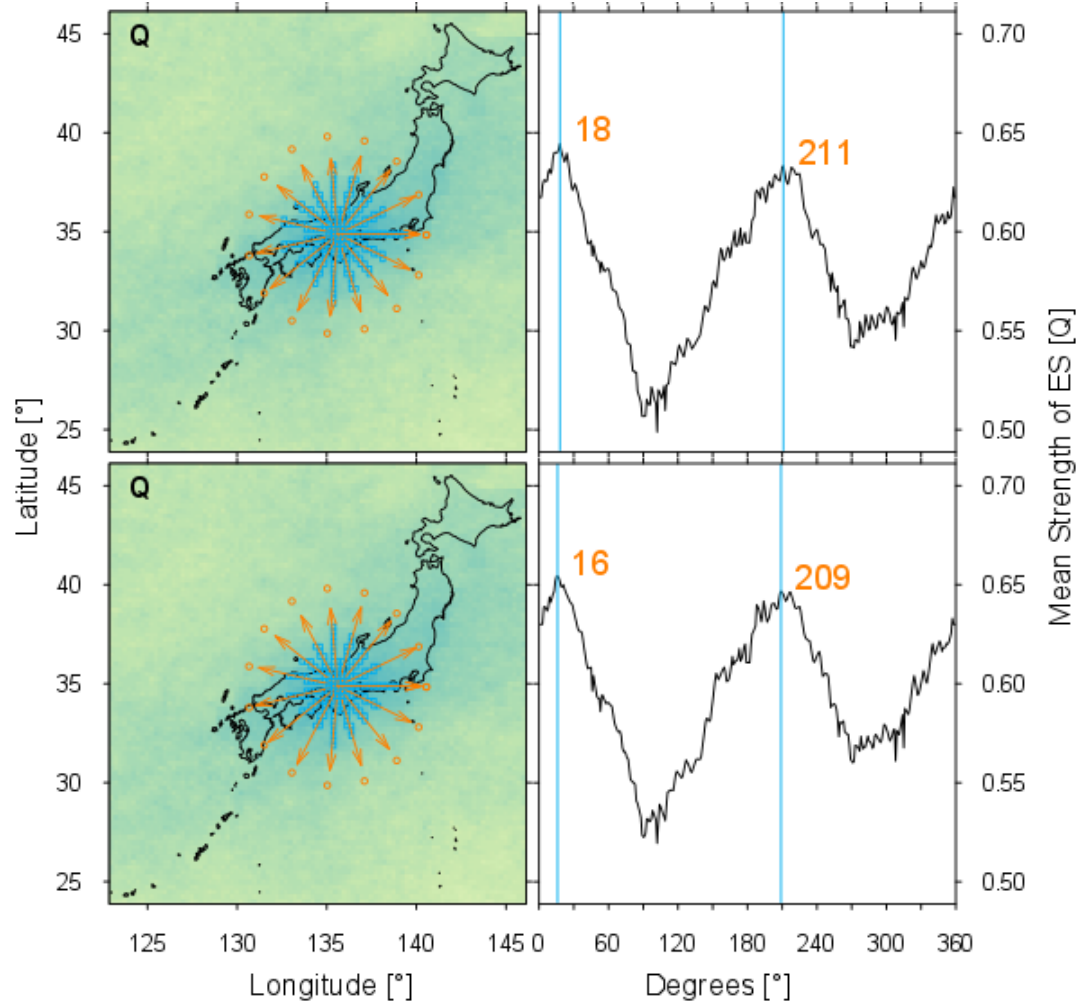
Effect of Considered Grids to Directionality



RADIAL RANKING OF „Q“ MATRIX

Directions based on Radial Ranking of ES [Q] – Lat=34.875, Lon=135.625

13 Cells



DEVIATION OF RADIAL RANKS

