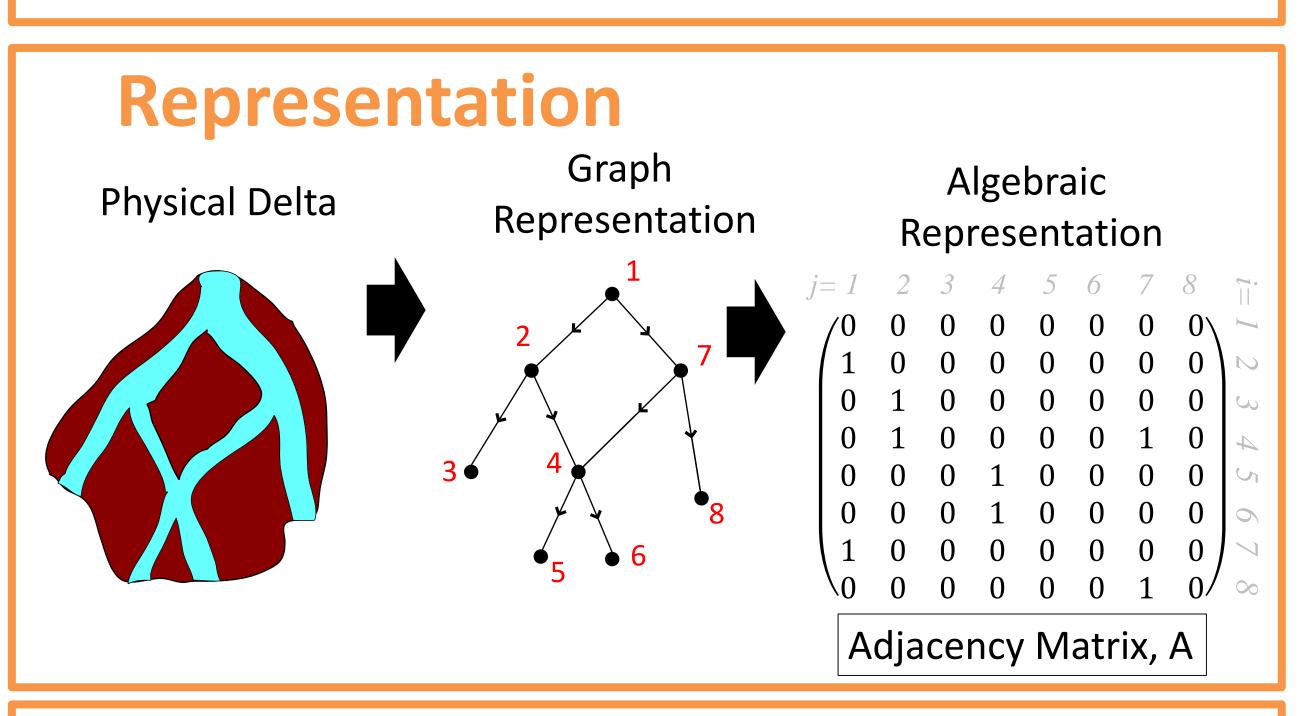


## Goal

- Quantify the patterns imprinted on the landscape as a function of the **physical processes** that created them.
- Using the graph theoretic framework proposed by Tejedor et al. [2015a,b], we are able to construct **vulnerability** maps that depict the relative change of sediment and water delivery to the shoreline outlets in response to possible perturbations in hundreds of upstream links. We show that an **inverse relationship** exists between entropy and vulnerability, reinforcing the idea that entropy is a surrogate of the capacity of the system to undergo changes.
- Using **numerical models** (Delft3D), we quantify the **signature the incoming sediment size** on the structure and flux distribution of the emerging **delta channel network**.



# Delta entropy

We conceptualize the **flow** in the delta by a large number of noninteracting flux packages that independently perform random downstream walk in a directed graph from the apex to the different outlets.

We set the **stationary proba**bility that the package of flux is traveling from vertex v to vertex u proportional to the flux F<sub>11</sub>, at the link that connects these vertices:

$$p_{uv} \propto F_{uv}$$

The **joint entropy** of an apex-to-outlet subnetwork is given by:

$$H(u,v) = -\sum_{(vu)\in S_i} p_{uv} \log p_{uv}$$
  
=  $\sum_{(vu)\in S_i} p_{uv} \log \frac{p_{uv}}{p_{u}\cdot p_{\cdot v}} - \sum_{(vu)\in S_i} p_{uv} \log \frac{p_{uv}^2}{p_{u}\cdot p_{\cdot v}}$ 

Here we use Shannon entropy to measure the information content of channel splitting and rejoining in a delta.

The entropy can be interpreted as the ability of the system to undergo changes [*Ulanowicz et al.*, 2009] or in other words, it quantifies how the uncertainty of the system enables it to deal with perturbations.

# A Graph-Theoretic Approach to Delta Channel Networks: Entropic assessment of complexity

Alejandro Tejedor<sup>1</sup>, Anthony Longjas<sup>1</sup>, Ilya Zaliapin<sup>2</sup> and Efi Foufoula-Georgiou<sup>1</sup> 1 Department of Civil, Environmental and Geo-Engineering, University of Minnesota, Minneapolis, MN 2 Department of Mathematics and Statistics, University of Nevada, Reno, NV



# **Vulnerability Assessment**

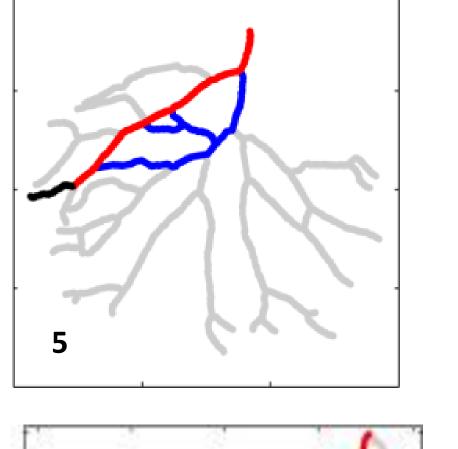
**Vulnerability** is defined in terms of how **changes** in **upstream** parts of the system would affect the shoreline fluxes. Questions such as what links of the delta network, if altered, might affect most drastically the distribution of fluxes to the costal outlets, or where an intervention should be imposed to maintain a desired flux to a particular outlet node for land building purposes, are important components of delta management towards sustainability.

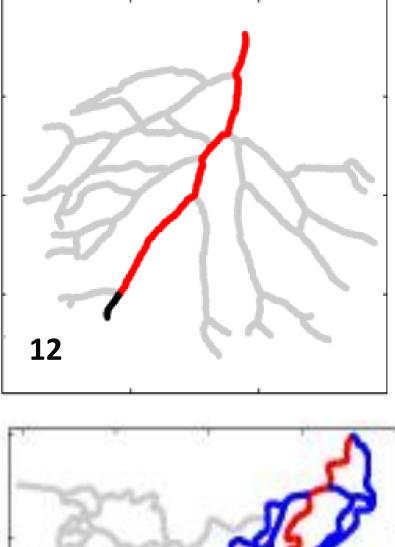
We characterize the flux reduction at outlet *i* with respect to the flux reduction at link (*vu*) by the *local vulnerability*:

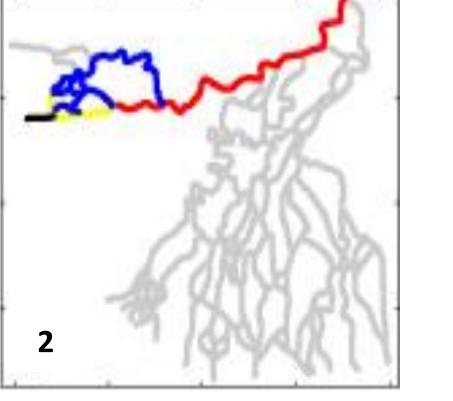
 $V_{\mu\nu}^{i} = p_{\mu\nu}^{i} / C_{\mu\nu}^{i}$ 

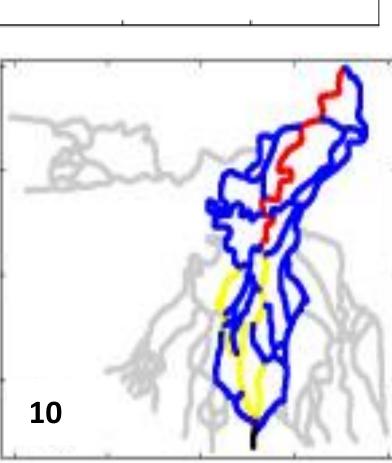
where  $p'_{\mu\nu}$  is the fraction of the steady flux in link (vu) that drains to outlet i and  $C'_{\mu\nu}$  is related to the ratio of the steady flux at the outlet  $F_i$  and the steady flux at the link (vu)  $F_{ij}$ .

### Vulnerability maps









Each panel highlights the contributing network for a single outlet.. Red, yellow, and blue links represent high  $(V_{uv}^i > 0.75)$ , medium  $(0.25 < V_{uv}^i \pm 0.75)$ , and low  $(V_{uv}^i \pm 0.25)$  values of the local vulnerability index. Shoreline outlets are shown in black.

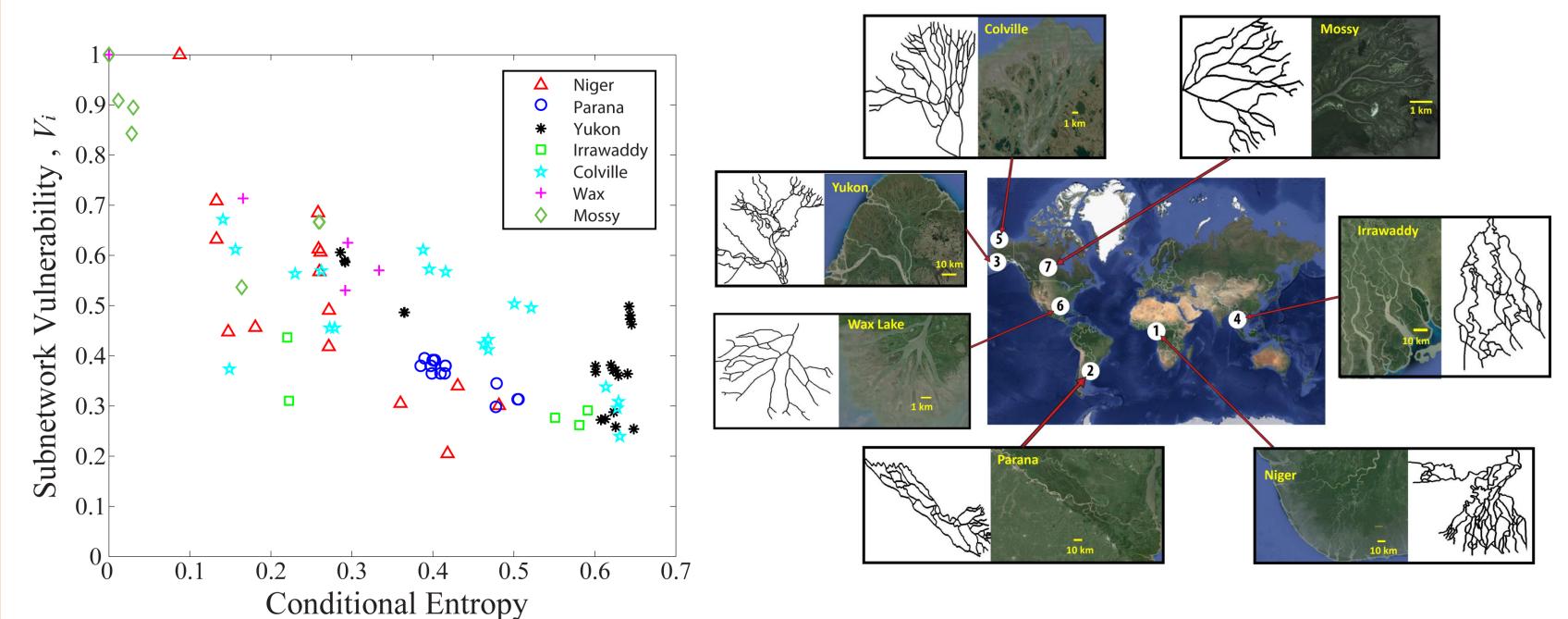
# **Entropy and Vulnerability**

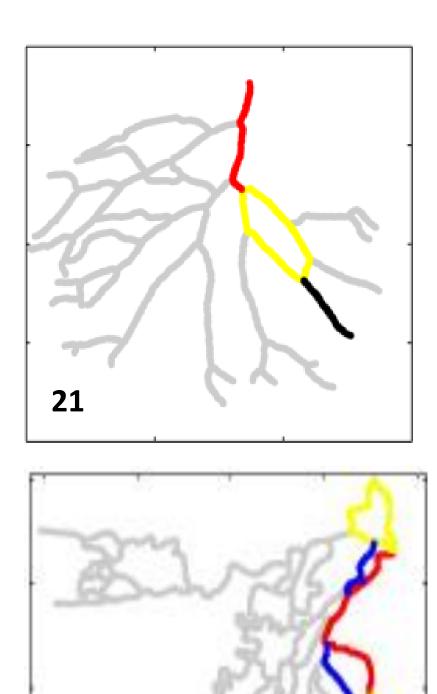
We can define the **subnetwork vulnerability** as the average of the local vulnerabilities over all channels (links) in the subnetwork that drains to outlet *i* :

$$V_i = \frac{1}{|E_i|} \sum_{(vu) \in E_i} V_{uv}^i$$

where  $|E_i|$  denotes the number of links in the subnetwork that drains to outlet *i*.

### We show that an **inverse relationship** exists between **entropy** and **subnetwork vulnerability**.

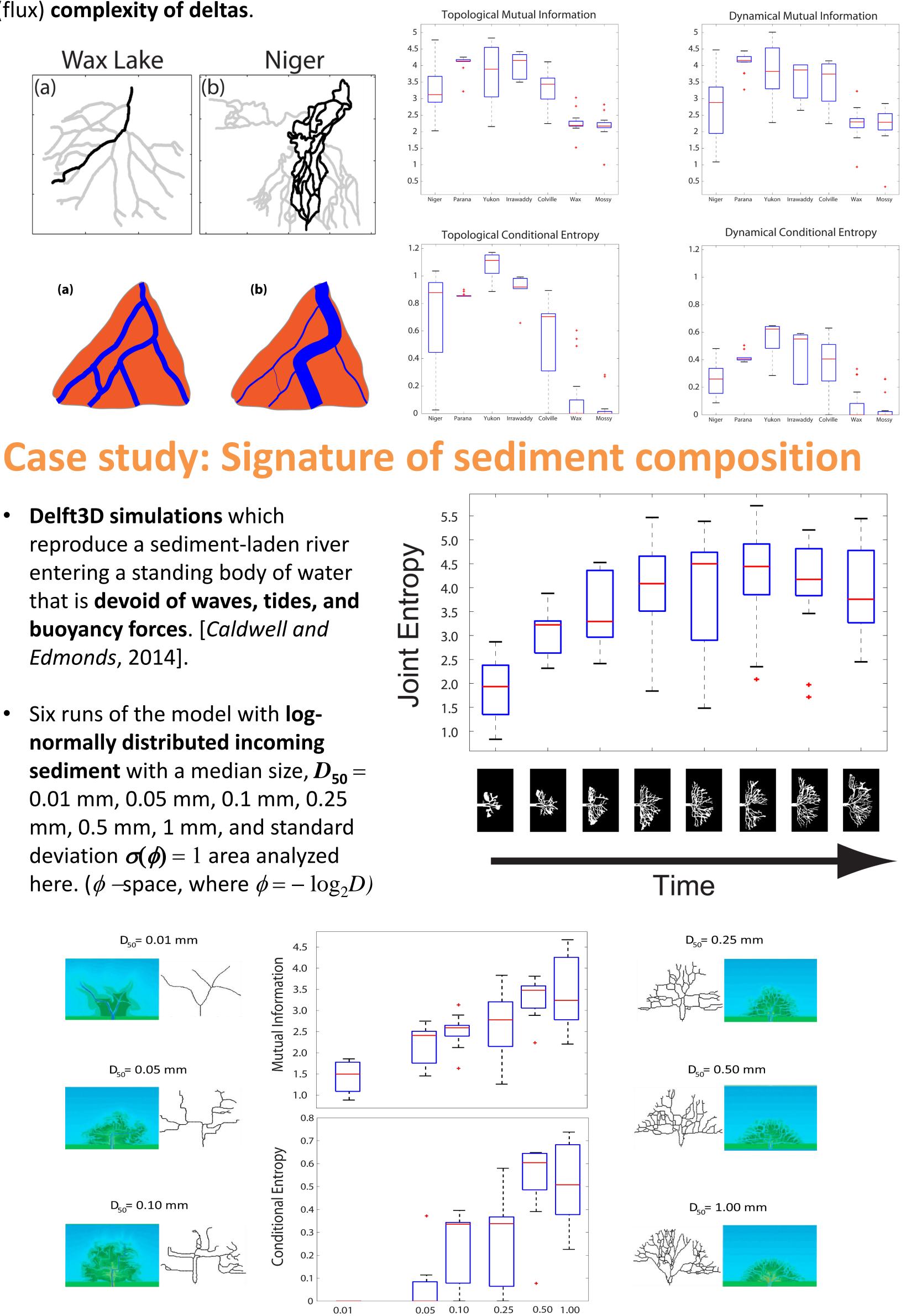


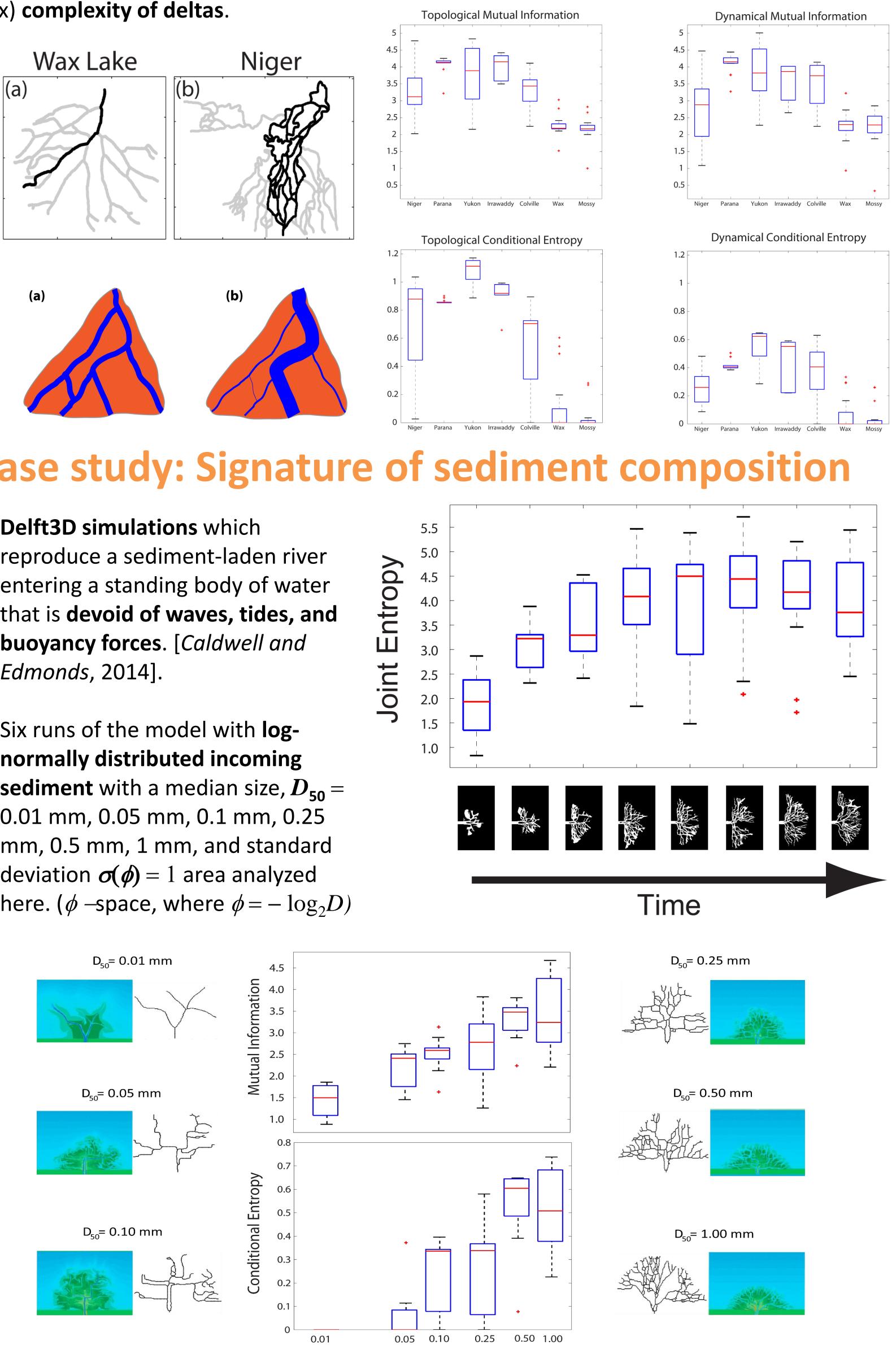


15

# **Quantifying Complexity**

We define a suite of metrics that depicts the topologic (structure of pathways) and dynamic (flux) complexity of deltas. pological Mutual Information





### References

Tejedor, A., A. Longjas, I. Zaliapin, and E. Foufoula-Georgiou (2015), Delta Channel Networks: 1. A graph-theoretic approach for studying connectivity and steadystate transport on deltaic surfaces, *Water Resour. Res.*, 51, doi:10.1002/2014WR016577. Tejedor, A., A. Longjas, I. Zaliapin, and E. Foufoula-Georgiou (2015), Delta Channel Networks: 2. Metrics of topologic and dynamic complexity for delta comparison, physical inference and vulnerability assessment, Water Resour. Res., 51, doi:10.1002/2014WR016604.

 $D_{fo}$  (mm)

- Caldwell, R. L., and D. A. Edmonds (2014), The effects of sediment properties on deltaic processes and morphologies: A numerical modeling study, J. Geophys. Res. Earth Surf., 119, 961–982, doi:10.1002/2013JF002965
- Tejedor, A., A. Longjas, R. Caldwell, D. A. Edmonds, I. Zaliapin, and E. Foufoula-Georgiou (2016), Quantifying the signature of sediment composition on the topologic and dynamic complexity of river delta channel networks and inferences toward delta classification, Geophys. Res. Lett., 43, doi:10.1002/2016GL068210.
- Acknowledgements:

This work is part of the BF-DELTAS project on "Catalyzing action towards sustainability of deltaic systems" funded by the Belmont Forum and the forthcoming 2015 "Sustainable Deltas Initiative" endorsed by ICSU. The research is also supported by the FESD Delta Dynamics Collaboratory EAR-1135427 and NSF grant EAR- 1209402 under the Water Sustainability and Climate Program. The data in our article can be provided upon request.





Driven to Discove