

Connecting Process and Form:

New Results on Scaling and Implications for Modeling and
Prediction in Ungauged Basins

Efi Foufoula-Georgiou
University of Minnesota

Grenoble
November, 2006



NATIONAL CENTER FOR EARTH-SURFACE DYNAMICS
A NATIONAL SCIENCE FOUNDATION SCIENCE & TECHNOLOGY CENTER



St. Anthony Falls Laboratory
UNIVERSITY OF MINNESOTA



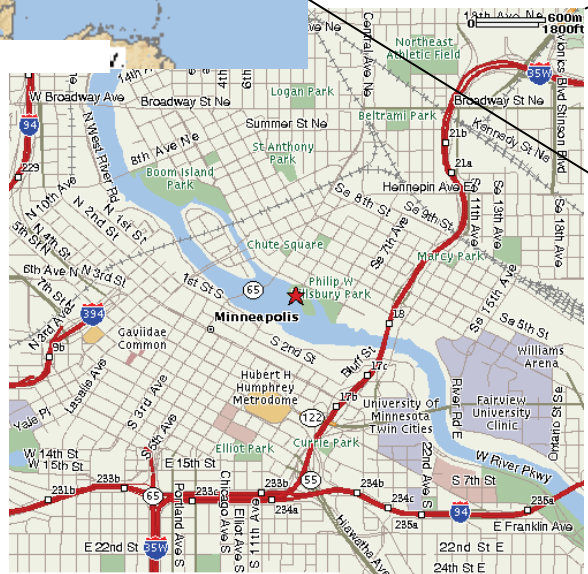
HYDROLOGY AND EARTH-SURFACE DYNAMICS RESEARCH @

SAFL and NCED

Efi Foufoula-Georgiou

**St. Anthony Falls Laboratory (SAFL)
National Center for Earth-Surface Dynamics (NCED)
Department of Civil Engineering**

University of Minnesota



St. Anthony Falls Laboratory University of Minnesota (1938-present)

SAFL's goal is to advance the knowledge of environmental hydrology and hydraulics, turbulence, earthscape evolution, and climate/ ecosystem dynamics via high quality experimental, theoretical and computational research.

Transfer this knowledge to the engineering community and to the public through applied research and outreach activities



St. Anthony Falls Laboratory University of Minnesota (1938-present)



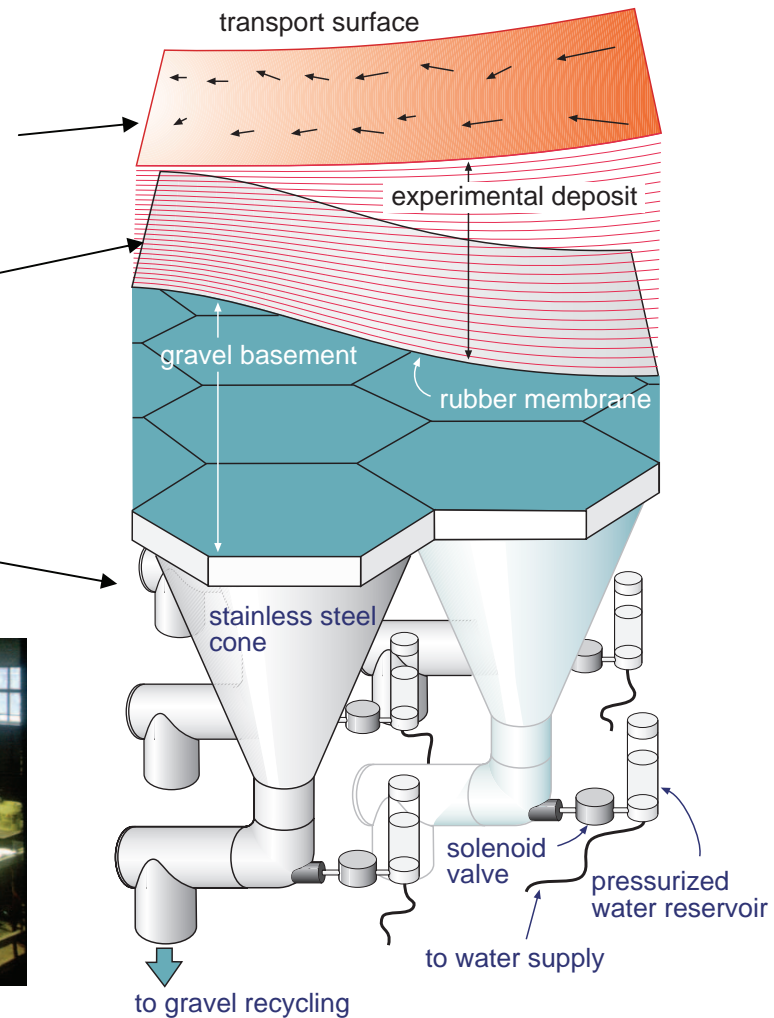
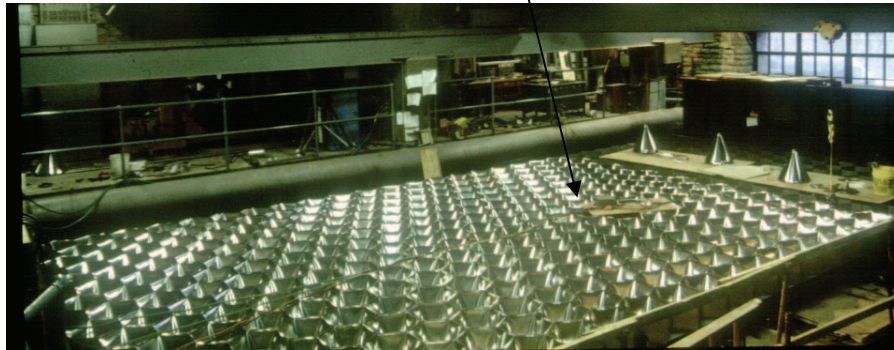
- 5000 m² of flumes, basins, tanks and offices
- Main channel (84 x 2.7m, 300 cfs)
- Recirculating turbidity-current flume
- Boundary layer wind tunnel (16x1.5x2.5m)
- 3m deep aquarium-grade tank with suspended inner channel for subaqueous flow experiments
- Environmental and Sediment laboratories
- Jurassic Tank (XES - eXperimental EarthScape basin)

Experimental EarthScapes in "Jurassic Tank"

This surface remains near its initial level, while...

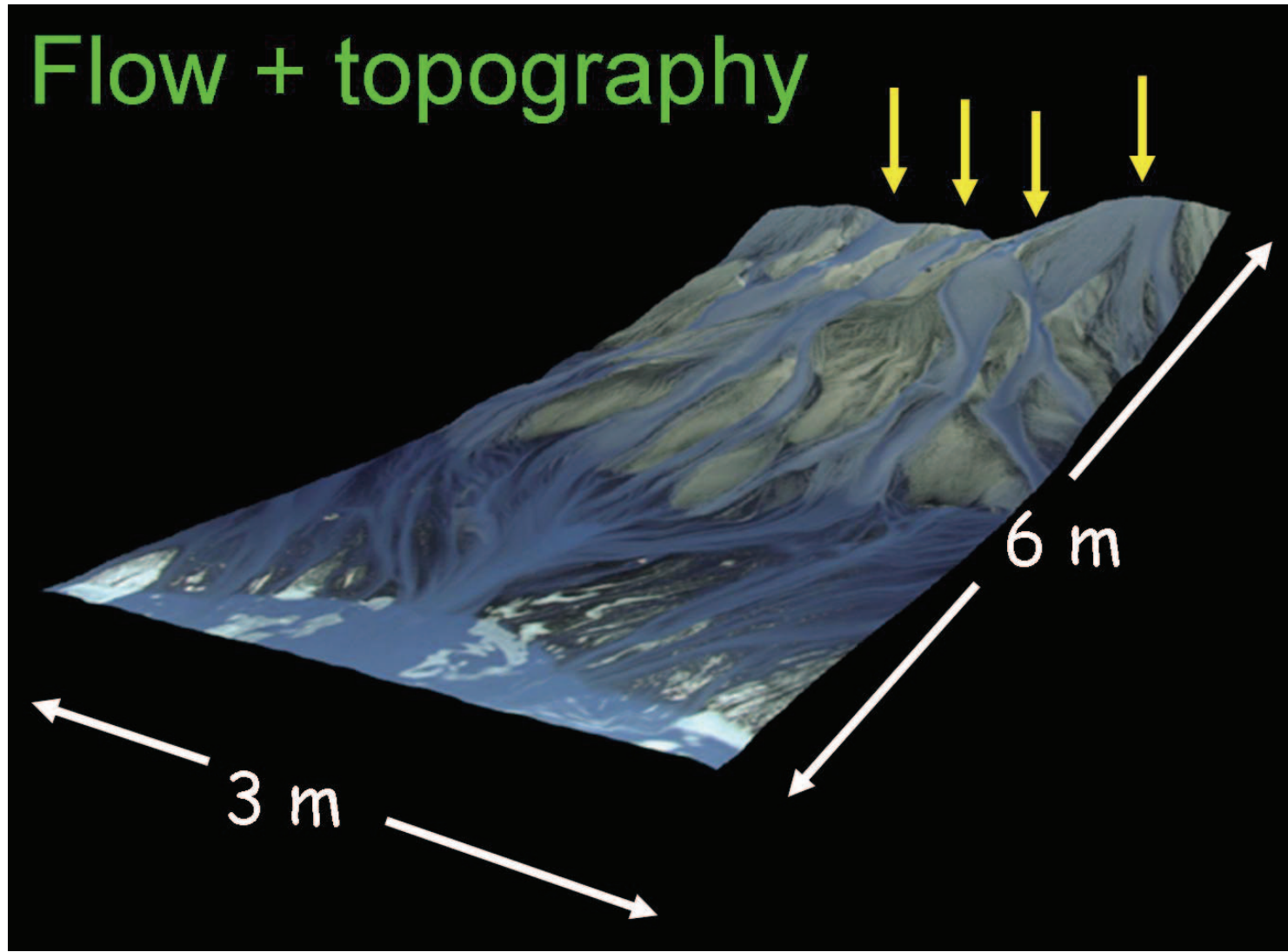
...this surface subsides...

...via these cells

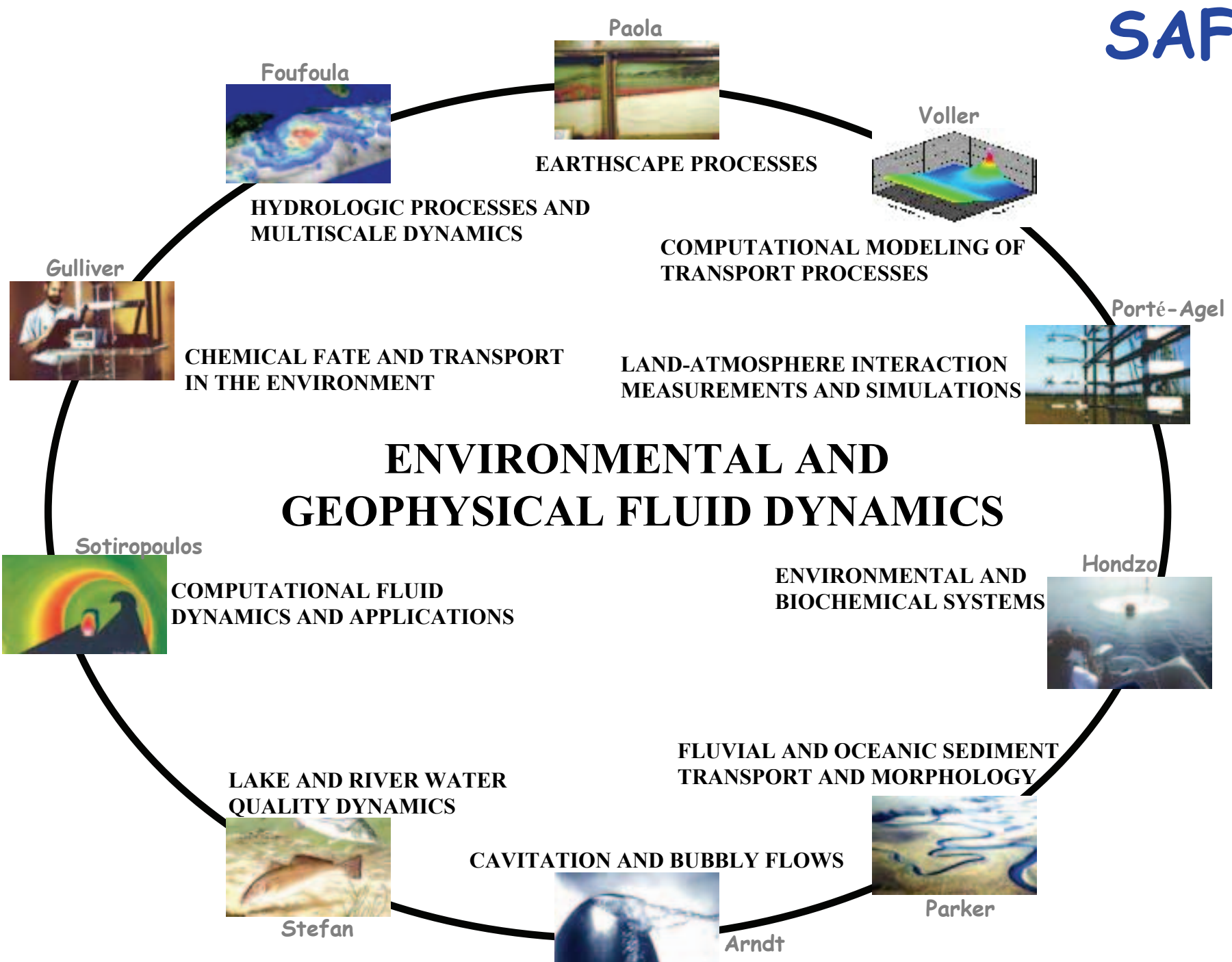


13 x 6.5m; 432 subsidence cells

Experimental EarthScapes in "Jurassic Tank"

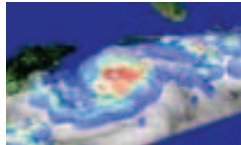


Stratigraphy, Morphodynamics, Continental Margins



ENVIRONMENTAL AND GEOPHYSICAL FLUID DYNAMICS

Foufoula



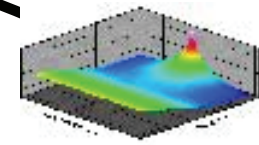
HYDROLOGIC PROCESSES AND MULTISCALE DYNAMICS

Paola



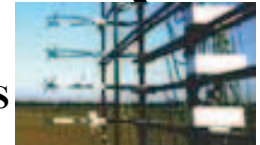
EARTHSCAPE PROCESSES

Voller



COMPUTATIONAL MODELING OF TRANSPORT PROCESSES

Porté-Agel



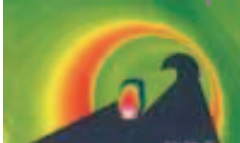
LAND-ATMOSPHERE INTERACTION MEASUREMENTS AND SIMULATIONS

Hondzo



ENVIRONMENTAL AND BIOCHEMICAL SYSTEMS

Sotiropoulos



COMPUTATIONAL FLUID DYNAMICS AND APPLICATIONS

FLUVIAL AND OCEANIC SEDIMENT TRANSPORT AND MORPHOLOGY



Parker

CAVITATION AND BUBBLY FLOWS



Arndt

LAKE AND RIVER WATER QUALITY DYNAMICS



Stefan

Gulliver

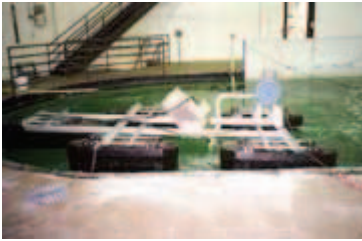


CHEMICAL FATE AND TRANSPORT IN THE ENVIRONMENT

WATER AND WASTEWATER TREATMENT



AERATION TECHNIQUES



HYDROPOWER ENGINEERING



HYDRAULIC STRUCTURES



SURFACE WATER QUALITY



RIVER ENGINEERING



The St. Anthony Falls Laboratory is involved in a wide variety of **APPLIED RESEARCH AND ENGINEERING** projects commissioned by government agencies, private companies, and consultants. These projects span the areas of river modeling for environmental protection and restoration; water and wastewater treatment; water quality of lakes, rivers and reservoirs; hydropower plants and hydraulic structures; wind engineering; and various performance and calibration testing.

CALIBRATION AND PERFORMANCE TESTING



WIND ENGINEERING

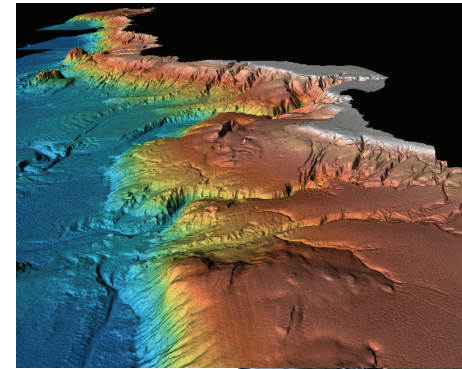


National Center for Earth-surface Dynamics (NCED)

A NSF Science and Technology Center
Established at U of M in 2002

NCED's purpose is to catalyze the development of an integrated predictive science of the processes shaping the surface of the Earth, in order to transform management of ecosystems, resources, and land use

sediment transport

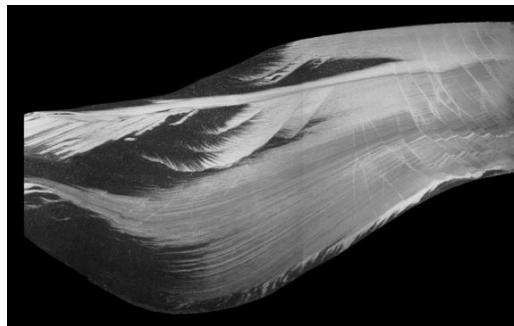


scaling

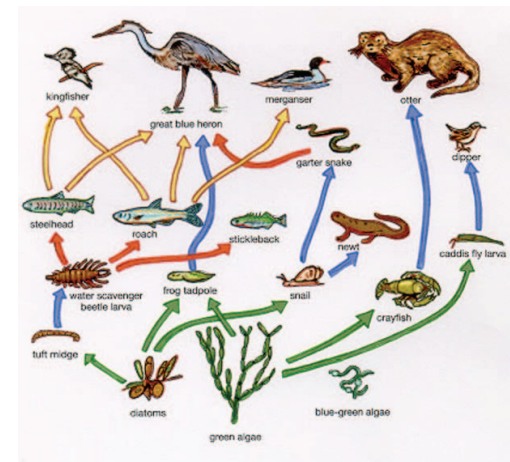
hydrology



geomorphology

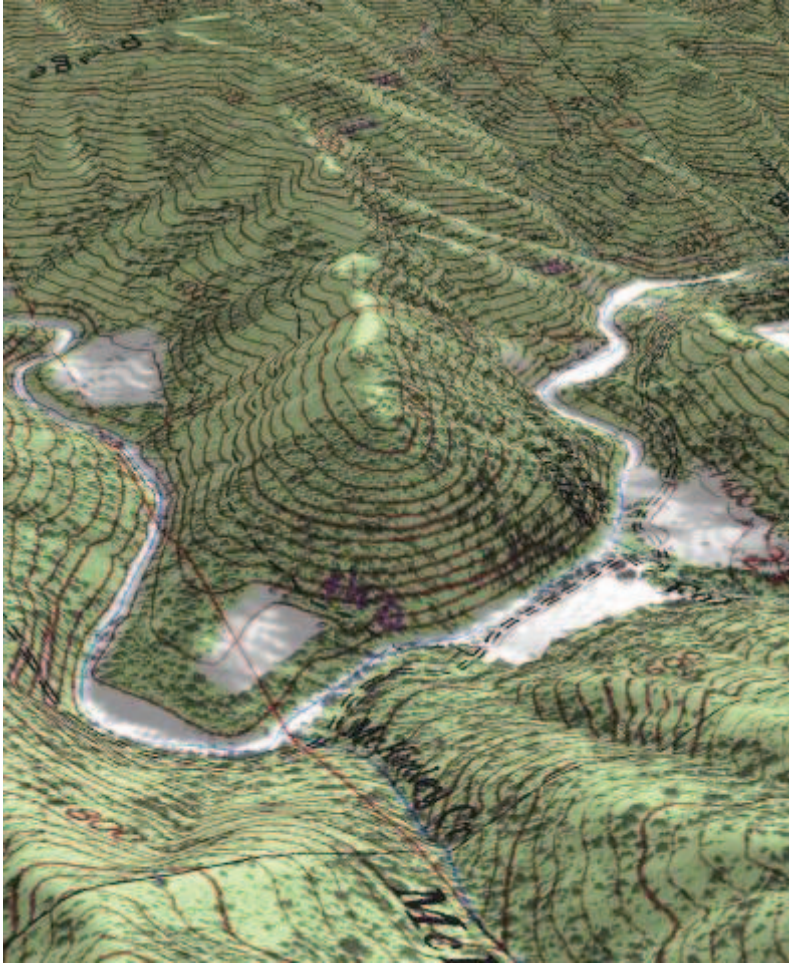


sedimentology



ecology

Landscape and ecosystem response to extreme stress



GCMs predict a reduction of precipitation here. How will the system respond (sediment yield, hydrology, ecosystem, landsliding...)?

Sustainable solutions to stream restoration

View downstream from Santa Teresa bridge (courtesy Matt Kondolf, UC Berkeley)



Jan 1996

Sustainable solutions to stream restoration

View downstream from Santa Teresa bridge (courtesy Matt Kondolf, UC Berkeley)



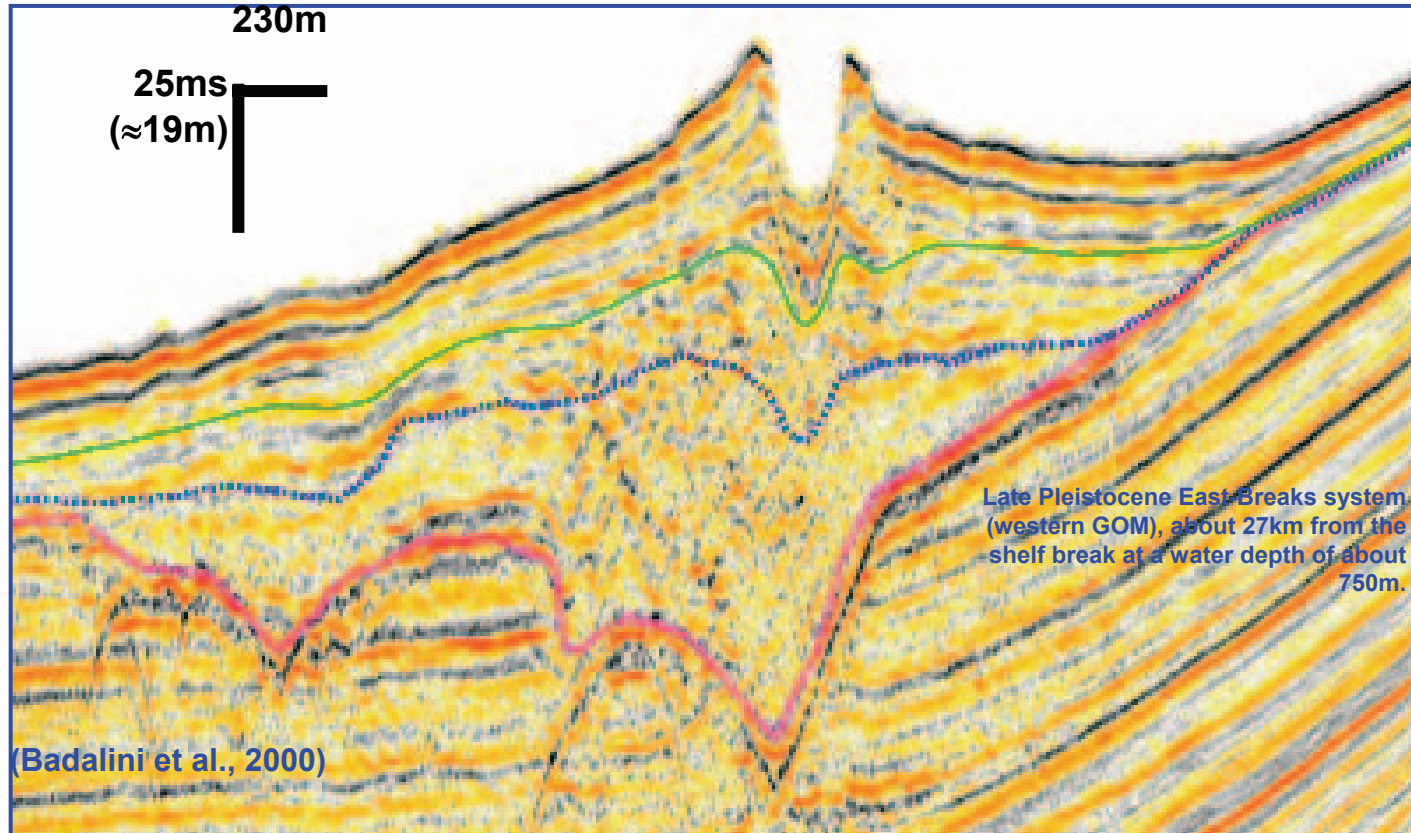
Jan 1996



July 1997 – After flood of Feb 1996

Could this have been prevented?

Exploration of natural resources



- Can climatic variations be inferred from this deposit?
- Is there recoverable oil in this deposit?
- Can the history of the channel be used for landscape prediction?

Participating Institutions

University of Minnesota (SAFL)



University of California, Berkeley



University of Colorado, Boulder



Fond du Lac Tribal and Community College



University of Illinois, Urbana/Champaign



Johns Hopkins University



Massachusetts Institute of Technology



Princeton University



Science Museum of Minnesota



Research Focus of my group

Hydrology/Geomorphology with emphasis on quantifying the space-time organization and interactions of precipitation, landforms and streamflow over a range of scales

For the purpose of:

1. Subgrid-scale parameterizations of predictive models, including downscaling
2. Upscaling of flux laws (water and sediment) in view of small-scale variability
3. Statistical prediction of "extremes" (precipitation depth, floods, large scour in a channelized system, large migration of a channel in a braided river system, etc.) based on observations of more common events

Current Research

1. Precipitation (NASA, NSF)

- Multiscale characterization and downscaling methodologies
- Multisensor estimation
- NWP model verification and quantification of forecast prediction uncertainty via ensembles

2. Hydro-geomorphology (NSF)

- Evolution of braided river systems
- Channel/floodplain dynamics and effect on hydrologic response
- Process signatures in high resolution topography

3. Atmospheric boundary layer turbulence (NASA, NSF)

- Subgrid-scale parameterizations and LES closures
- Stable boundary layer

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Overarching Questions

1. How much of the physical/mechanistic behavior of the coupled hydrologic/geomorphologic system is reflected in the observed statistical patterns of landscapes and streamflows?
2. Are statistical patterns distinct across physical boundaries and how can they be used in assisting modeling, prediction and observatory design across scales and across environments?
3. Where/what to sample to get the most out of a limited number of observations?

MAIN MESSAGES

1. Physical processes do leave important signatures on the statistics of landscapes and streamflows and thus provide a powerful means of inference

[to guide modeling and observatory design, to further pose and test hypotheses, etc . . .]

2. High resolution topography offers new opportunities for connecting process and form at an ever increasing range of scales

[hillslope to watershed scales, explicit extraction of channel heads, verification of mechanistic transport laws, spatially-distributed hydrologic modeling, etc...]

Examples to discuss

1. The **scaling break in floods** reflects important fluvial regime transitions and a **channel-floodplain exchange** process that is scale & frequency dependent.
[Implications for modeling and prediction]
2. **High-resolution DEMs** offer new opportunities, e.g., objective and explicit identification of the **hillslope-to-valley-to-channel transition**.
[Implications for modeling and subgrid-scale parameterizations]
3. **Bedload size distributions** and mass flux along river networks are less controlled by the flow pathways and more by the **sediment production at the hillslope**.
[Implications for monitoring, theories of scale-dependent channel formation]
4. New ways of looking at landscapes, e.g., **river corridor width functions**, highlight the ability to depict important physical boundaries in **valley forming processes** from the presence of statistical boundaries.
[Implications for spatially-distributed modeling]

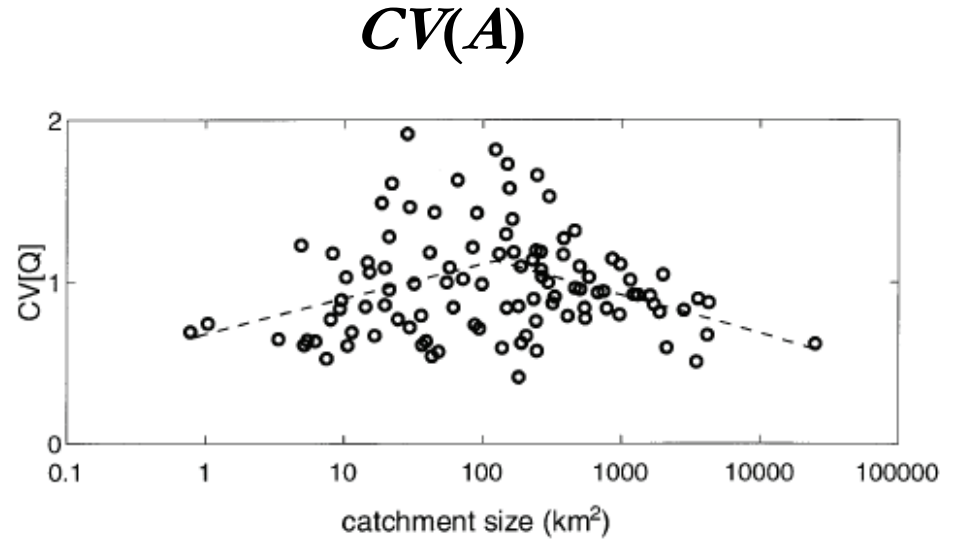
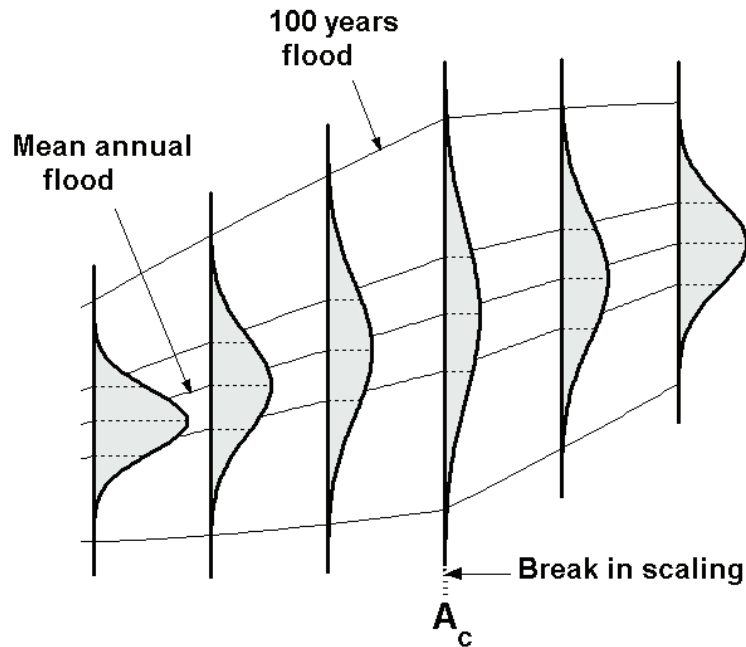
Related Publications

1. Dodov B., E. Foufoula-Georgiou, Fluvial processes and streamflow variability: Interplay in the scale-frequency continuum and implications for scaling, *Water Resources Research*, 41, W05005, doi:10.1029/2004WR003408, 2005
2. Theodoratos, N., I. Iorgulescu, E. Foufoula-Georgiou, A geomorphologic interpretation of the statistical scaling in floods, *Water Resources Research*, under review, 2006.
3. Passalacqua P., F. Porté-Agel, E. Foufoula-Georgiou, C. Paola, Application of dynamic subgrid-scale concepts from large-eddy simulation to modeling landscape evolution, *Water Resources Research*, 42, W06D11, doi:10.1029/2006WR004879, 2006
4. Sklar L. S., W. E. Dietrich, E. Foufoula-Georgiou, B. Lashermes, D. Bellugi, Do gravel bed river size distributions record channel network structure?, *Water Resources Research*, 42, W06D18, doi:10.1029/2006WR005035, 2006
5. Lashermes, B., E. Foufoula-Georgiou, and W. Dietrich, Objective delineation of valleys in canyon systems: a methodology based on wavelets and high resolution DEMs, in preparation, 2006.
6. Lashermes, B. and E. Foufoula-Georgiou, Area and width functions of river networks: new results on multifractal properties, *Water Resources Research*, under review, 2006
7. Gangodagamage C., E. Barnes, and E. Foufoula-Georgiou, Anomalous scaling in river corridor widths reflects localized nonlinearities in valley forming processes, under review, 2006.

1. SCALING BREAK IN FLOODS

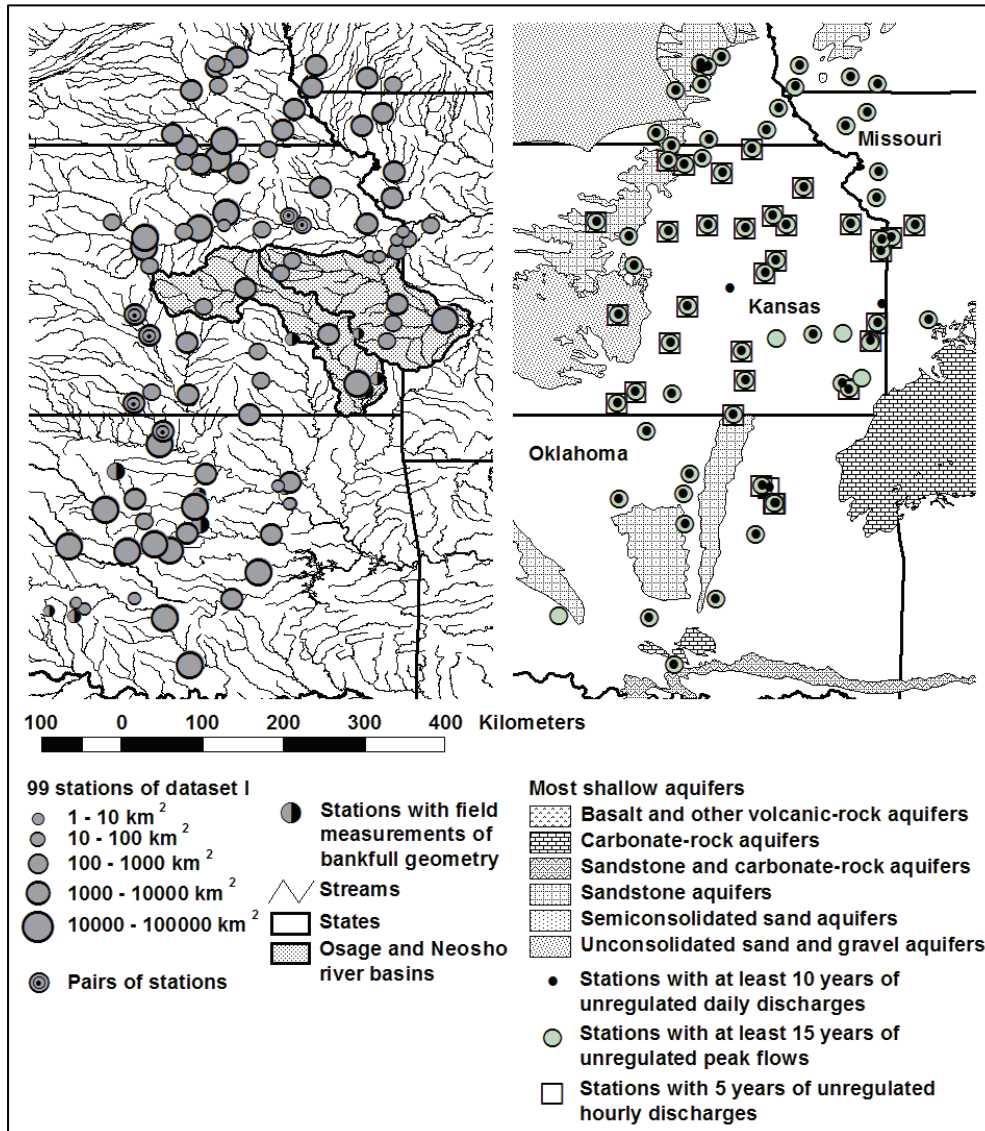
Multiscaling theory of flood peaks, Gupta et al. [1994]:

$$Q(\lambda A) \stackrel{d}{=} G(\lambda) Q(A)$$



(reproduced from *Smith, 1992*)

Midwest Region



- 99 stations for **HG** (100's of measurements for different Q/ station)

- 72 stations for **max annual flows** (>15 yrs)

- 70 stations for **daily flows** (>10 yrs)

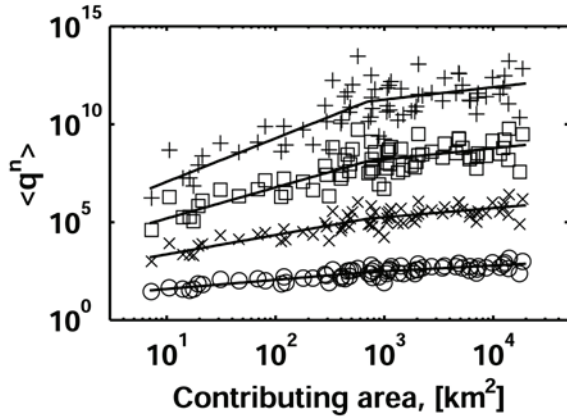
- 72 stations for **hourly flows** (>5 yrs)

- High resolution **hydrography** data for Osage and Neosho basins, KS

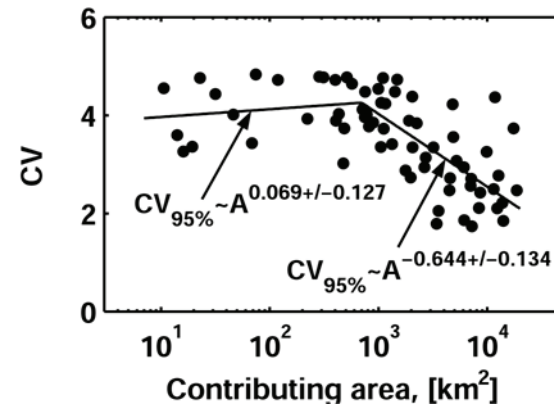
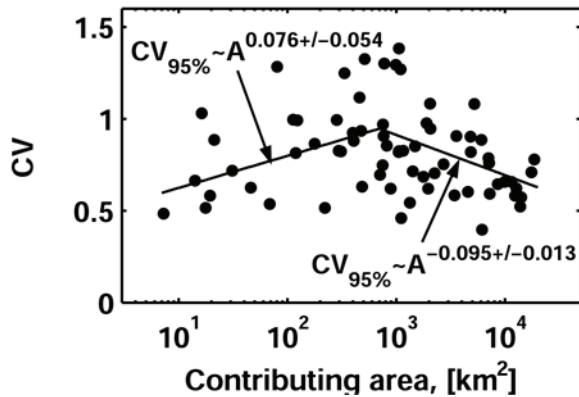
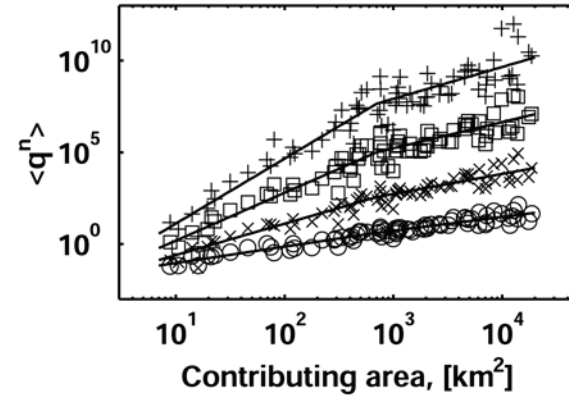
- **Stratigraphic logs** for 420 water wells

- 115 stations of **suspended sediment** (100's measurements for different Q/station)

Scaling of Maximum Annual Floods

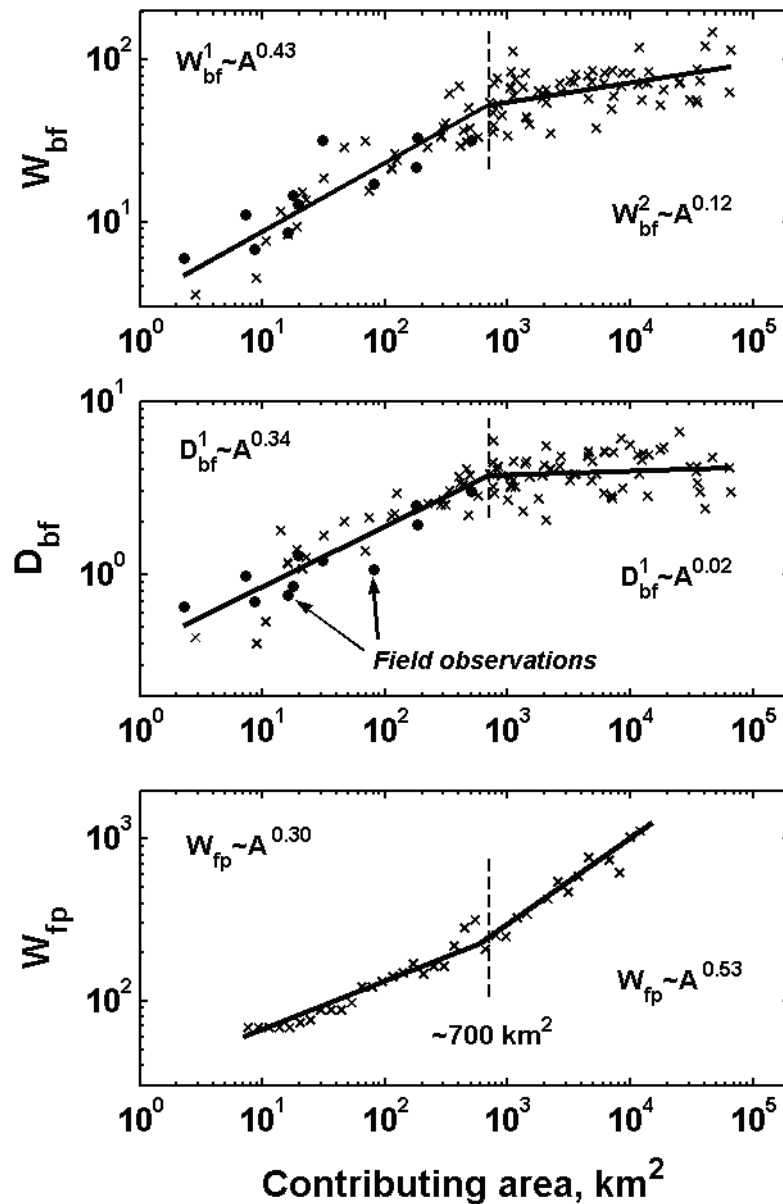


Scaling of Daily Discharges



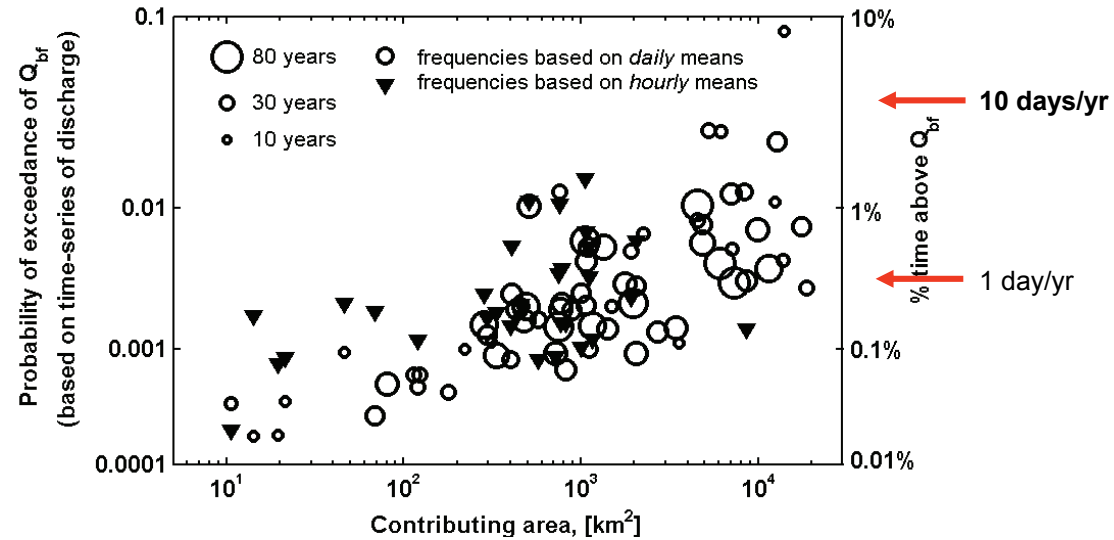
What controls the scaling break?

Channel Bankfull and Floodplain Geometry

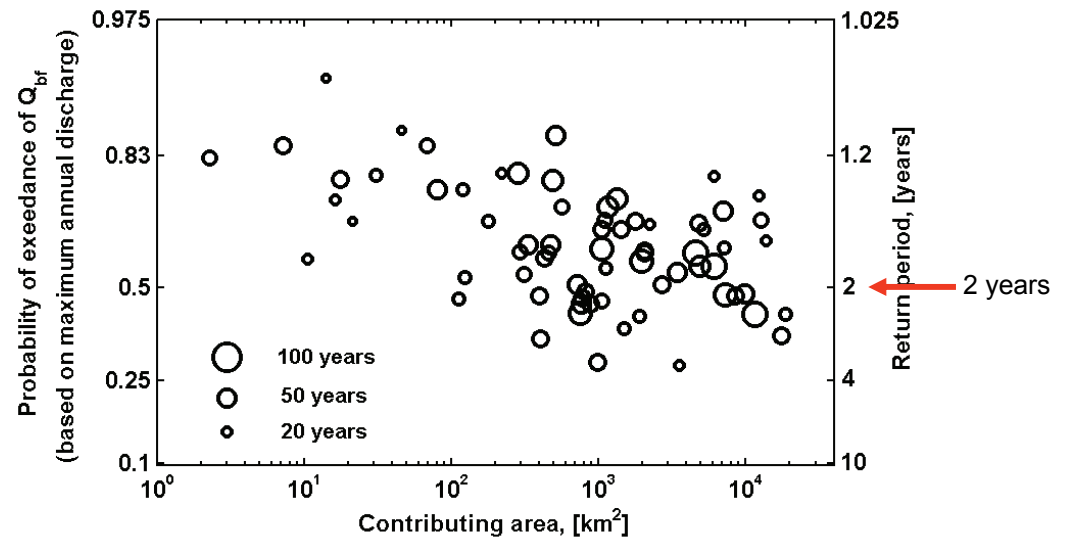


Frequency of Bankfull Discharge

(1) From daily/hourly time-series

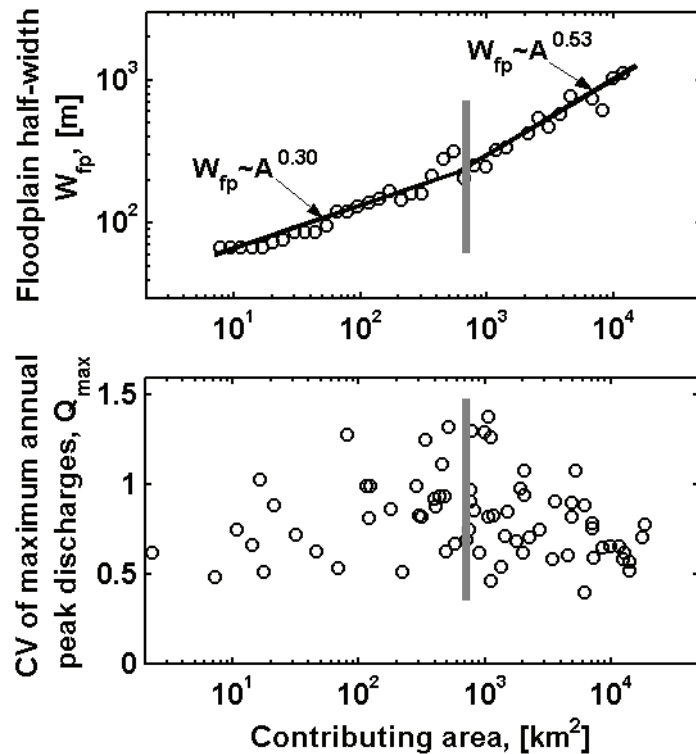


(2) From maximum annual discharges

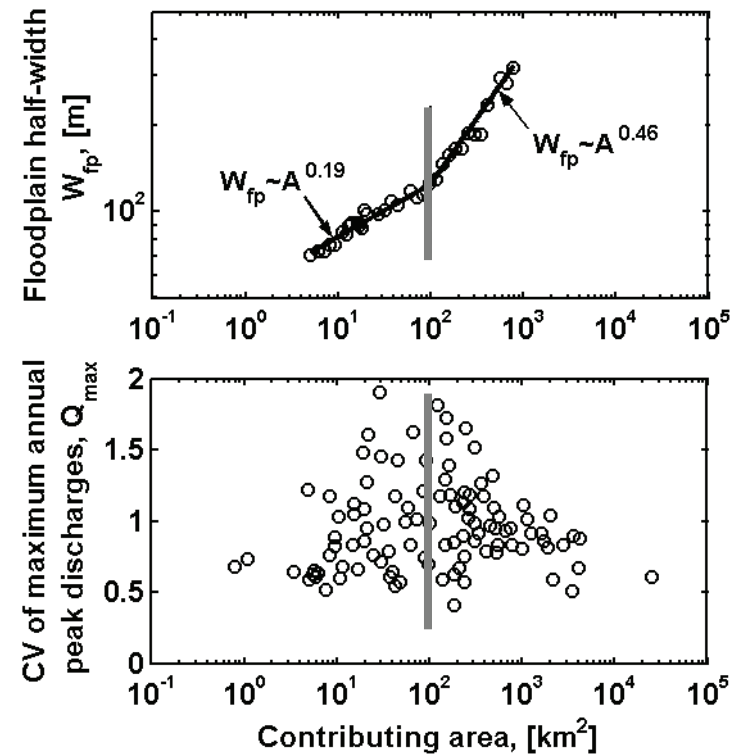


The scaling break in floods is controlled by the channel/floodplain geometry and interactions

Midwest



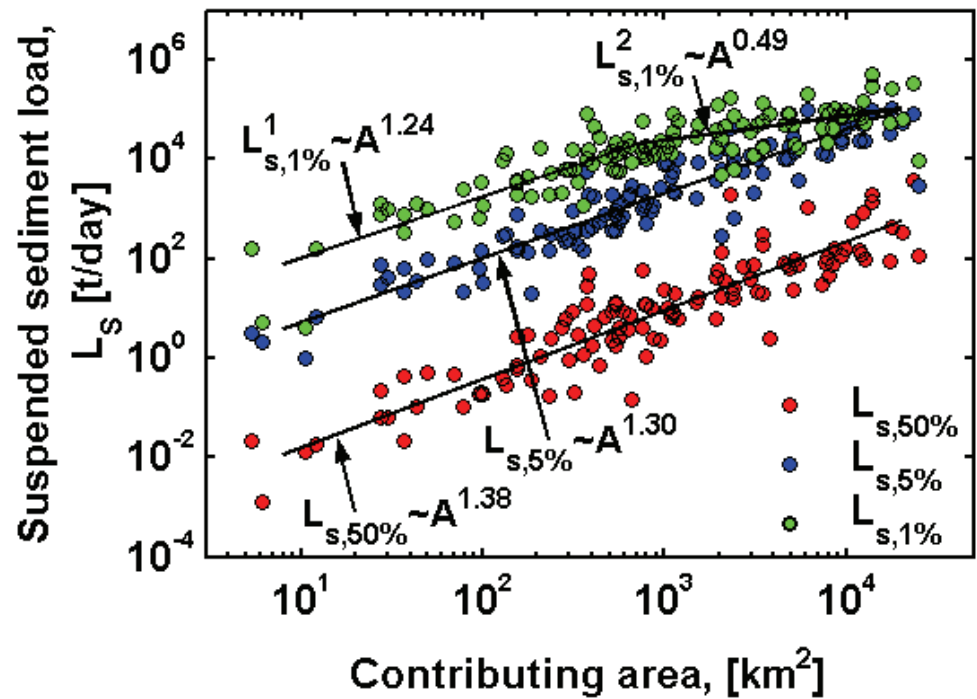
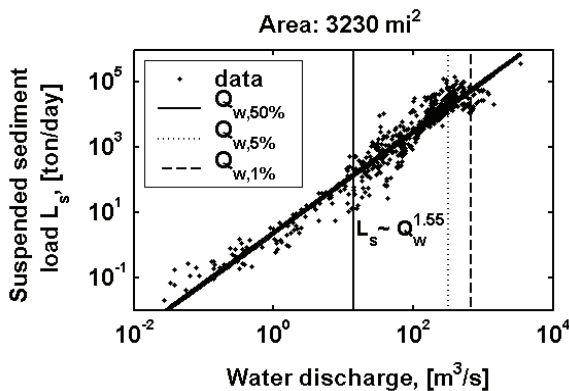
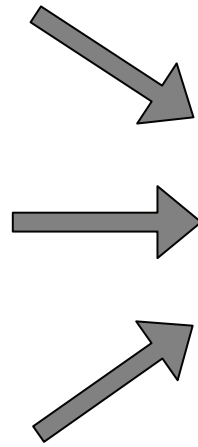
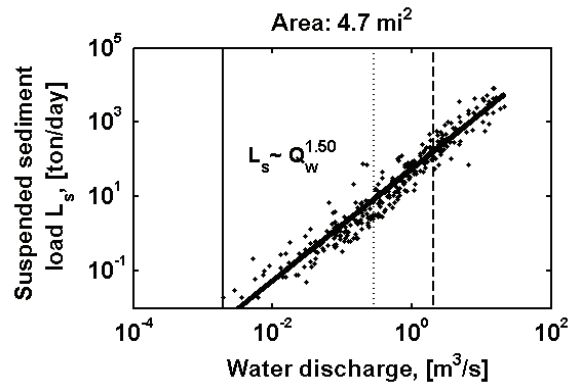
Appalachian



Implications for Flood Prediction

- Hydrologic transitions are imprinted in geomorphologic transitions
- High resolution DEMs offer potential to explicitly extract channel-floodplain morphometry which can:
 - (a) guide hydrologic predictions over a range of scales, and
 - (b) guide spatially-distributed modeling over large domains

Implications for Suspended Sediment Loads



2. Objective Extraction of Hillslope-to-Valley Transition from High Resolution DEMs (LIDAR)?

-Computation of local slope and curvature

$$h(x, y)$$

Gradient magnitude:

$$|\nabla h(x, y)| = \sqrt{\left(\frac{\partial h}{\partial x}\right)^2 + \left(\frac{\partial h}{\partial y}\right)^2}$$

direction:

$$\theta(x, y) = \tan^{-1}\left(\frac{\frac{\partial h}{\partial y}}{\frac{\partial h}{\partial x}}\right)$$

curvature:

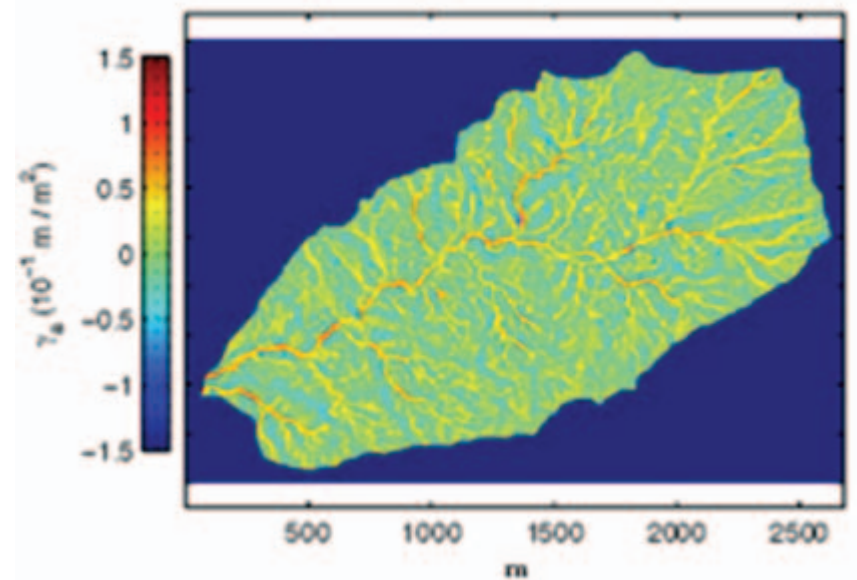
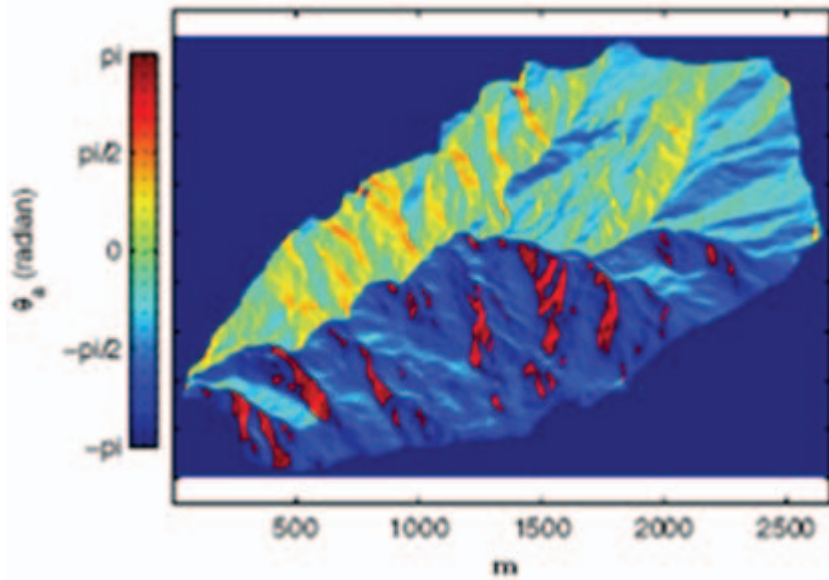
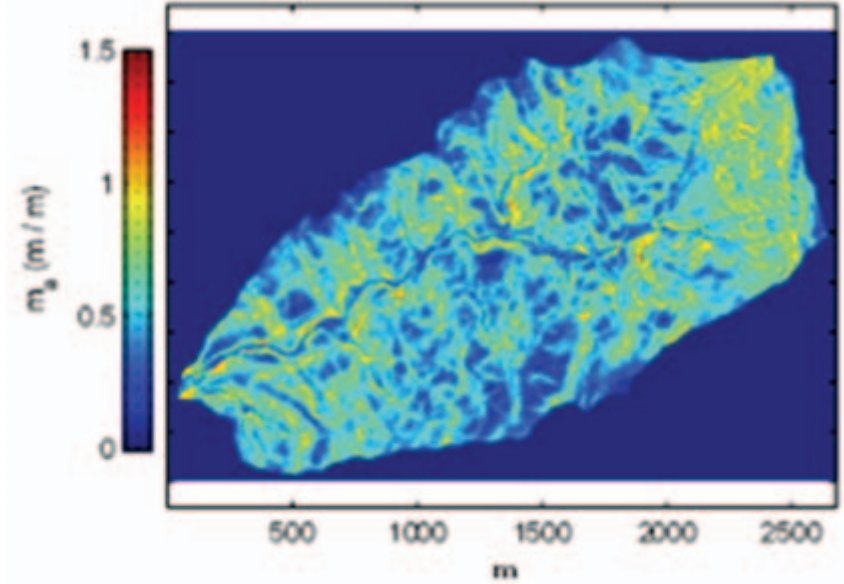
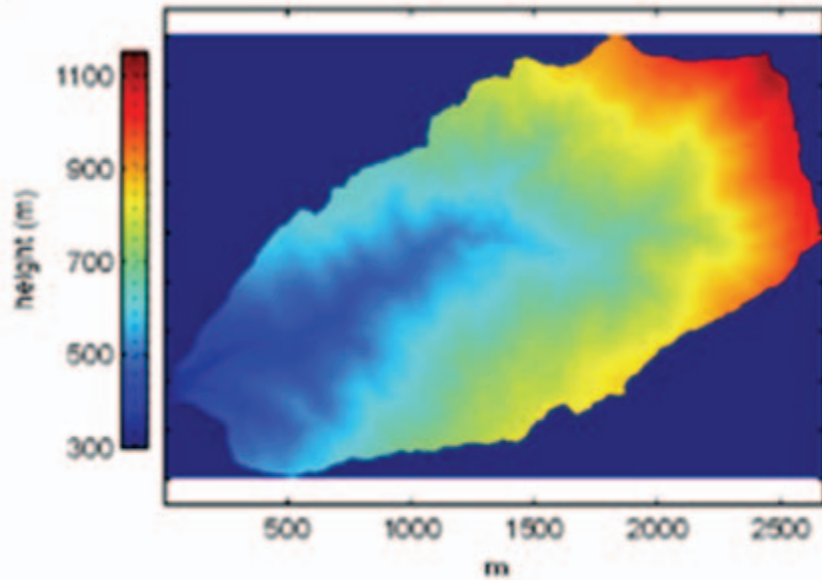
$$\nabla^2 h(x, y) = \frac{\partial^2 h(x, y)}{\partial x^2} + \frac{\partial^2 h(x, y)}{\partial y^2}$$

-Typically, smooth topography and then take ∇h , $\nabla^2 h$ or smooth local ∇h , $\nabla^2 h$ by spatial averaging.

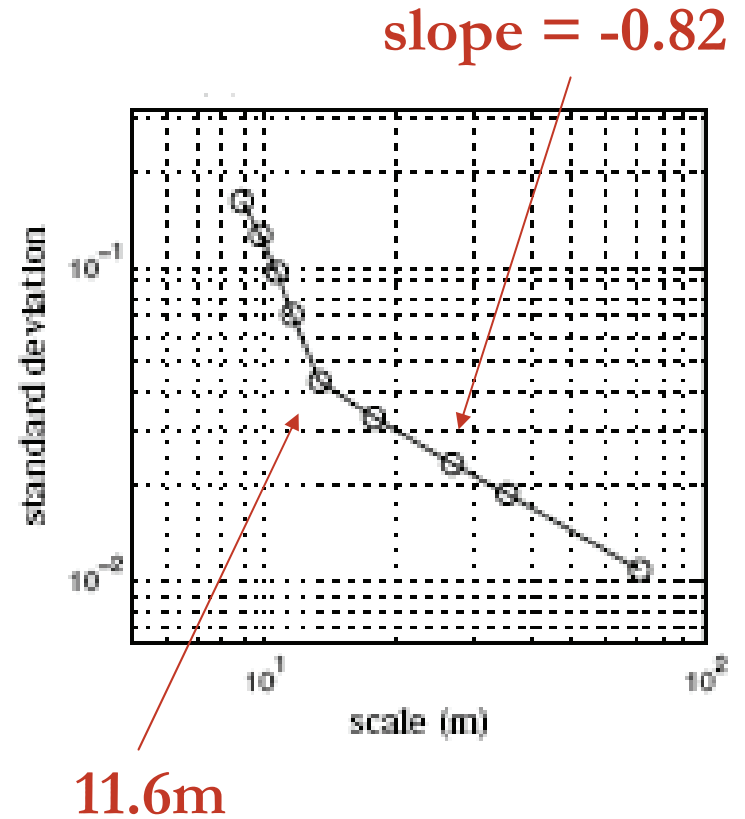
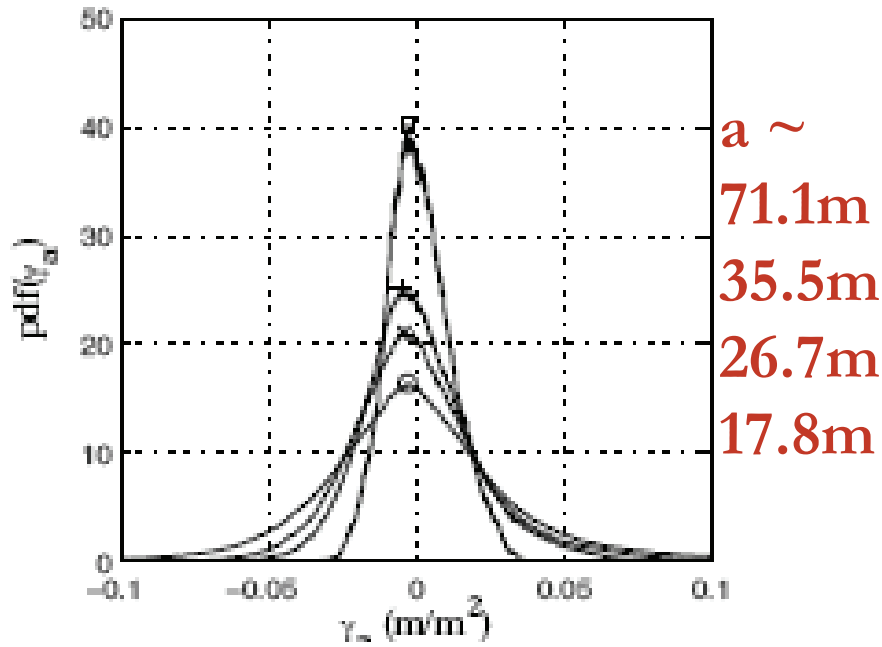
-Propose a wavelet-based formalism (**compute attributes at a range of scales**):

$$\frac{\partial}{\partial x}(h * g) = \frac{\partial h}{\partial x} * g = h * \frac{\partial g}{\partial x}$$

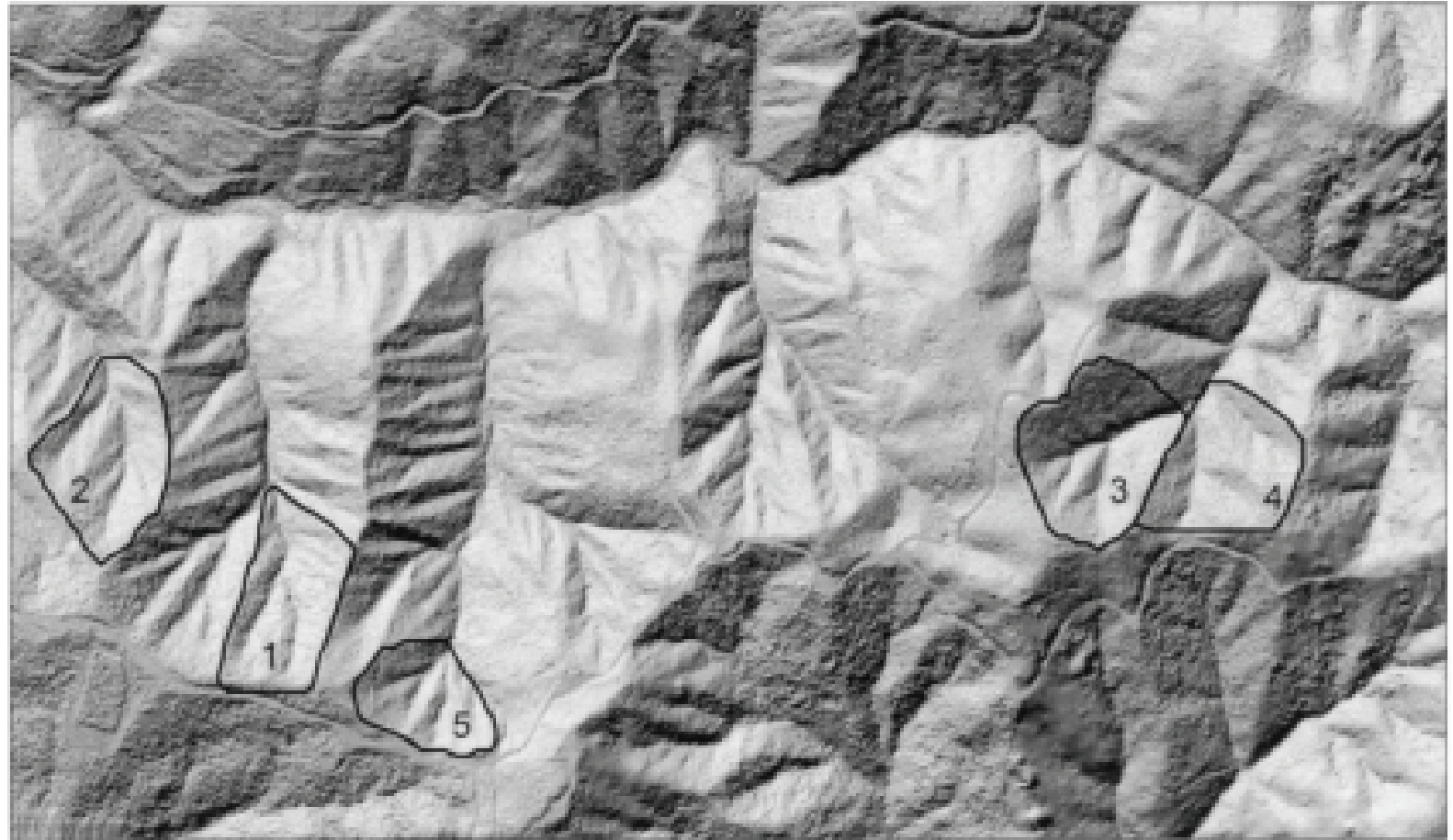
Angelo Coast Reserve



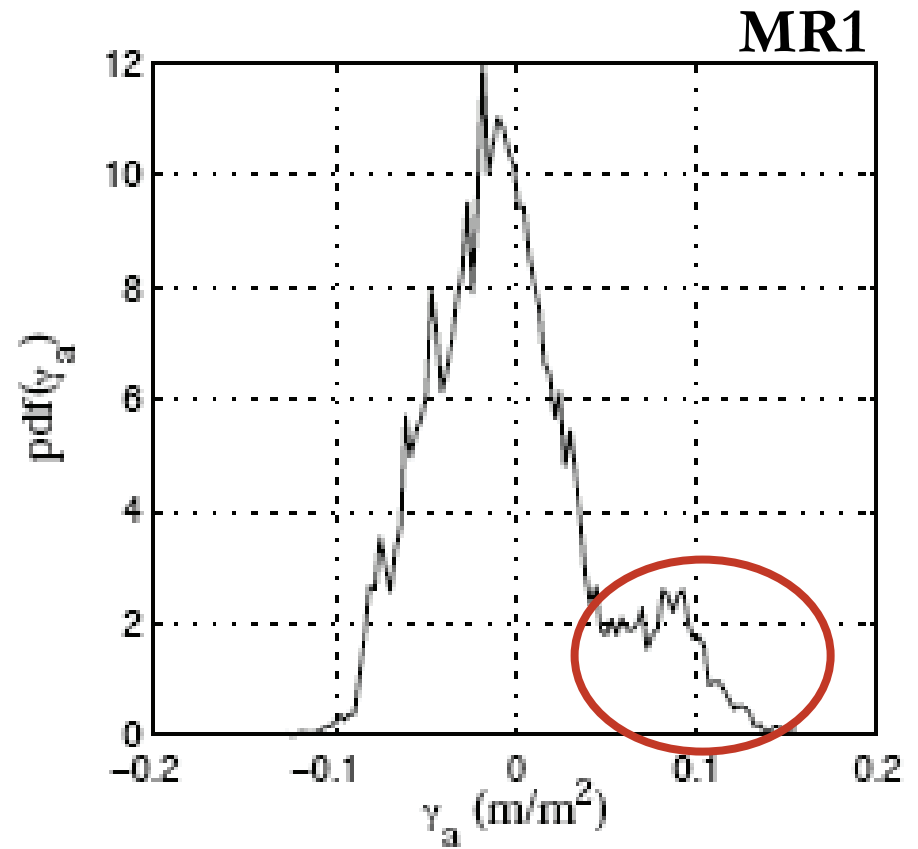
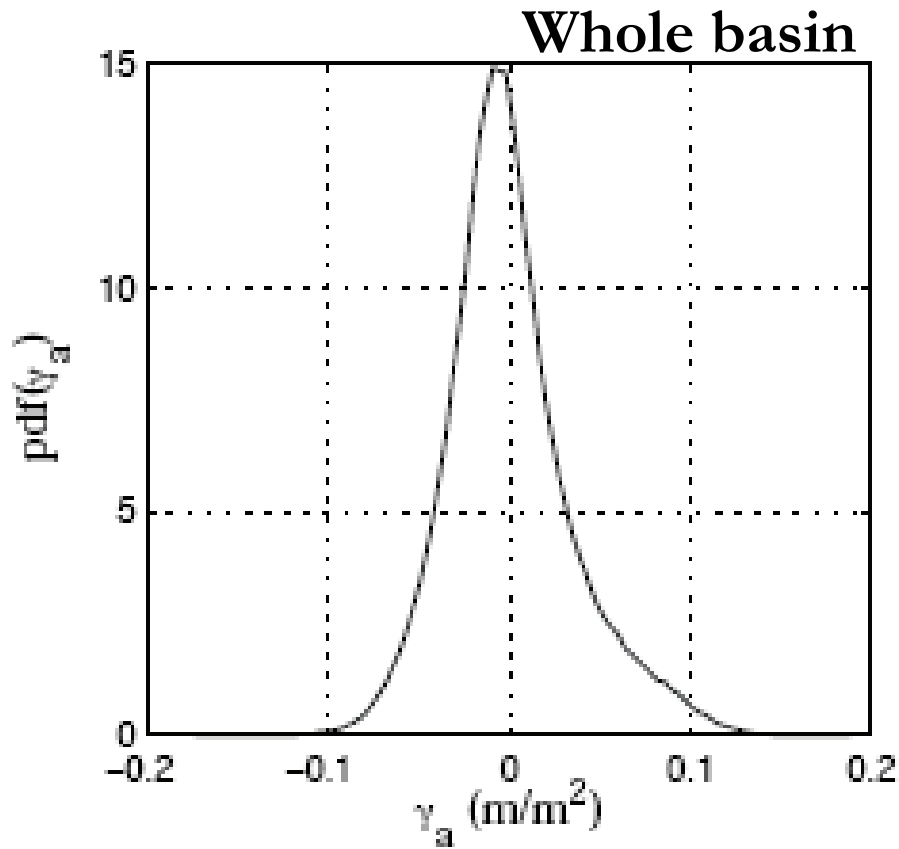
Minimum Scale for Curvature Interpretation?



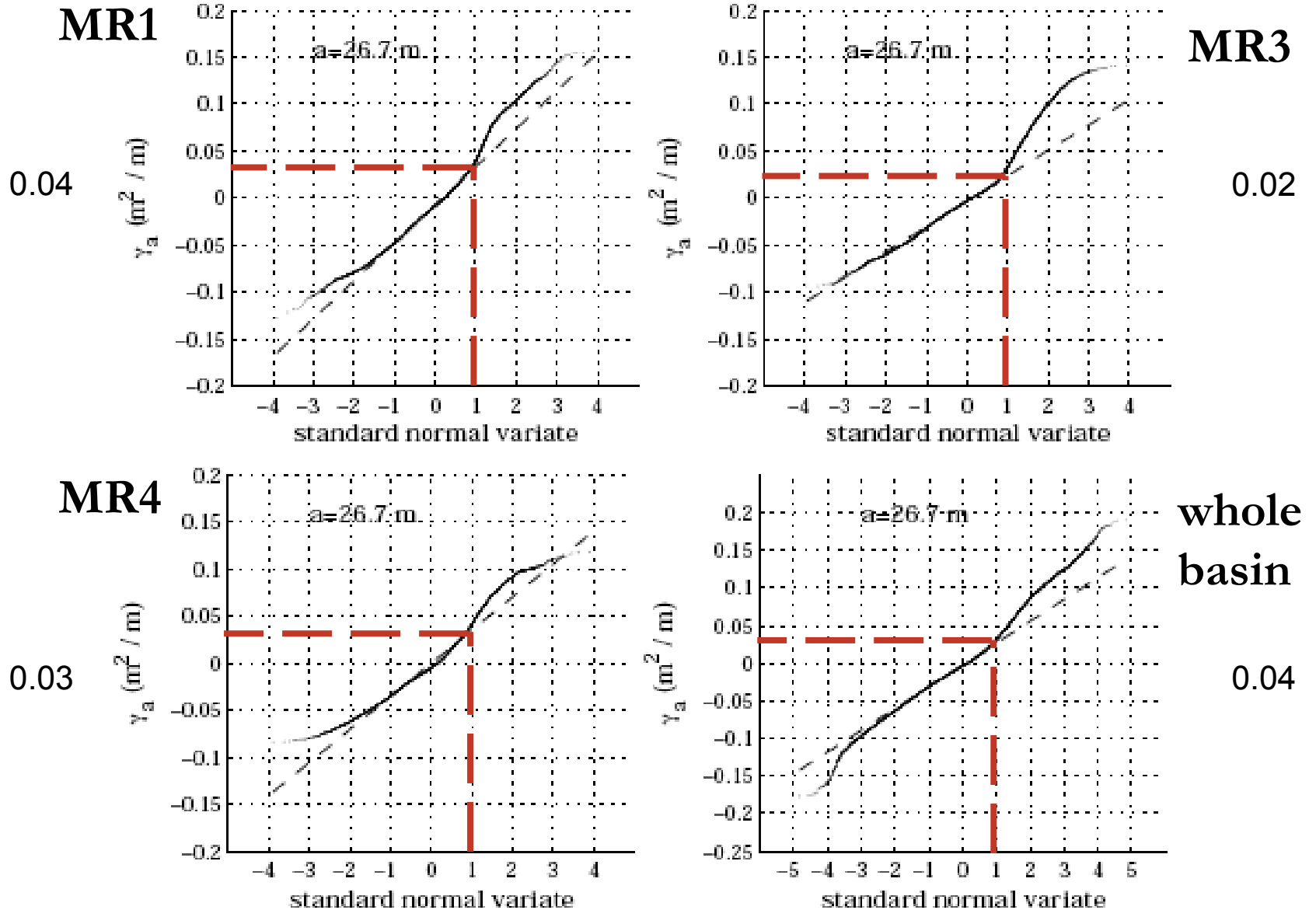
Oregon Coast Range



Pdf of γ_a for OCR ($a=26.7\text{m}$)

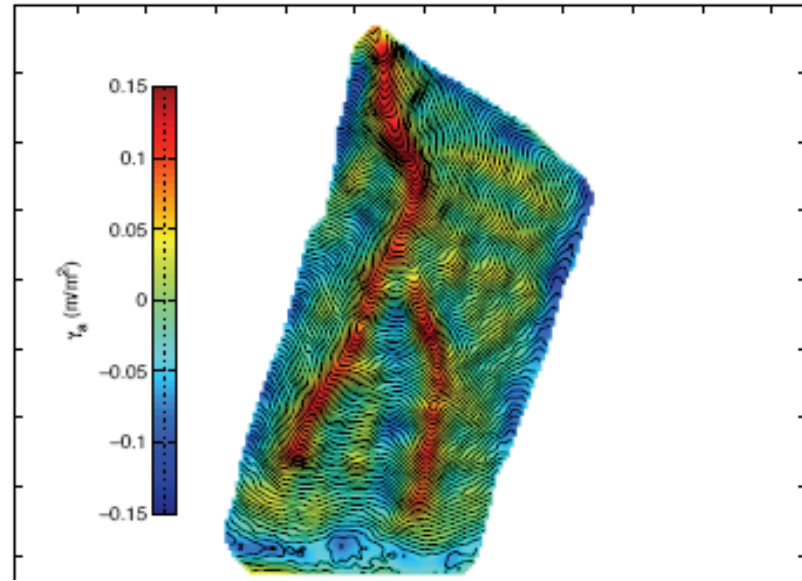


OCR: Q-q plots for γ_a

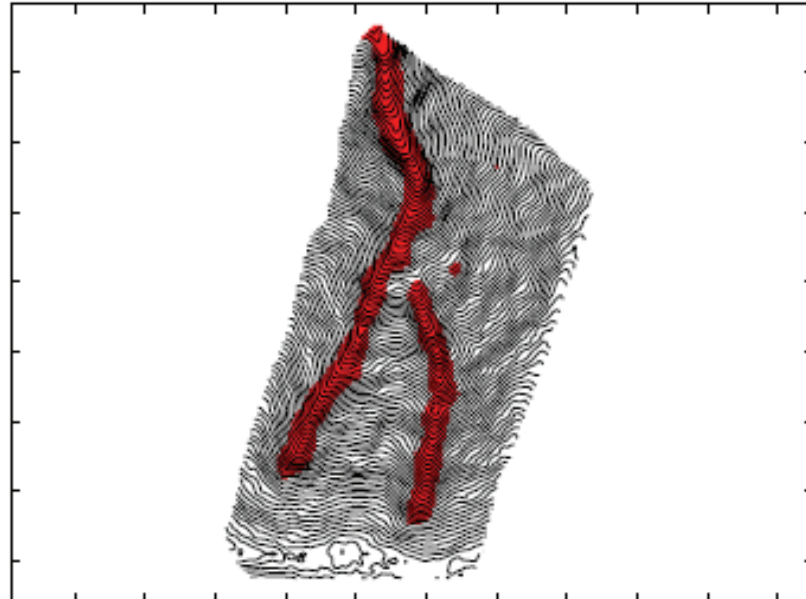


MR1 Subbasin

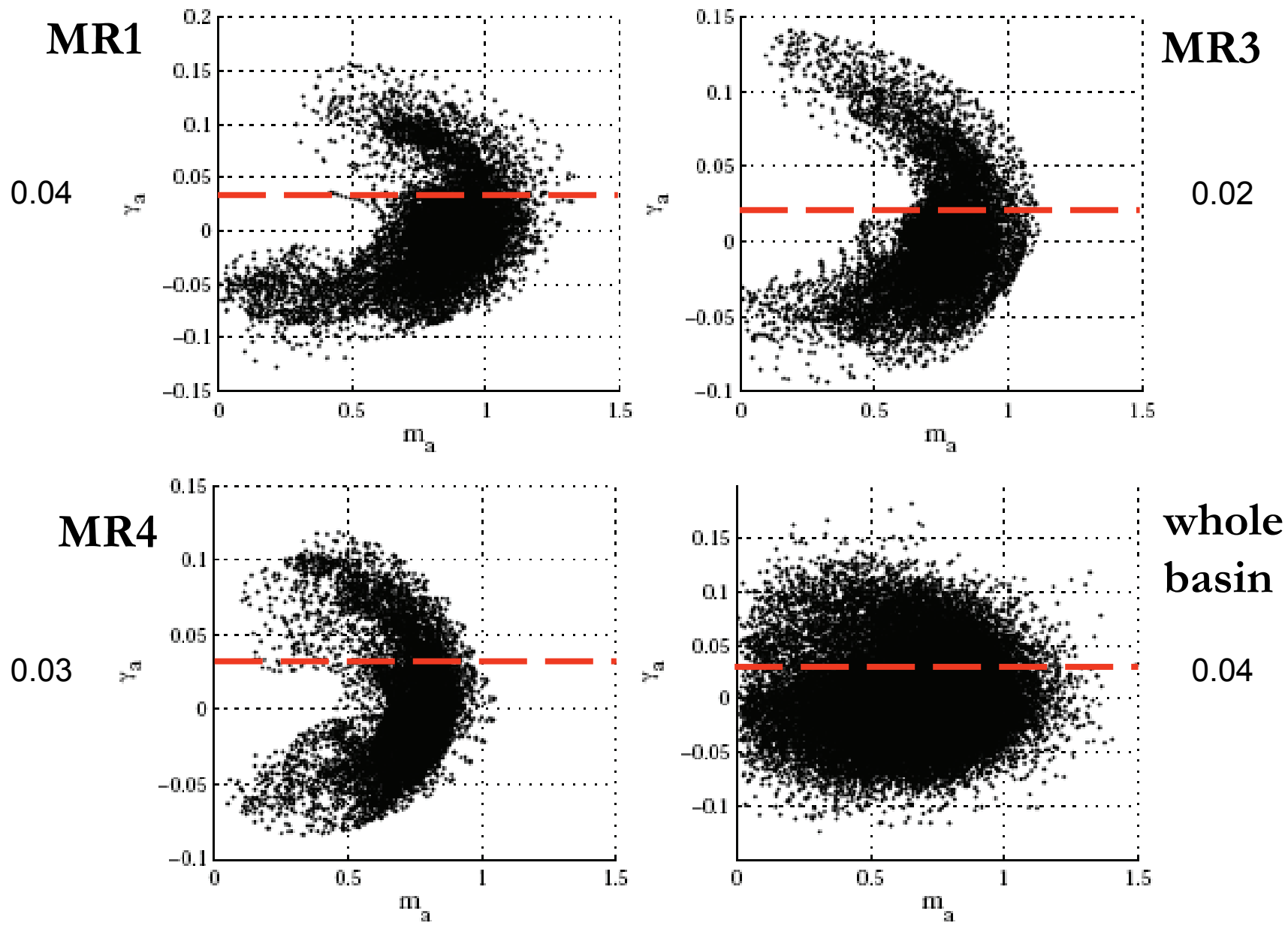
γ_a 

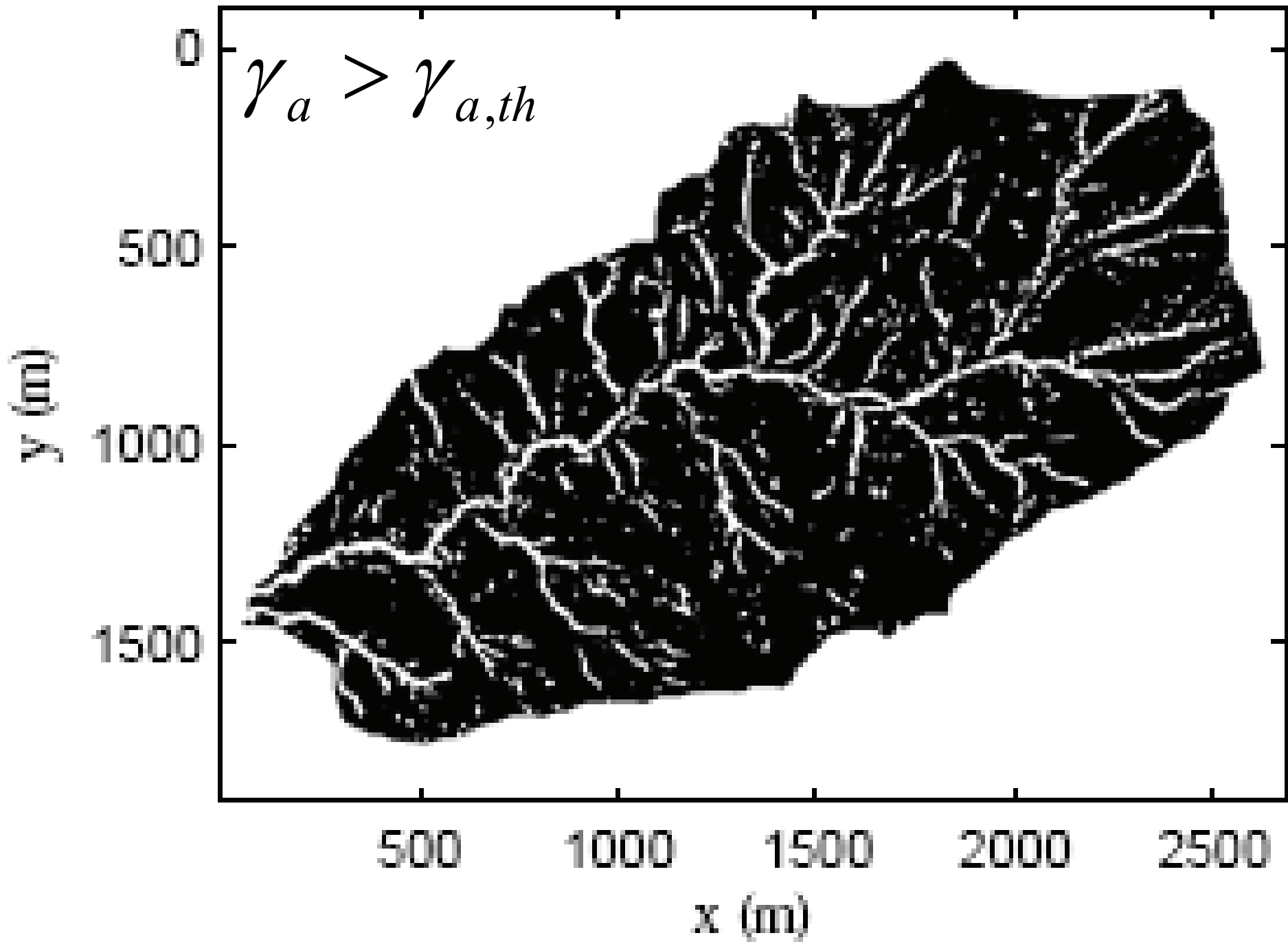


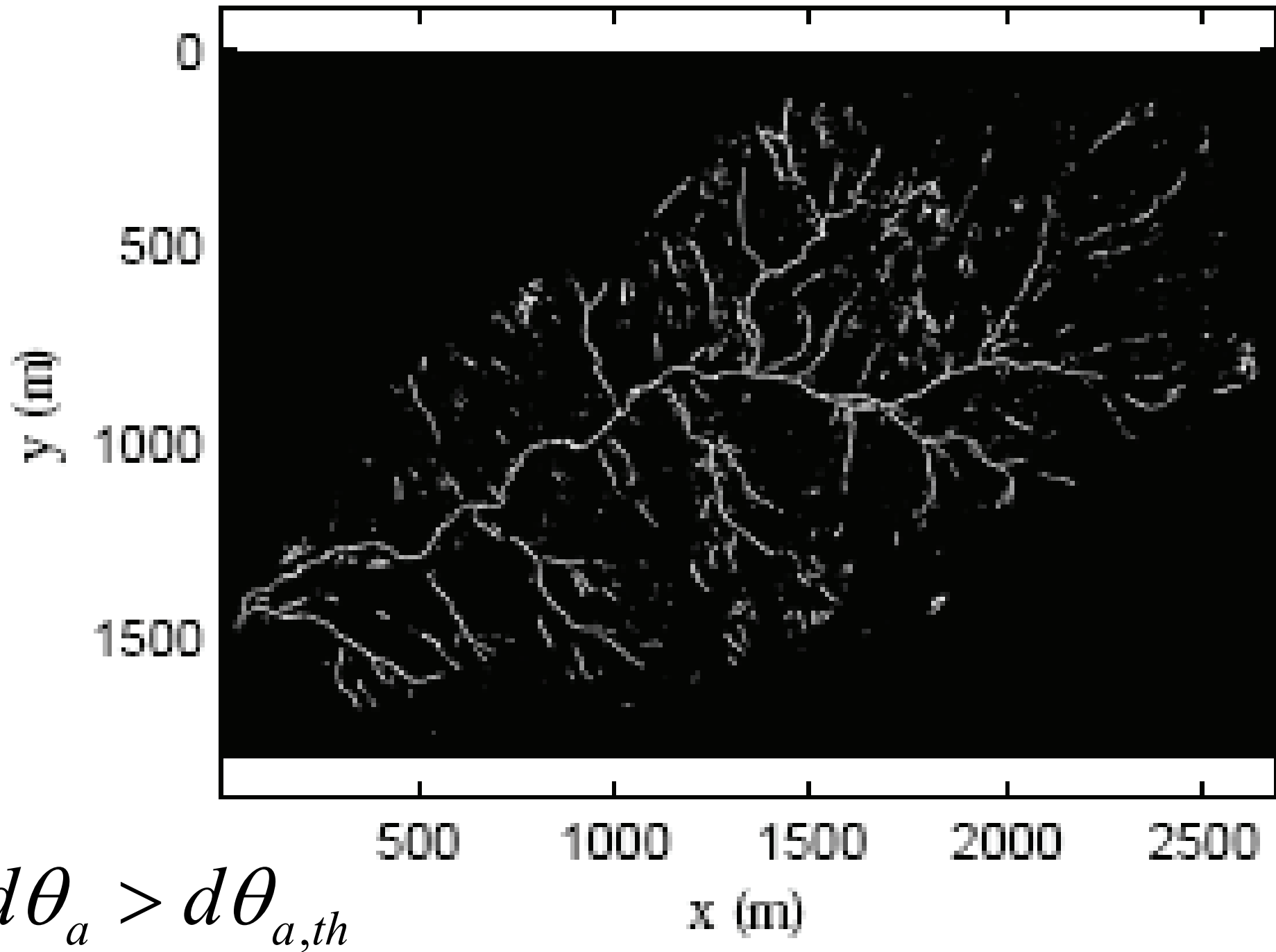
$$\gamma_a \geq \gamma_{a,th}$$

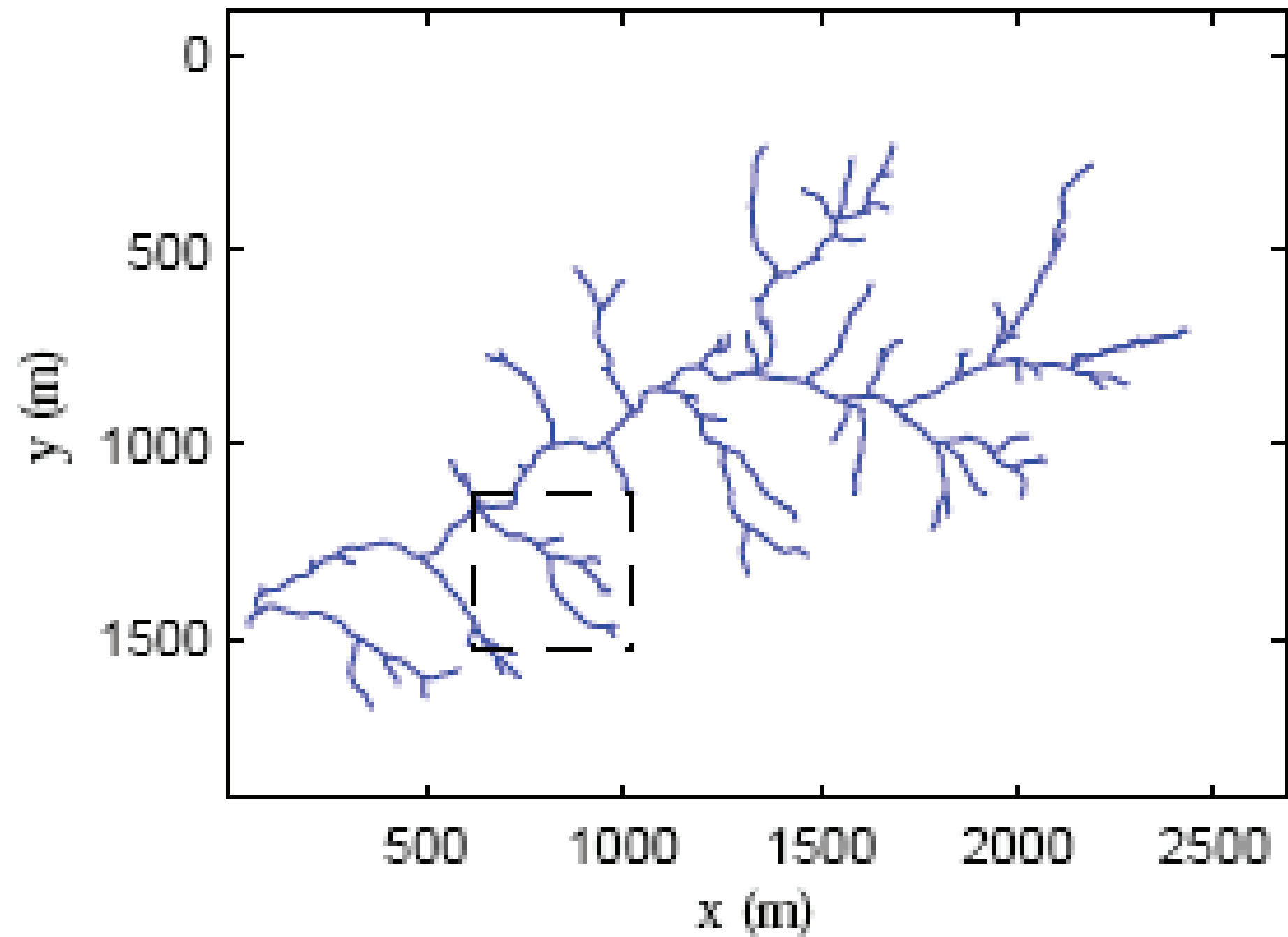


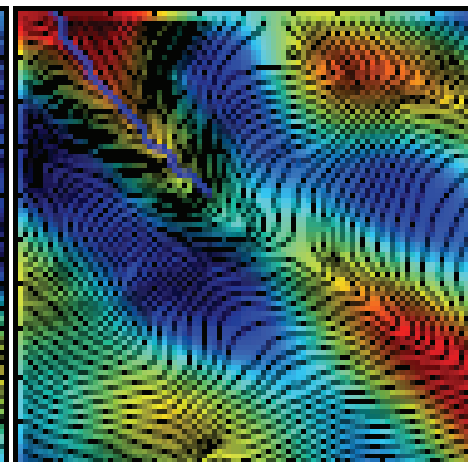
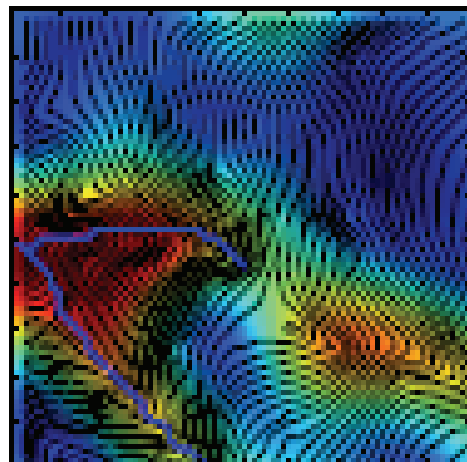
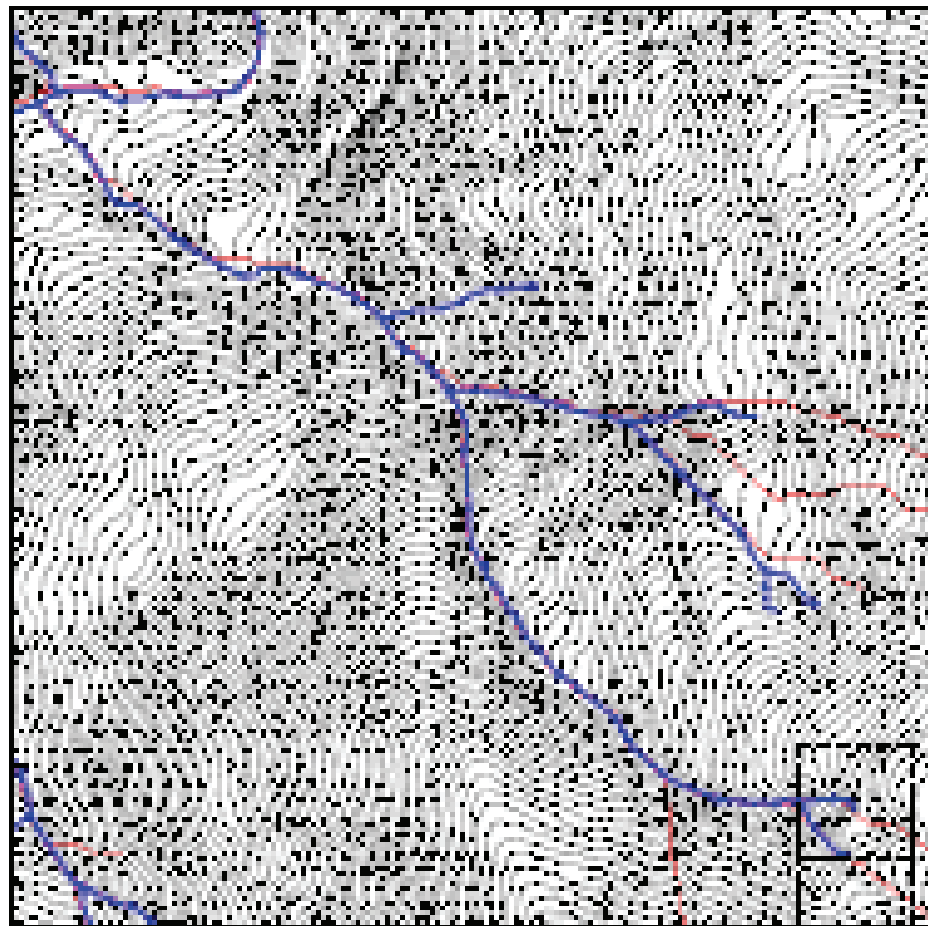
Curvature vs. Gradient for OCR











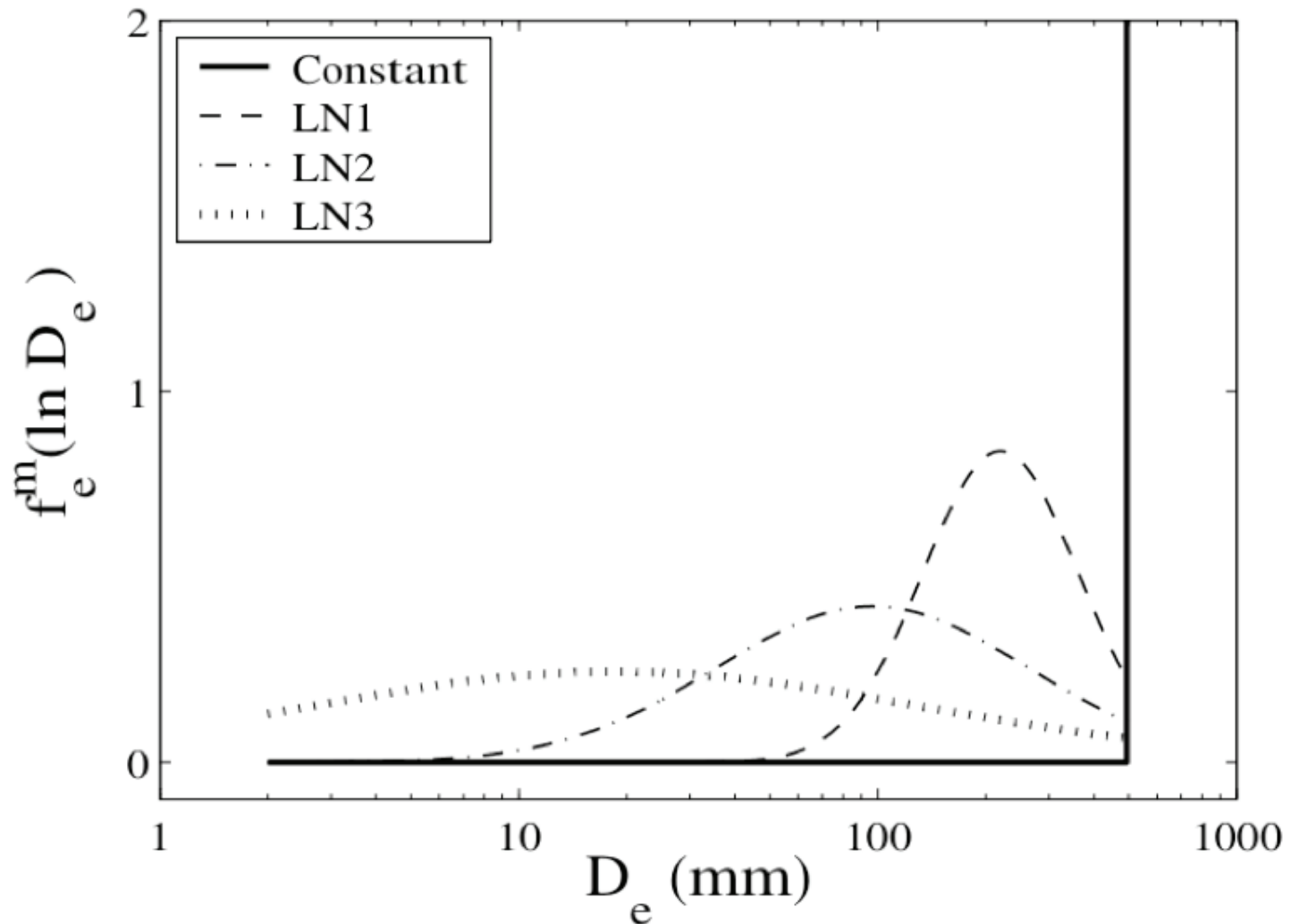
3. Bedload size distributions:

Importance of hillslope sediment production

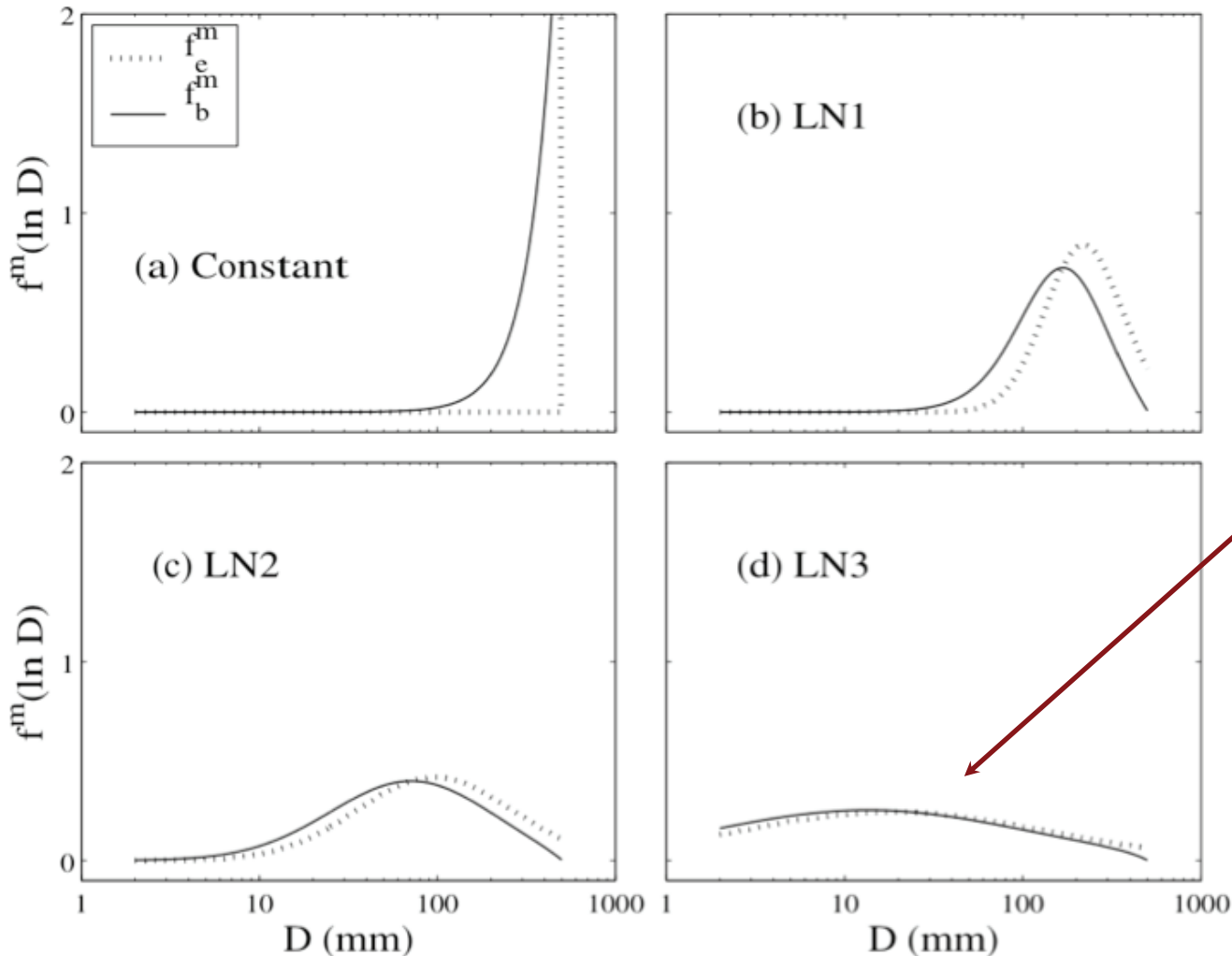
Do gravel bed size distributions record channel network structure?

Ref: Sklar L. S., W. E. Dietrich, E. Foufoula-Georgiou, B. Lashermes, D. Bellugi, Do gravel bed river size distributions record channel network structure?, *Water Resources Research*, 42, W06D18, doi:10.1029/2006WR005035, 2006.

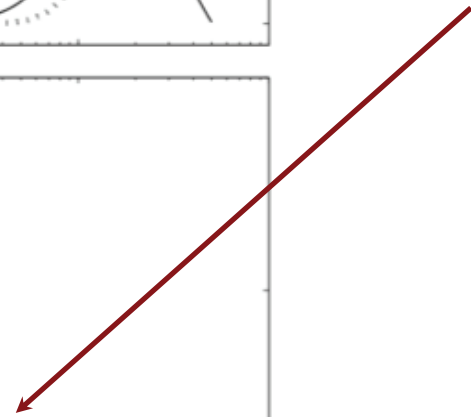
Pdfs of **entering** sediment



Pdfs of **entering** sediment & **steady-state** bedload sediment



As variance of entering sediment distribution increases, bedload steady-state pdf approaches entering pdf



Conclusions and Implications

Bedload mass flux equilibrates with supply over length scale of $1/\alpha$, and then it becomes *independent* of drainage area

How do channel cross sections develop under flow which scales with area but bedload mass flux that is constant?

The **bedload steady-state grain size distribution** differs little from the hillslope supply distribution in the case of poorly sorted hillslope sediments

Large-scale variability in bed material is due primarily to spatial gradients in hillslope sediment production and transport characteristics

Need theory and data to predict the grain size distribution supplied to channels by hillslopes

4. River Corridor Geometry:

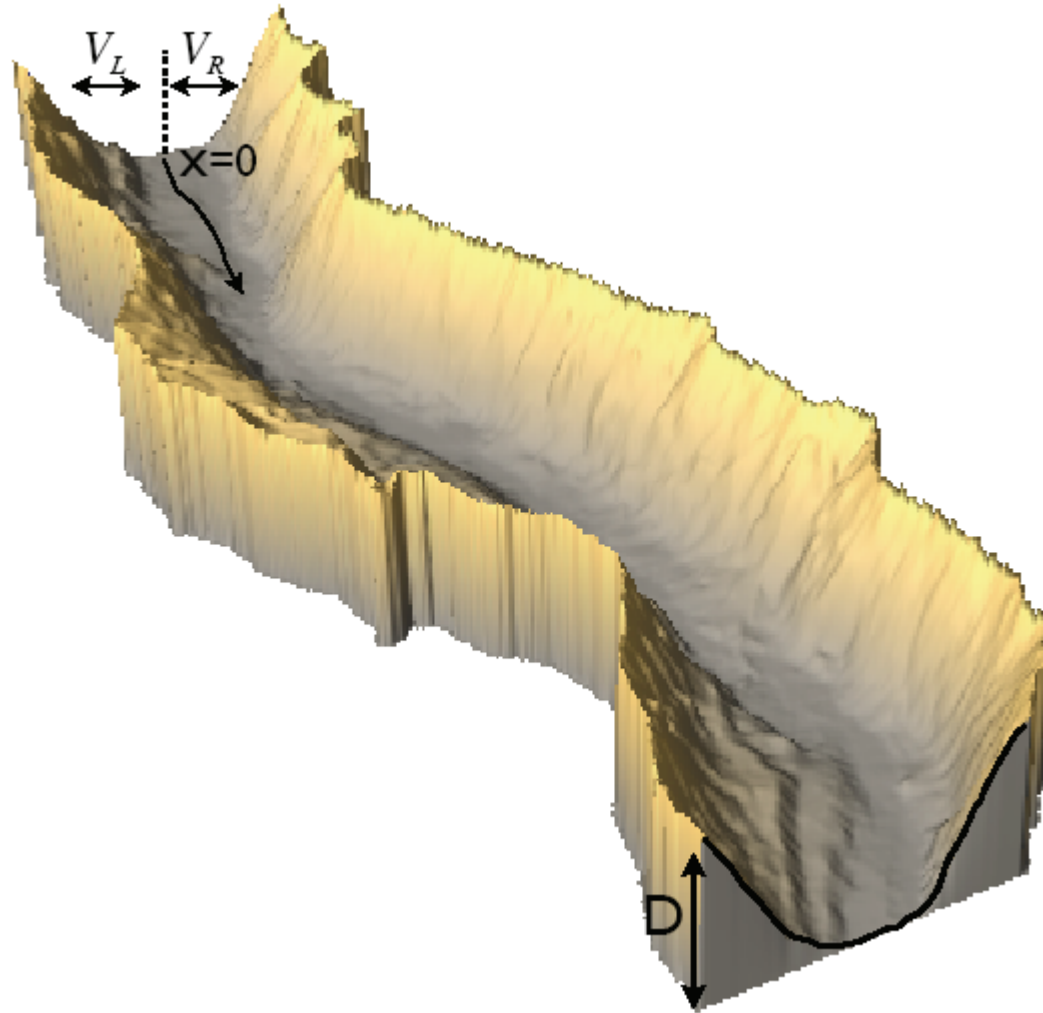
Can statistics reveal the underlying physics?

4. River Corridor Geometry:

Can statistics reveal the underlying physics?

- Do differences in mechanistic laws governing valley-forming processes leave their signature on the statistical properties of valley geometry?
- Are statistically-distinct regimes the result of physically-distinct valley-forming processes?

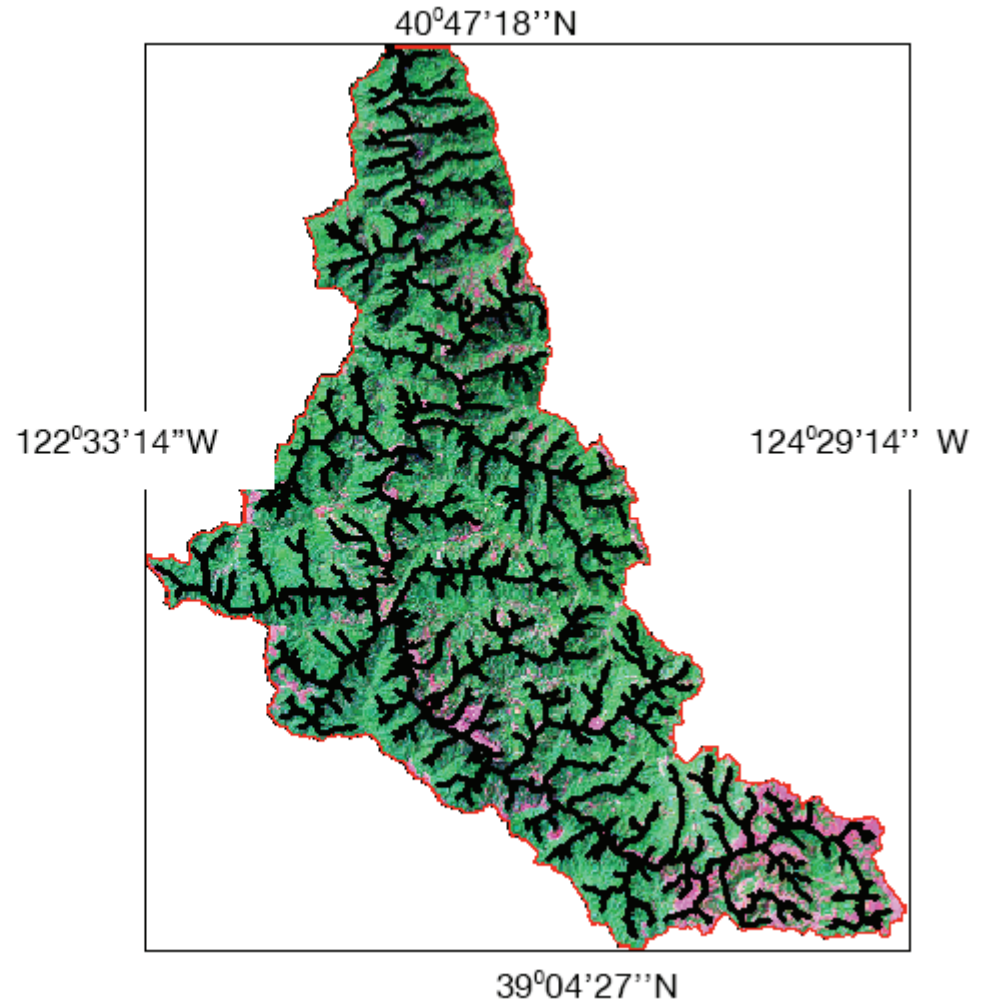
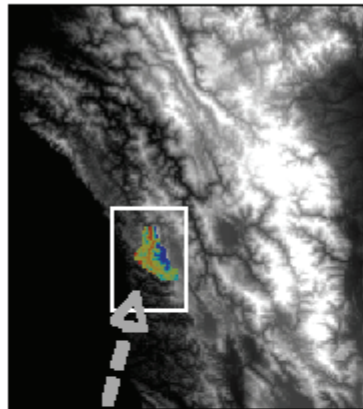
River Corridor Width Functions



$$V_L(x; D)$$

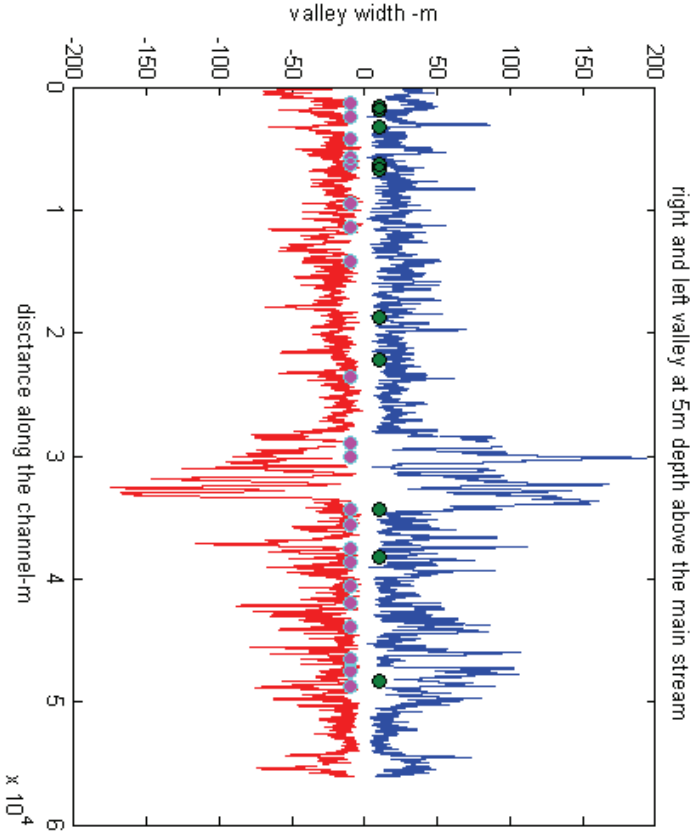
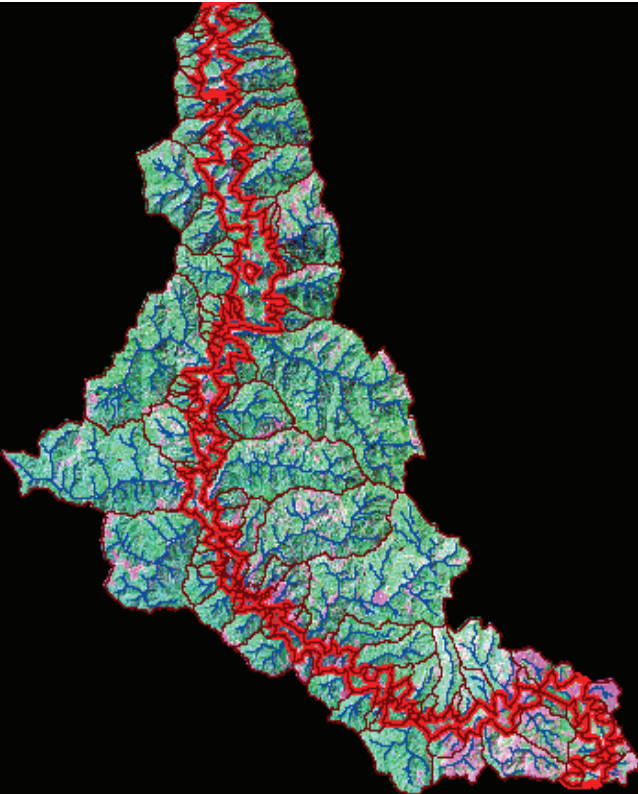
$$V_R(x; D)$$

South Fork Eel River, CA

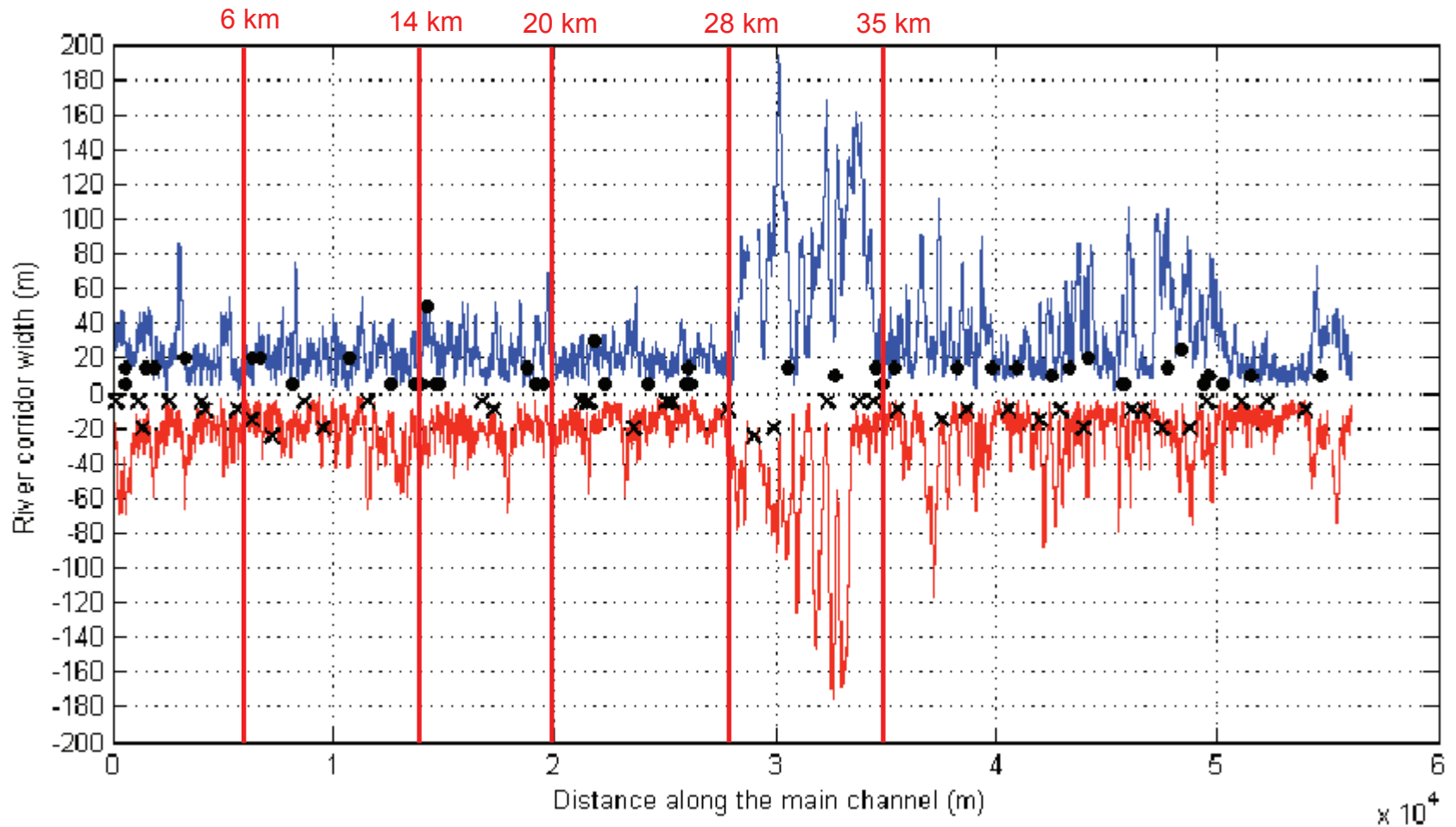


Area = 351 km²

River Corridor Width Function (D=5m)

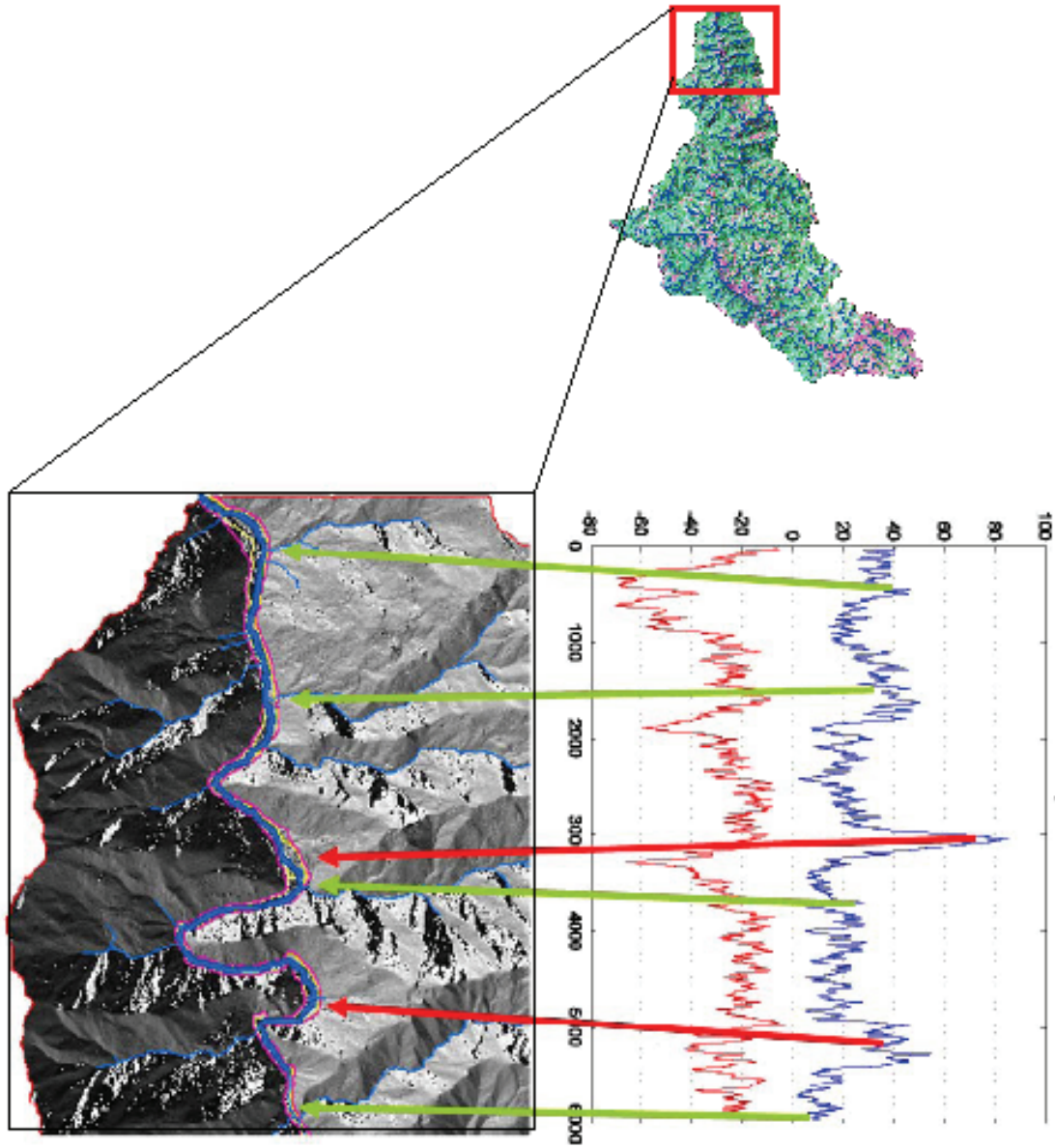


River Corridor Width Function: South Fork Eel River



89 tributaries: (1 km² – 150 km²)

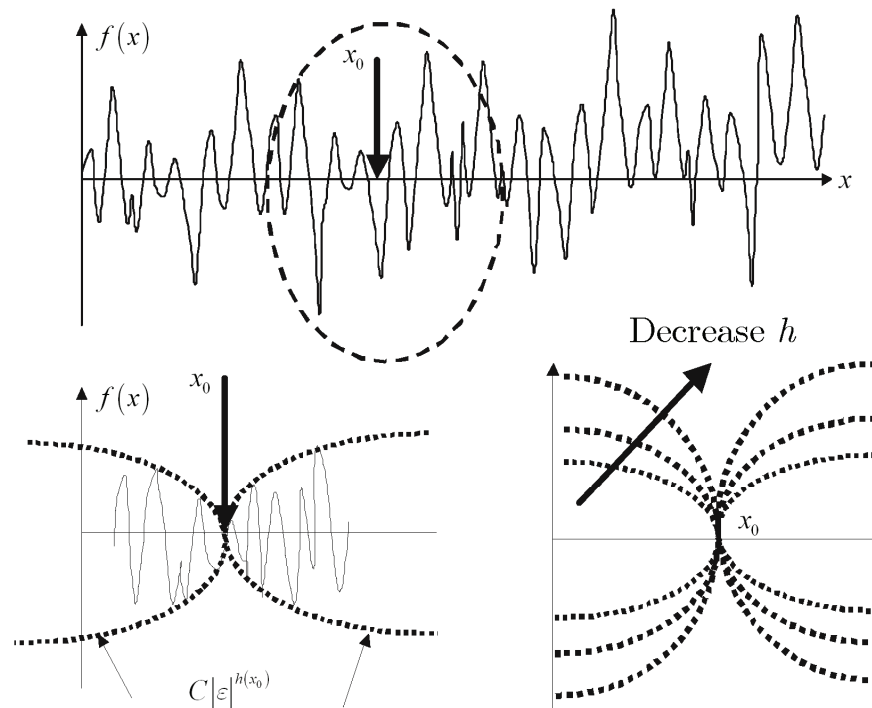
River Reach: 0-6 Km



MULTIFRACTAL FORMALISM

- Characterize a signal $f(x)$ in terms of its local singularities

$$|f(x_0) - f(x_0 + \varepsilon)| \leq C \cdot |\varepsilon|^{h(x_0)}$$

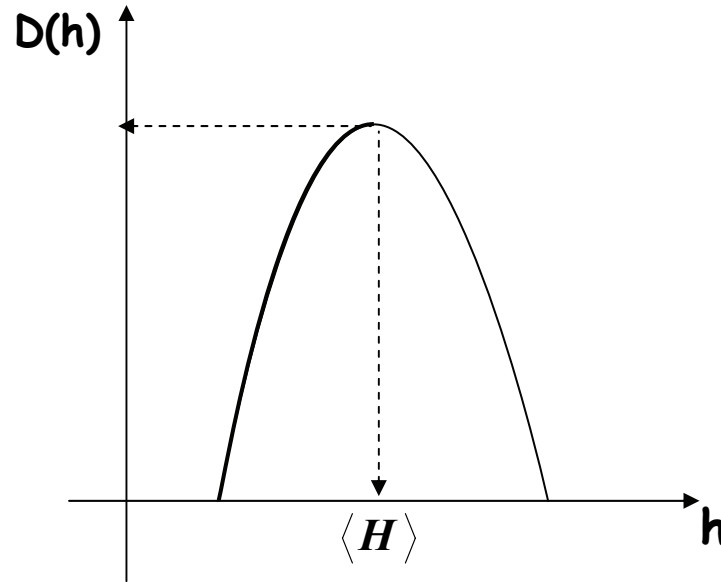


Ex: $h(x_0) = 0.3$ implies $f(x)$ is very rough around x_0 .

$h(x_0) = 0.7$ implies a "smoother" function around x_0 .

Multifractal Formalism

- Spectrum of singularities $D(h)$



- $D(h)$ can be estimated from the statistical moments of the fluctuations.

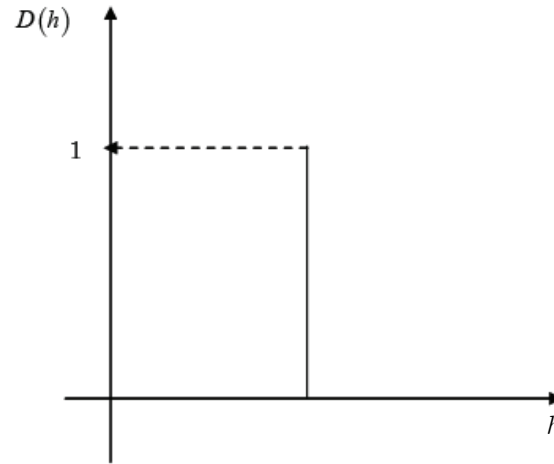
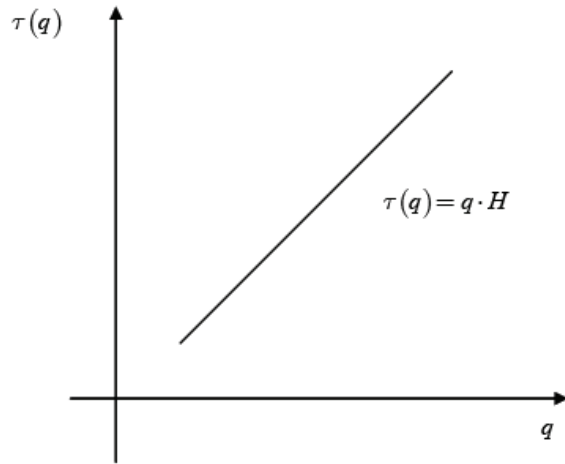
$$M(q, a) = \left\langle \left| f(x) - f(x+a) \right|^q \right\rangle \sim a^{\tau(q)}$$

$$D(h) = \min_q [qh - \tau(q) + 1]$$

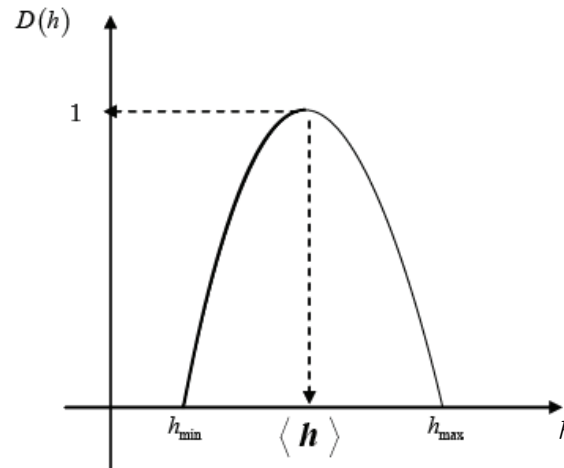
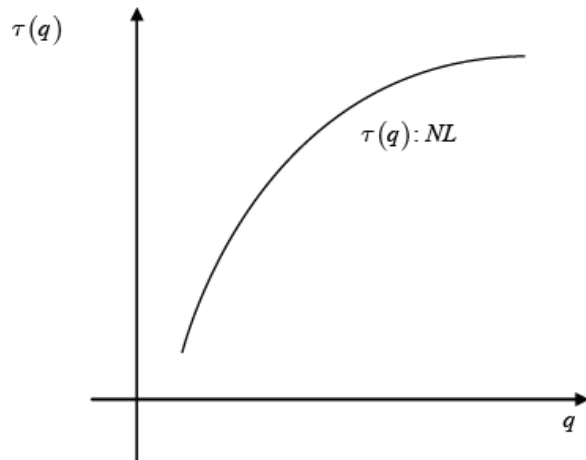
Legendre Transform

Multifractal Formalism

- Spectrum of scaling exponents $\tau(q)$



monofractal



multifractal

Implications of Multifractality

-Normalized moments depend on scale

$$\text{e.g., } CV(a)^2 = \frac{M_2(a) - M_1^2(a)}{M_1^2(a)} = \frac{M_2(a)}{M_1^2(a)} - 1 = a^{\tau(2) - 2\tau(1)} - 1$$

mono-scaling: $\tau(q) = q \cdot H \rightarrow CV(a) = \text{constant}$

multi-scaling: $\tau(q) \neq q \cdot H \rightarrow CV(a)$ depends on a

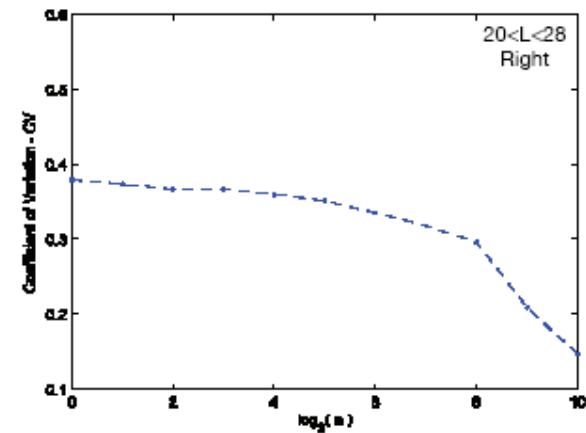
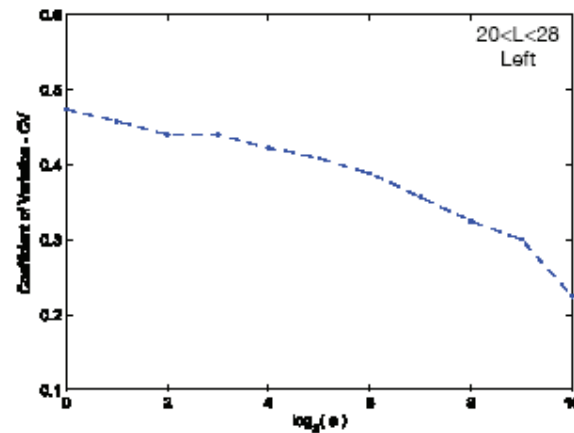
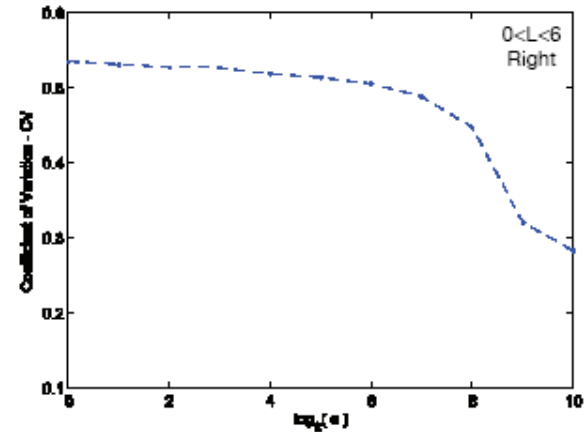
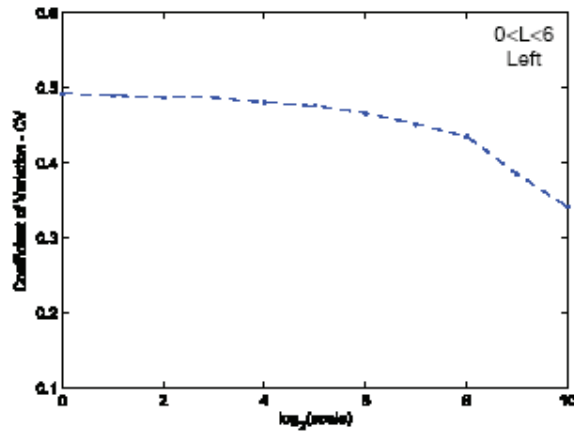
-Statistical moments of fluctuations increase faster as scale decreases (at very small scales, pdfs have heavy tails)

-Chance of getting very high fluctuations locally, although sparsely.

-More than one degree of singularities is present.

-These singularities are spread throughout the signal intermittently

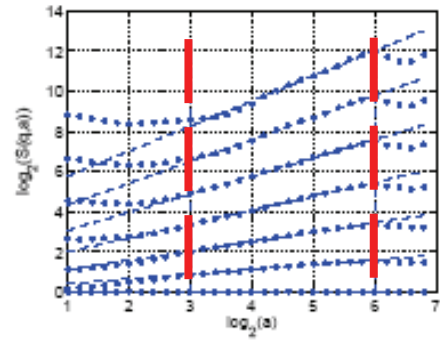
CV of River Corridor Widths



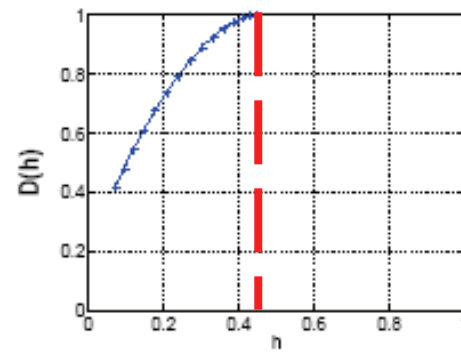
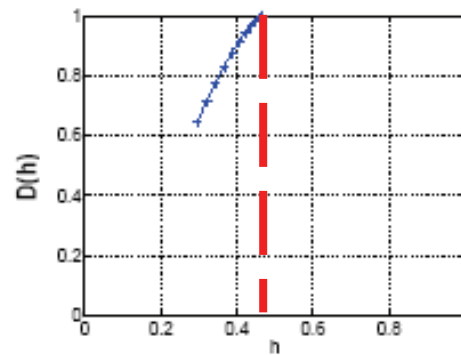
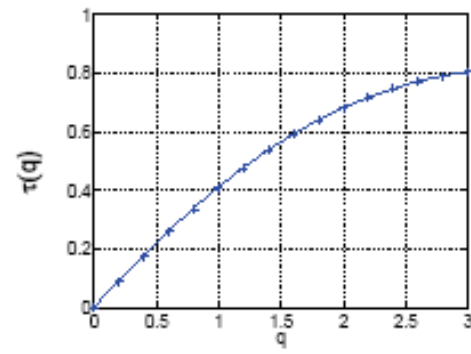
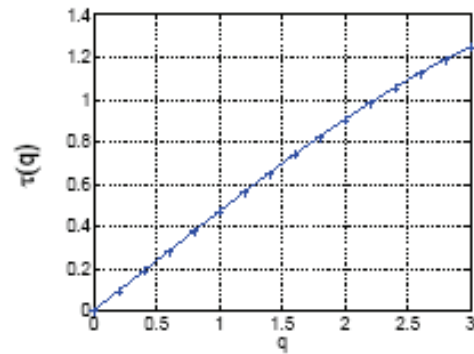
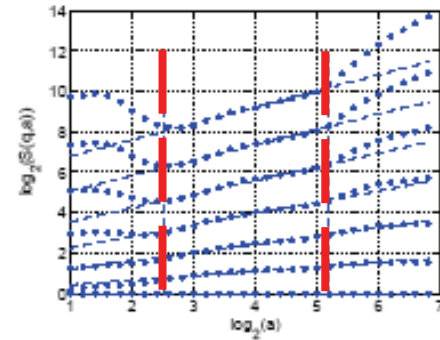
Suggests multifractality

River Reach: 0-6 km

LEFT



RIGHT

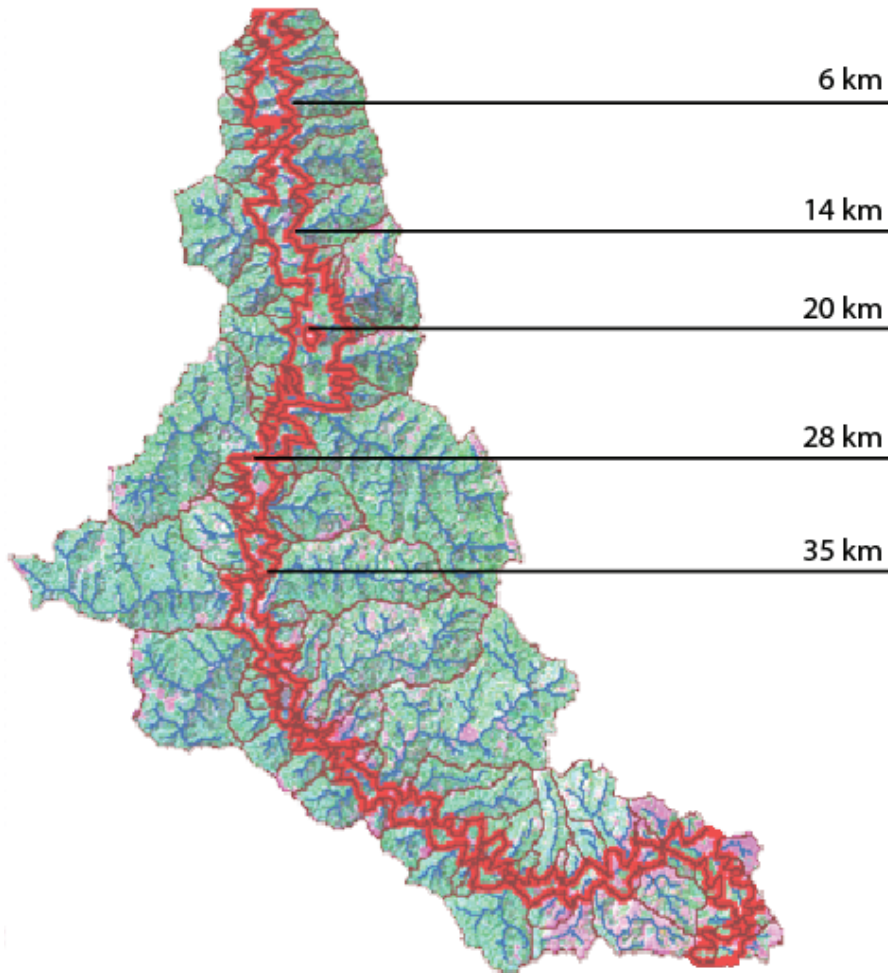


Summary of Results

distance from outlet (km)	along-stream slope (deg)	side of the corridor (Left/Right)	spectral slope	scaling range (m)	scaling range (Octaves)	Hölder exponent $\langle H \rangle$	(h_{\min}, h_{\max})	c_1	c_2
0 < x < 6	0.40	Right	1.27	5.0 – 36.8	2.5 – 5.2	0.45	(-0.1, 1.18)	0.45	0.07
		Left	1.36	9.2 – 64	3.2 – 6.0	0.47	(0.02, 1.02)	0.50	≈ 0.0
6 < x < 14	0.47	Right	1.63	9.2 – 56	3.2 – 5.8	0.51	(0, 1.30)	0.51	≈ 0.0
		Left	1.45	8.6 – 56	3.1 – 5.8	0.49	(0.1, 1.22)	0.48	0.02
14 < x < 20	0.27	Right	1.18	8.0 – 56.0	3.0 – 5.8	0.29	(-0.1, 1.20)	0.32	0.13
		Left	1.19	9.8 – 36.8	3.3 – 5.2	0.39	(0.0, 1.07)	0.41	0.25
20 < x < 28	0.24	Right	1.21	8.0 – 64	3.0 – 6.0	0.58	(0.1, 1.10)	0.59	0.05
		Left	1.28	16.0 – 128	4.0 – 7.0	0.22	(-0.1, 0.60)	0.23	0.17
28 < x < 35	.124	Right	1.41	8.0 – 128	3.0 – 7.0	0.81	(0.0, 2.00)	1.00	0.38
		Left	1.43	8.0 – 128	3.0 – 7.0	0.76	(0.0, 1.60)	0.77	0.10

Right-Left asymmetry

Physical interpretation of statistical signatures?



Left	Right
$H = 0.50$ $c_2 \simeq 0.07$	$H = 0.45$ $c_2 \simeq 0.00$
$H = 0.48$ $c_2 \simeq 0.02$	$H = 0.51$ $c_2 \simeq 0.00$
$H = 0.41$ $c_2 \simeq 0.25$	$H = 0.32$ $c_2 \simeq 0.13$
$H = 0.23$ $c_2 \simeq 0.17$	$H = 0.59$ $c_2 \simeq 0.05$
$H = 0.77$ $c_2 \simeq 0.10$	$H = 1.00$ $c_2 \simeq 0.38$

More localized transport mechanism

More localized on R than L side?

Smoother overall valleys?

Presence of more terraces in R than L?

Summary of Overarching Questions

1. How much of the physical/mechanistic behavior of the coupled hydrologic/geomorphologic system is reflected in the observed statistical patterns?
2. Are statistical patterns distinct across physical boundaries and how can they be used in assisting modeling, prediction and observatory design across scales and across environments?
3. Where/what to sample to get the most out of a limited number of observations?