



# Quantifying Spatial Variability for Sustainable Soil Management

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**Asim Biswas**  
Assistant Professor  
Department of Natural Resource Sciences

# Thank You...

- Athyna Cambouris
- Joanne Lagacé
- All the members...



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DIFFUSER LE SAVOIR**  
Centre de référence  
en agriculture et  
agroalimentaire du Québec

# Background

- B.Sc. (Agriculture) in Soil Science (East India; 2000 - 2004)
- M.Sc. (Agriculture) in Soil Science (South India; 2004 - 2006)
  - Soil Pedology (soil formation and development)
  - Soil Mineralogy (soil mineralogical composition)
  - Spatial Variability
- Ph.D. in Soil Science (Canada; May 2007 – June 2011)
  - Soil Physics
  - Soil Hydrology (vadose-zone hydrology)
  - Spatial Variability
  - Pedometrics (Pedology + mathematics/statistics)
- Environmental Research Scientist (CSIRO; July 2011 – April 2013)
- Assistant Professor (McGill University; May 2013- Present)

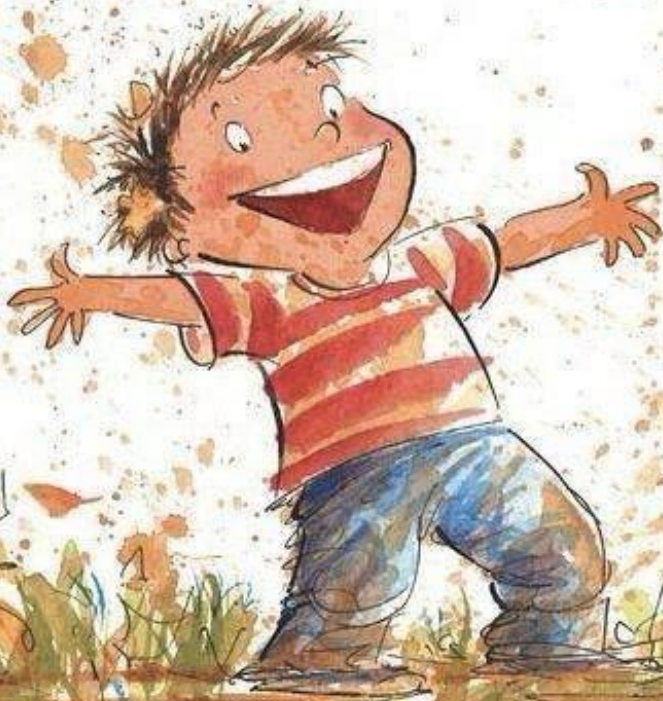
## Dirt on My Shirt

There's dirt on my shirt

And leaves in my hair

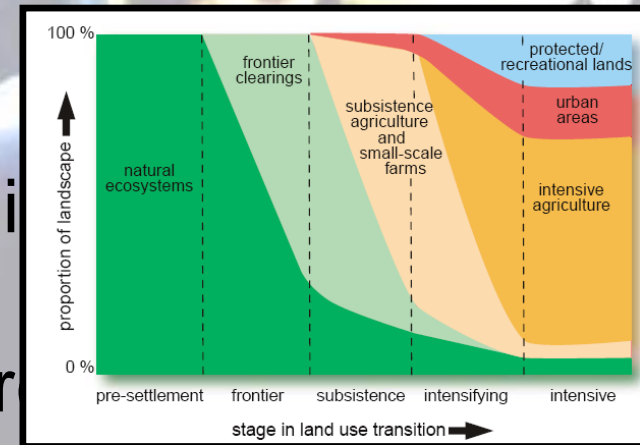
There's mud on my boots

But I don't really care



# Challenges

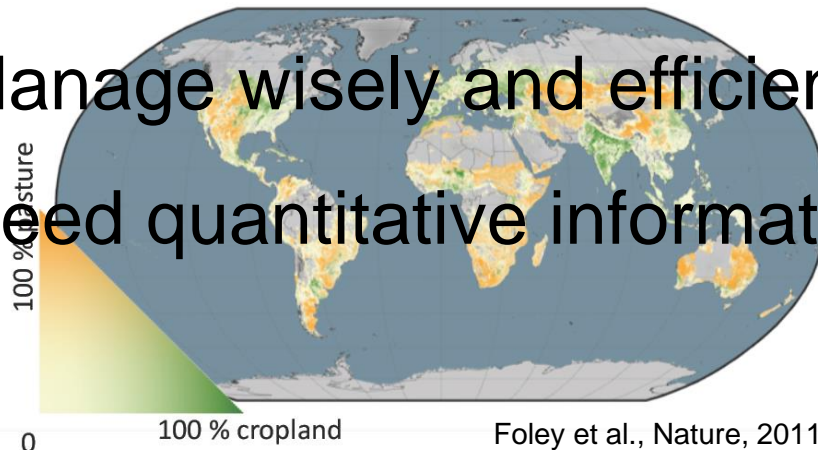
- Change in -
  - Population
  - Environment
  - Weather and Climate
  - Biodiversity
  - Land use and Land management



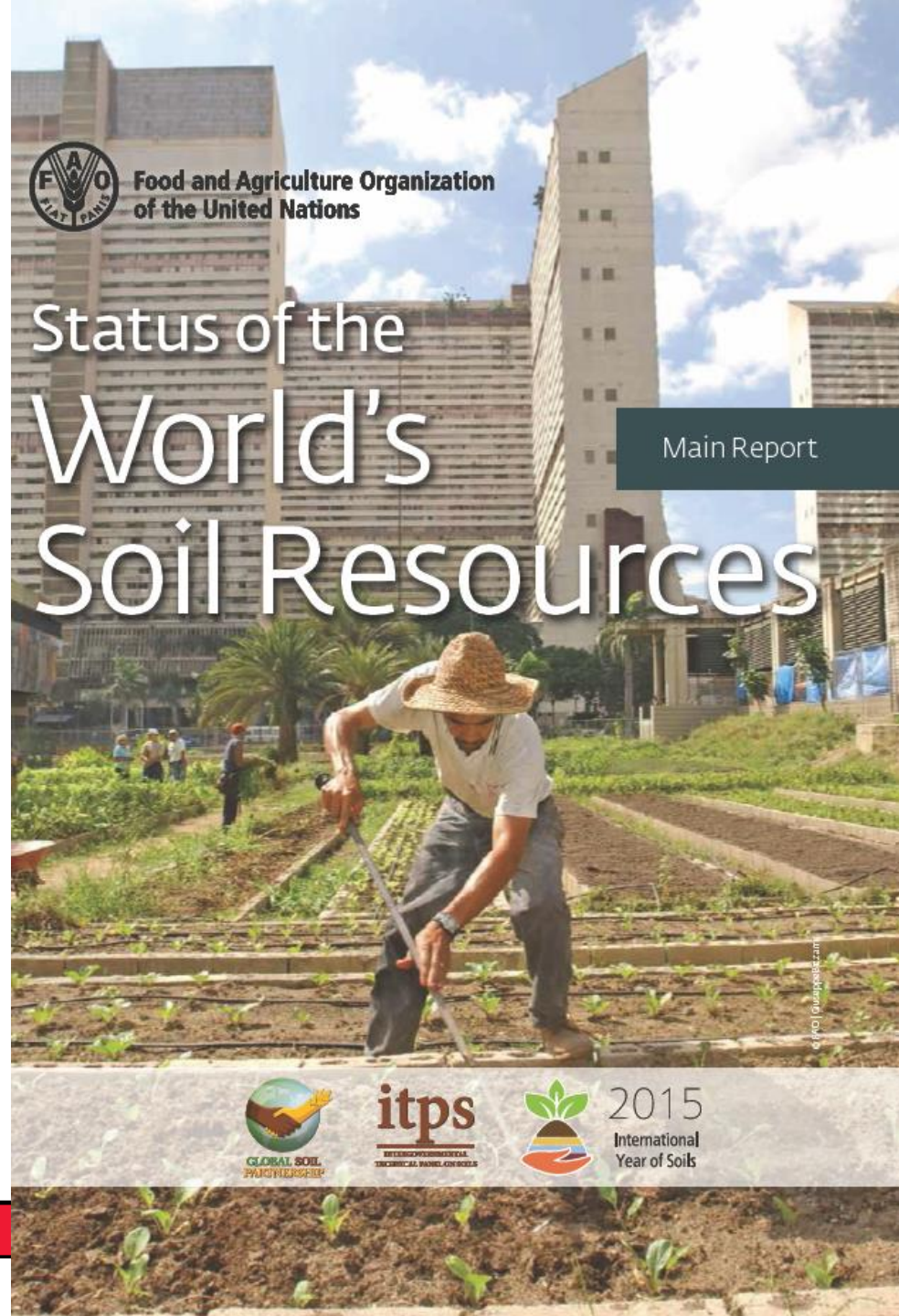
- Ecosystem and h

# Opportunities

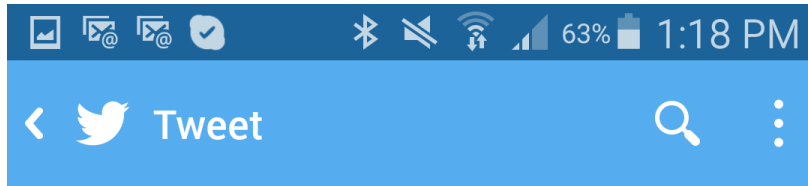
- We can not control things beyond our reach (weather events, changing climate).
- What ever lost is lost and will not get back.
- We should not let it go what we have.
- We can manage natural resources better (soil, water).
- Manage wisely and efficiently, more sustainably.
- Need quantitative information of our natural resources.



“Soils are fundamental to life on Earth but human pressures on soil resources are reaching critical limits. Careful soil management is one essential element of sustainable agriculture and also provides a valuable lever for climate regulation and a pathway for safeguarding ecosystem services and biodiversity.”



# Sustainable Soil Management



**Asim Biswas**  
@biswas\_asim

Sustainability "meeting the needs of the present while improving the ability of future generations..." #ACSMtg #RodSnyder plannery session



**Asim Biswas**  
@biswas\_asim

"short term sustainability is whether I can stay in business while long term sustainability is leaving the farm in better shape than I get."

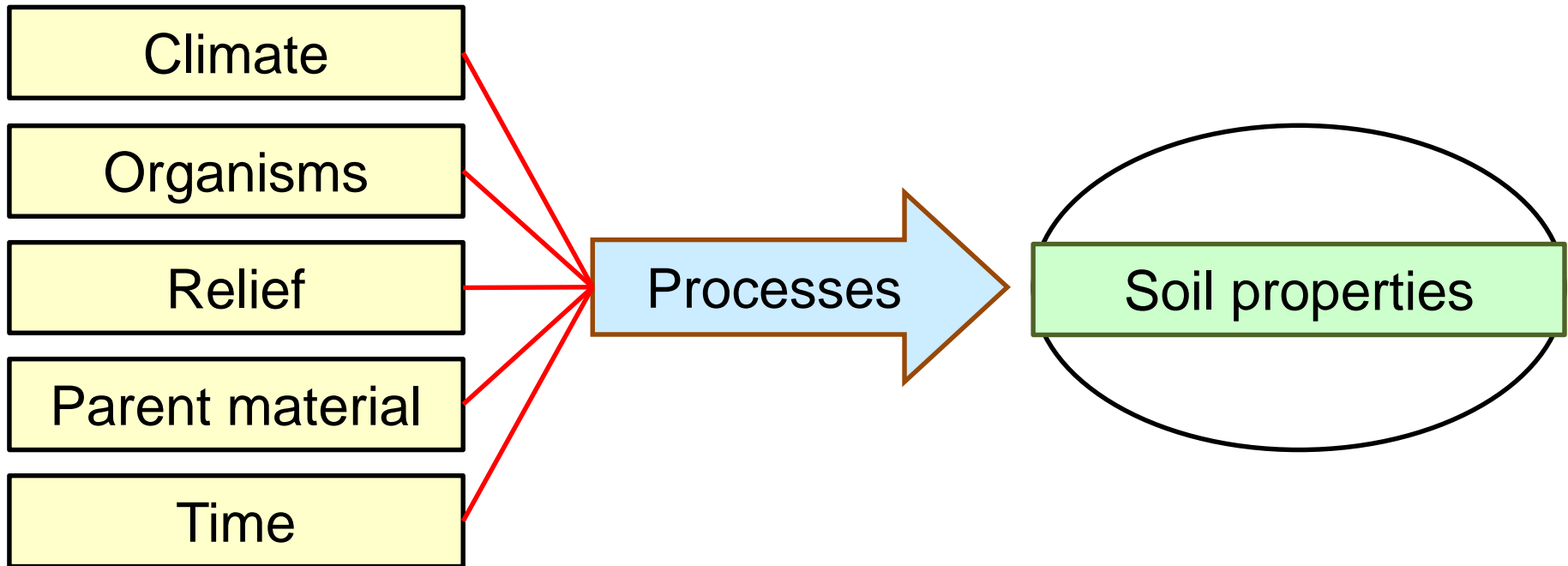
We should **manage soil for today** and **conserve for tomorrow.**

“we did not inherit the earth from our ancestors, we borrow it from our children”

**Need quantitative information variability of soil**



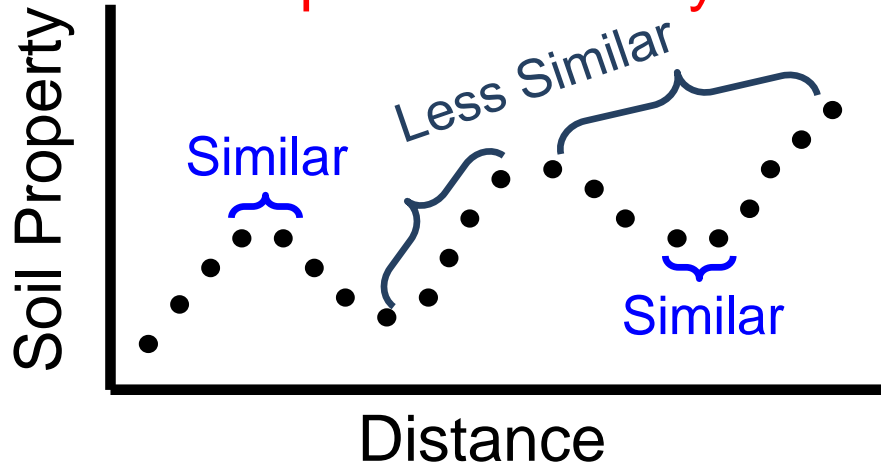
# Soil and its formation



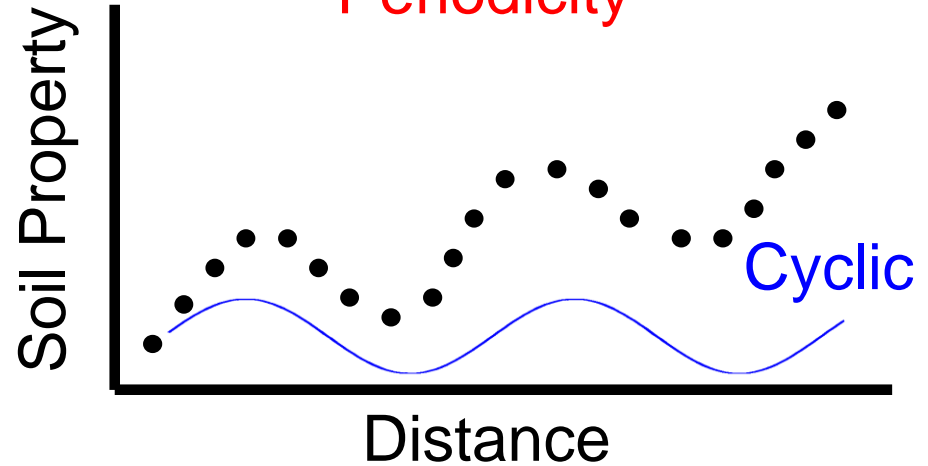
**Soil properties vary from location to location**

# Characteristics of Soil Spatial Variability

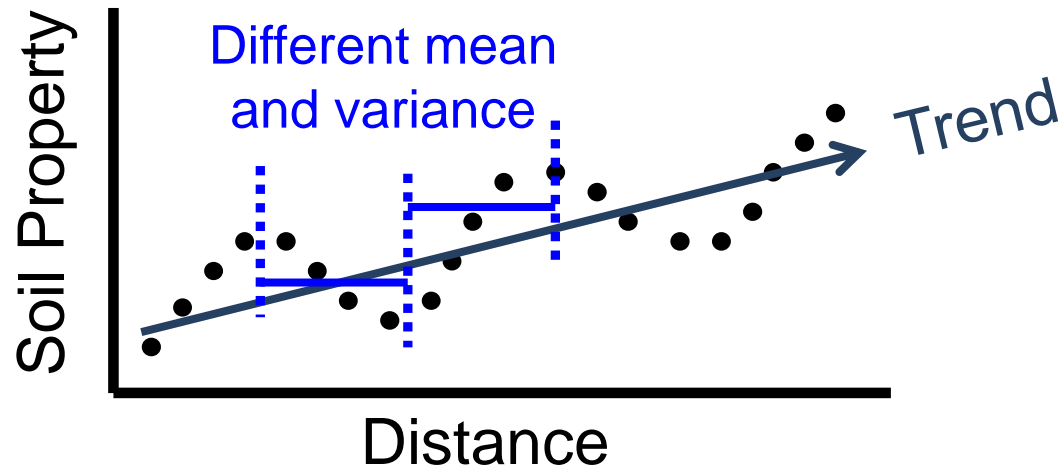
## Spatial similarity



## Periodicity



## Nonstationarity



# Characteristics of Soil Spatial Variability

## Nonlinearity



“No single medicine for all diseases”

- Methods to better analyze soil spatial variability.
- Use of the information to infer underlying soil processes.
- What does soil variability inform about soil development?
- Using information of soil variability for attribute prediction.

Water storage

# Soil Spatial Variability

- ✓ What is the dominant scale of variation?
- ✓ Where do I sample?
- ✓ Where do I monitor?
- ✓ How do I untangle complexity to produce better predictive relationship?
- ✓ How do I assess soil function at multiple scales?
- ✓ How do I meet user demand (farmers vs. catchment managers)?
- ✓ What do I know on the underlying processes and the development of soil?

# Relationship b/w Soil Properties

- Difficult to measure (e.g.  $K_s$ , water retention)
- Relatively easy to measure (e.g. particle sizes, OC)
- Predictive relationship (e.g. pedotransfer functions)
- Variability in soil properties
- Variability in the relationship



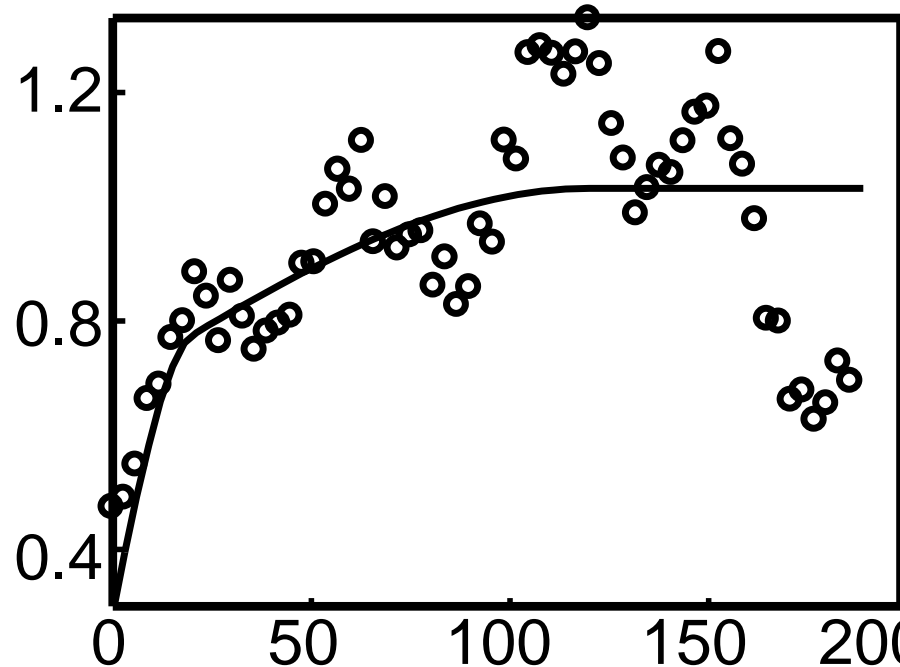
## Spatial relationship between soil hydraulic and soil physical properties in a farm field

Asim Biswas and Bing Cheng Si

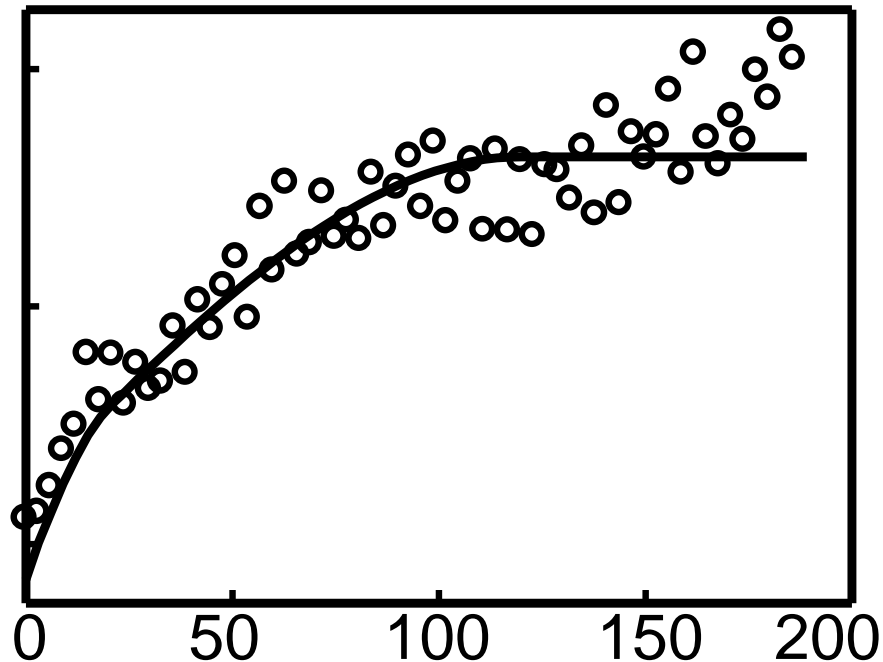
*Department of Soil Science, University of Saskatchewan, Saskatoon, Saskatchewan, Canada S7N 5A8.  
Received 7 September 2008, accepted 6 May 2009.*

# Geostatistical Analysis

Semivariogram of Ks



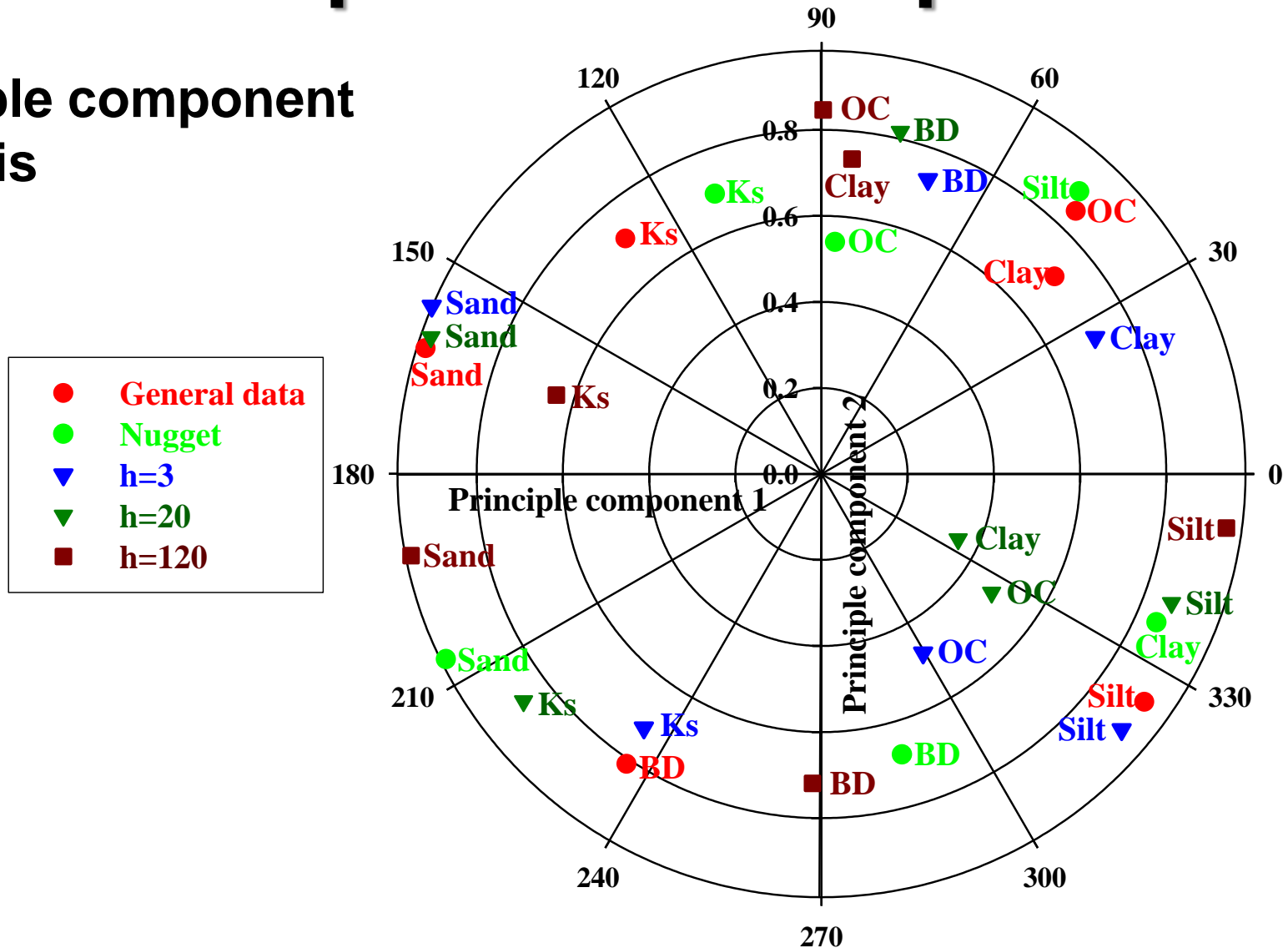
Semivariogram of Sand



Lag Distance (m)

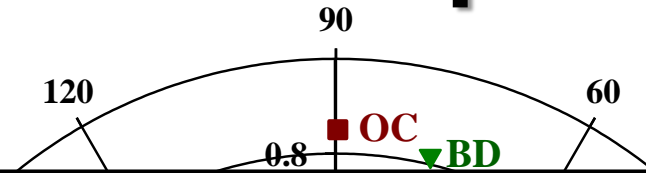
# Relationship b/w Soil Properties

## Principle component analysis



# Relationship b/w Soil Properties

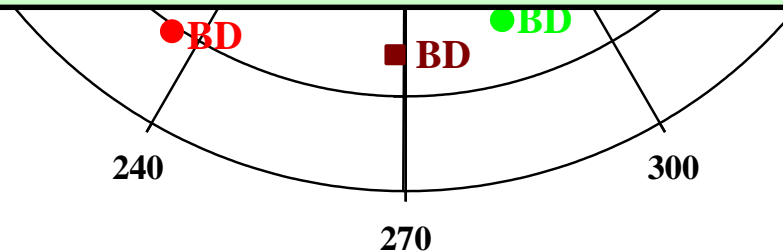
Principle component



What did we get?

Information on scales of variations in soil properties

The scale-varying relationship among soil properties





# N-dynamics and Landscape Characteristics

Nonlin. Processes Geophys., 15, 397–407, 2008  
www.nonlin-processes-geophys.net/15/397/2008/  
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Nonlinear Processes  
in Geophysics

## Spatial relationship between $\delta^{15}\text{N}$ and elevation in agricultural landscapes

A. Biswas, B. C. Si, and F. L. Walley

Department of Soil Science, University of Saskatchewan, Saskatoon, SK, Canada

Received: 28 September 2007 – Revised: 4 April 2008 – Accepted: 4 April 2008 – Published: 13 May 2008

**Abstract.** Understanding of the nitrogen (N) cycle and its spatial variability is important for managing ecosystems. Soil  $\delta^{15}\text{N}$ , as an important indicator of different soil nitrogen cycling processes, may provide critical information about the spatial variability in soil N cycling. The objective of this study was to examine the dominant landscape

Parry, 1989). Variations in the nature and magnitude of N-cycling processes within a landscape ultimately control the availability of mineral N ( $\text{NH}_4^+$  and  $\text{NO}_3^-$ ) which is essential for agricultural production and likewise is the source of serious environmental pollution (e.g.,  $\text{NO}_3^-$  contamination of groundwater and emissions of  $\text{N}_2\text{O}$ , an important greenhouse

# N-dynamics and Landscape Characteristics

Nonlin. Processes Geophys., 15, 397–407, 2008  
www.nonlin-processes-geophys.net/15/397/2008/

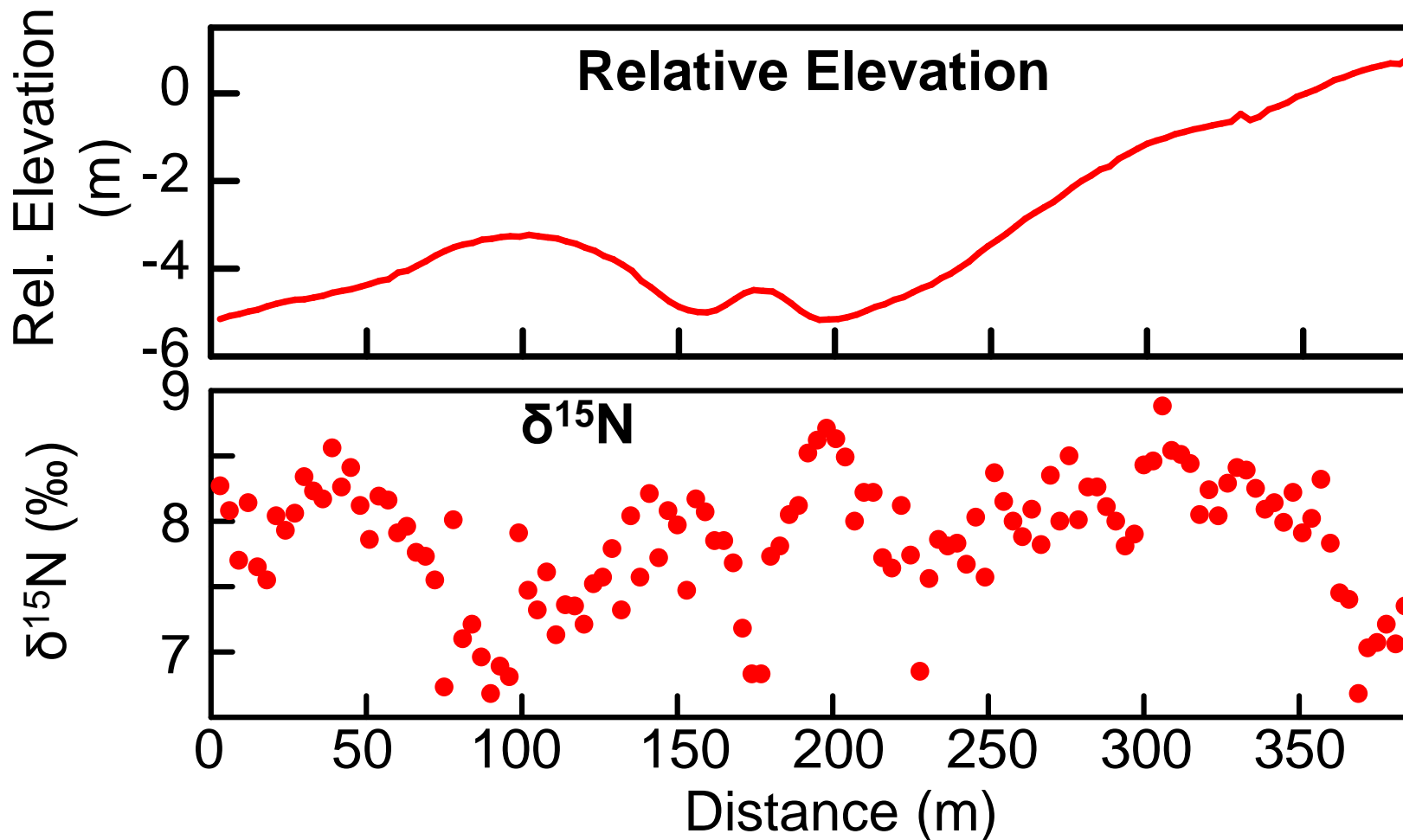


Nonlinear Processes

## N- Dynamics

- isotopes of nitrogen
- isotopic fractionation in physical, chemical and biological processes
  - nitrification
  - denitrification
  - ammonia volatilization
- favour lighter  $^{14}\text{N}$  and depleted first
- N pool develops distinctly different  $\delta^{15}\text{N}$  signals

# N-dynamics and Landscape Characteristics



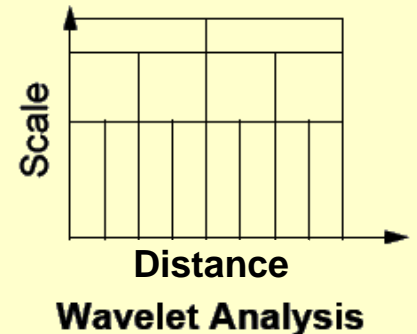
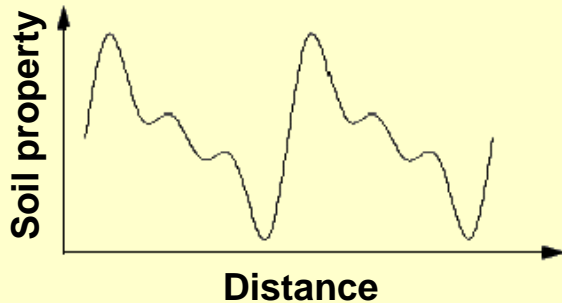
# N-dynamics and Landscape Characteristics

Nonlin. Processes Geophys., 15, 397–407, 2008  
www.nonlin-processes-geophys.net/15/397/2008/



Nonlinear Processes

## Wavelet Transform



Distance (m)

# N-dynamics and Landscape Characteristics

Nonlin. Processes Geophys., 15, 397–407, 2008  
[www.nonlin-processes-geophys.net/15/397/2008/](http://www.nonlin-processes-geophys.net/15/397/2008/)

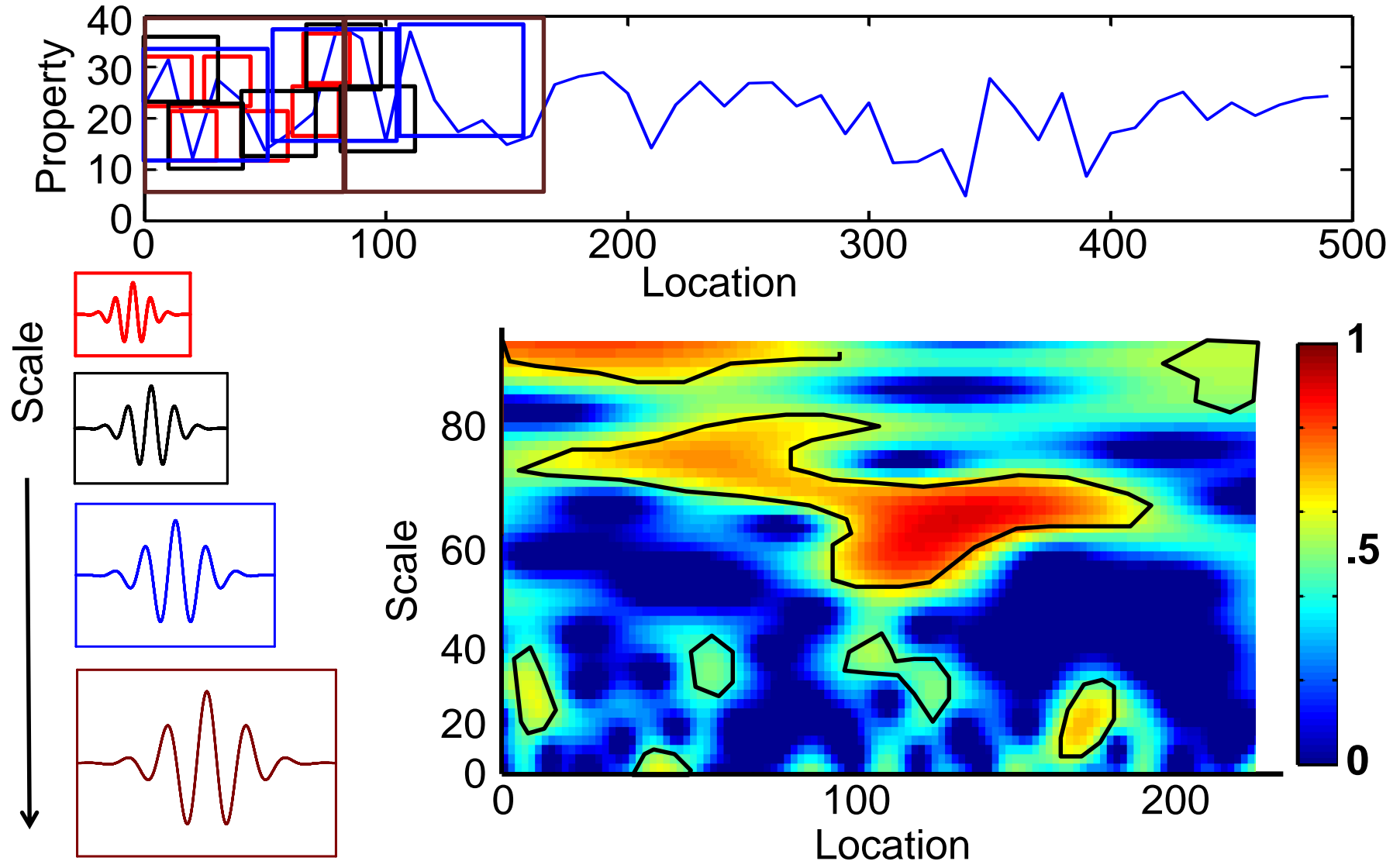


Nonlinear Processes

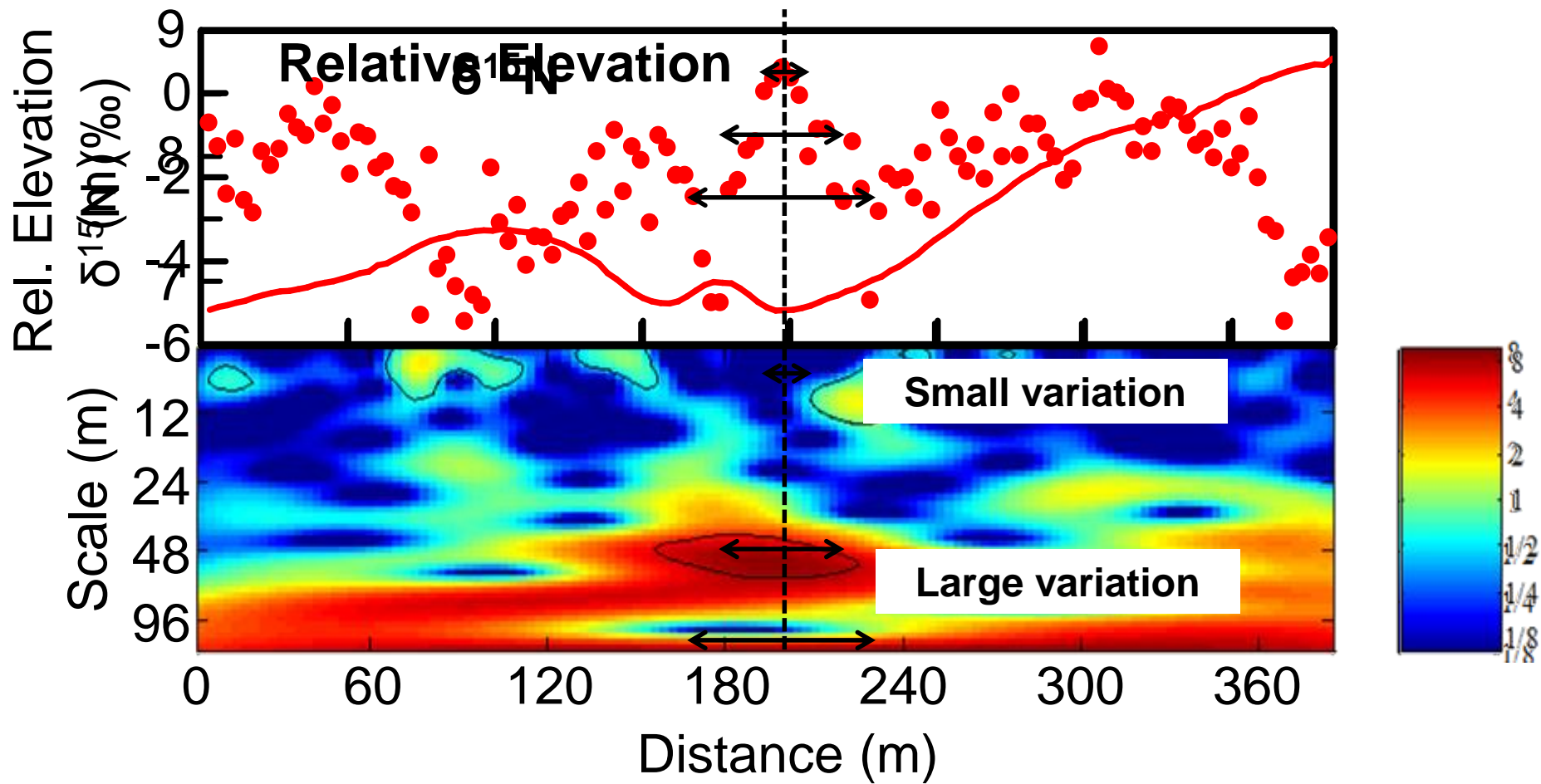
Scaling



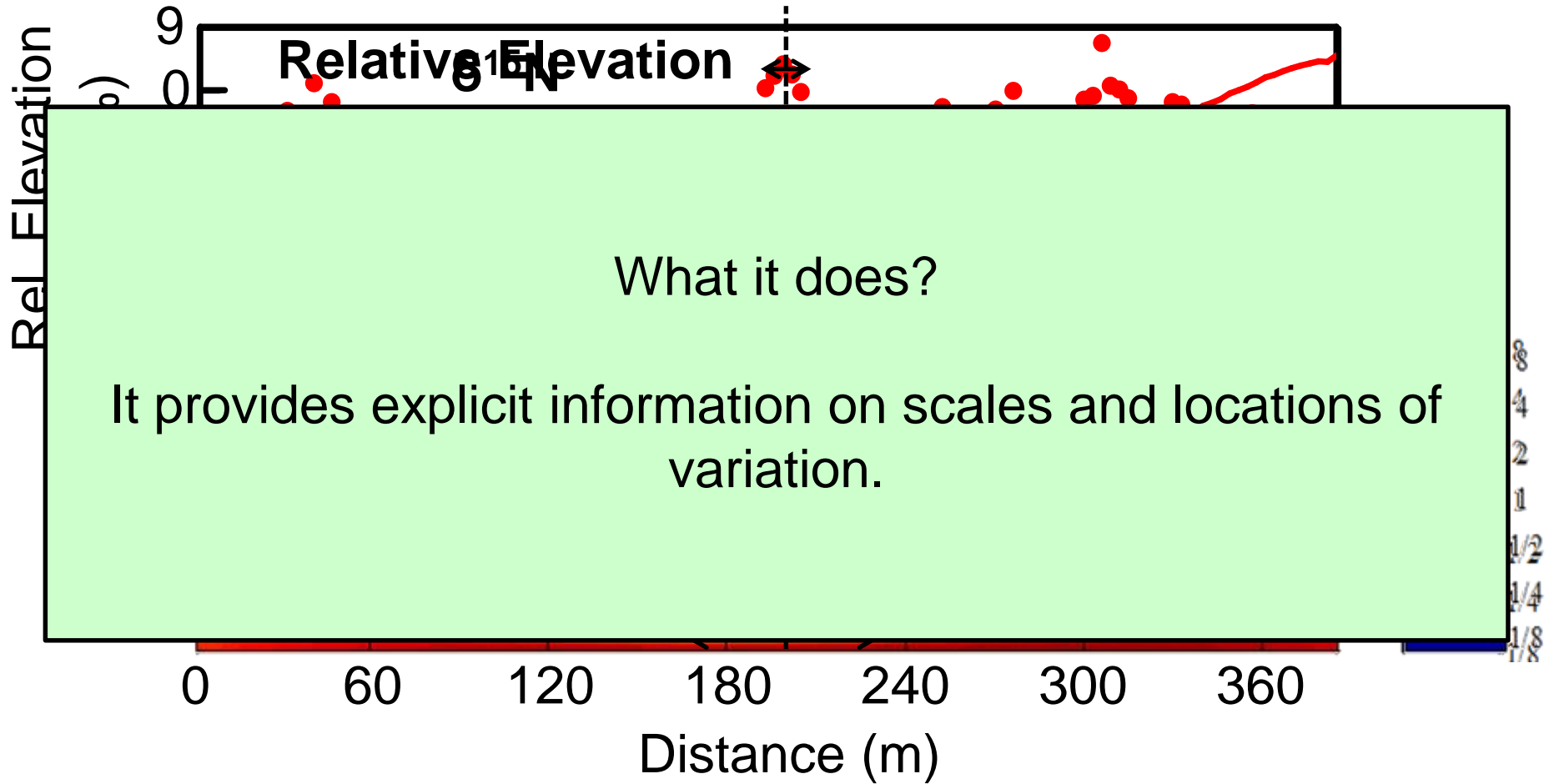
# Wavelet Transform



# N-dynamics and Landscape Characteristics

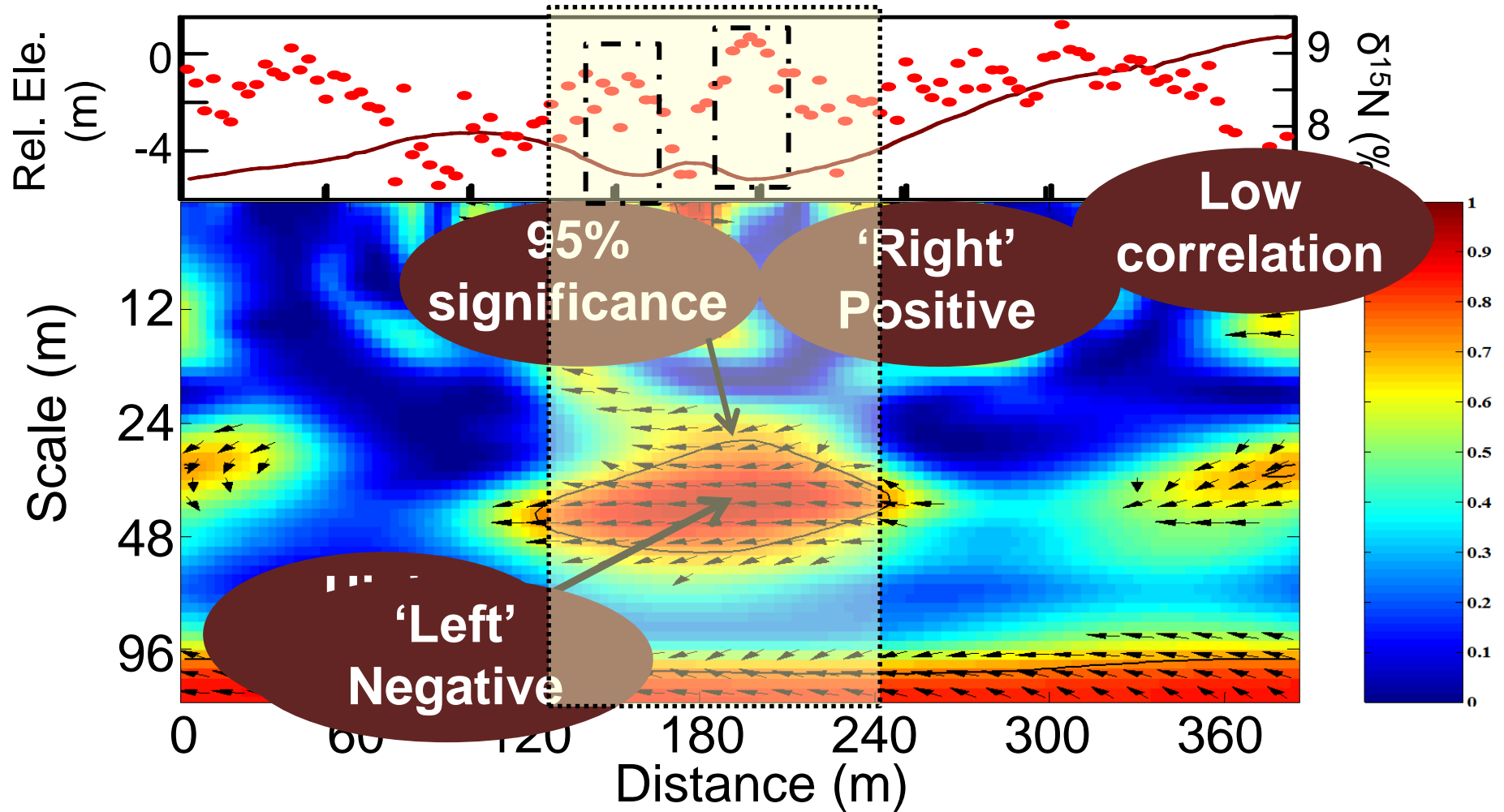


# N-dynamics and Landscape Characteristics

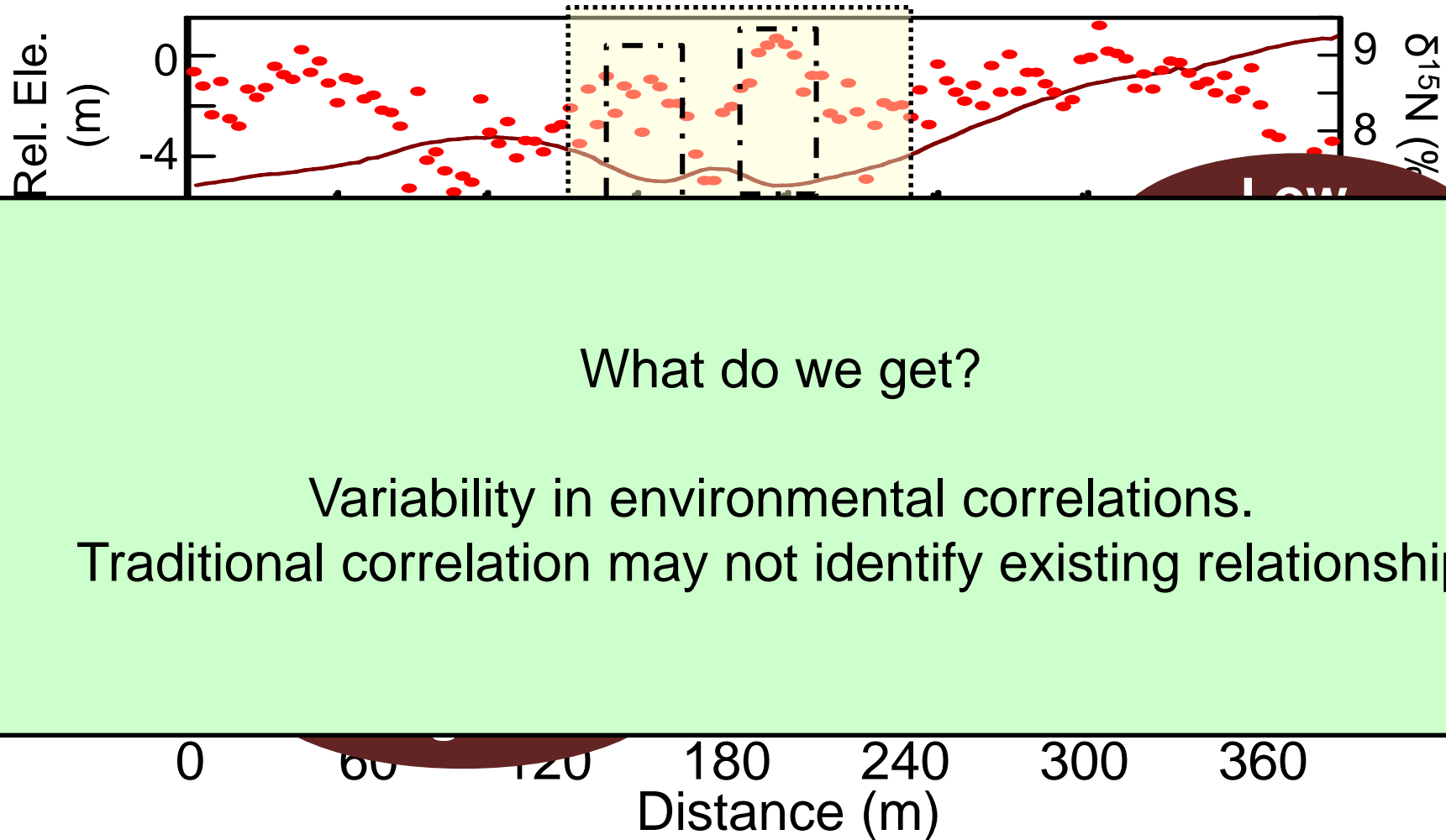




# N-dynamics and Landscape Characteristics



# N-dynamics and Landscape Characteristics



What do we get?

Variability in environmental correlations.  
Traditional correlation may not identify existing relationship.

# Similarity of the Spatial Pattern

Journal of Hydrology 408 (2011) 100–112

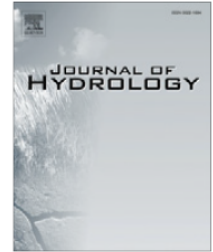


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Journal of Hydrology

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## Scales and locations of time stability of soil water storage in a hummocky landscape

Asim Biswas, Bing Cheng Si\*

Department of Soil Science, University of Saskatchewan, Saskatoon, Saskatchewan, Canada S7N5A8

### ARTICLE INFO

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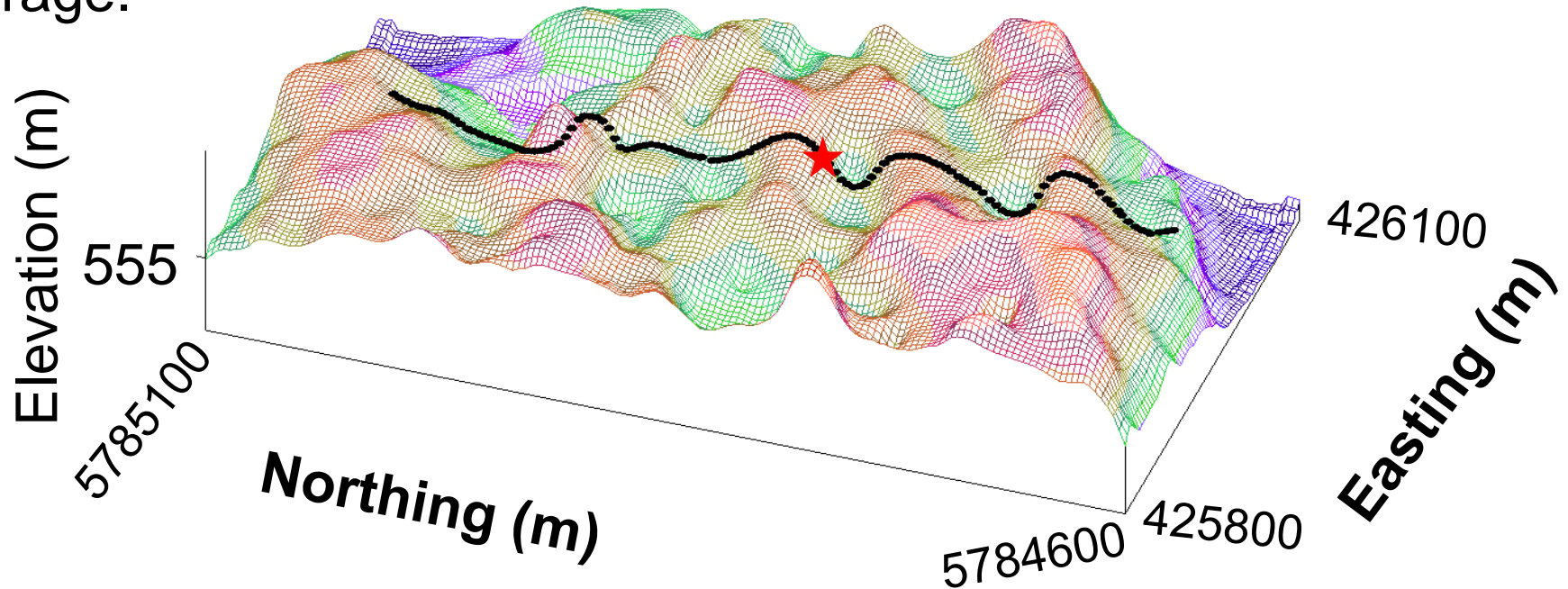
This manuscript was handled by Philippe Baveye, Editor-in-Chief, with the assistance of Juan V. Giraldez, Associate Editor

### SUMMARY

Different factors and processes operating in different intensities and at different space–time scales result in strong spatio-temporal variability in soil water storage. However, there is similarity between the overall spatial patterns of soil water storage measured at different times, which has been identified as time stability. The objective of this study was to examine the scales and locations of time stability of soil-water storage spatial patterns at different seasons and depths in a hummocky landscape. Soil water storage was measured up to 140 cm depth over a 4-year period using time domain reflectometry and a neutron probe along a transect in the St. Denis National Wildlife Area, Saskatchewan, Canada. The transect was 576 m long with 128 sampling points (4.5 m sampling interval) and traversed several knolls and depressions.

# Similarity of the Spatial Pattern

- ✓ Similar relationship can be developed over time.
- ✓ Intra-season, inter-season, and inter-annual.
- ✓ The wet locations stay wet and dry locations stay dry over time.
- ✓ Identify the location with soil water storage stays close to field average.



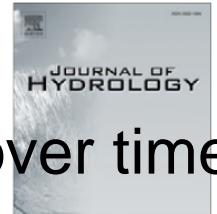
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Journal of Hydrology 408 (2011) 100–112

Contents lists available at ScienceDirect

Journal of Hydrology



Such representative locations can be used to monitor or validate remote sensing measurements.

Article history  
Received 16 October 2010  
Received in revised form 8 July 2011  
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Available online 31 July 2011  
This manuscript was handled by Philippe Baveye, Editor-in-Chief, with the assistance of Juan V. Giraldez, Associate Editor

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# Similarity between depths

Soil & Water Management & Conservation

## Depth Persistence of the Spatial Pattern of Soil Water Storage in a Hummocky Landscape

**Asim Biswas**

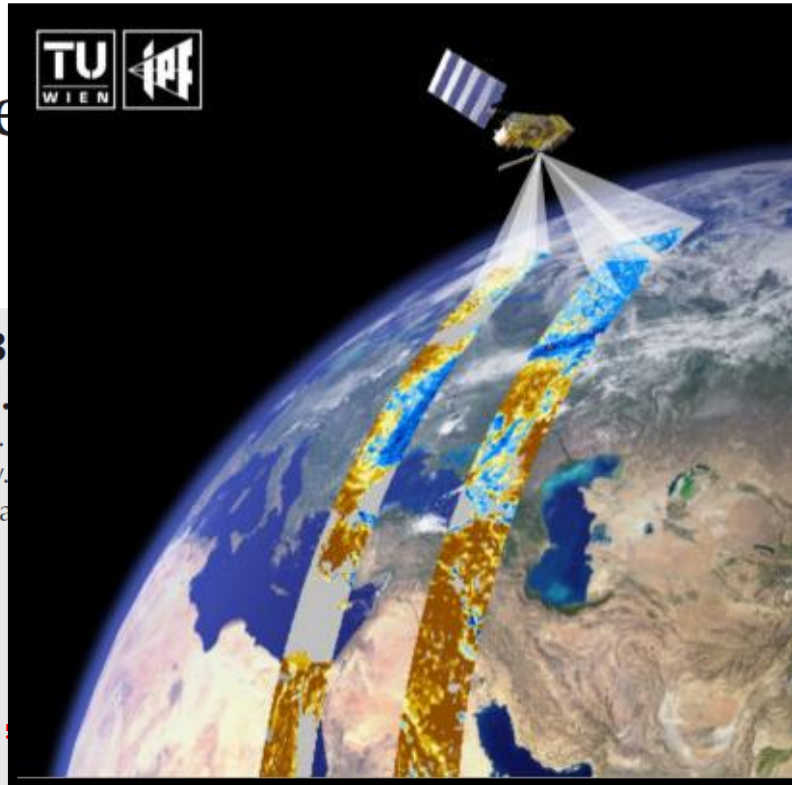
**Bing C. Si\***

Dep. of Soil Science  
Univ. of Saskatchewan  
Saskatoon, SK, S7N 5A8, Canada

**SSSAJ, 2011, 75: 1099-1109**

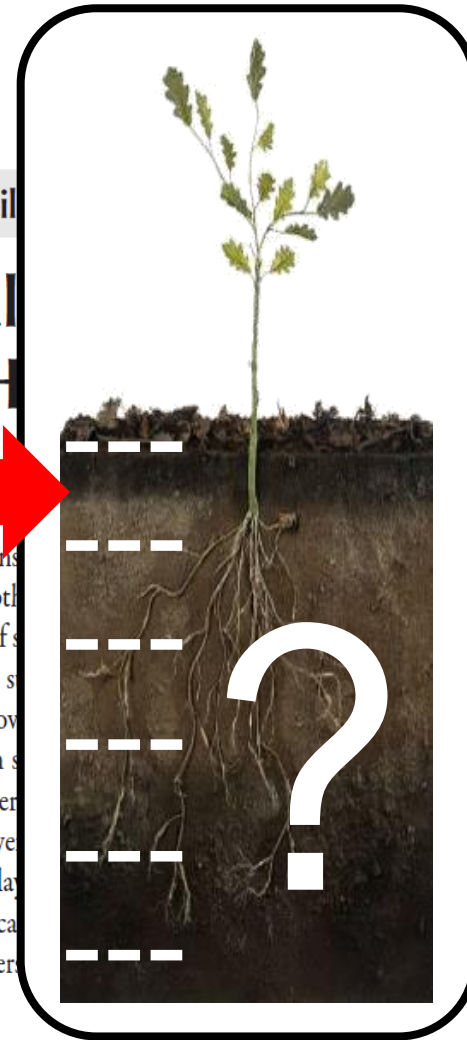
Information on surface soil water is readily available either from satellite images or from other surface measurements. Understanding the relationships between soil water at the surface and subsurface layers can help understand hydrological processes at depth. The objective of this study was to examine the similarities in the overall and scale specific spatial patterns of soil water storage at different depths. Soil water content was measured at the 20-cm depth increments, from the surface to a depth of 1 m, using a neutron probe and time-domain reflectometry along a transect traversed over several knolls and depressions in the St. Denis National Wildlife Area (SDNWA), Saskatchewan, Canada. High soil water storage was observed in depressions and low water storage on knolls creating an inverse spatial pattern relative to elevation. High Spearman rank correlation coefficients between the surface and subsurface soil layers indicated strong similarity in the overall spatial pattern of soil water at different depths. Soil water contents in layers close in vertical distance had stronger similarity than that of layers far apart. Wavelet coherency analysis indicated strong similarity in the large-scale (>72 m) spatial patterns of soil water at the surface layer and deeper layers during recharge period. However, large-scale similarity was weaker

# Similarity between depths



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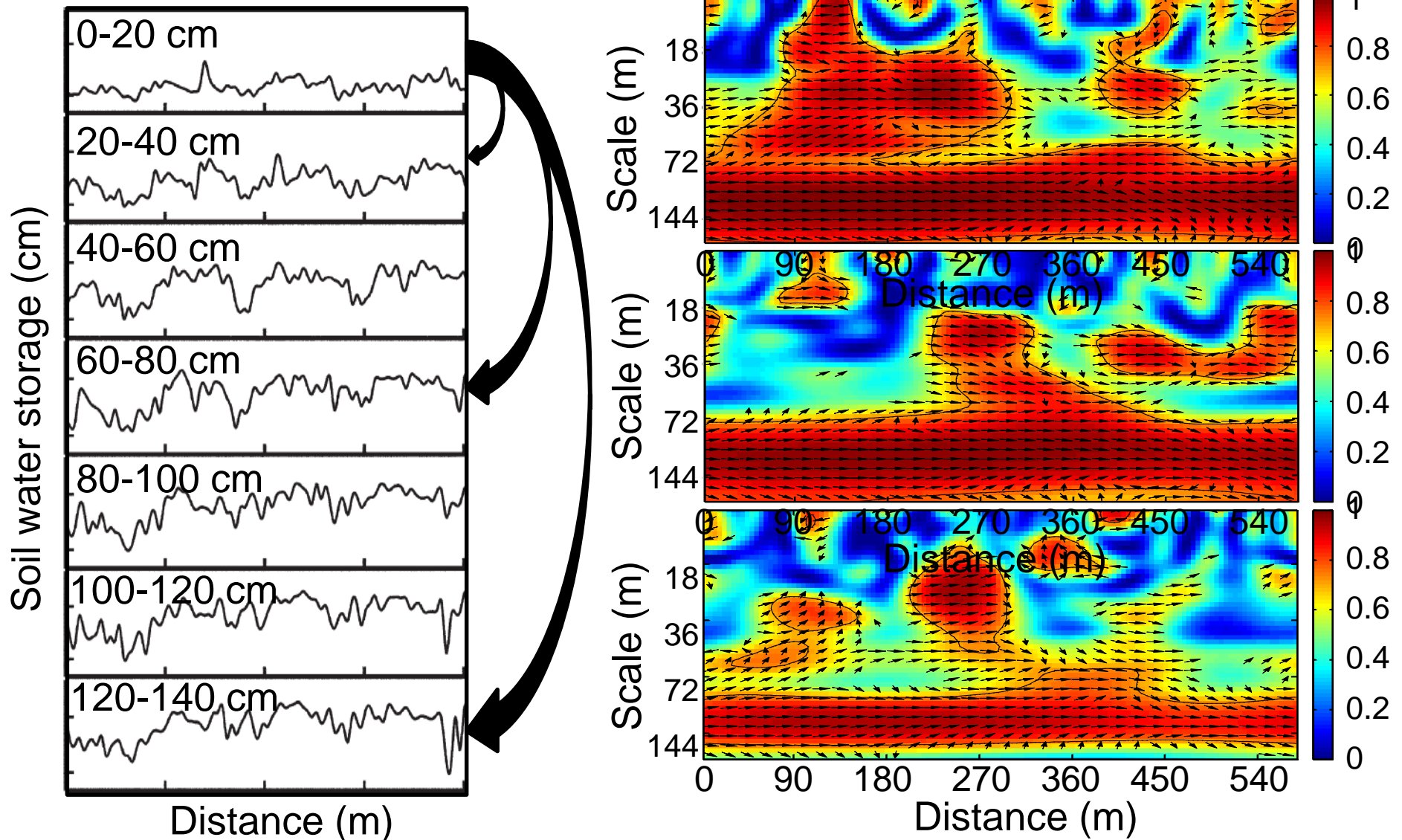
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National Wildlife Area  
and low water storage  
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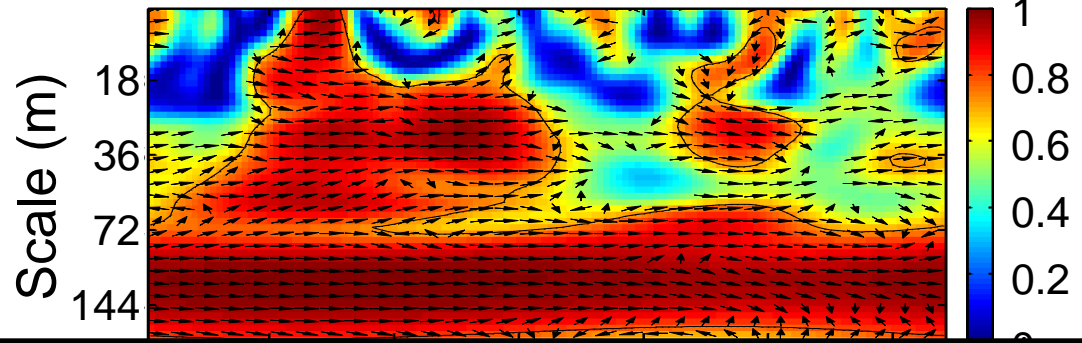
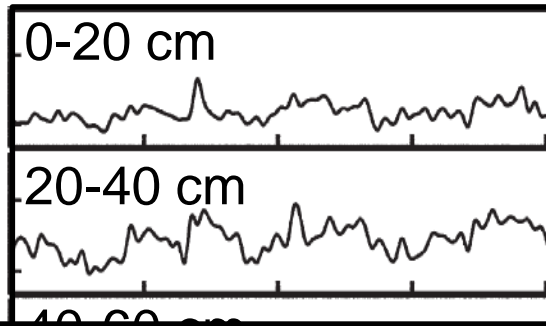
SSSAJ

# Similarity between depths



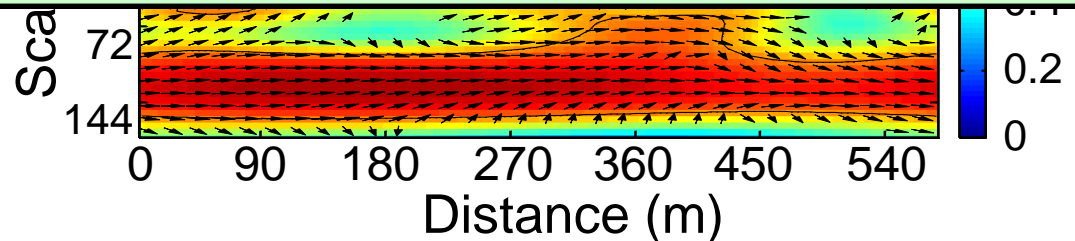
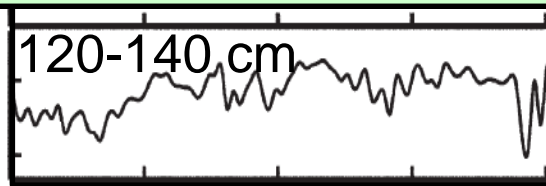


# Similarity between depths



What does it enable?

Whole profile hydrological dynamics from surface measurements.



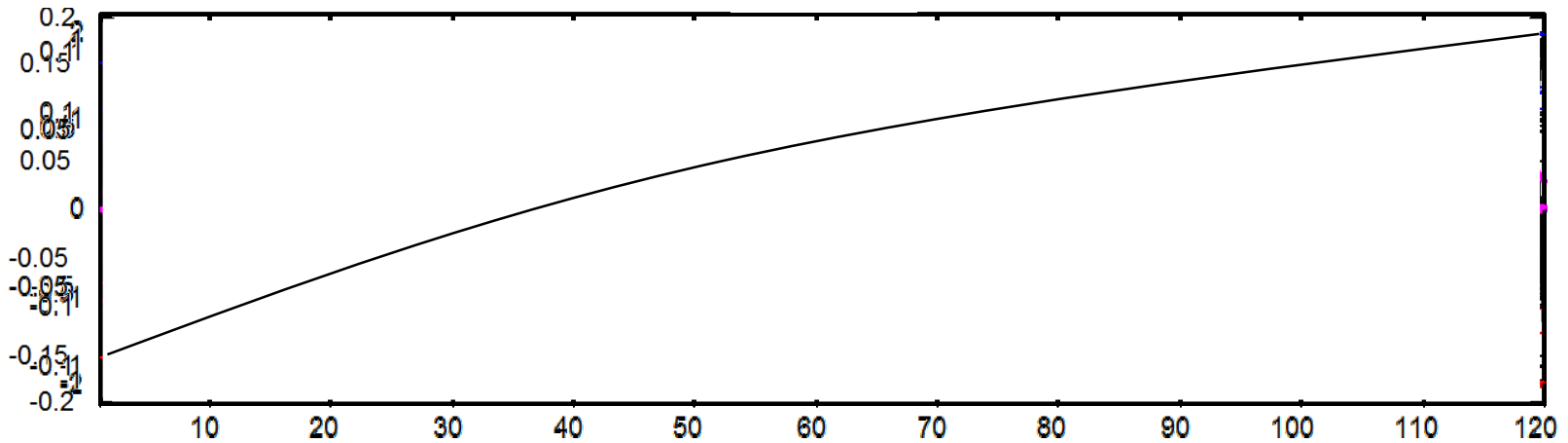
# Separating Scale-Specific Variations

- Scale-specific spatial variations
- Identify dominant scales and their relative contribution to overall variability

**Empirical mode decomposition**

# Empirical Mode Decomposition

## Residue



# Separating Scale-Specific Variations

Soil Physics

## Revealing the Controls of Soil Water Storage at Different Scales in a Hummocky Landscape

Asim Biswas

Bing Cheng Si\*

Dep. of Soil Science  
Univ. of Saskatchewan  
Saskatoon, SK S7N5A8, Canada

**SSSAJ, 2011, 75: 1295-1306**

Soil water storage is controlled by topography, soil texture, vegetation, water routing processes, and the depth to the water table. Interactions among these factors may give rise to scale-dependent nonstationary and nonlinear patterns in soil water storage. The objectives of this study were to identify the dominant scales of variation of nonstationary and nonlinear soil water storage and delineate the dominant controls at those scales in a hummocky landscape using the Hilbert–Huang transform (HHT). Soil water storage (up to 140 cm) was measured along a 128-point transect established at St. Denis National Wildlife Area, Saskatchewan, Canada, using time domain reflectometry and a neutron probe. Empirical mode decomposition was used to decompose the measured soil water storage series into six different intrinsic mode functions (IMFs) according on their characteristic scales. The first IMF represented the variations at small scales, the second IMF might characterize the variations associated with microtopography and the landform elements. The IMF 3 was highly correlated with elevation and had the largest variance contribution toward the total variance among all the IMFs. The fourth IMF was correlated to organic C (OC), showing the long-term history of water availability, which may be a reflection of topographic setting or the elevation. The fifth and sixth IMFs were associated with elevation, soil texture, and OC but they contributed a small fraction of the total variance. Therefore, decomposition made through HHT was physically meaningful and provided improved prediction of soil water storage from topography, soil texture, and OC.

**Abbreviations:** EMD, empirical mode decomposition; HHT, Hilbert–Huang transform; HSA,

# Separating Scale-Specific Variations

IMF	% Var. Cont.	Correlation				
		Re. Ele.	Sand	Silt	Clay	OC

What does it enable?

Scale-specific correlation.

Dominant controlling factors at different scales.

$r < 0.05$ ,  $r < 0.01$

Var. Cont.- variance contribution, Re. Ele.-relative elevation,  
OC- organic carbon

# Separating Scale-Specific Variations

IMF	% Var. Cont.	Correlation				
		Re. Ele.	Sand	Silt	Clay	OC
1	6	0.00	0.02	-0.08	0.08	-0.01
2	10	-0.38**	-0.11	0.10	0.03	0.38**
3	41	-0.70**	-0.07	0.00	0.12	0.58**
4	6	-0.22*	-0.26**	0.11	0.26**	0.31**
5	5	0.55**	-0.59**	0.43**	0.36**	0.11
6	4	0.37**	-0.57**	0.38**	0.39**	0.31**

\*  $P < 0.05$ ; \*\*  $P < 0.01$

Var. Cont.- variance contribution, Re. Ele.-relative elevation,  
OC- organic carbon

# Scale-Specific Variations- Multiple Factors

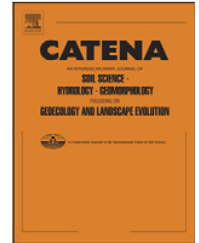
Catena 113 (2014) 377–385



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Catena

journal homepage: [www.elsevier.com/locate/catena](http://www.elsevier.com/locate/catena)



## Application of multivariate empirical mode decomposition for revealing scale-and season-specific time stability of soil water storage



Wei Hu <sup>a,1</sup>, Asim Biswas <sup>b,2</sup>, Bing Cheng Si <sup>a,\*</sup>

<sup>a</sup> University of Saskatchewan, Department of Soil Science, Saskatoon, SK S7N 5A8, Canada

<sup>b</sup> Department of Natural Resource Sciences, McGill University, 21111 Lakeshore Road, Ste-Anne-de-Bellevue, QC H9X 3V9, Canada

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### ABSTRACT

Spatial patterns of soil water storage (SWS), the total amount of water stored in soil at a given depth interval, tend to be similar if we measure at different times. This is characterized as time stability and can be used to optimize sampling design. The objective of this study was to examine the scale- and season-specific time stability of SWS spatial patterns at seven depth intervals (at every 20 cm down to 140 cm) in a hummocky landscape. Soil



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## Application of multi-scale and seasonal

Wei Hu<sup>a,1</sup>, Asim Biswas<sup>b</sup>

<sup>a</sup> University of Saskatchewan, Department of Soil Science

<sup>b</sup> Department of Natural Resource Science

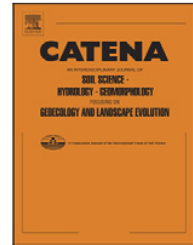
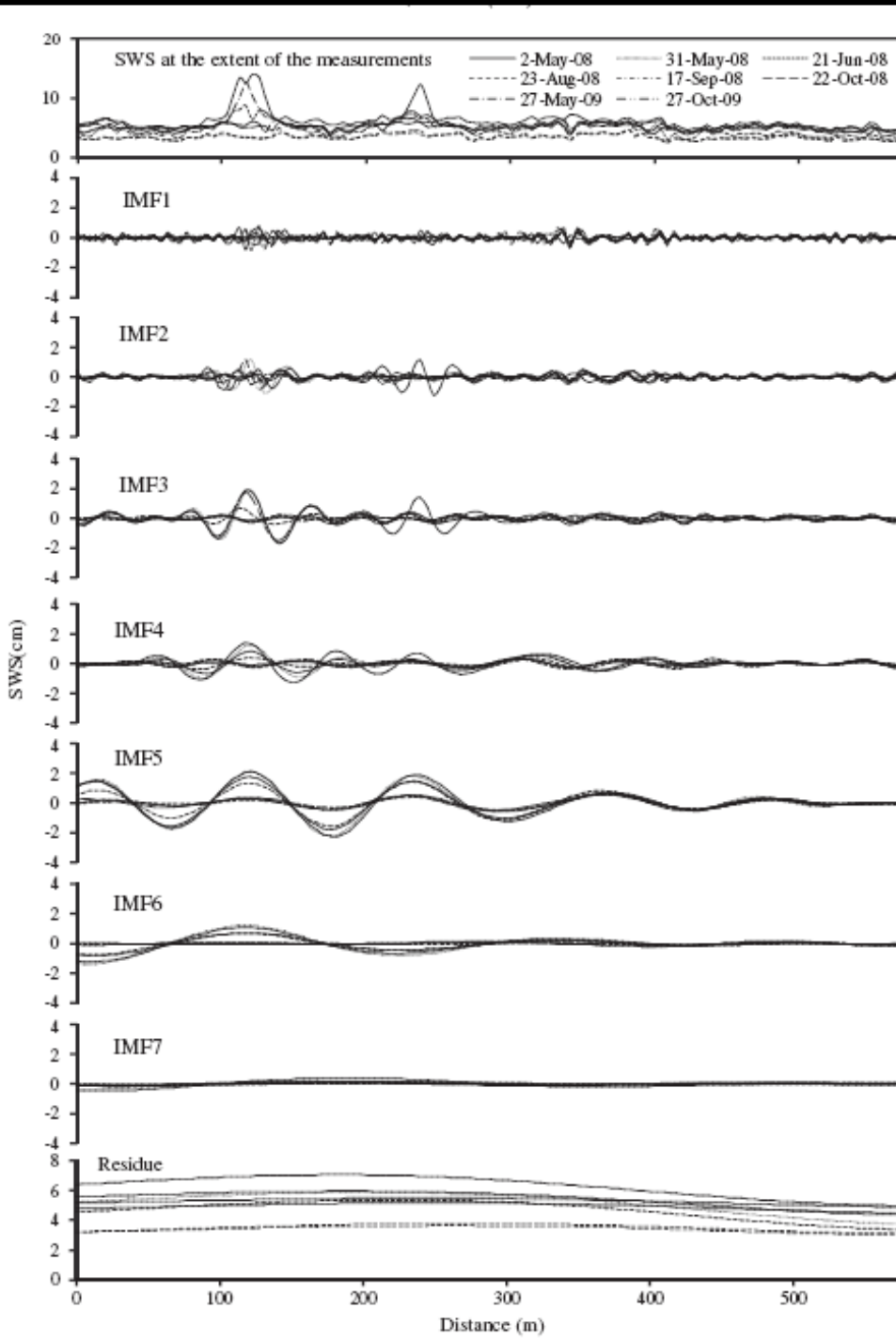
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soil at a given depth interval, the stability and can be used to assess season-specific time stability in a hummocky landscape. Soil





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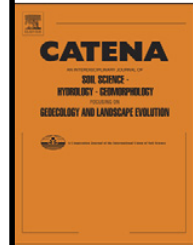
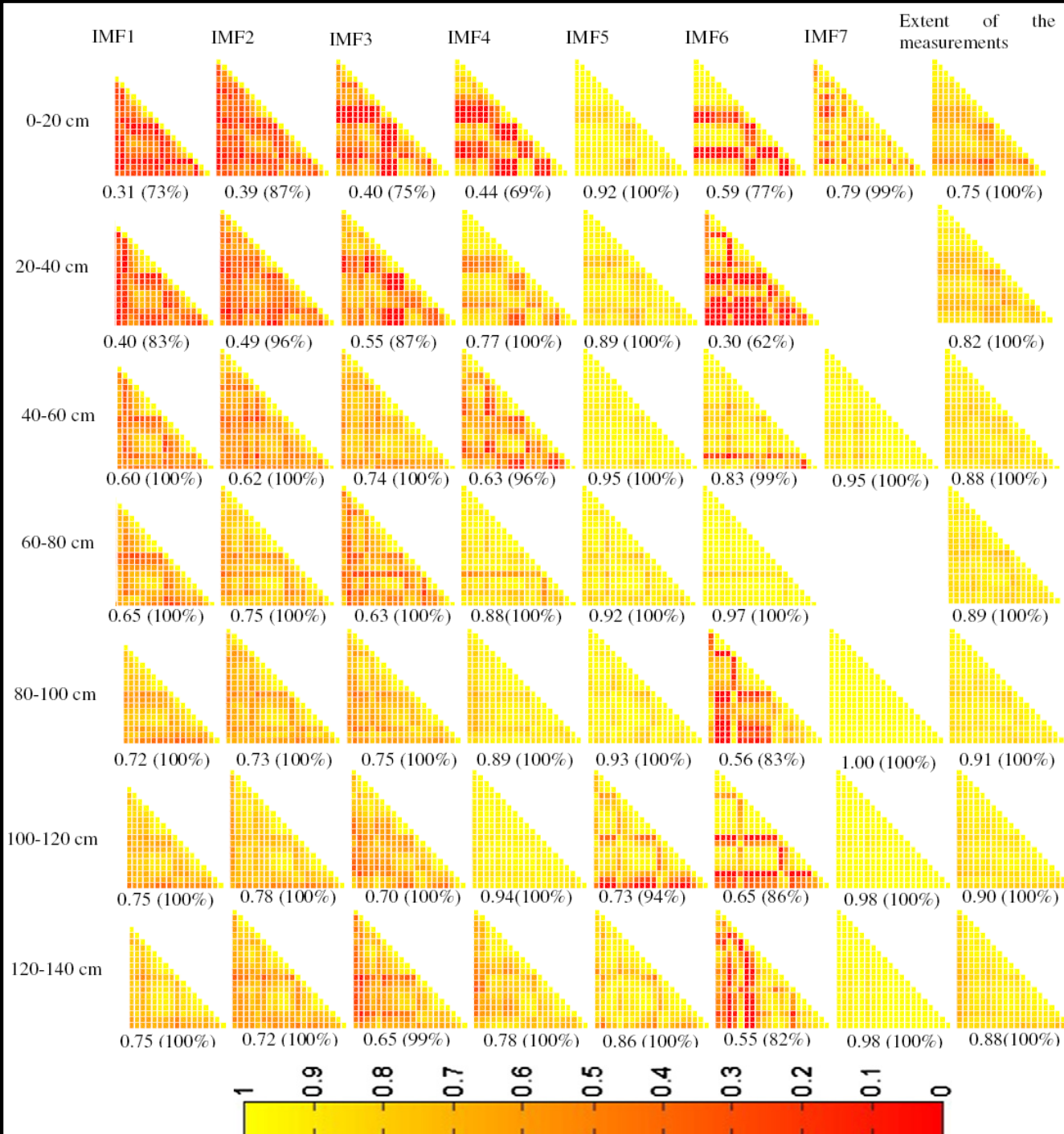
## Application scale-and

Wei Hu<sup>a,1</sup>, A

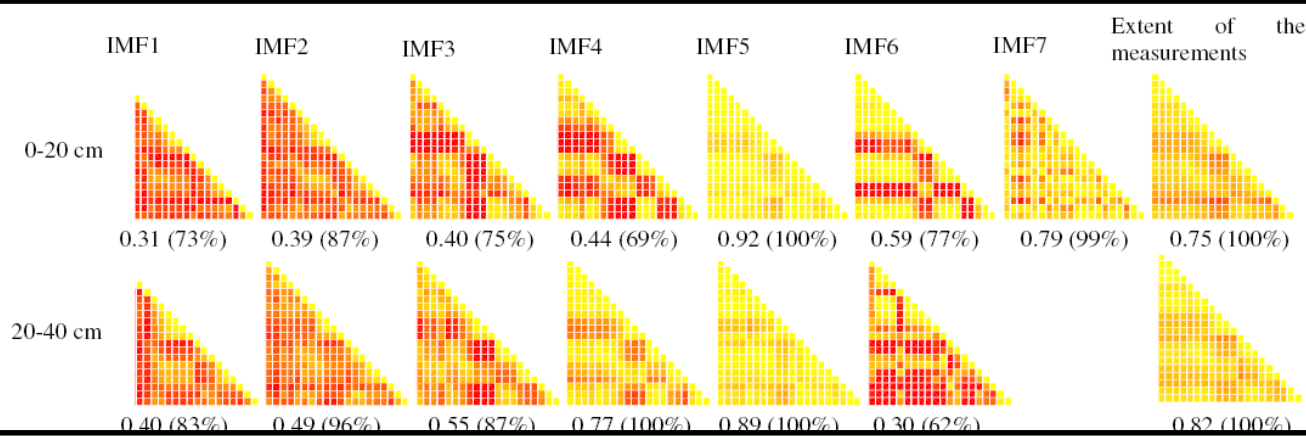
<sup>a</sup> University of Saskat  
<sup>b</sup> Department of Nat

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an depth interval,  
d can be used to  
ific time stability  
y landscape. Soil

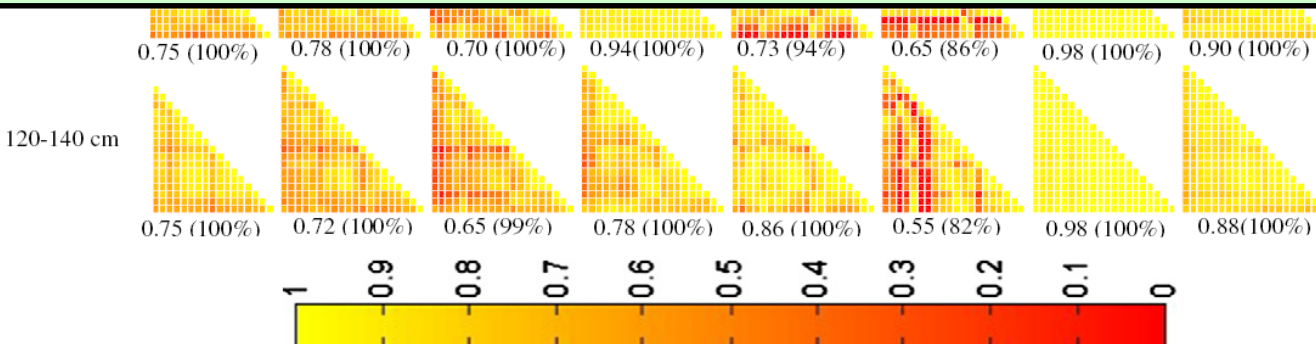


What does it enable?

Reveal the matched scale of variations among factors  
 Scale specific predictions are improved from multiple factors

### ARTICLE

Article history:  
 Received 13 January  
 Received in revised  
 Accepted 30 August



an depth interval,  
 d can be used to  
 ific time stability  
 ky landscape. Soil

# Scale-Specific Variations in 2D

One property may vary at one scale, while others at other scales

## Bi-dimensional empirical mode decomposition

Separating Scale-Specific Spatial Variability in Two Dimensions using Bi-Dimensional Empirical Mode Decomposition

**SSSAJ, 2013, 77: 1991-1995**

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Empirical mode decomposition (EMD) has been used to separate the spatial variability in soil properties at different scales in one dimension. The objective of this note is to illustrate the use of a two-dimensional extension of the EMD (known as bi-dimensional empirical mode decomposition or BEMD) to separate the spatial variability at different scales. A digital elevation model (DEM) was used as an example to demonstrate the method. The BEMD generated the

# Separating 2D variations

Scale: 7509 m

Scale: 3905 m

Scale: 8839 m

Var.: 14 %

Var.: 77 %

## DEM

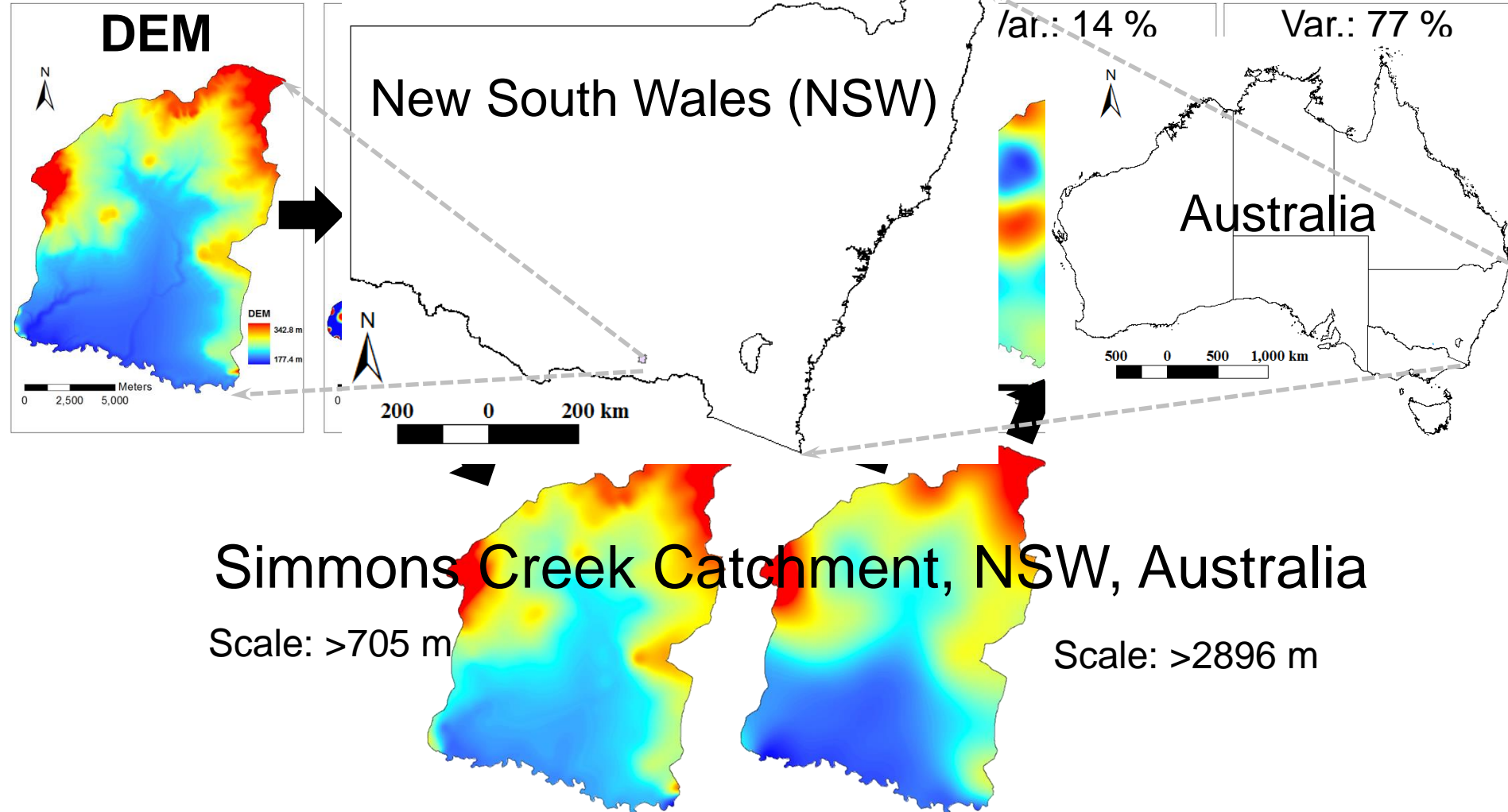
## New South Wales (NSW)

## Australia

## Simmons Creek Catchment, NSW, Australia

Scale: >705 m

Scale: >2896 m



# Separating 2D variations

Scale: 7509 m

Scale: 705 m

Scale: 2896 m

Scale: 3905 m

Scale: >8839 m

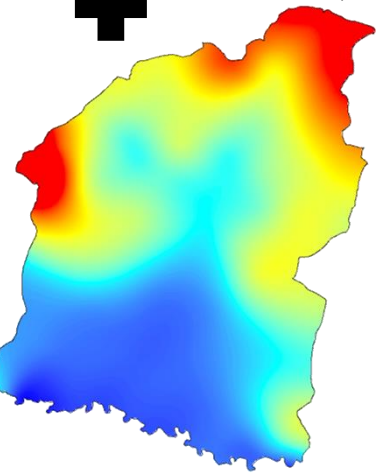
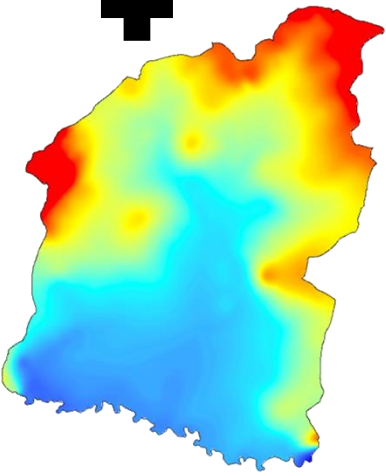
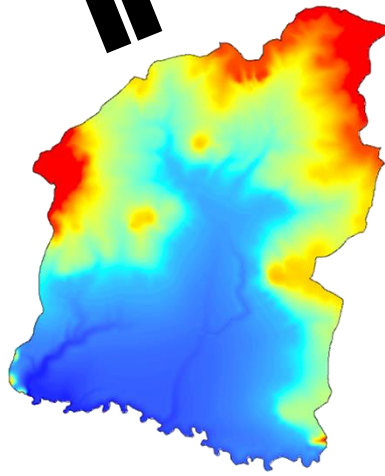
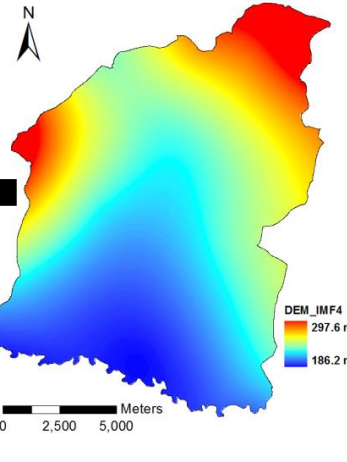
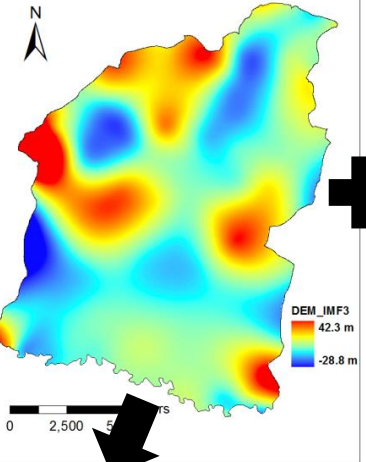
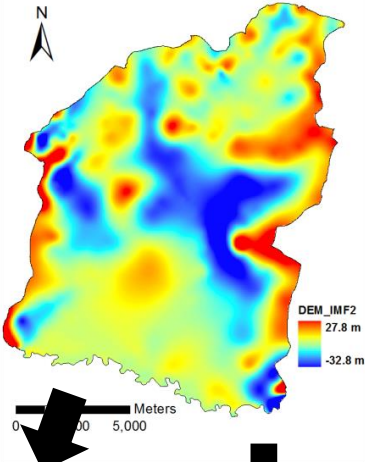
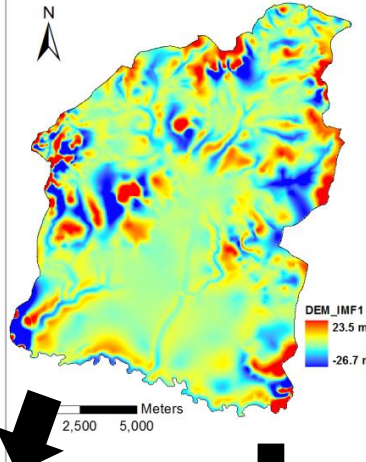
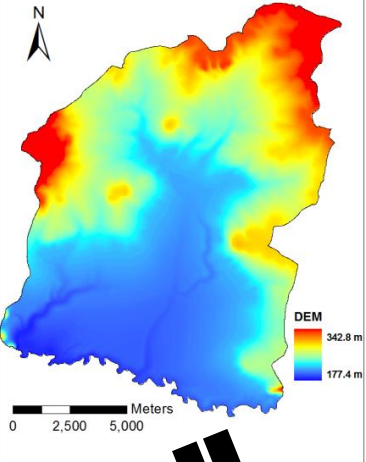
**DEM**

Var.: 2 %

Var.: 7 %

Var.: 14 %

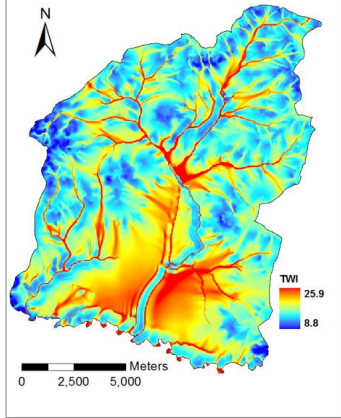
Var.: 77 %



# Separating 2D variations

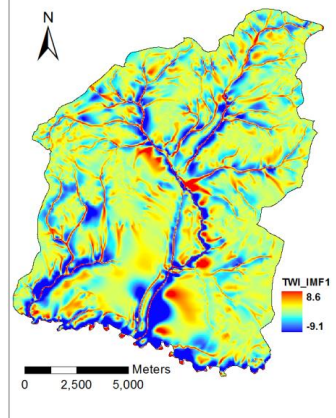
## Wetness

### Index



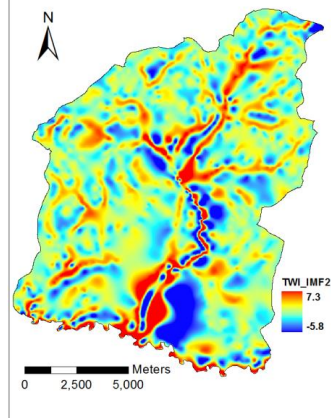
Scale: <1 km

Var.: 36 %



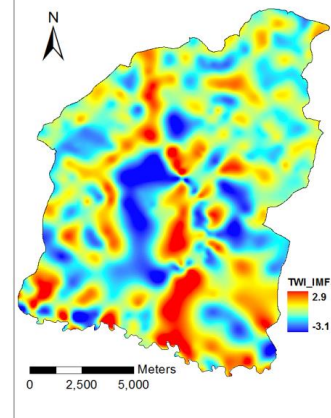
Scale: 1-2.5 km

Var.: 25 %



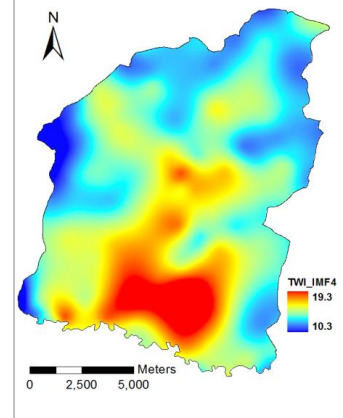
Scale: 2.5-5 km

Var.: 13 %

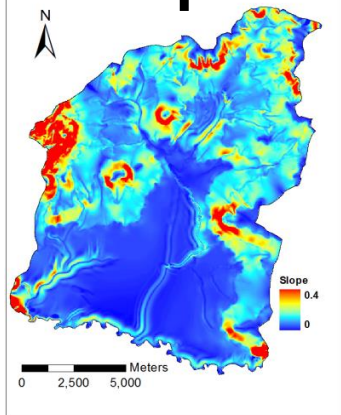


Scale: >5 km

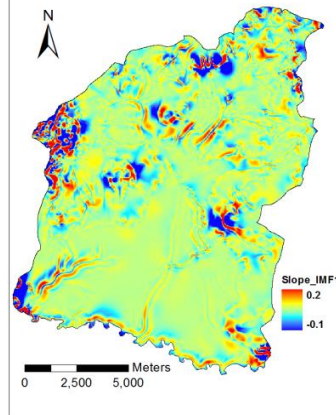
Var.: 26 %



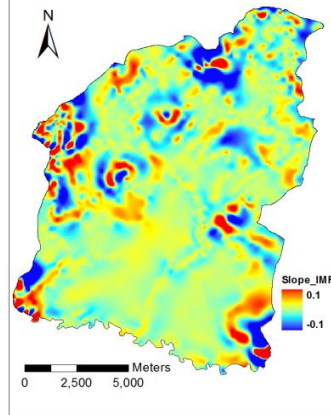
### Slope



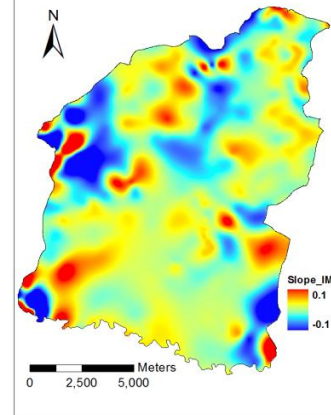
Var.: 13 %



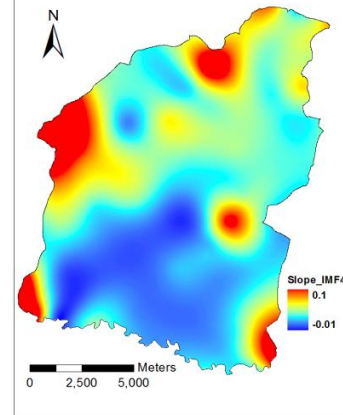
Var.: 10 %



Var.: 23 %



Var.: 54 %



# Separating 2D variations

## Wetness Index

Scale: <1 km

Var.: 36 %

Scale: 1-2.5 km

Var.: 25 %

Scale: 2.5-5 km

Var.: 13 %

Scale: >5 km

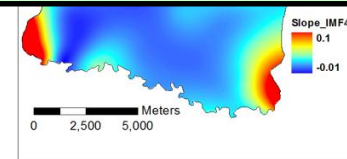
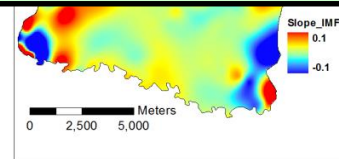
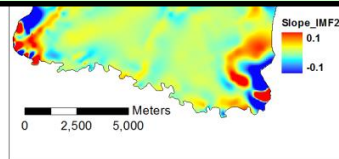
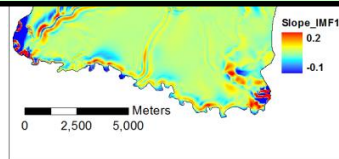
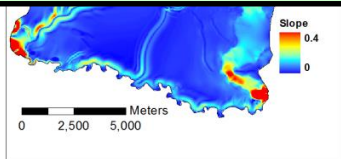
Var.: 26 %

What does it enable?

Scale-separation: meets user data demand

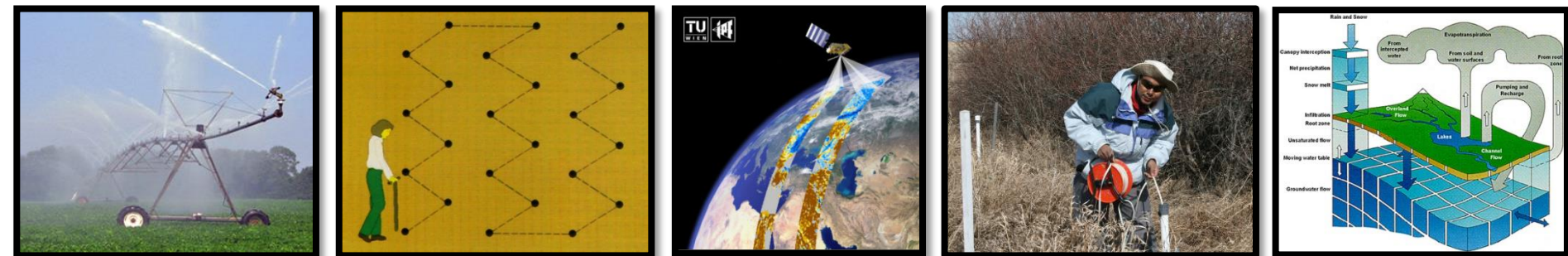
Scale-specific predictions

Multi-scale digital soil mapping



# Summary

- Optimize sampling strategy and experimental design
  - Scales of hydrological processes
- Identify representative locations for monitoring
- Previously hidden predictive relationship
- Infer at depth from surface measurements
- Identify environmental controls at different scales
- Scale-specific prediction
- Multi-scale digital soil mapping





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## Co-authors-

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McGill



UNIVERSITY OF  
SASKATCHEWAN



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Dr. Henry Chau



Graduate and Summer students



McGill

Graduate and Summer students



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Union  
Géophysique  
Canadienne



Soil  
Science  
Society of America



# The Team



# Thank You

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