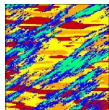
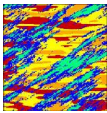


PluriGaussian Model
used for simulating
heterogeneous deposits



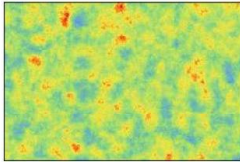
Multigaussian framework

- Multigaussian provides an optimal framework for various simulations models:
 - Spectral method
 - Turning bands method
 - Sequential method
- Able to:
 - Operate on "continuous" variables
 - Simulate most of the known covariances / variograms
 - Honor conditioning data (through kriging)

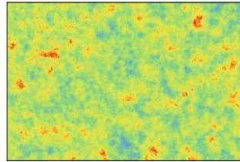


Multigaussian framework

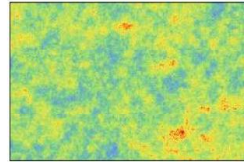
Able to simulate most of covariances / variograms



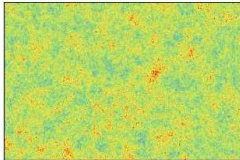
Spherical



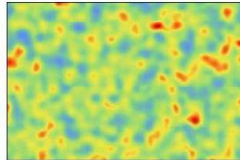
Exponential



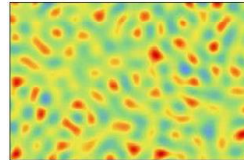
Hyperbolic



Stable

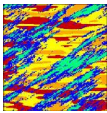


Gaussian



Cardinal sine

Courtesy from Ch. Lantuéjoul



From continuous to categorical

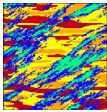
How to simulate categorical variable (facies) ?

- Turn the facies into numerical variable through some indicators and adapt the simulation method:

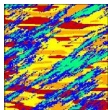
SGS → *SIS*

- Consider the facies as a transformed version of underlying Gaussian random function(s):

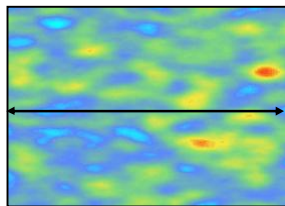
Truncated Gaussian (TG) & Plurigaussian (PGS)



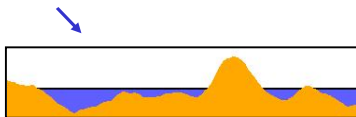
TRUNCATED GAUSSIAN & PLURIGAUSSIAN SIMULATIONS



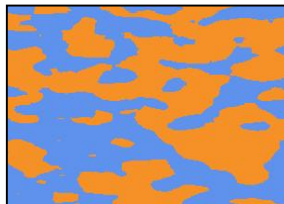
Truncated Gaussian Model



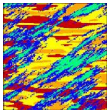
Stationary normalized Gaussian RF Y
Covariance $\rho(h)$ or $\gamma(h)$



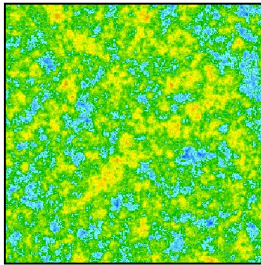
Threshold on the Gaussian RF



Random Set A
Proportions p
Covariances $K_A(h)$ or $\gamma_A(h)$



Proportions and thresholds



Simulation of the
Gaussian RF Y

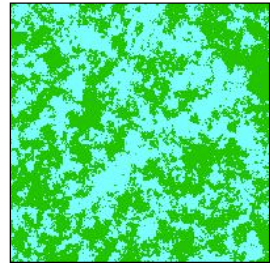
Proportion \rightarrow Threshold

proportion \rightarrow

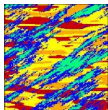
$G(Y)$

\uparrow
threshold

$$A = \{x; Y(x) \leq s\}$$



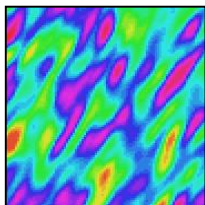
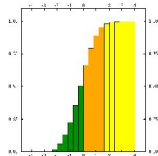
Facies Simulation



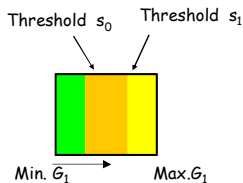
Several facies

$$p_2 + p_1 = G(s_1)$$

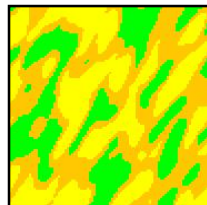
$$p_1 = G(s_0)$$



Gaussian RF

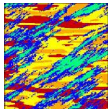


Lithotype rule



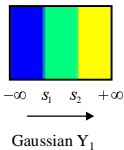
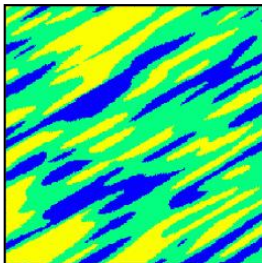
Facies Simulation

Use ONE underlying Gaussian RF to simulate several facies

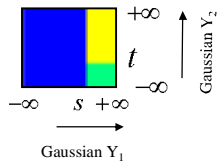
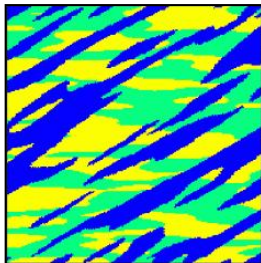


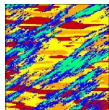
From Mono to PluriGaussian

Mono-Gaussian

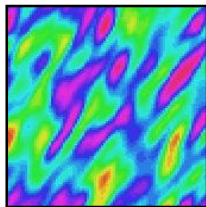


PluriGaussian

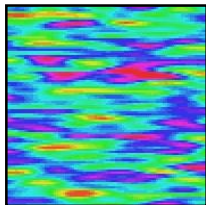
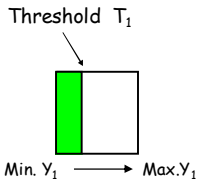




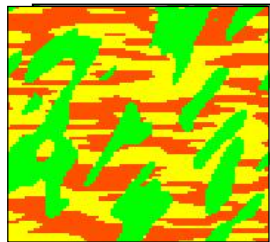
Three facies - Two gaussians



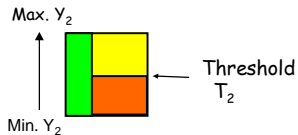
Gaussian (Y_1)

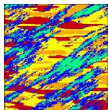


Gaussian (Y_2)

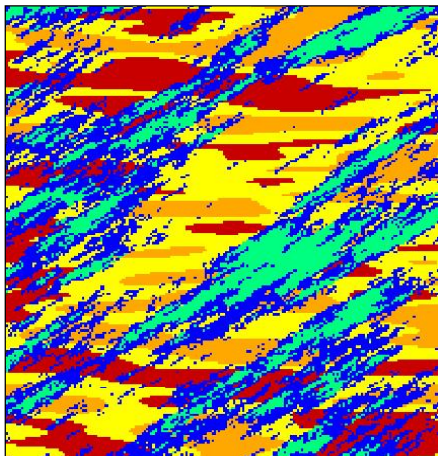


Facies
Simulation





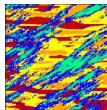
Several facies



Simulation with:

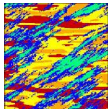
- 5 facies
- 2 Gaussian RF:
 - different covariances
 - different anisotropies



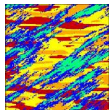


Other properties

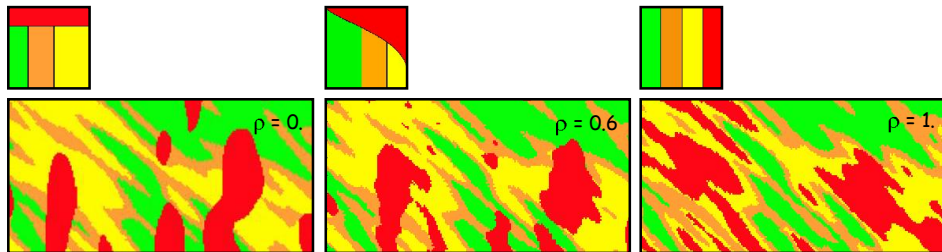
- Non-stationarity
 - Use stationary underlying Gaussian random function
 - Consider non-constant proportions / thresholds
- Conditioning to data:
 - based on simulations of underlying Gaussian random functions
 - Gaussian random functions can be conditioned to hard data
 - Translate facies data into Gaussian values (Gibbs sampler)
 - Possibility to handle hard and soft information



CORRELATED UNDERLYING GAUSSIAN RANDOM FUNCTIONS



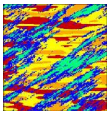
Correlated underlying GRF



The underlying gaussian RF are intrinsically correlated:

$$\begin{cases} Y_1(x) = Z_1(x) \\ Y_2(x) = \rho Z_1(x) + \sqrt{1 - \rho^2} Z_2(x) \end{cases}$$

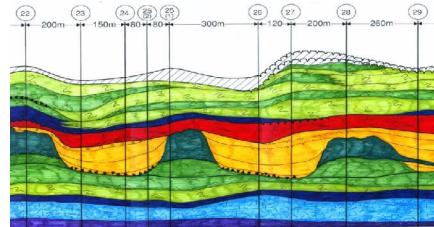
Z_1 and Z_2 not correlated



Correlated underlying GRF

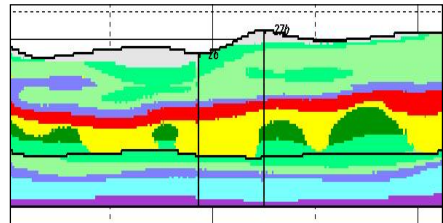


Paradox: algal mounds



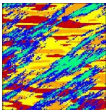
Interpreted cross-section

- Non skeletal carbonate facies
- Quartz sand facies
- Skeletal bioclastic facies
- Algal mound facies (final stage)
- Algal mound facies (initial stage)
- Incipient algal mounds
- Intermediate facies
- Sponge facies
- Black laminated shales

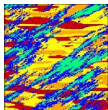


Simulation with correlated GRFs

Courtesy from A. Galli et al.

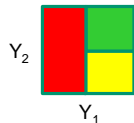
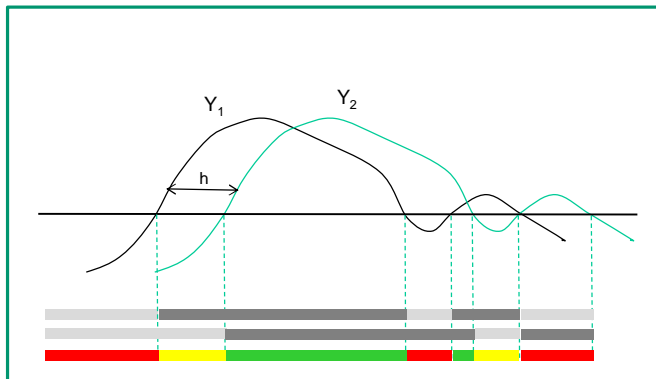


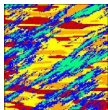
SHIFTED PLURIGAUSSIAN SIMULATIONS



Shifted PGS

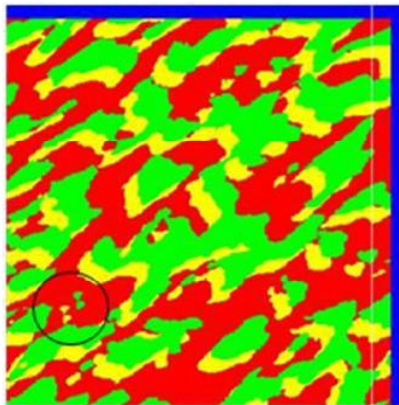
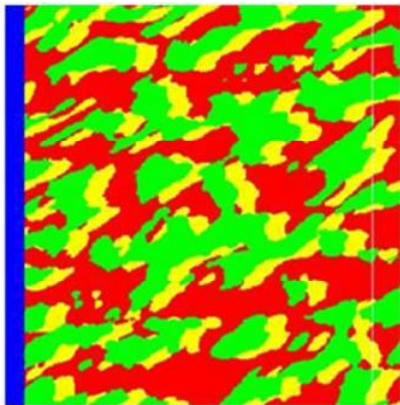
$Y(x)$ designates the first GRF, the second GRF is given by $Y(x+sh)$



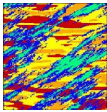


Shifted PGS

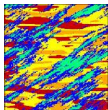
Two examples of shifted PGS



No systematic contact between yellow and green facies

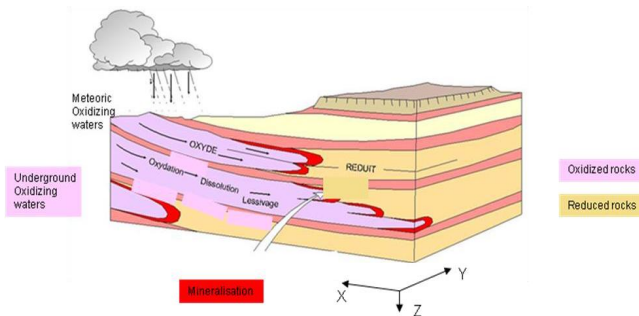


SHADOWED PLURIGAUSSIAN SIMULATIONS

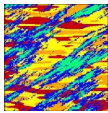


Shadowed PGS

Simulation of Uranium roll-fronts

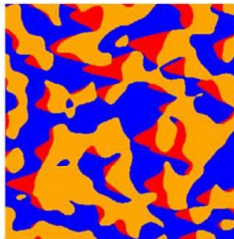
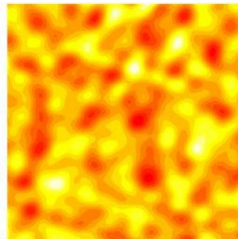
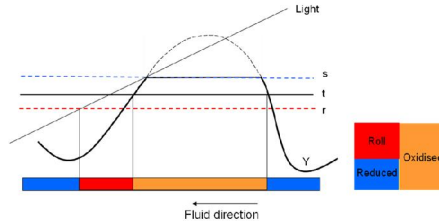


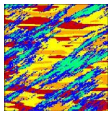
Courtesy from V. Langlais (AREVA)



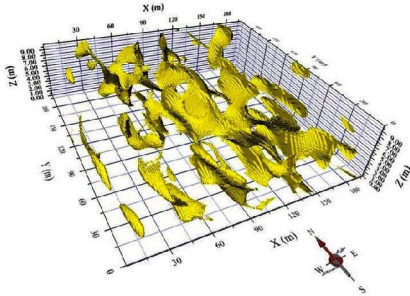
Shadowed PGS

- The first GRF is considered as the relief (truncated below "s"), the second GRF is the shadow (on the reference plane "r")

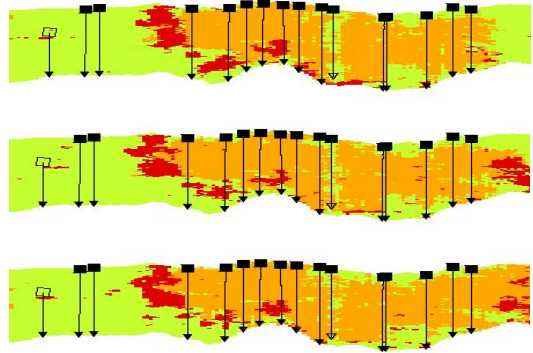




Shadowed PGS

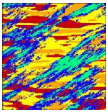


Simulation of roll-fronts

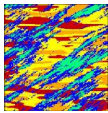


3 conditional simulations

Courtesy from AREVA

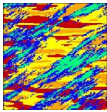


APPLICATIONS OF PGS



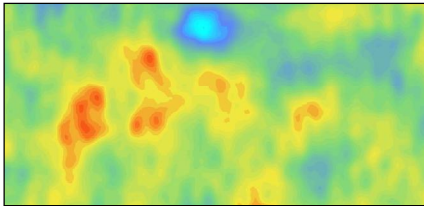
Applications

- The following illustrations are obtained by making specific choices for:
 - The covariances of the GRFs
 - The lithotype rule
 - The proportions and thresholds
 - The non-stationarity

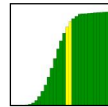
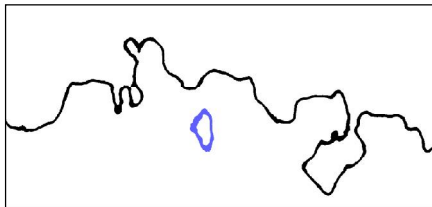


PGS Illustrations

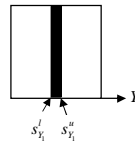
Narrow threshold interval



Simulation: meander & oxbow lake



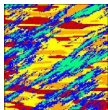
Lower & upper thresholds



Lithotype Rule

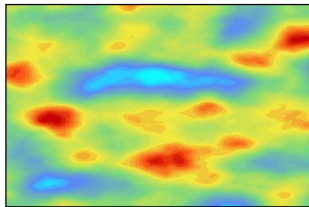


A meandering river

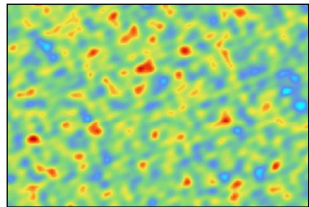


PGS Illustrations

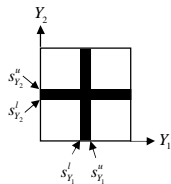
Definition of a Complex Random Set



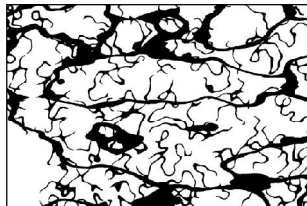
Long range GRF



Short range GRF



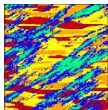
Lithotype Rule



Mixed scale texture

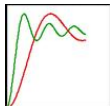
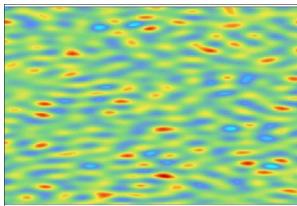


Tidal channel on tidal flat, Coos Bay, Oregon



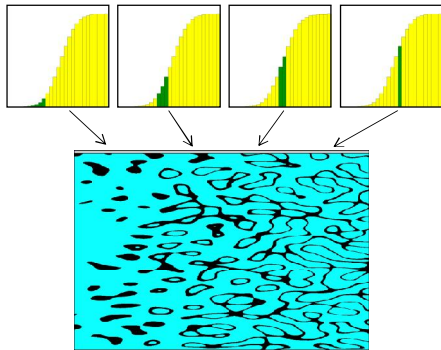
PGS Illustrations

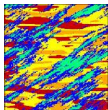
Non-stationary threshold interval



*One stationary GRF
with anisotropic
periodic variogram*

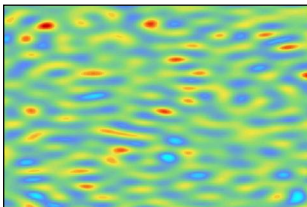
Constant proportion - Non-stationary thresholds





PGS Illustrations

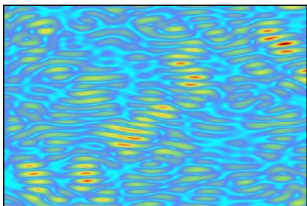
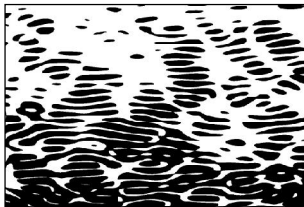
Non-stationary threshold interval



*Anisotropic
periodic GRF Y_0*



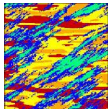
Ripples



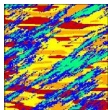
$Y_1 = \text{Gradient of } Y_0$

*Ripples on tidal flat,
SE Alaska*





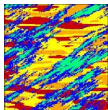
JOINT SIMULATION OF TWO PHENOMENA: BI-PGS



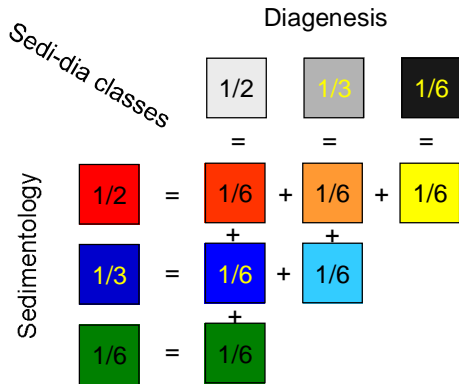
Introduction

Simulate heterogeneities :

- Two indicators reflecting two linked processes:
 - Sedimentology
 - Diagenesis
- Conditioned by **heterotopic** data set:
 - All samples have Sedimentology information
 - Only few have Diagenesis index

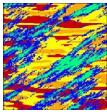


Joint proportions



Proportions of

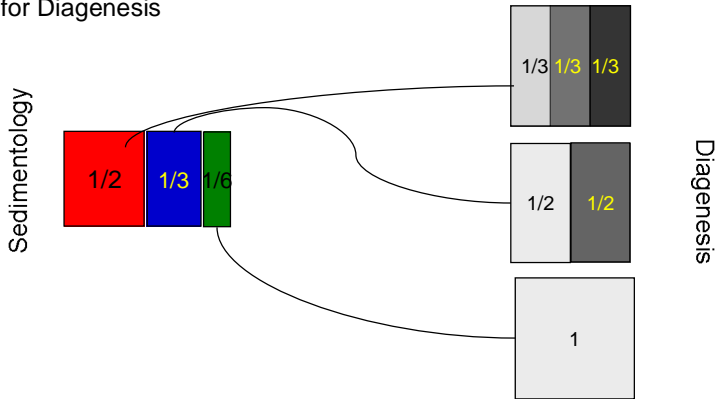
- Sedimentology facies
- Diagenesis indices
- Sedimentology-Diagenesis classes



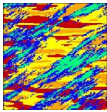
Bi-Plurigaussian Simulation

Two step process:

- PGS_1 for Sedimentology
- PGS_2 for Diagenesis

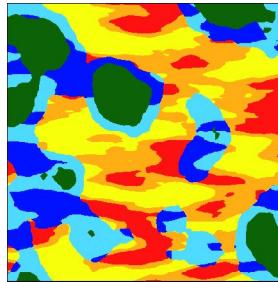
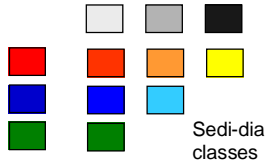
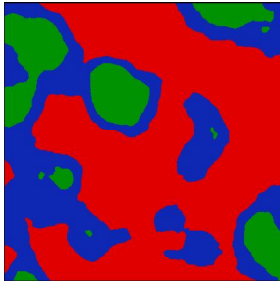


Proportions of Diagenesis are conditional to Sedimentology facies



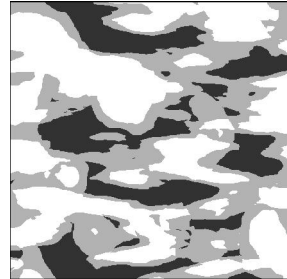
Bi-Plurigaussian Simulation

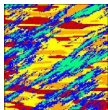
Sedimentology



Final conditional simulation

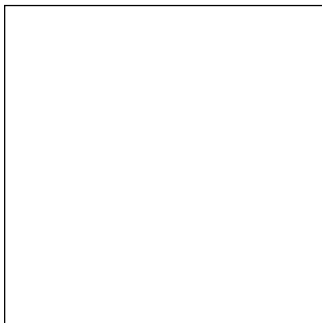
Diagenesis





Heterotopic Data Set

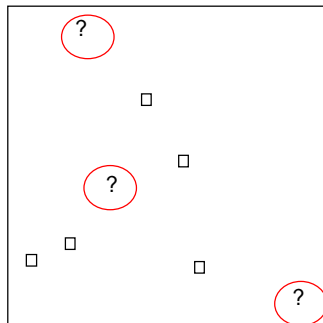
Bivariate categorical information



Sedimentology

9 data

3 facies

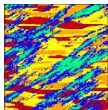


Diagenesis

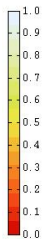
6 data

3 indices

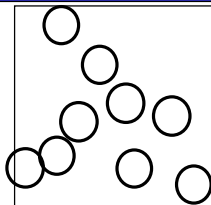




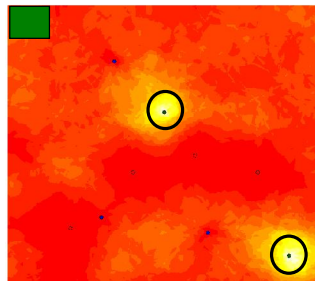
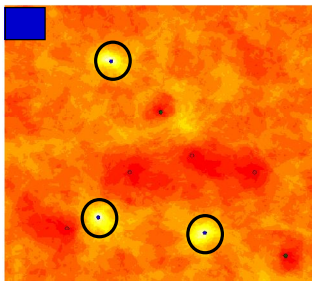
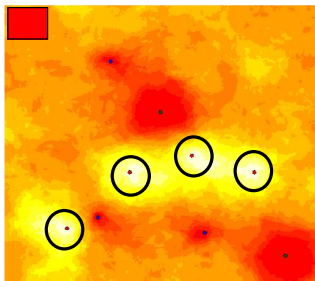
Probability of the sedimentary facies

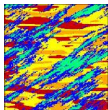


Data

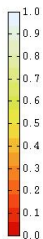


Sedimentology

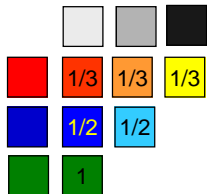




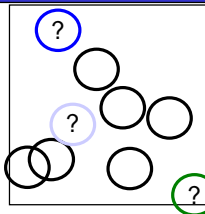
Probability of the diagenetic index



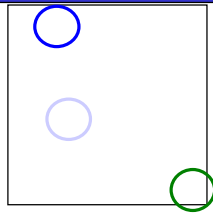
Proportion (dia/sedi)



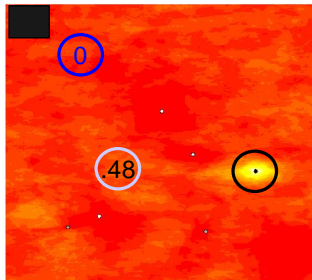
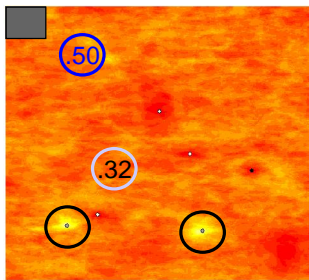
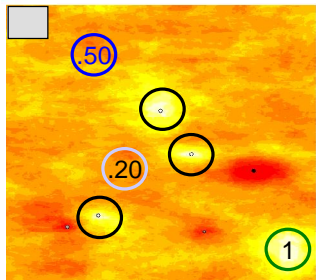
Data

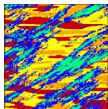


Diagenesis



Sedimentology



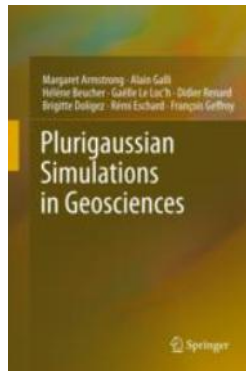


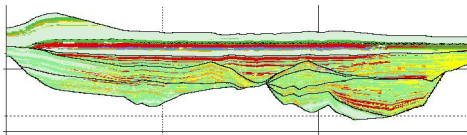
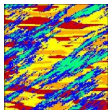
References

- Download **PluriDemo** package for:
 - Variography
 - PuriGaussian
 - Pluri-Sets
- **Plurigaussian Simulations in Geosciences, 2nd edition**
Armstrong, M., Galli, A., Beucher, H., Loc'h, G., Renard, D., Doligez, B., Eschard, R., Geffroy, F.

From:

<http://www.geosciences.mines-paristech.fr/web/en/organization/presentation-of-the-group-2/main-projects/pluridemo/projet-pluridemo>





Thank you for your attention

