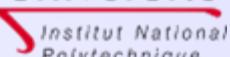


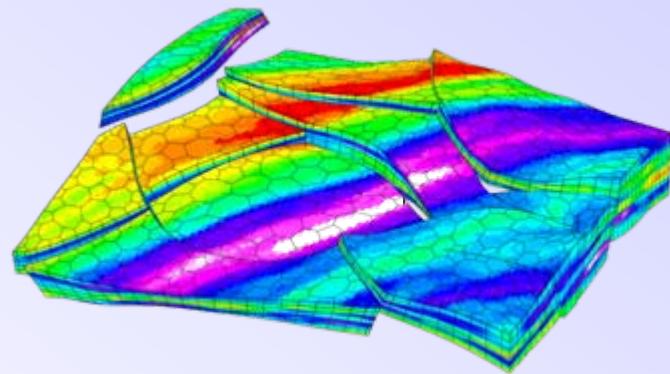
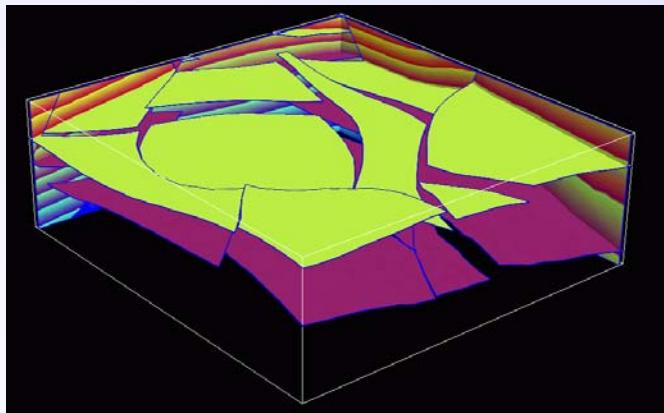
Towards a Better Description of Subsurface Heterogeneities.

Guillaume Caumon

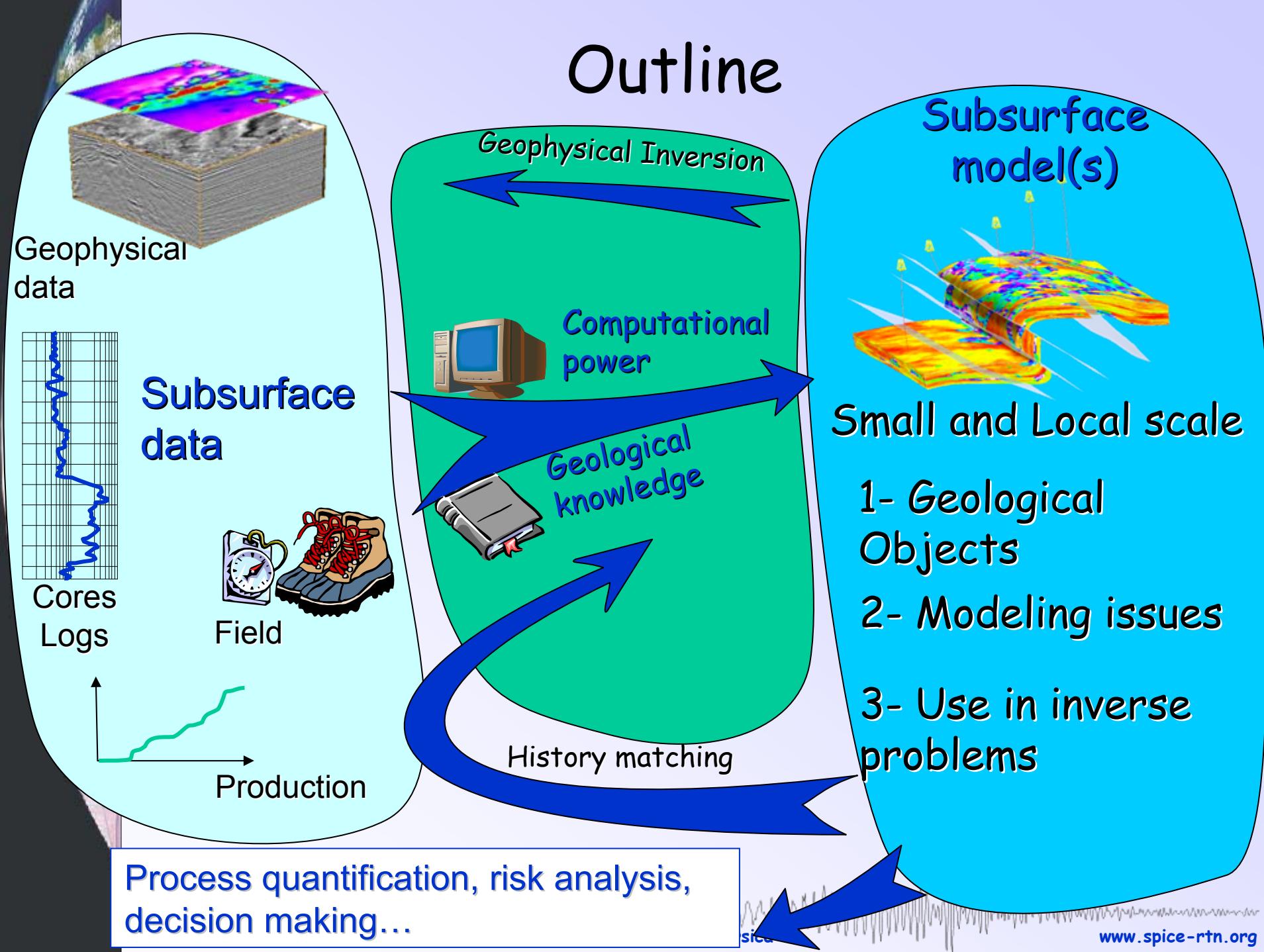
Nancy-Université

Institut National
Polytechnique
de Lorraine



C R P G



Outline

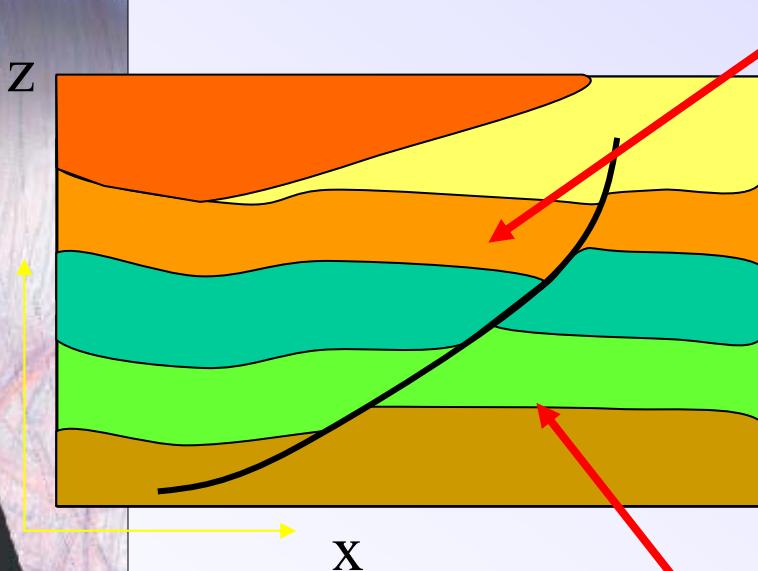


1. Geological Objects



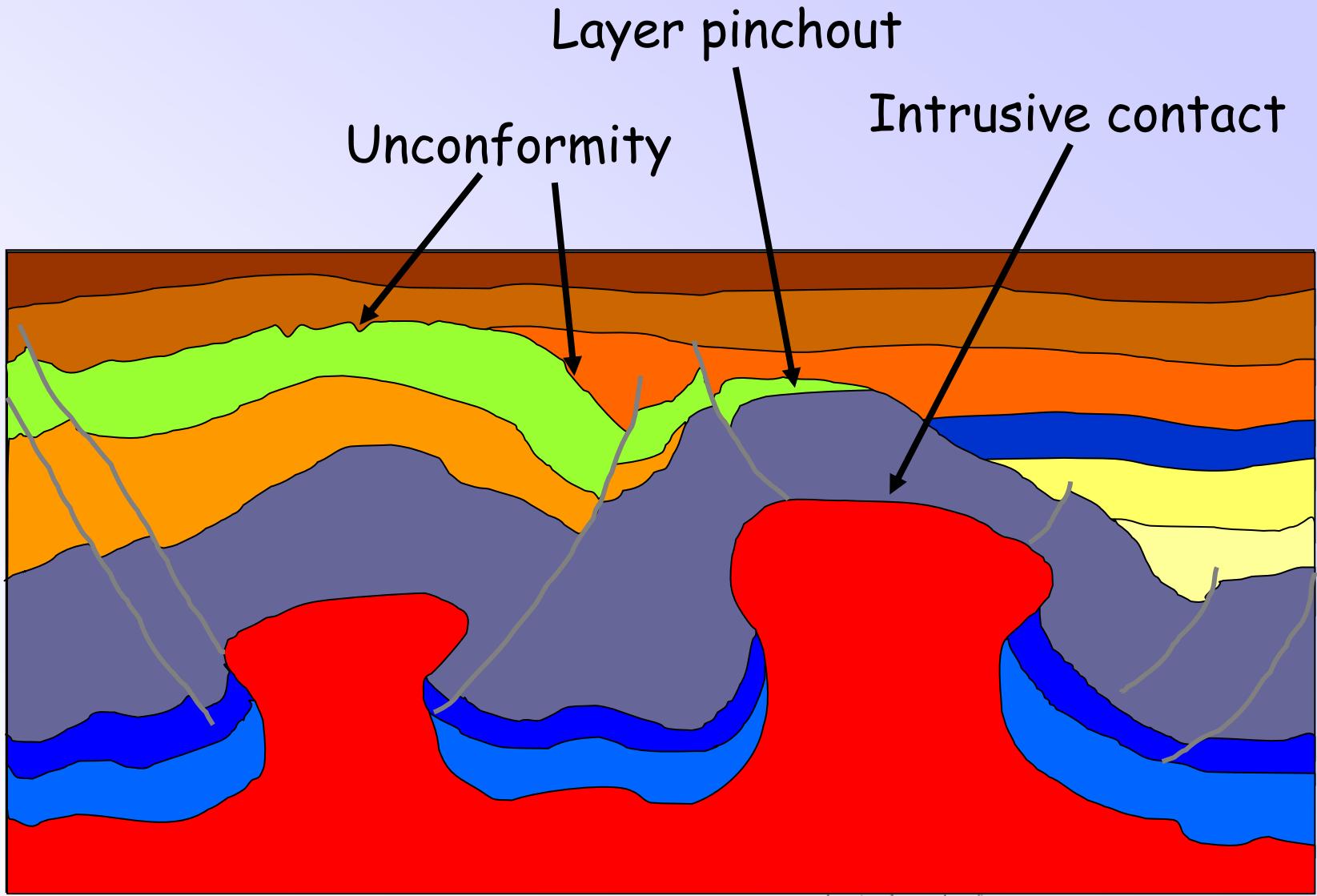
Stratigraphic Objects

Sedimentary Unit = layer

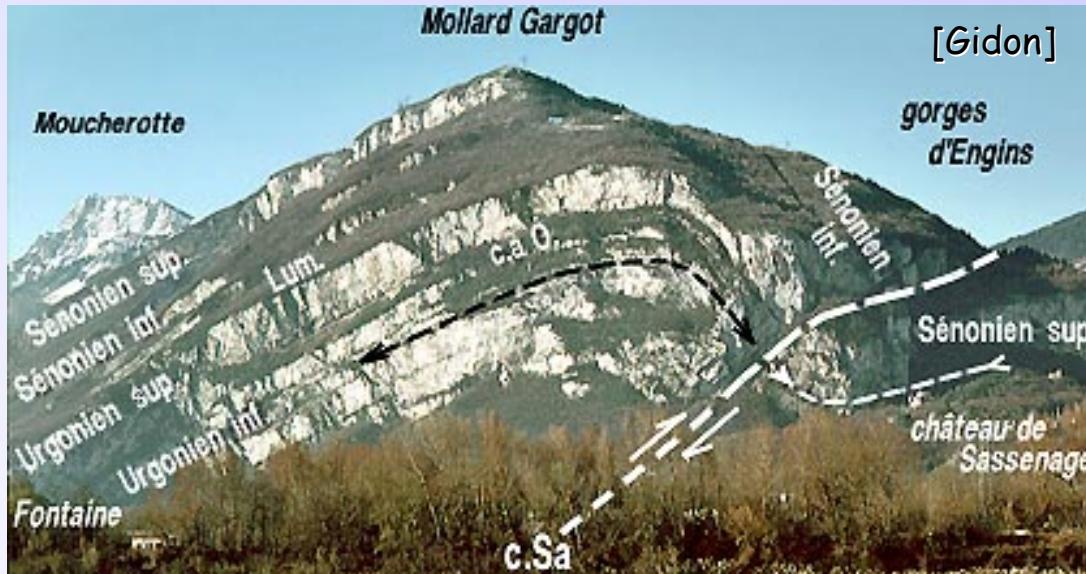


Interface = Horizon

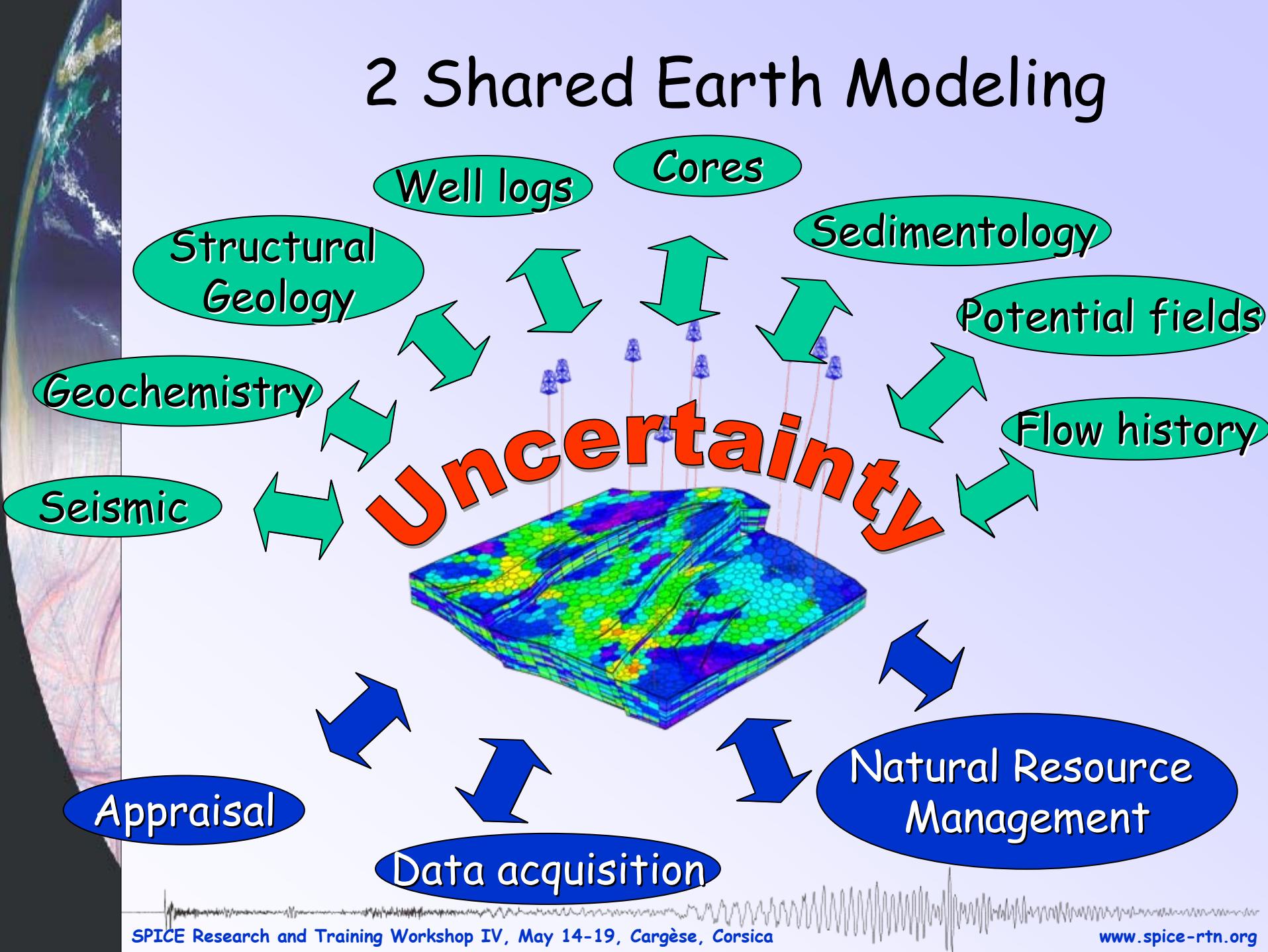
Unconformities



Tectonic Structures : Folds and Faults



2 Shared Earth Modeling



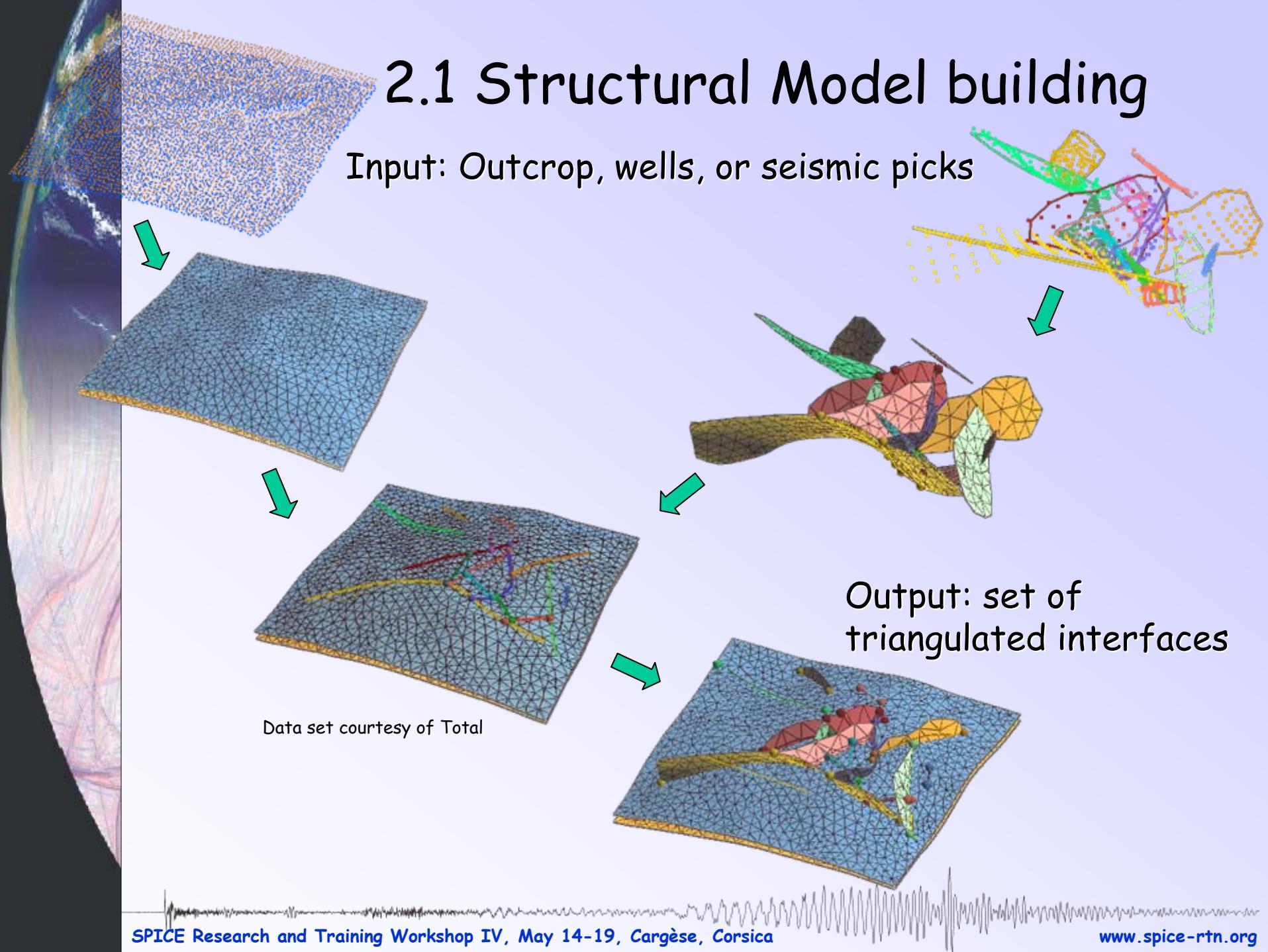


Software

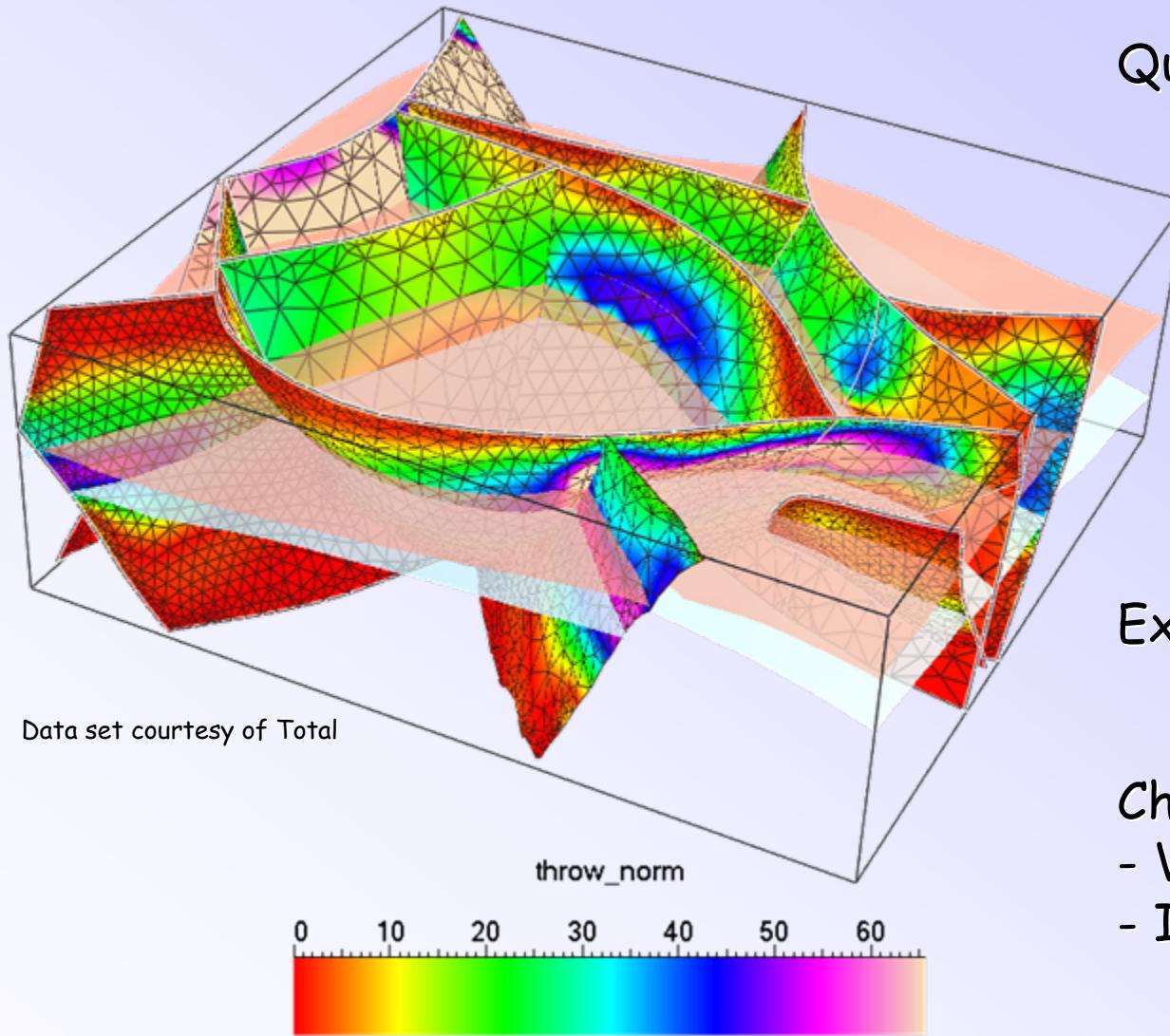
- Gocad / Earth Decision Suite - Paradigm Geophysical
 - Petrel - Schlumberger
 - Power Model - Landmark Graphics
 - RMS - Roxar
 - Earth Vision - DGI
 - Jewel Suite - JOA
- ⇒ Integrated 3D modeling software
- ⇒ Data transfer issues

2.1 Structural Model building

Input: Outcrop, wells, or seismic picks



Structural Model: QC

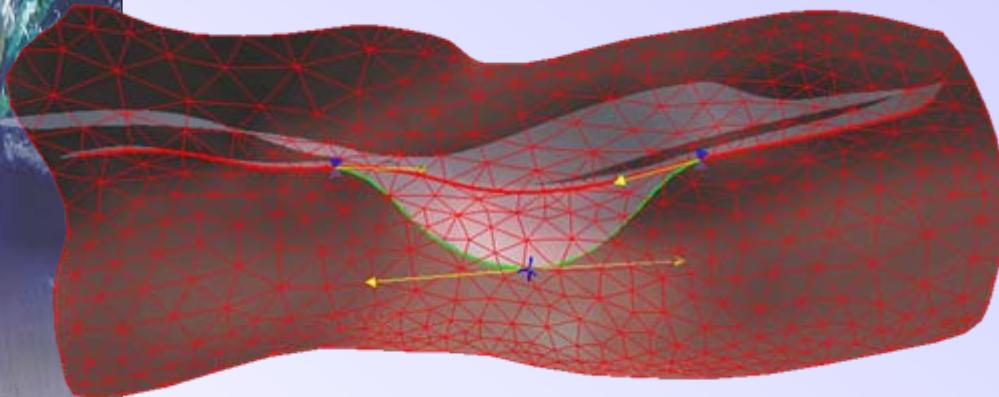


Example: fault slip

Challenges:

- Visualization
- Interactive editing

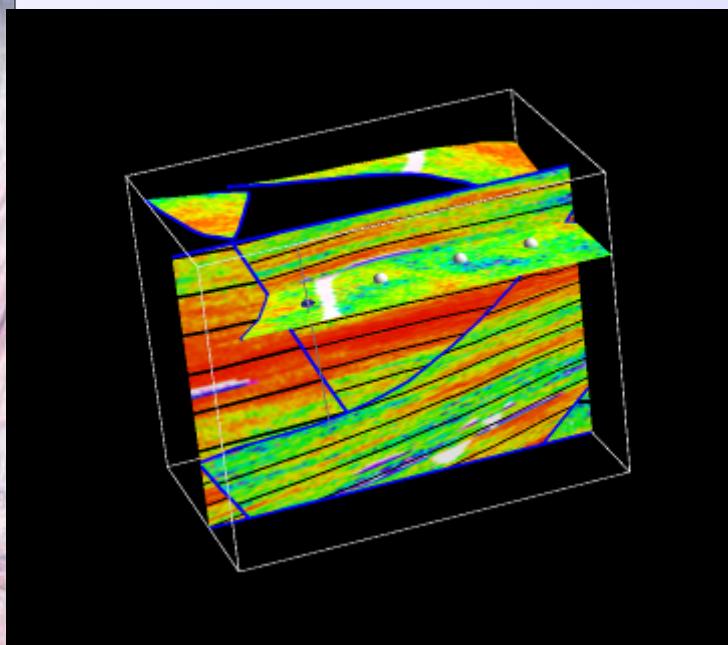
Editing a structural model



Interactive contact editing on
explicit interfaces

[Caumon et al, 2004]

Controlled topological changes
Local remeshing issues



Interactive editing on
implicit interfaces

[Frank & Mallet 2005]

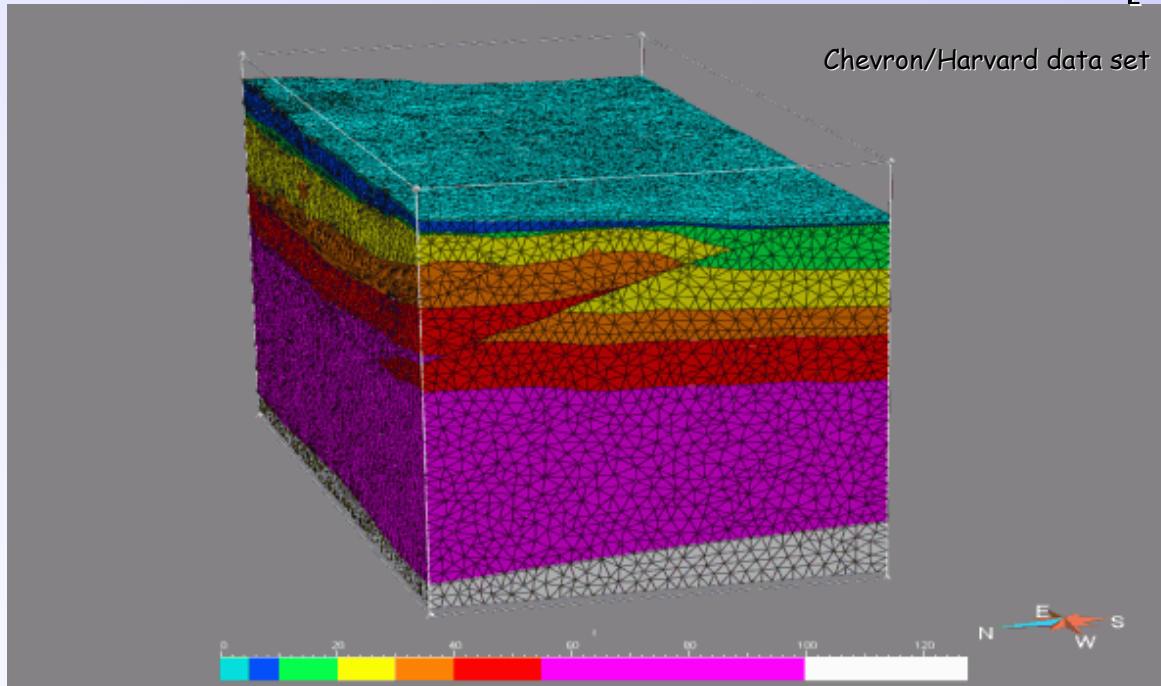
Editing of the implicit function
No remeshing needed

Fault editing in a tetrahedral mesh

[Tertois&Frank, 2005]

Quantitative QC: structural restoration

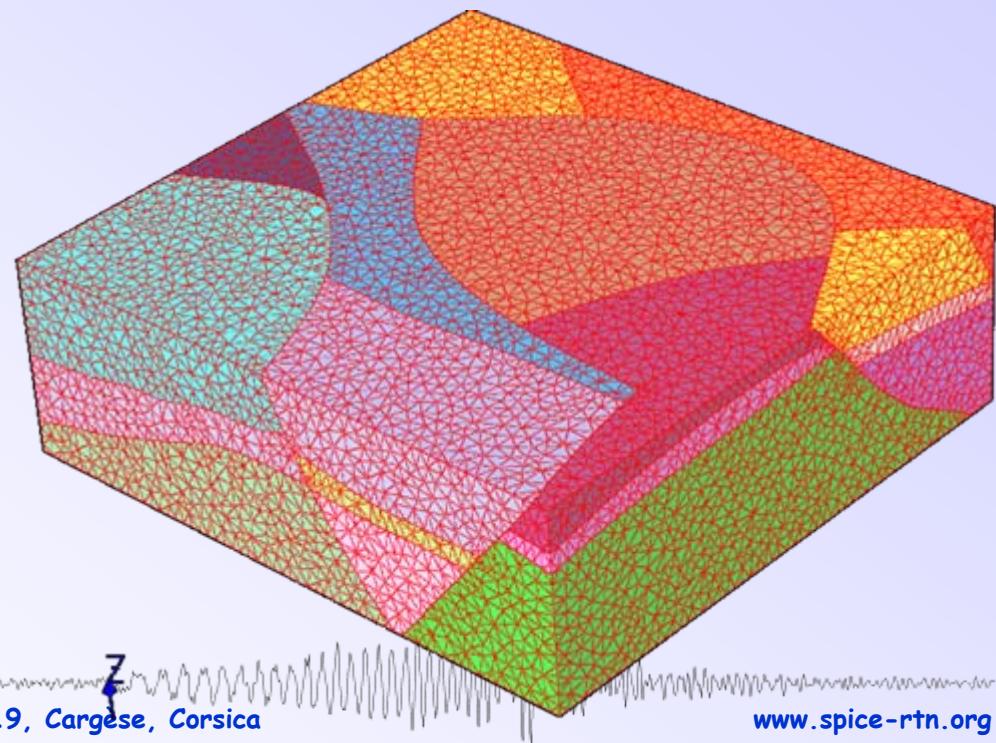
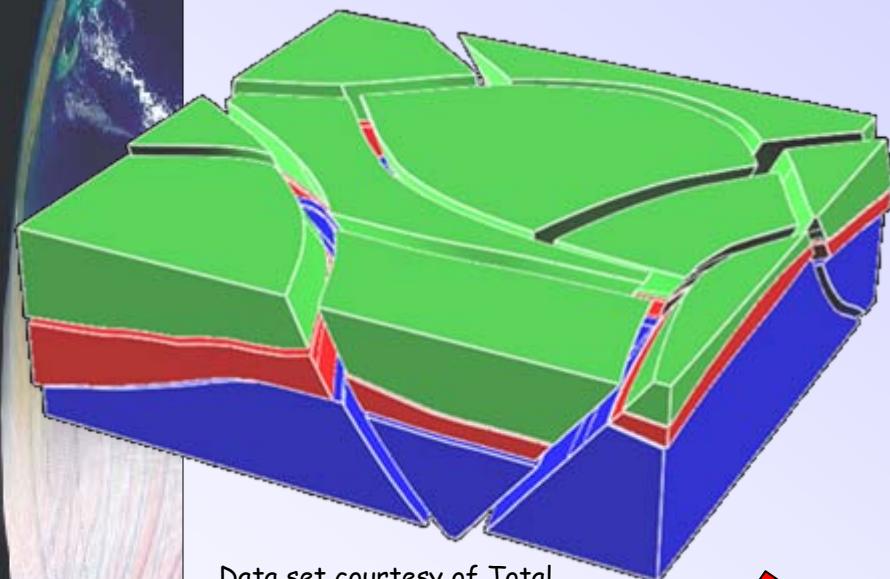
[Muron et al, 2005]



Restoration of volumes
(FE linear elastic model, with dynamic relaxation or
static analysis to handle faults)

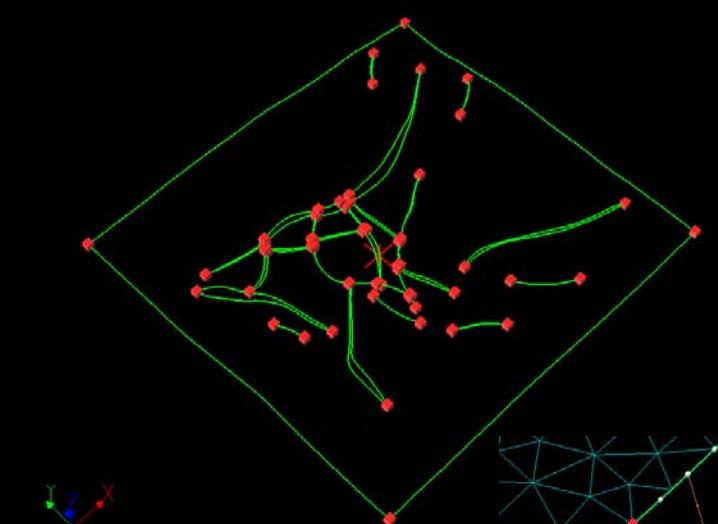
Tetrahedral gridding

[Lepage, 2003]

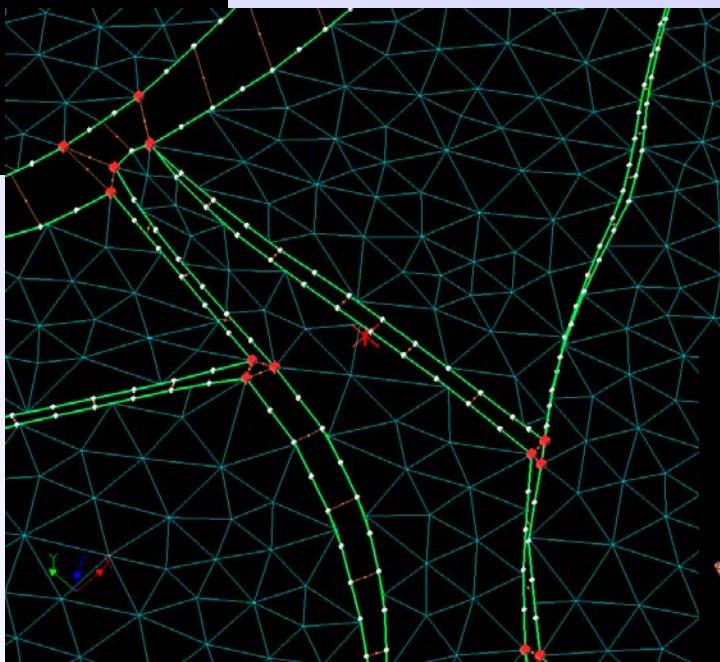


Tetrahedral gridding

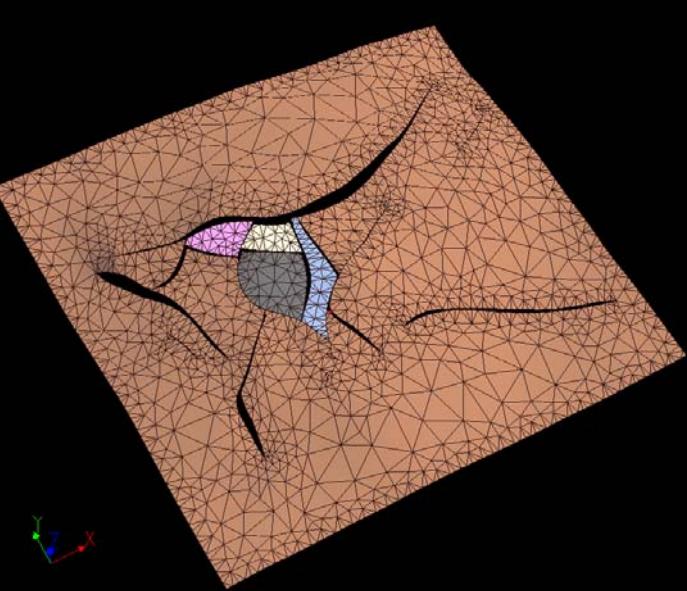
[Lepage, 2003]



1- Extraction of contacts



2- Uniform resampling



3- Surface re-meshing

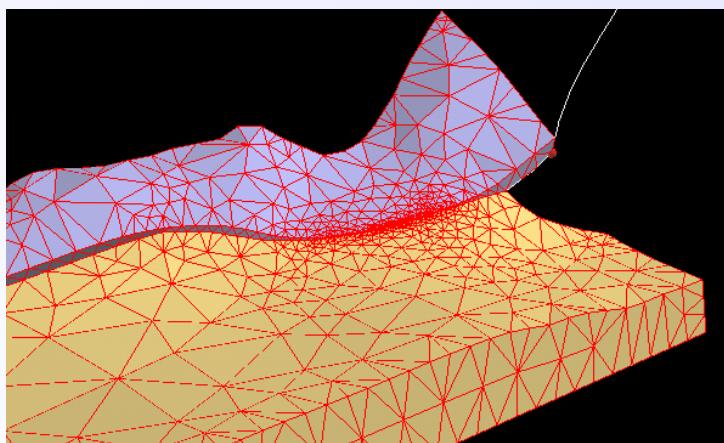
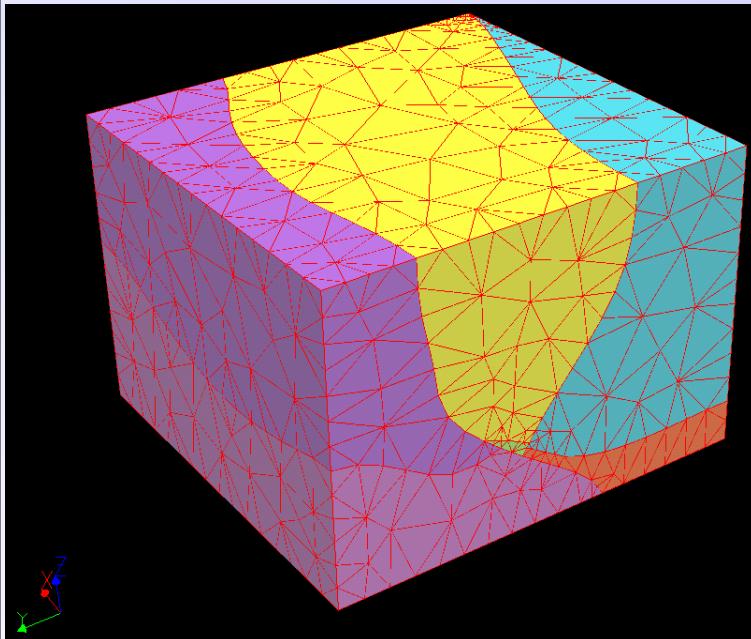
Tetrahedral gridding

[Lepage, 2003]

4- Conforming tetrahedral meshing

Insertion of points so as to:

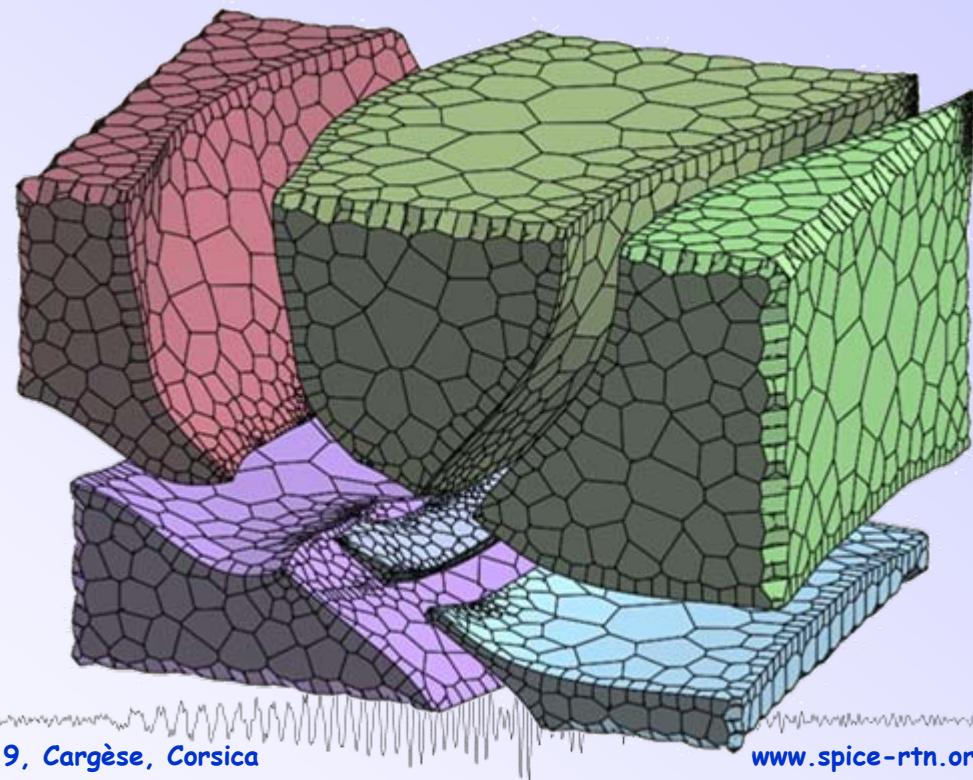
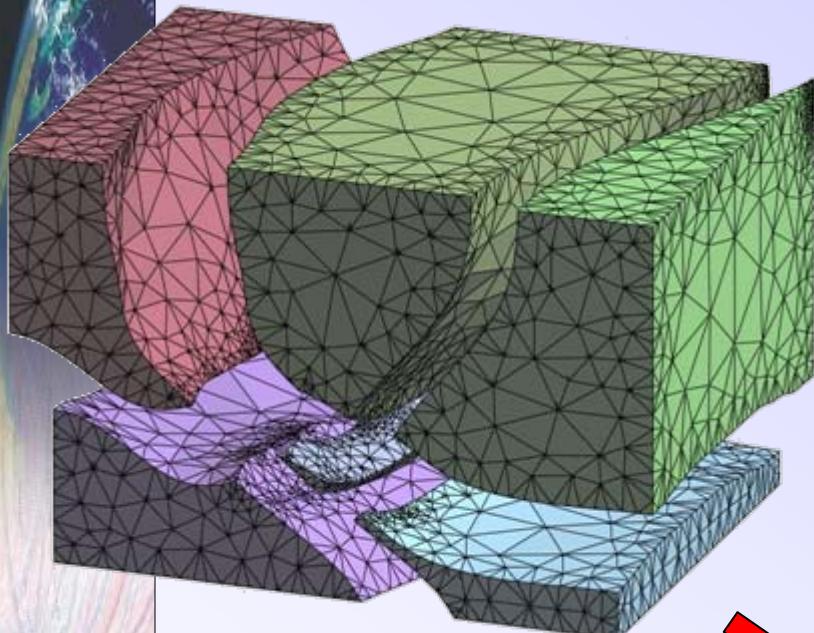
- Maximize mesh quality
- Honor constraints (Faults, horizons)



Consequence: high tetra density
close to neighboring contacts

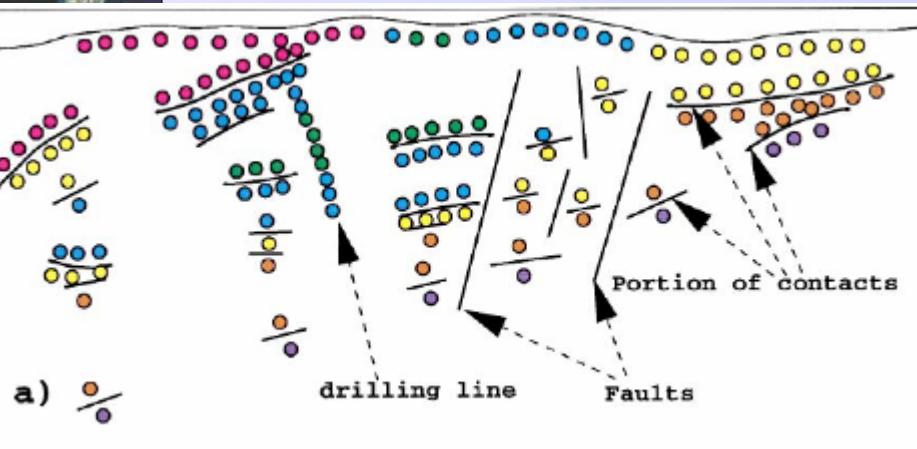
Voronoi gridding

[Conreaux, 2001; Lepage, 2003]

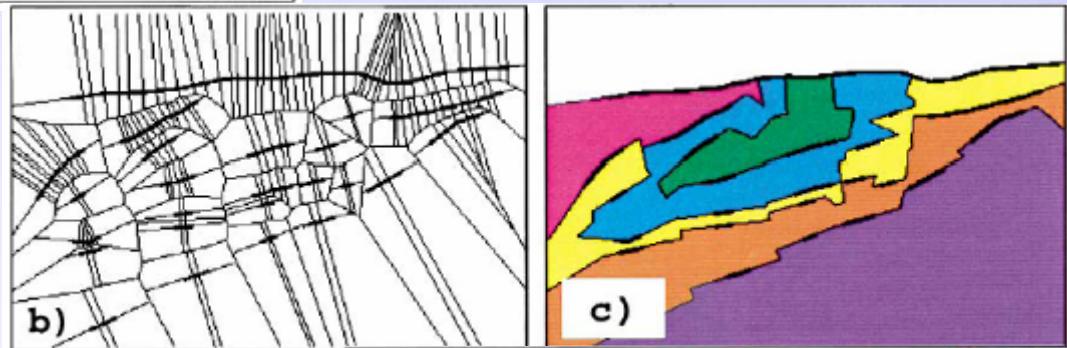


Direct Voronoi-based gridding

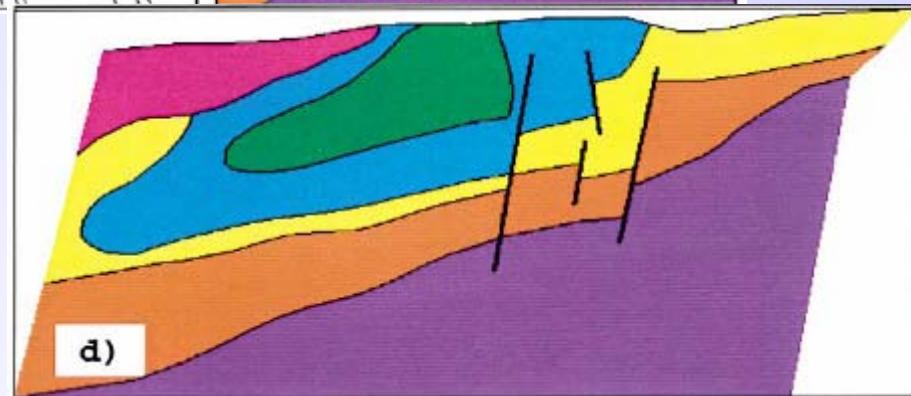
[Courrioux et al., 2001]
[Nullans et al, 1998]



Input (field) data



Voronoi diagram



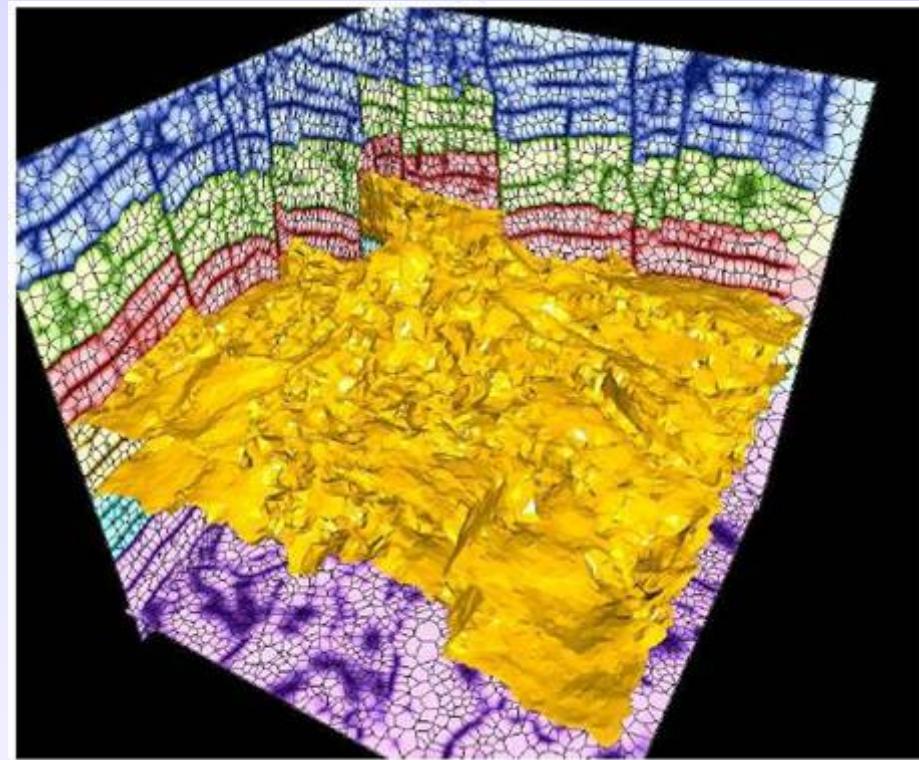
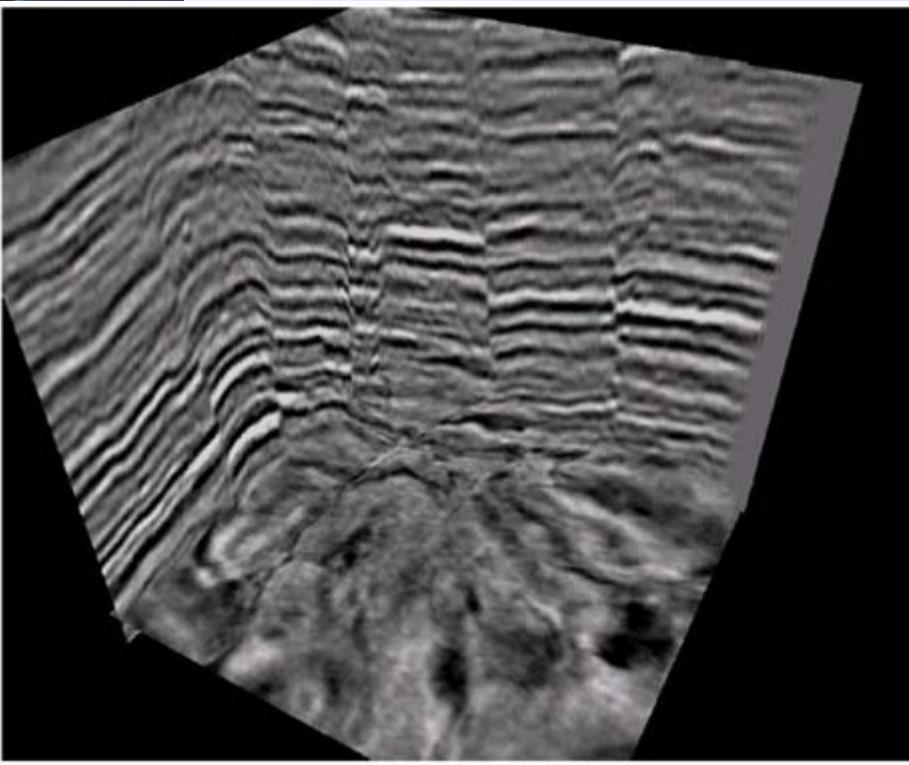
Smoothed Voronoi diagram



Direct construction from migrated seismic data

[Hale and Emmanuel, 2002]

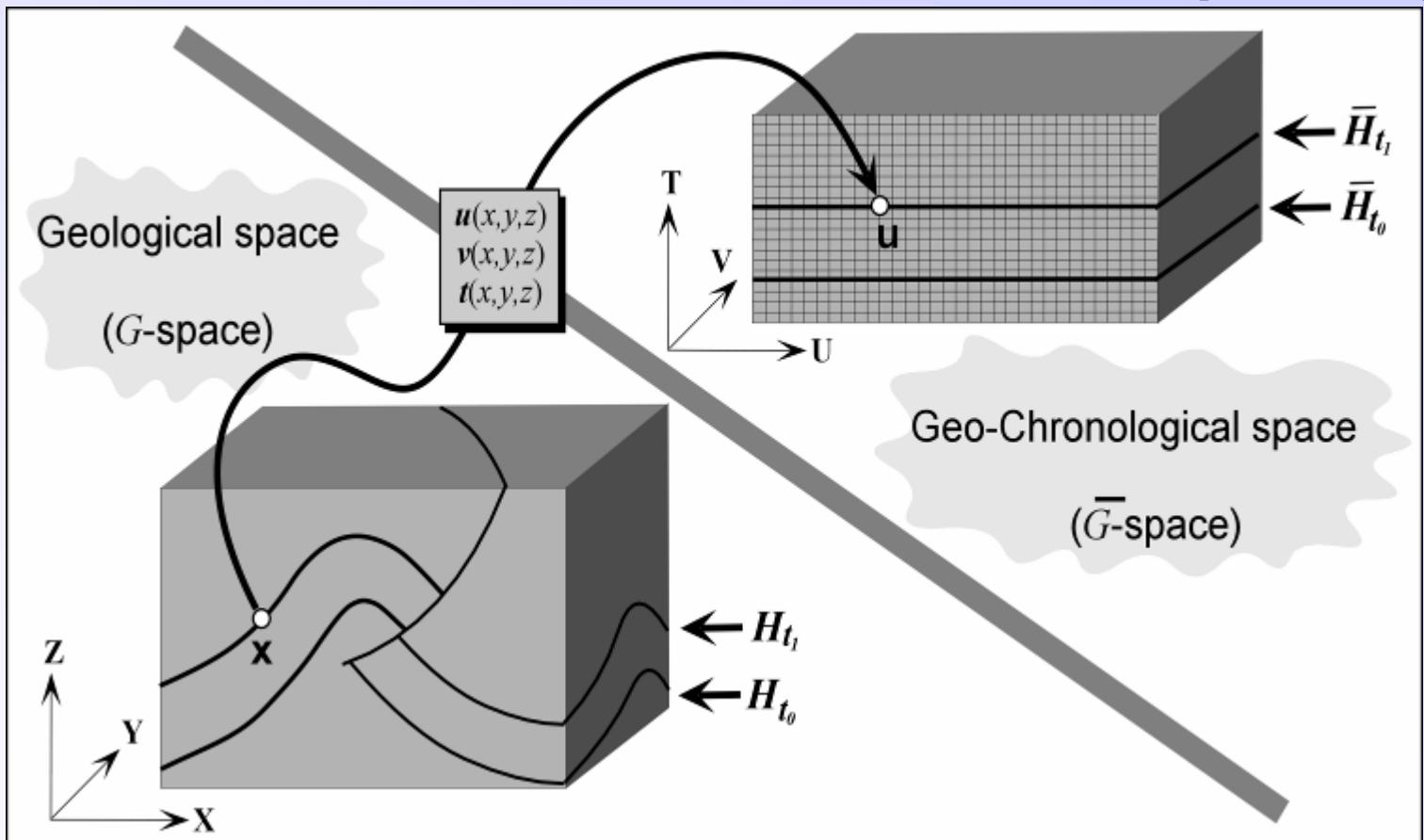
"Atomic Meshes"



Both automatic approaches are appealing,
but take no geological input, hence obtained models lack realism

2.2 Petrophysical Modeling

[Mallet, 2004]



Mapping into the Geo-Chronological space

First Geochron Implementation: Stratigraphic gridding

[Bombarde & Mallet 96]
[Levy & Mallet 98]

Compute curvilinear (u, v)
Coordinates on the horizon:
2D Quad gridding



Conforming



Baselap

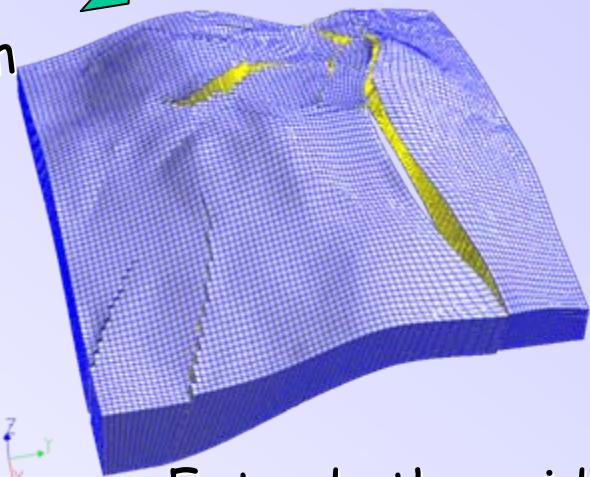
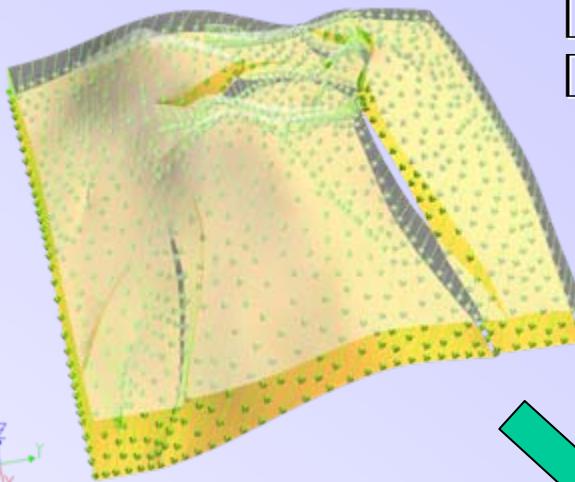
Associate top and bottom
Compute thickness maps



Progradational



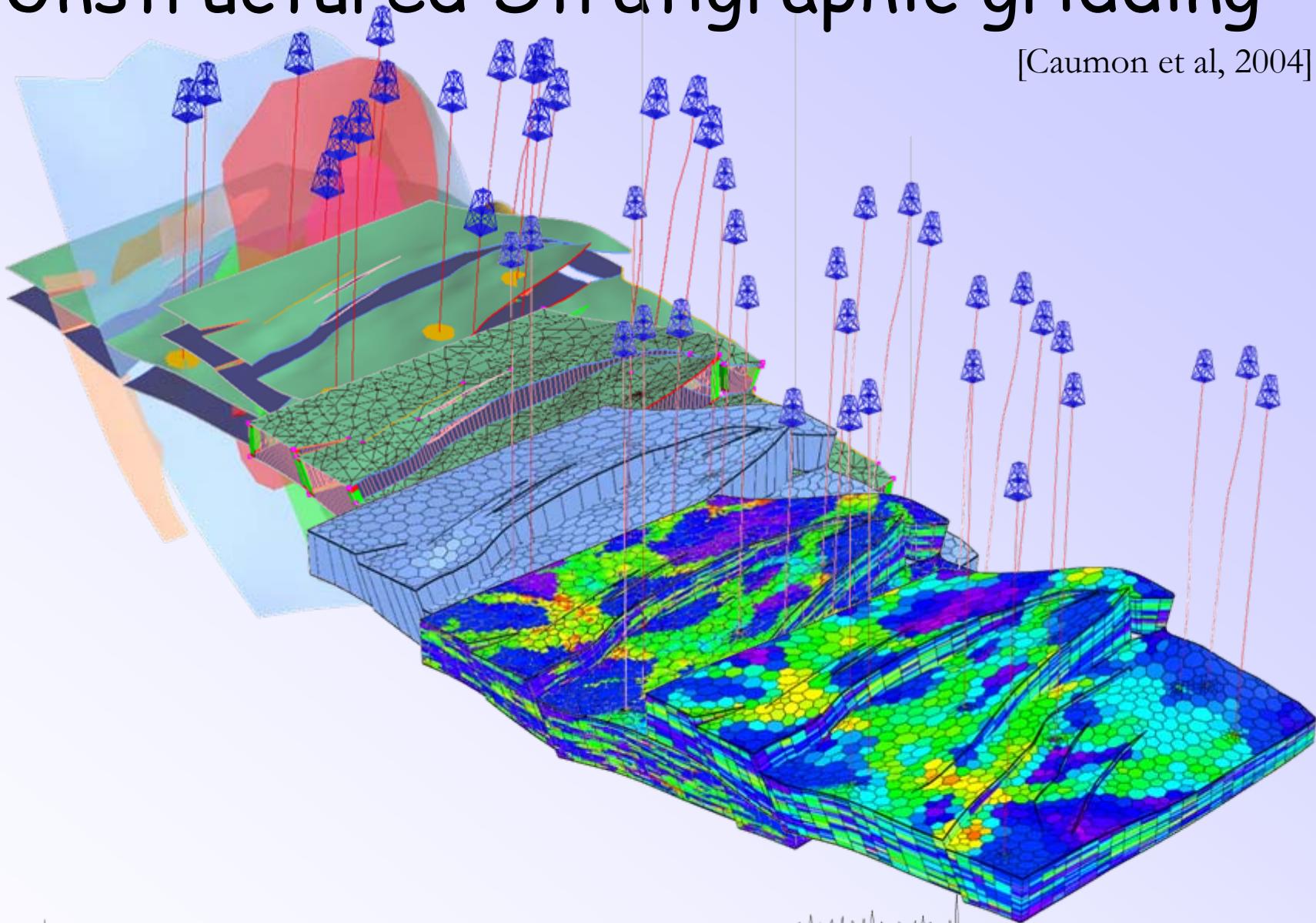
Eroded

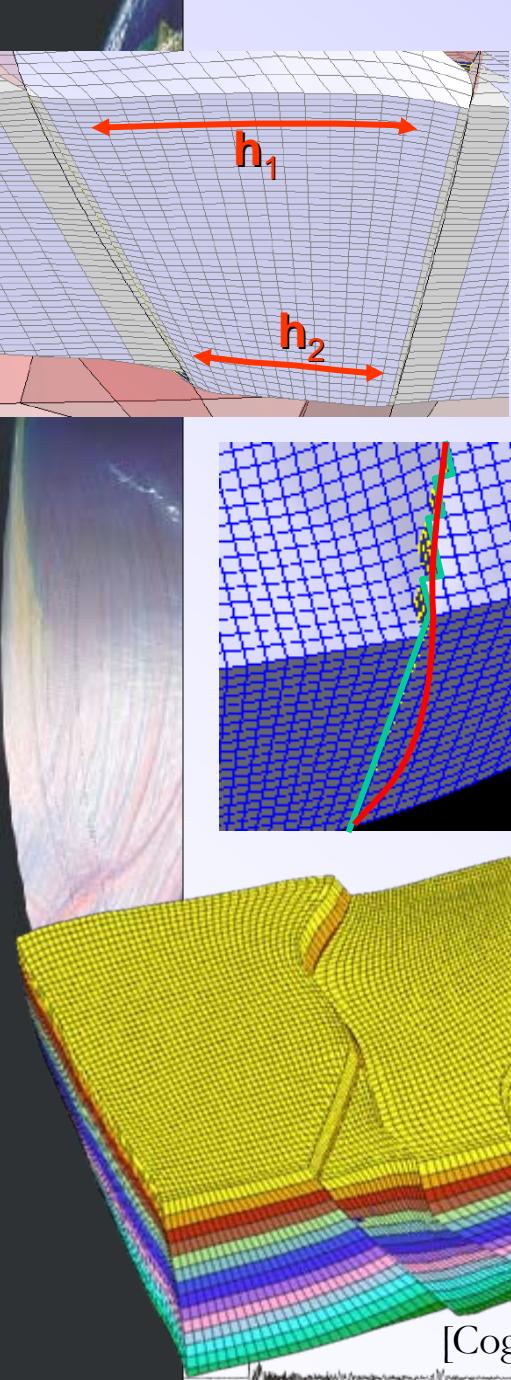


Extrude the grid

Unstructured Stratigraphic gridding

[Caumon et al, 2004]





Stratigraphic Gridding: problems

- Distortions

- Simplification of fault geometries

More generally: **a structured hexahedral mesh cannot conform to all geometries encountered in nature**

[Cognot, 2001]

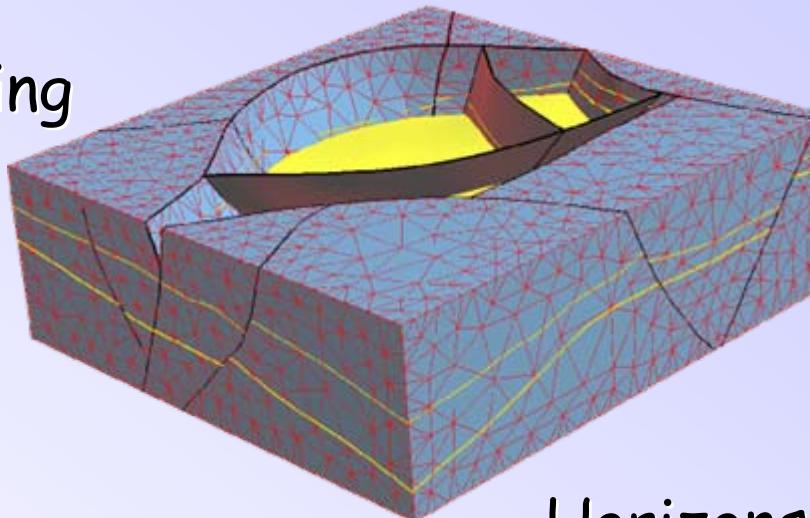
Second Geochron Implementation

[Moyen & Mallet 2004]

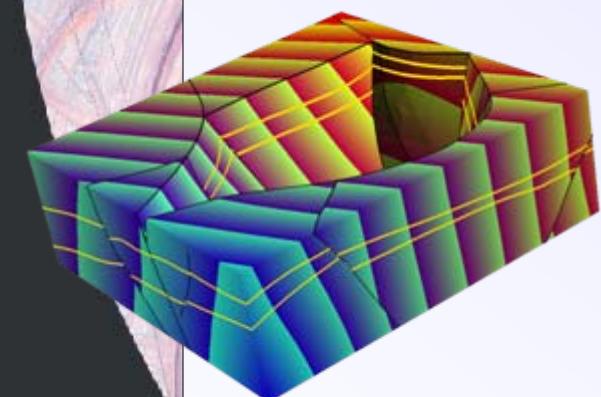
(u, v, t) coordinates on a Tetrahedral mesh

Mesh conforming
to faults only

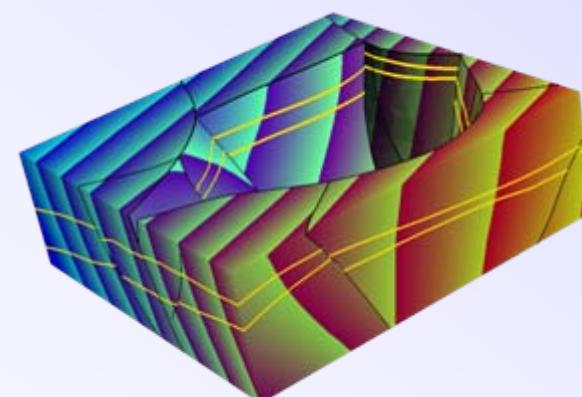
[Lepage, 2003]



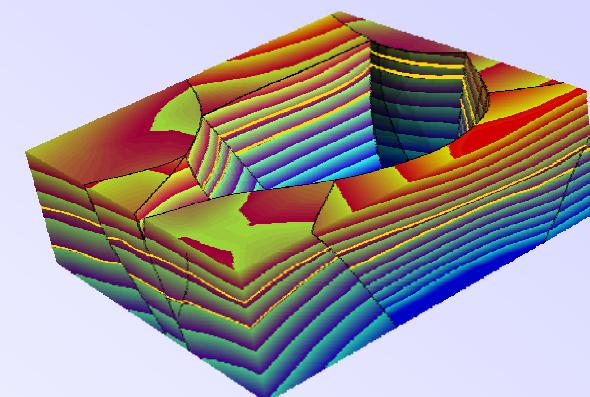
Horizons = isovales of t



u



v

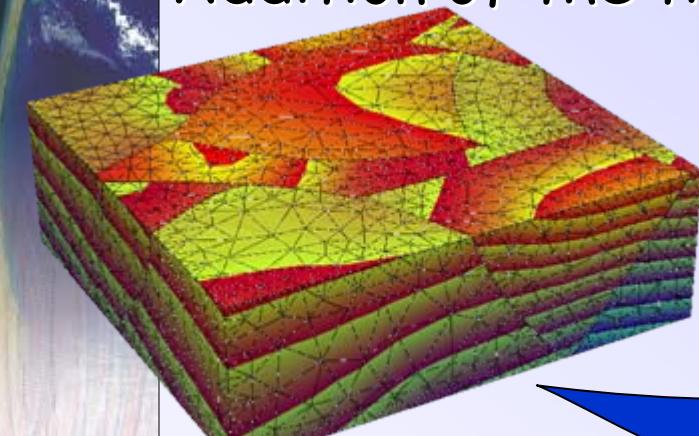


t

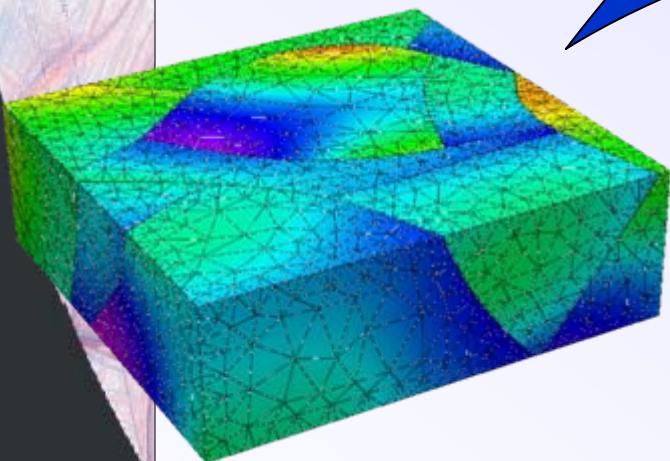
Stratigraphic Uncertainty

[Caumon et al. 2006]

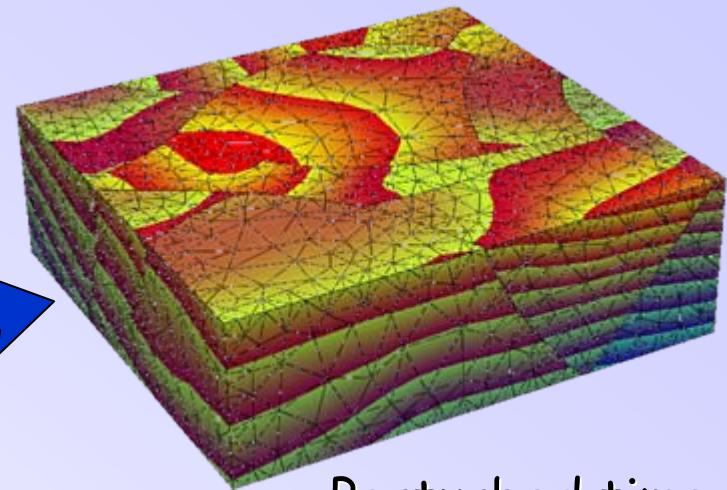
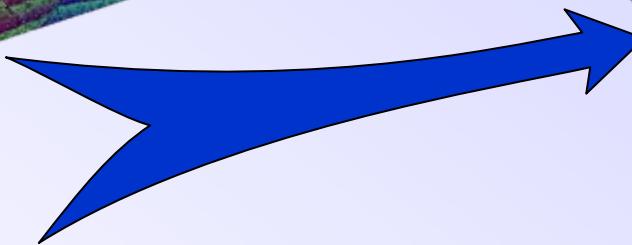
Addition of the time coordinate with 3D random fields



Time



Perturbation



Perturbed time

Horizontal γ range \sim wavelength
Vertical γ range $\sim \Delta$ Thickness

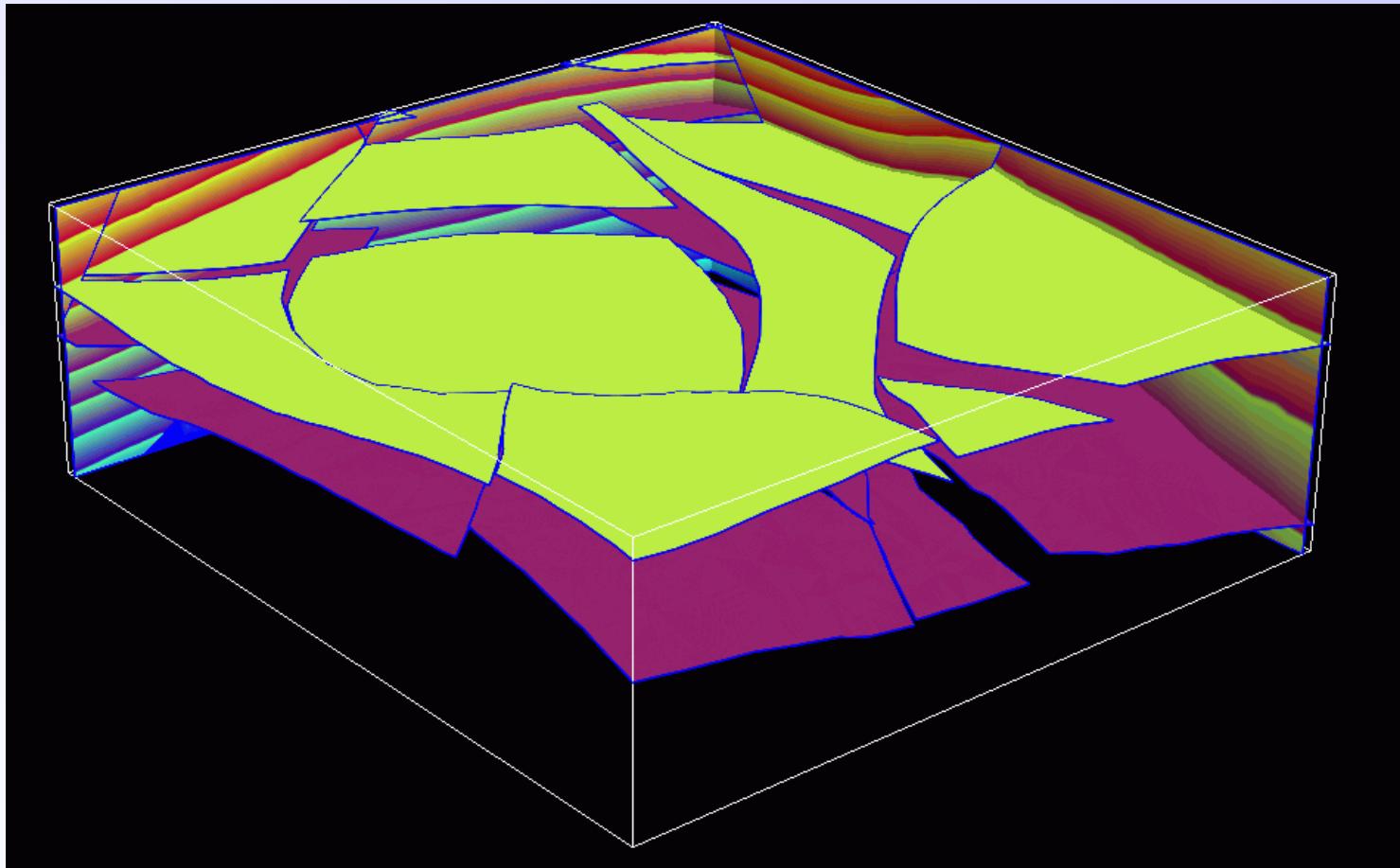
Random field may be generated either:

- in Geochron space (fault throw fixed)
- in Geological space (fault throw variable)

Stratigraphic Uncertainty

[Caumon et al. 2006]

Addition of the time coordinate with 3D random fields

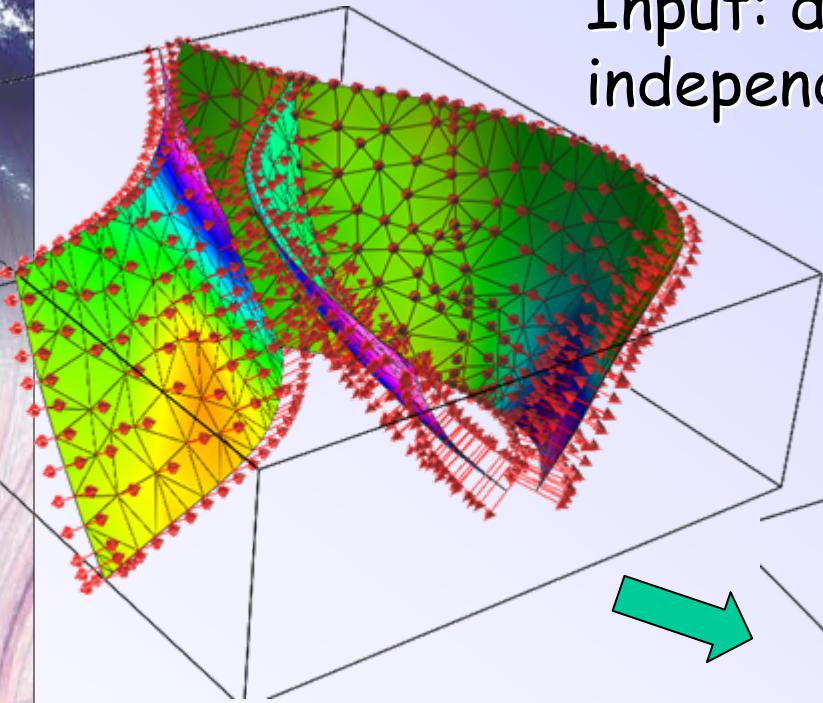


Uncertainty about Fault Geometry

[Zhang & Caumon, 2006]

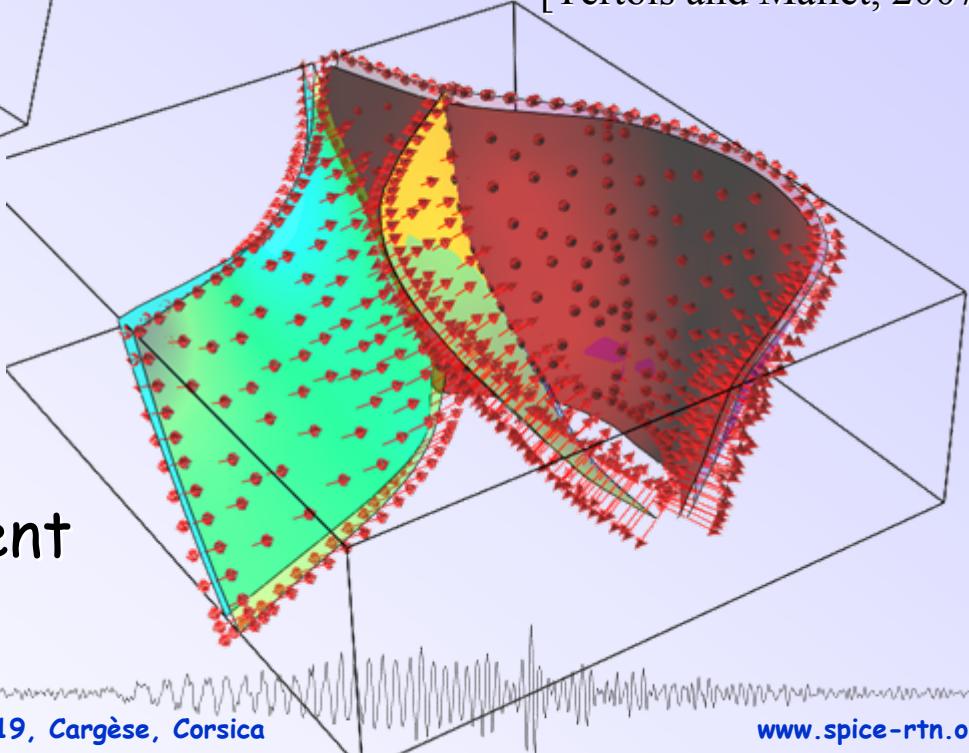
[Caumon et al, 2007]

Input: displacement vectors computed independently on faults [Thore et al 2002]

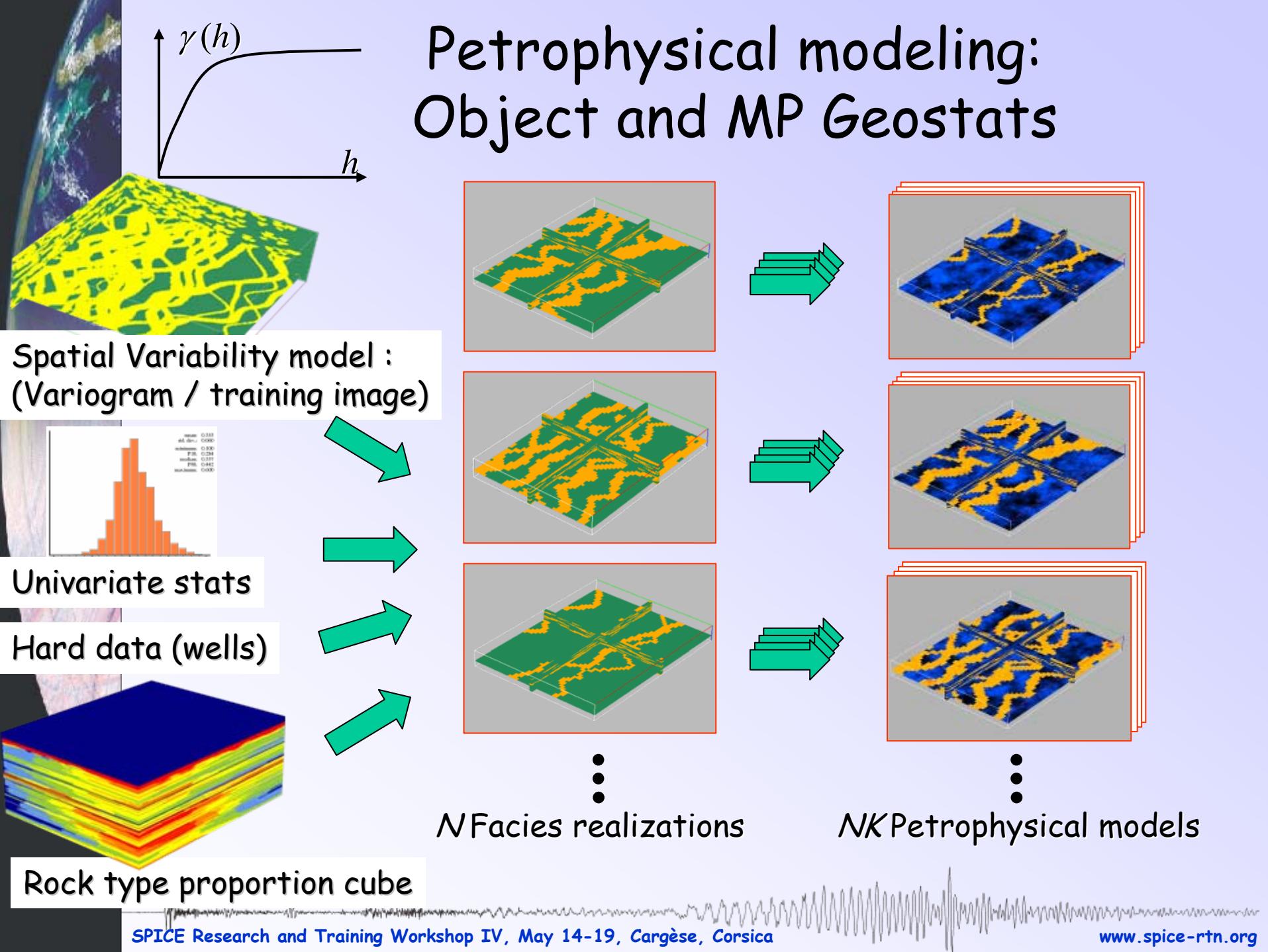


Output:
consistent displacement
vectors everywhere

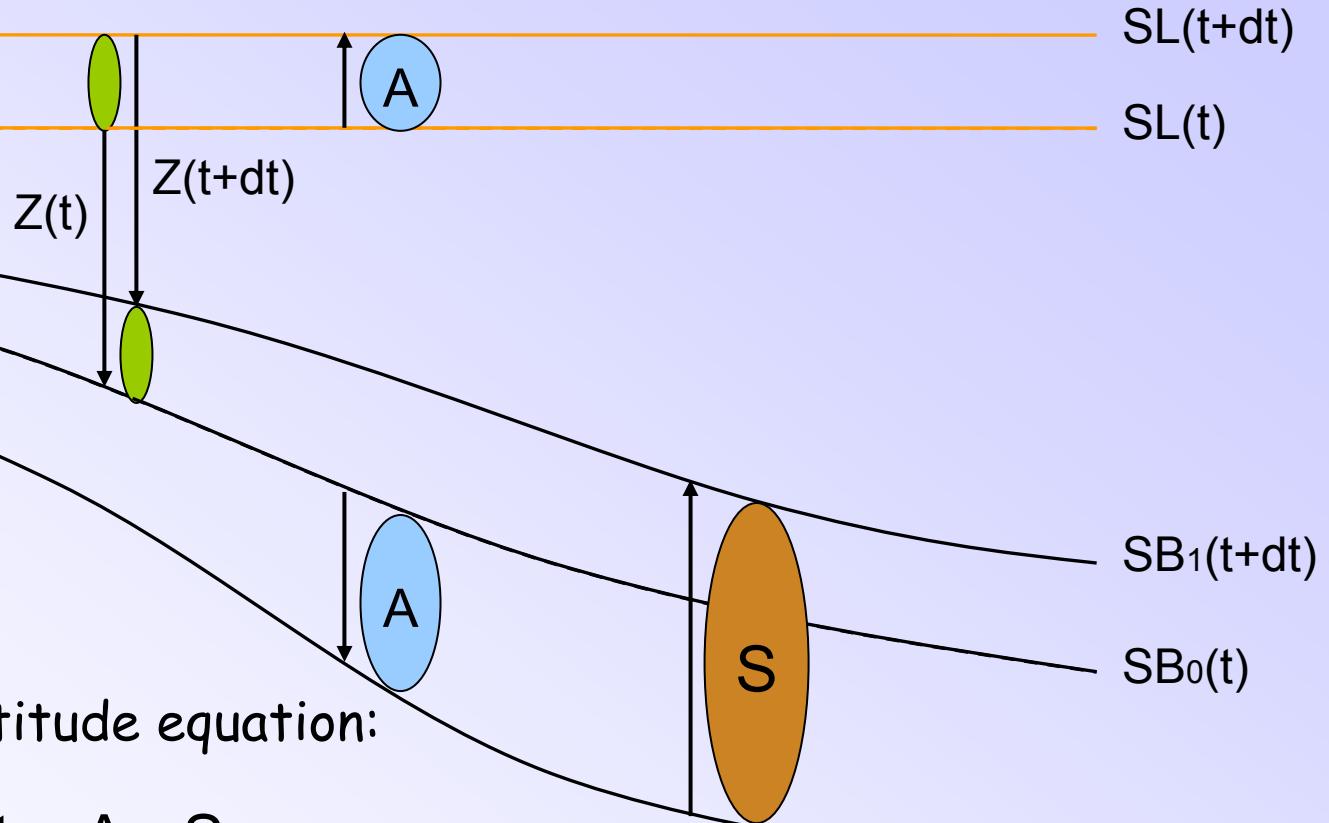
Mesh Deformation
[Tertois and Mallet, 2007]



Petrophysical modeling: Object and MP Geostats



balanced altitude equation



Balanced altitude equation:

$$dZ/dt = A - S$$

Variation of
Bathymetry

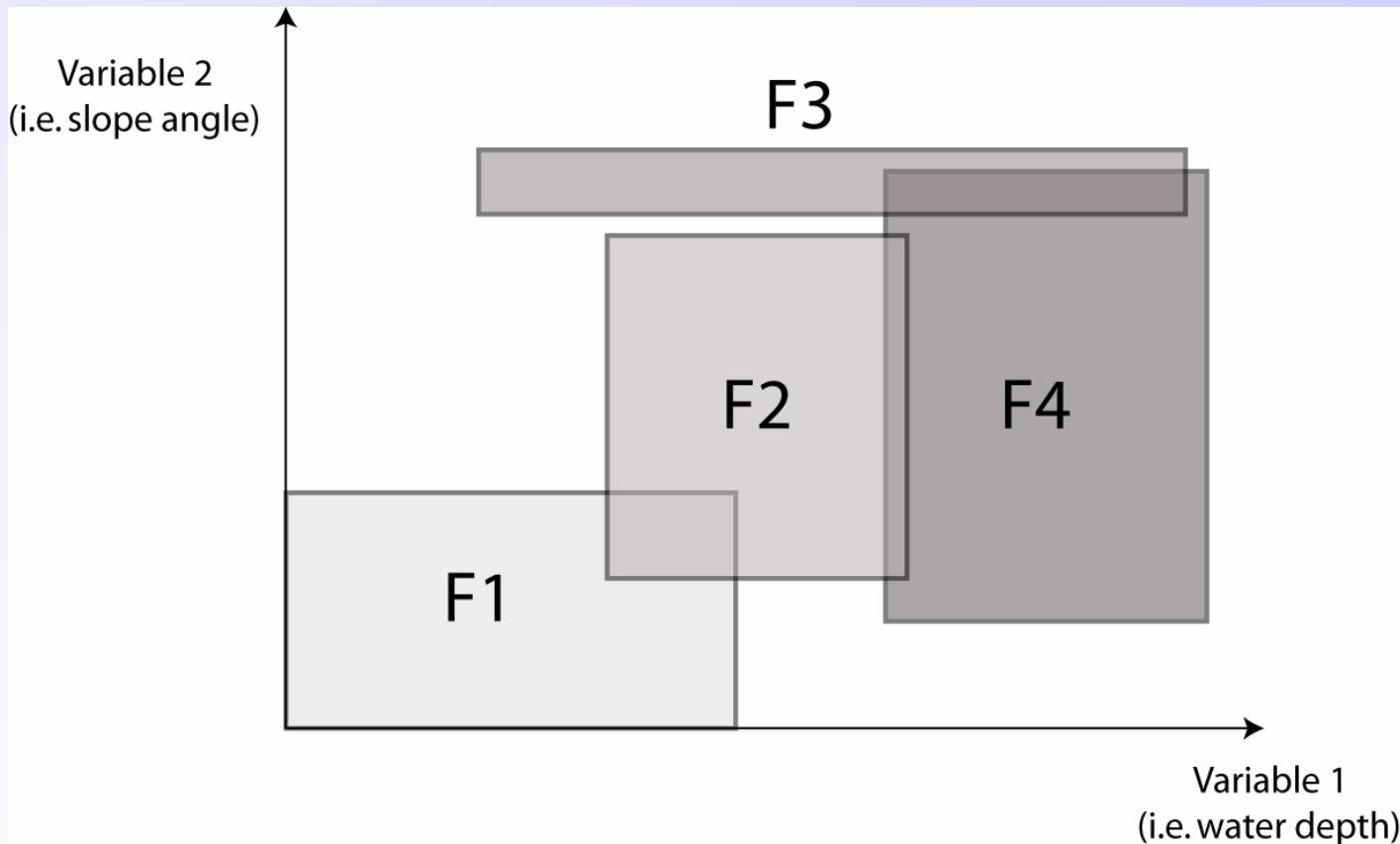
Variation of
Accommodation
(available space)

Sedimentation rate

[Massonnat, 1999]

[Kedzierski & Mallet, 2006]

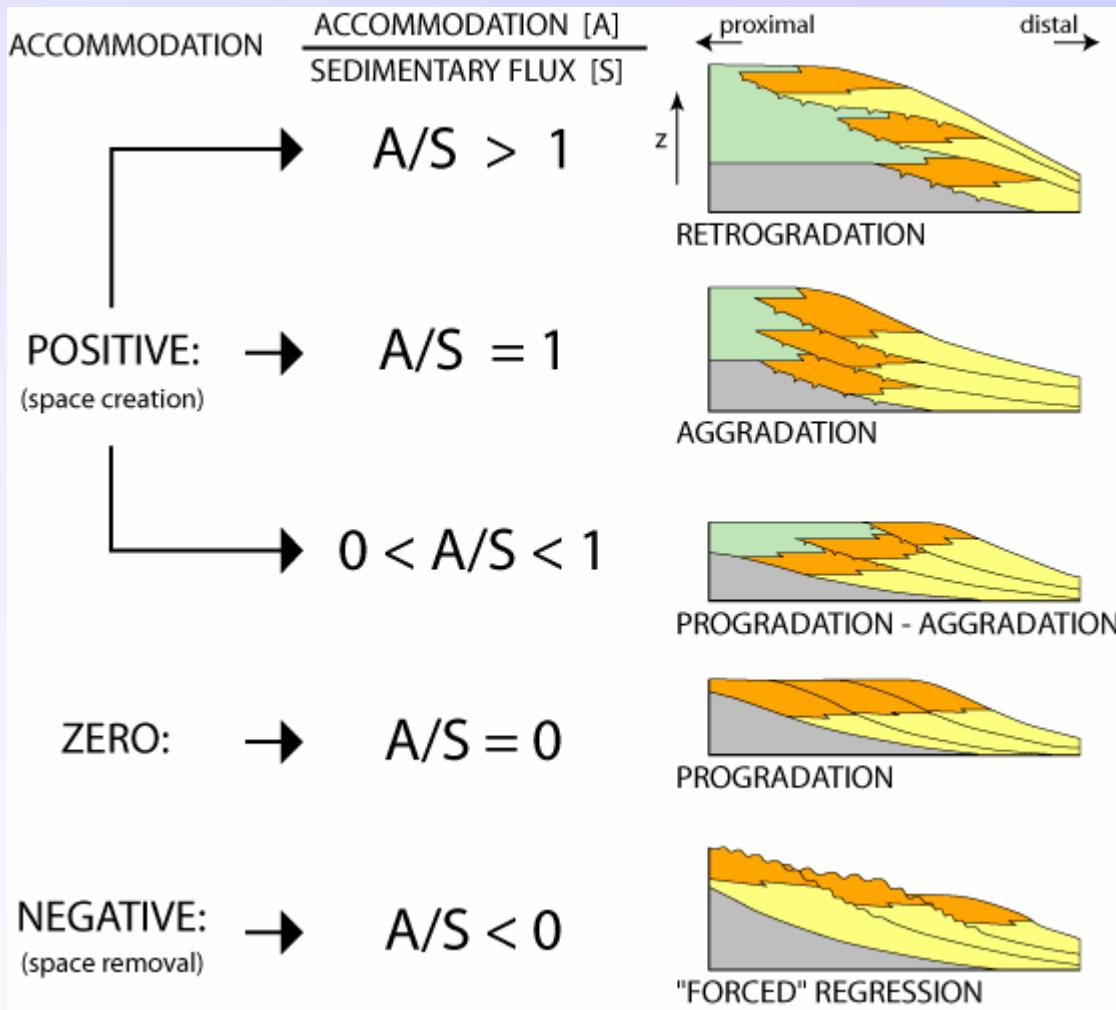
Sedimentological knowledge



(Kedzierski & Mallet, 2006)

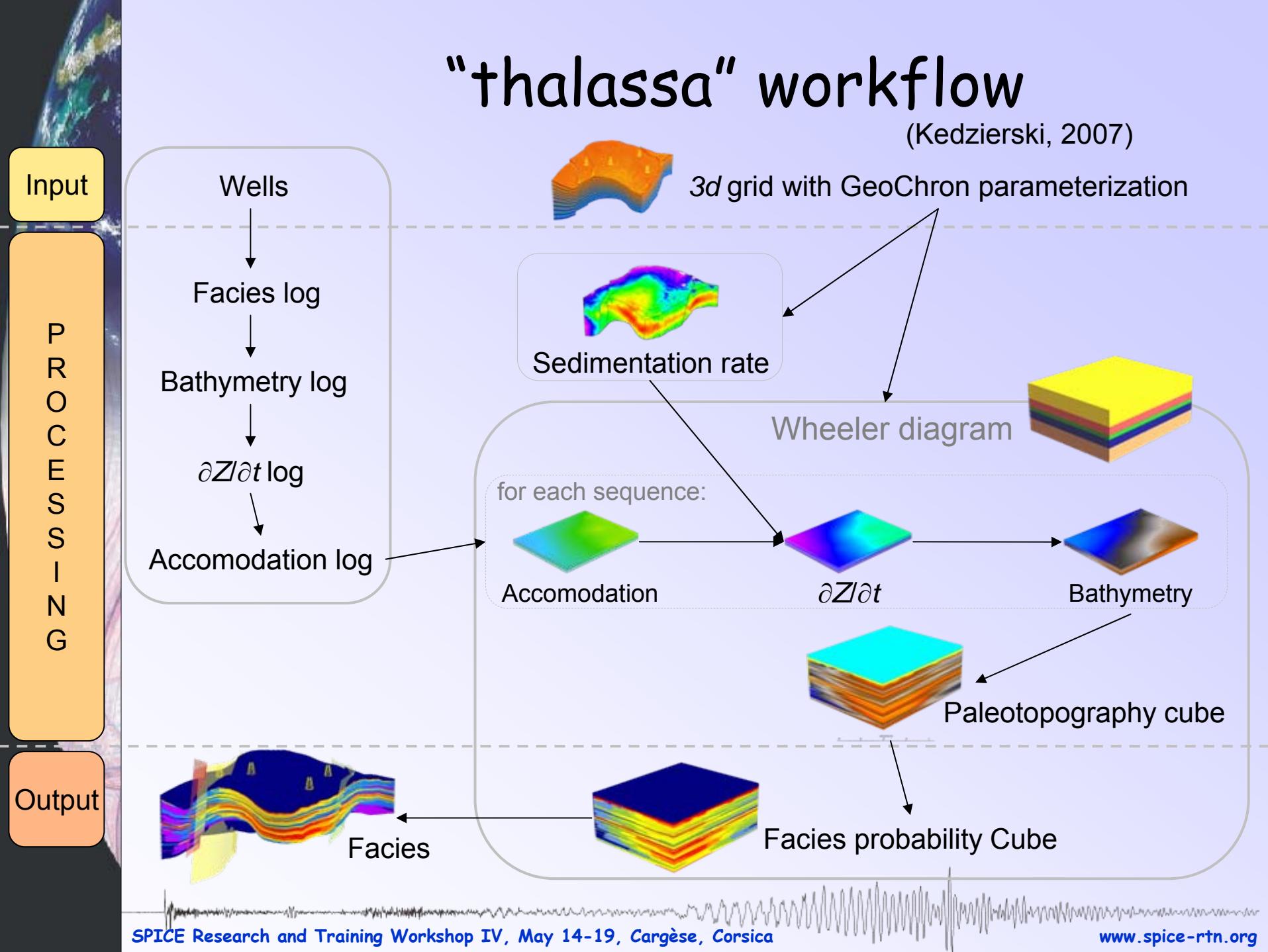
stratigraphic architecture control

(Homewood et al., 1999)



"thalassa" workflow

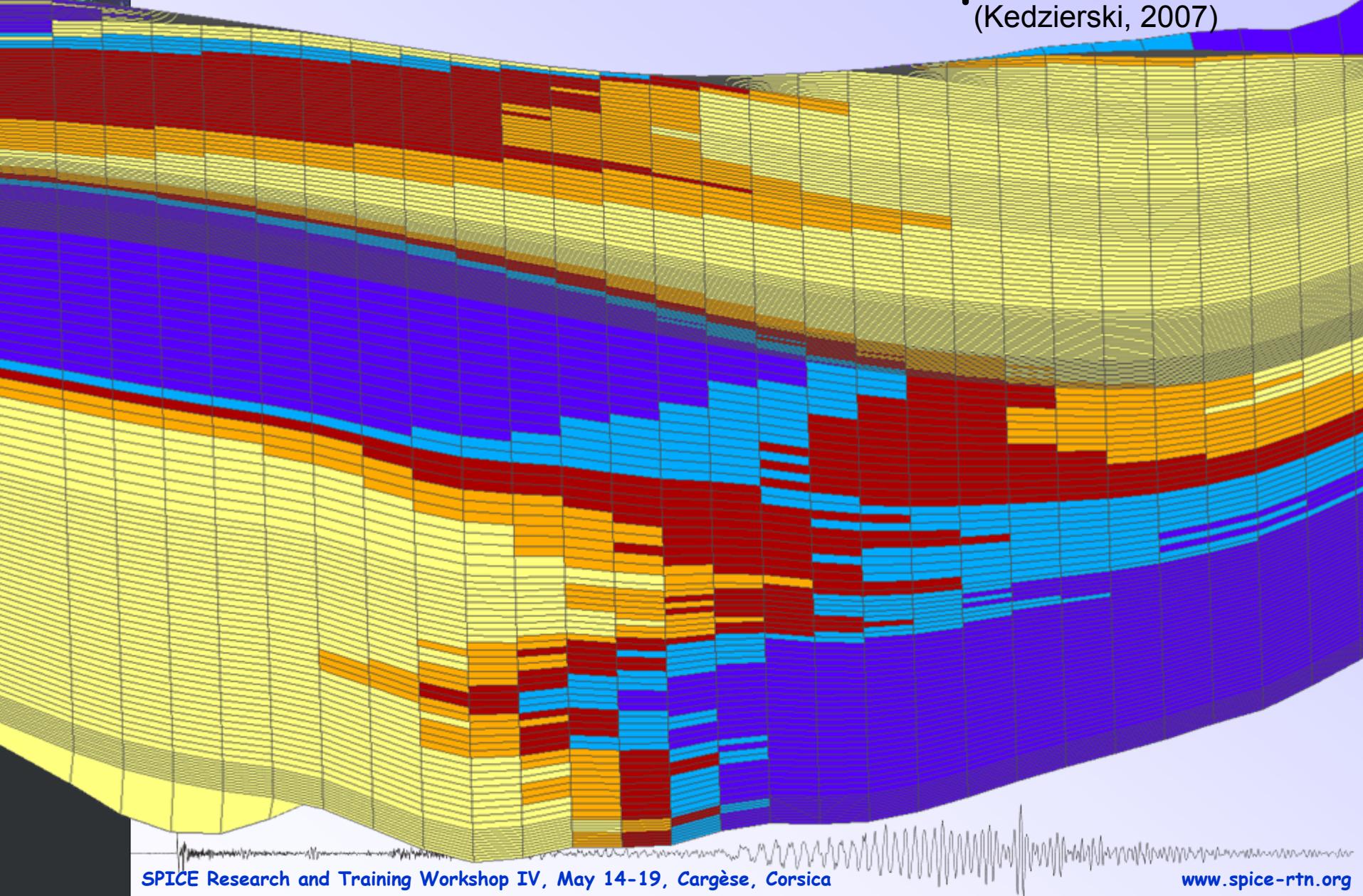
(Kedzierski, 2007)





"thalassa" output

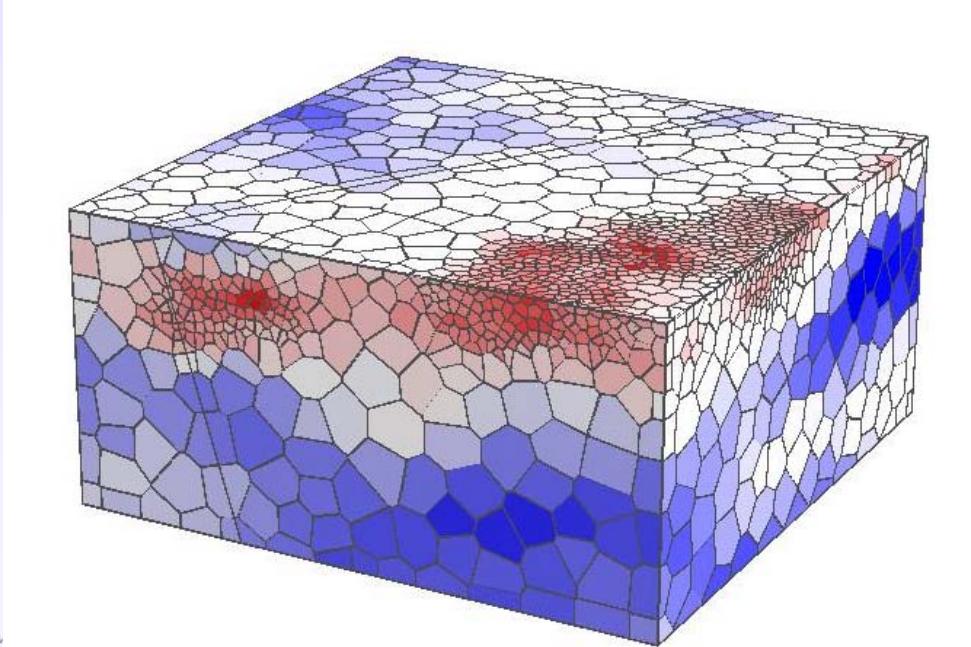
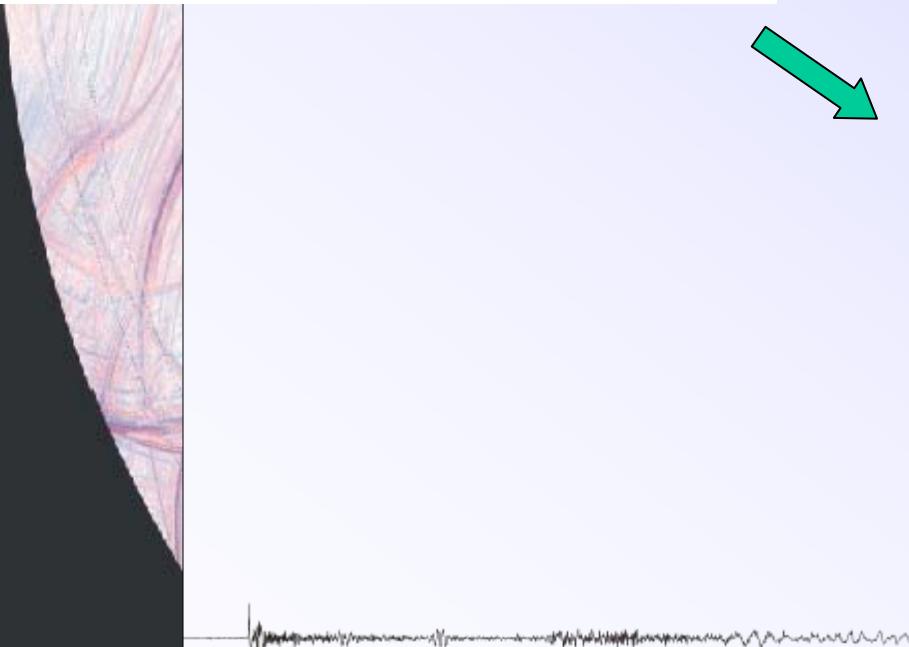
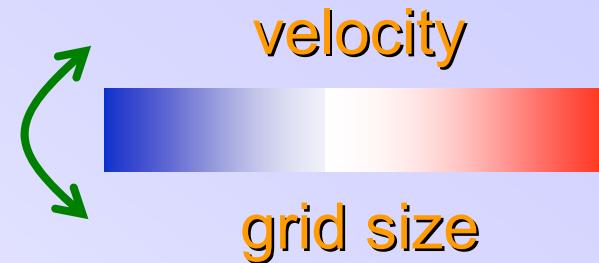
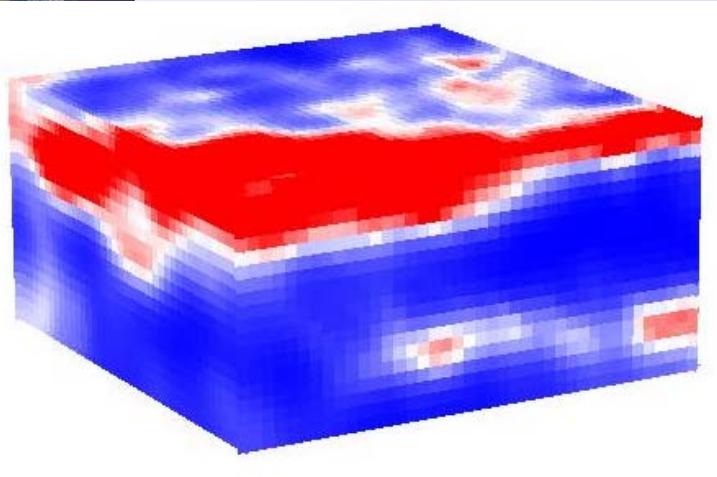
(Kedzierski, 2007)





Unstructured Grid Upscaling

[Prevost et al., 2005]





3. Applications to inverse problems

3.1- Inverting fault slip using surface restoration

[Caumon and Muron, 2006]

3.2- Response surfaces in reservoir engineering

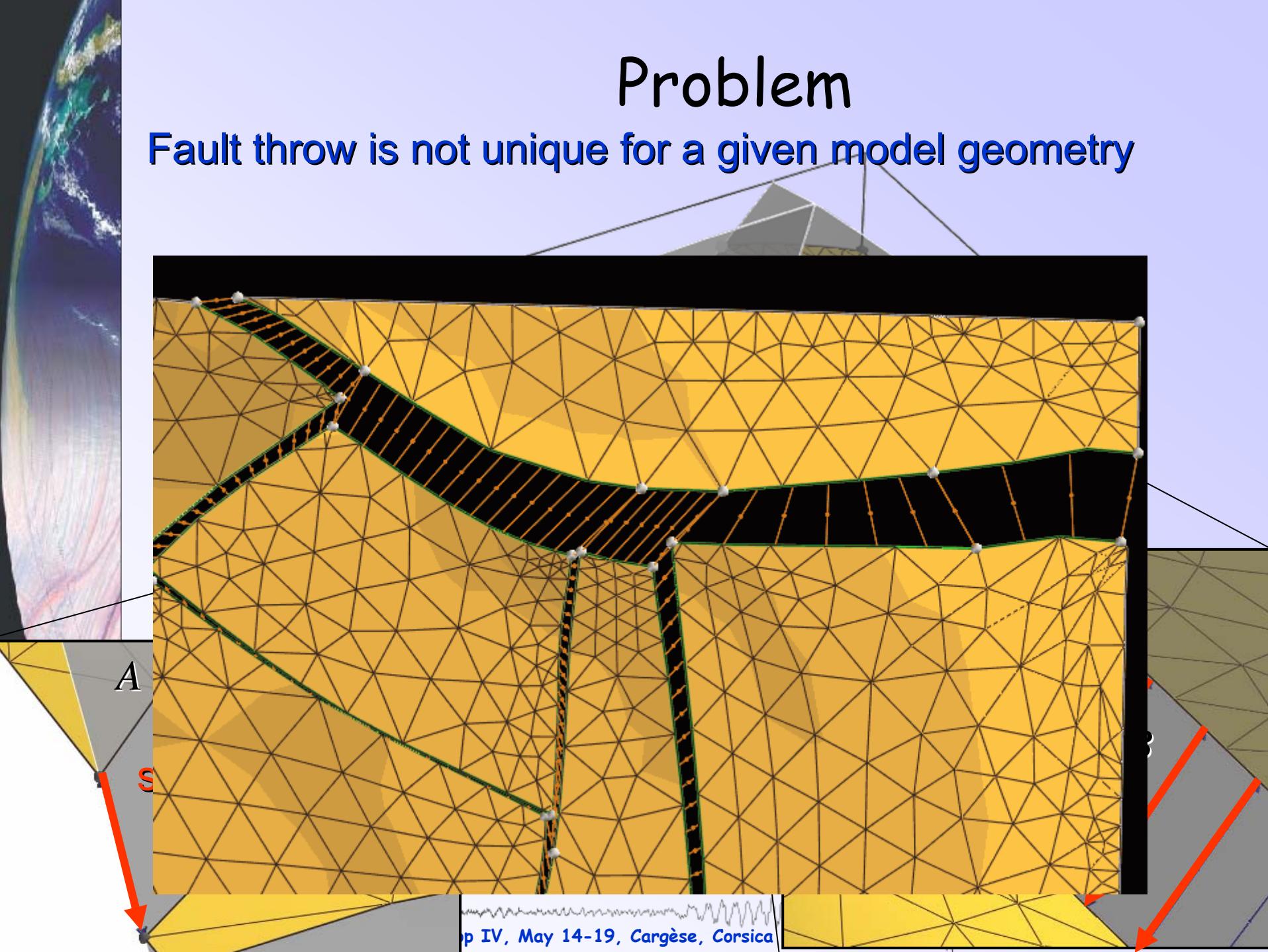
[Fetel et al, 2006]

3.3- Inverting reservoir geometry using production data

[Suzuki et al, 2006]

Problem

Fault throw is not unique for a given model geometry

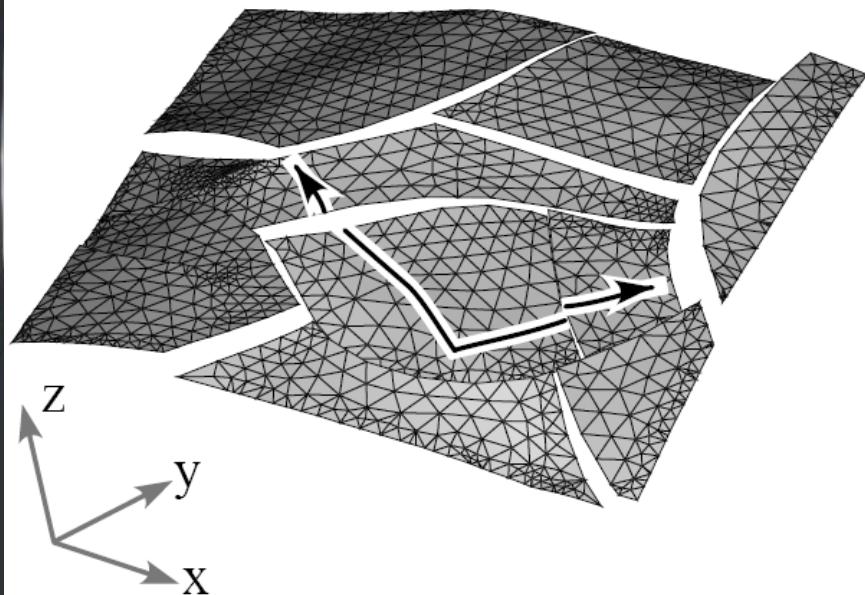




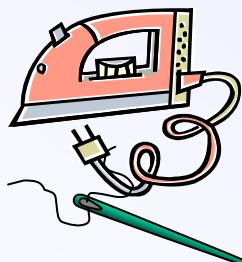
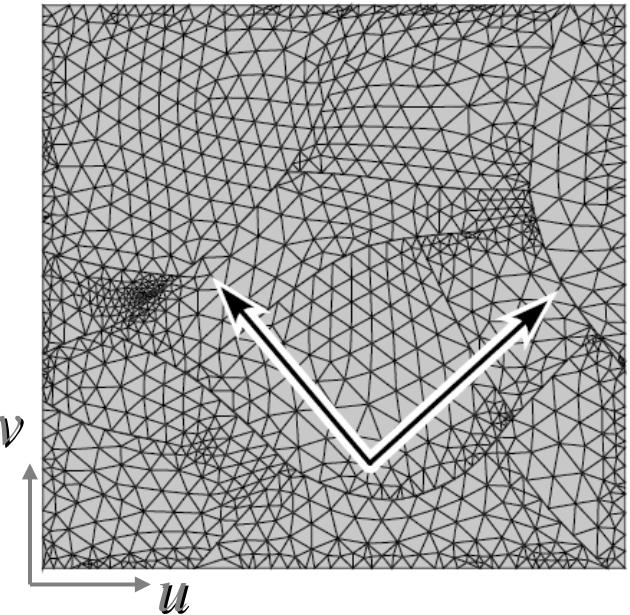
2D Restoration

[Gratier et al 91, Rouby et al. 93, Léger et al 97, Rouby et al 00, Mallet 02, Massot 02, Dunbar & Cook 03, Thibert 05, Moretti et al 06]

$\mathbb{R}^3 (x,y,z)$

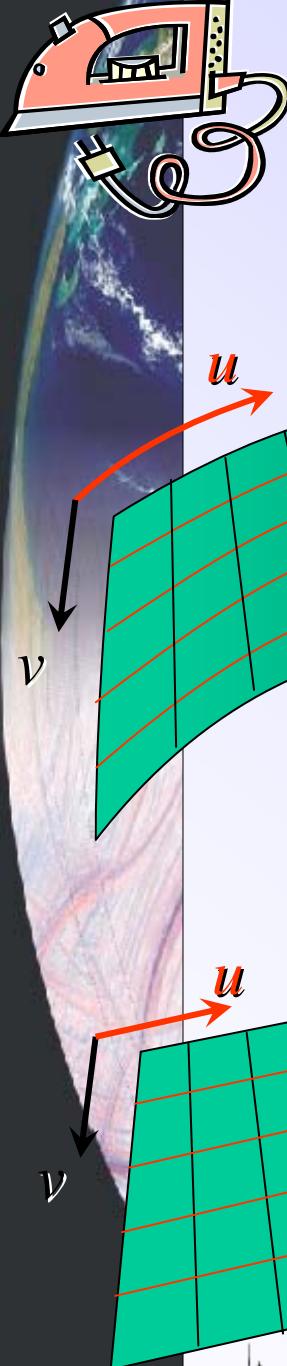


$D (u,v)$



1/ "Iron" geological surfaces

2/ "Sew" Fault gaps



1/ Flattening the horizons

Amounts to parameterize the surface [Levy et al 98, Levy 01]

Minimizing strain $\varepsilon = \frac{1}{2}(\mathbf{G}_1 - \mathbf{G}_0)$ entails :

Minimum elongation
(conservation of distances)

$$\|\operatorname{grad} u\| = \|\operatorname{grad} v\| = 1$$

Minimum distortion
(conservation of angles)

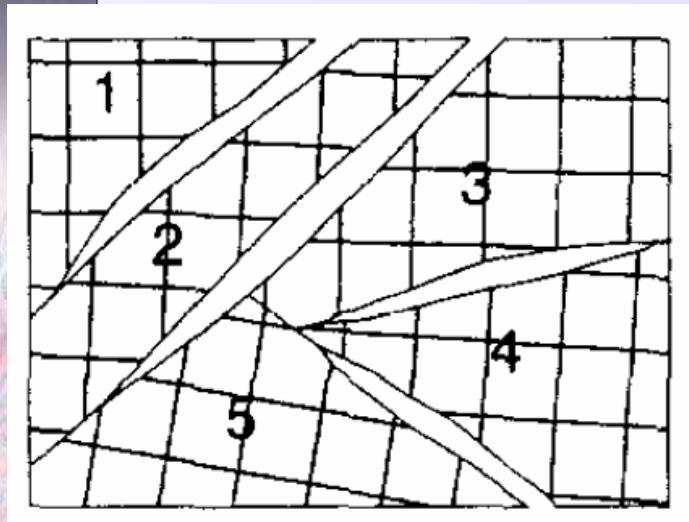
$$\operatorname{grad} u \cdot \operatorname{grad} v = 0$$



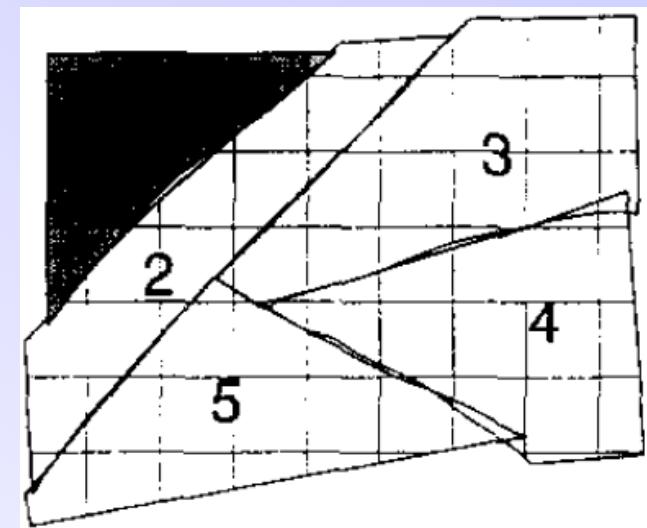
2/ Bridging fault gaps

Rigid blocks hypothesis
⇒ block packing

[Rouby et al 93]

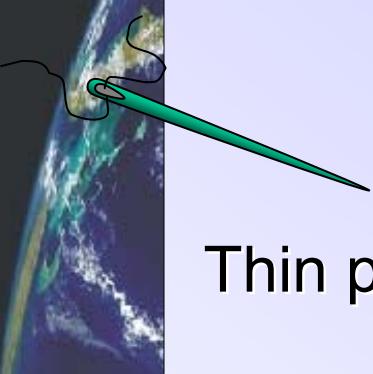


Unfolded blocks



Restored model

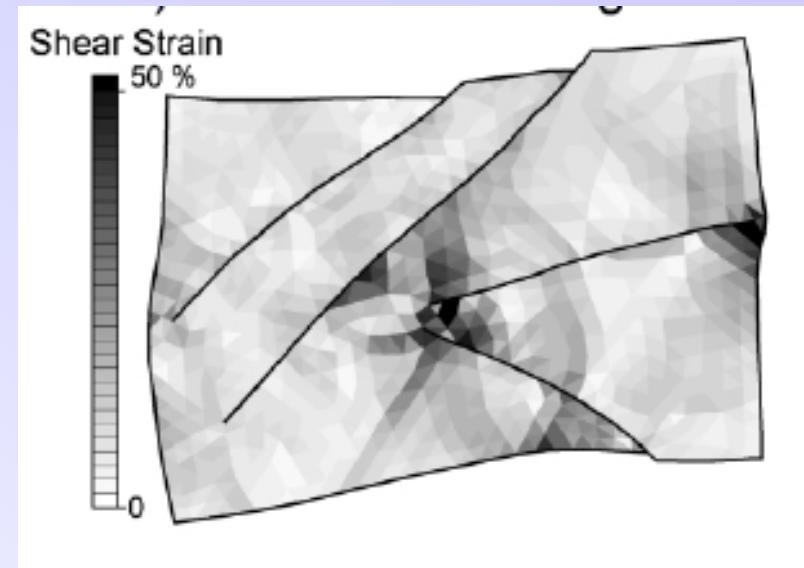
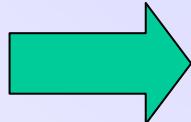
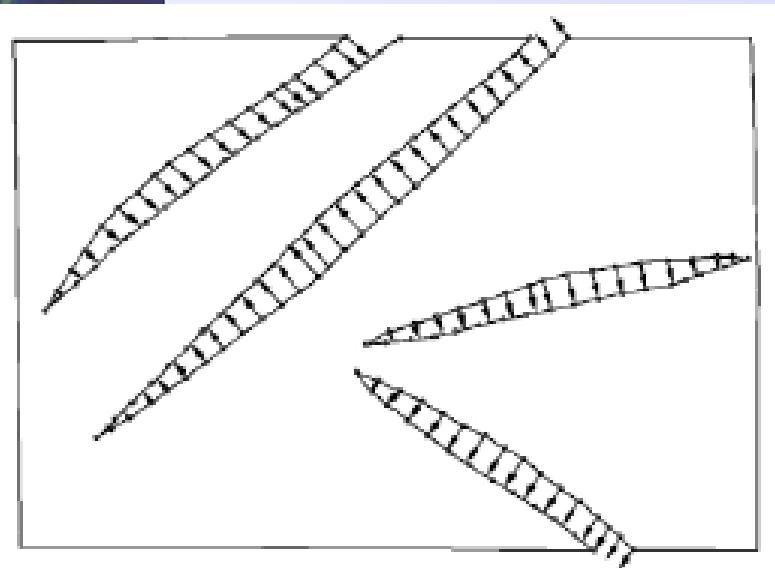
Blocks may not be rigid



2/ Bridging fault gaps

Thin plate analogy

[Dunbar & Cook 03]



Initial throw definition

Throw is optimized in the process

Restored model

Mechanical approach interesting, but questionable in 2D

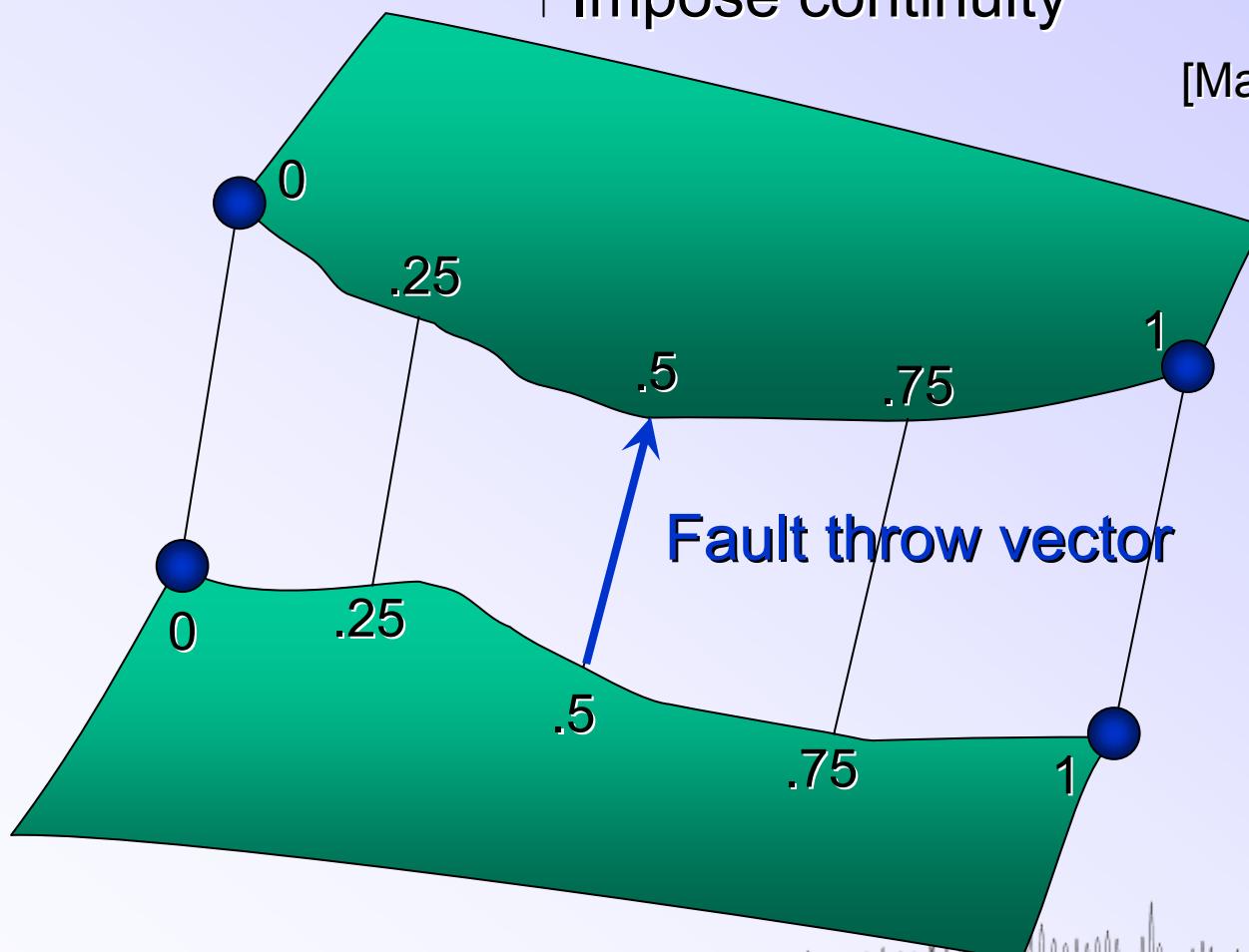


2/ Bridging fault gaps

Use curvilinear coordinates (u, v)

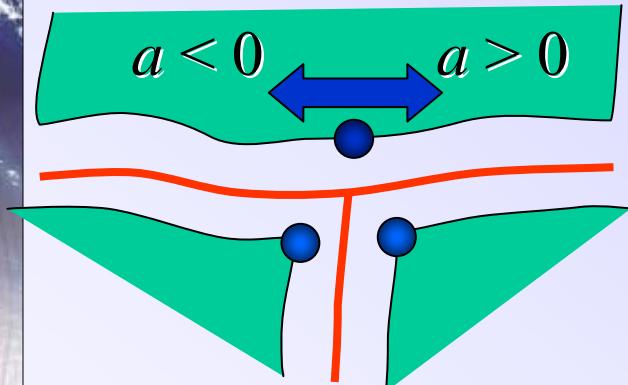
Impose continuity

[Massot & Mallet 02]

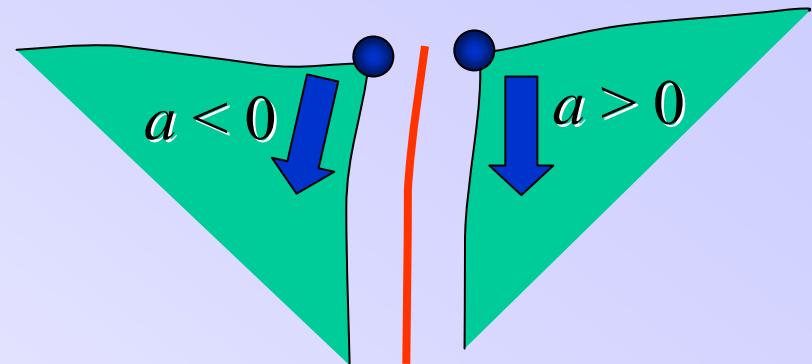


Fault throw perturbation

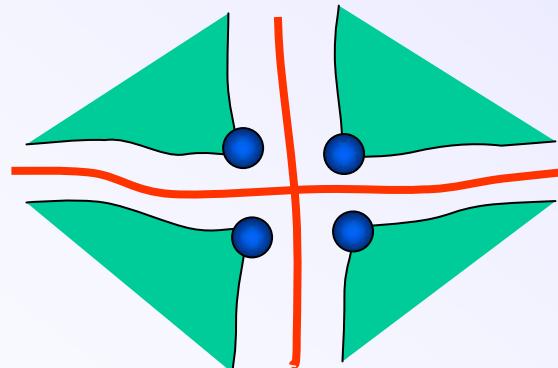
Displace border extremities ● by some curvilinear abscissa a , relative to the reference position



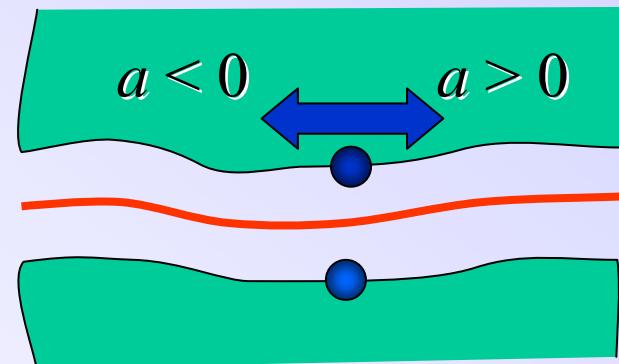
Main and Branching fault $\perp\!\!\!/\!$



Fault and external border $\perp\!\!\!/\!$



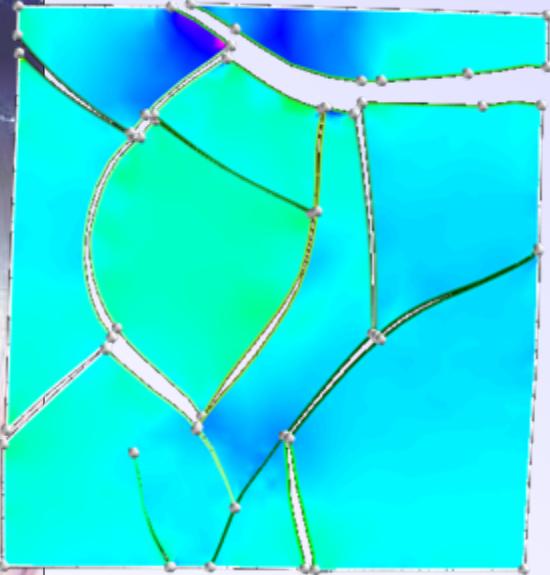
Multiple (frozen) $\perp\!\!\!/\!$



Internal =

Fault Slip validation: 2D strain analysis

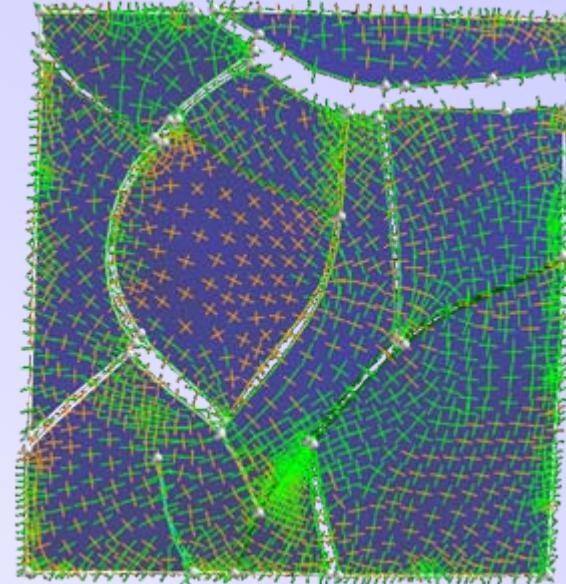
$$\text{strain } \varepsilon = \frac{1}{2}(\mathbf{G}_1 - \mathbf{G}_0)$$



Dilatation

Should close to 0

→ More valuable than curvature



Principal strain directions

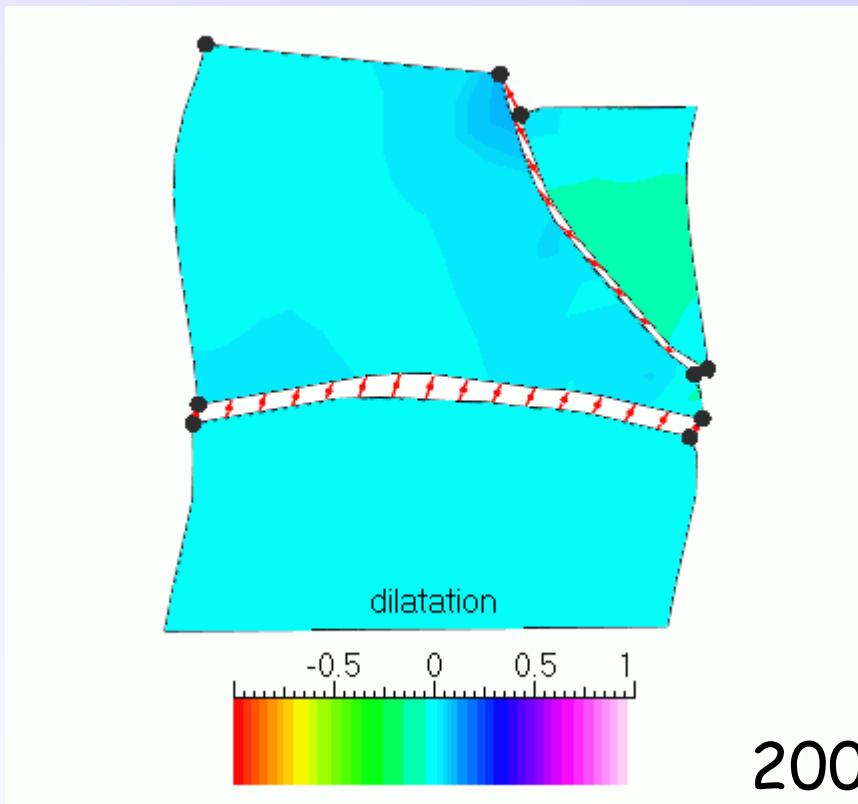
Should be ~isotropic

Simple application

3 flattened fault blocks (deformation due only to faults)

Prior uncertainty : 20% of fault trace length

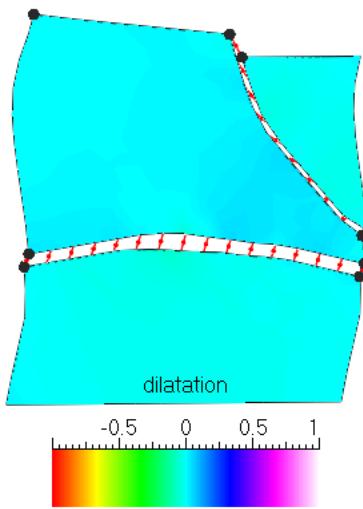
MCMC sampling



200 realizations, ~3 min

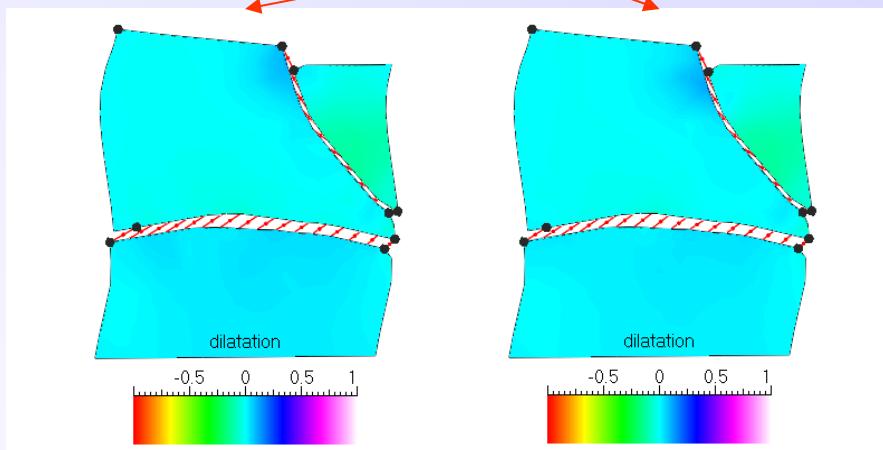
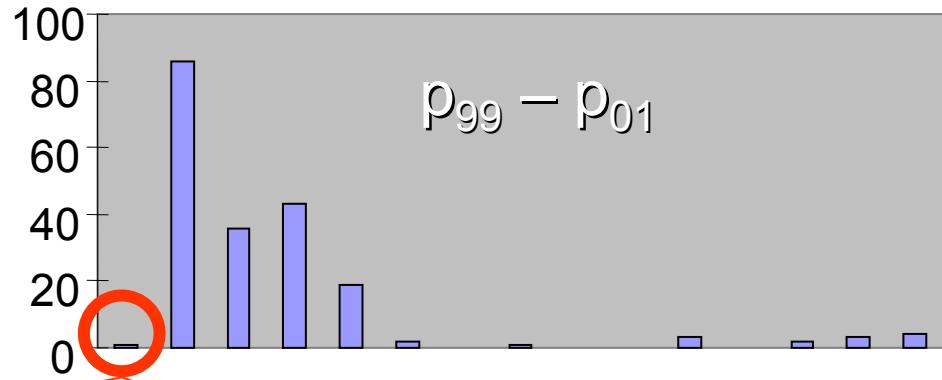
Objective function: $p_{99} - p_{01}$ of the dilatation

Results



Reference model

Dilatation Spread



MCMC: Computationally expensive (optimizations in progress)
Choice of the objective function difficult



3. Applications to inverse problems

3.1- Inverting fault slip using surface restoration

[Caumon and Muron, 2006]

3.2- Response surfaces in reservoir engineering

[Fetel et al, 2006]

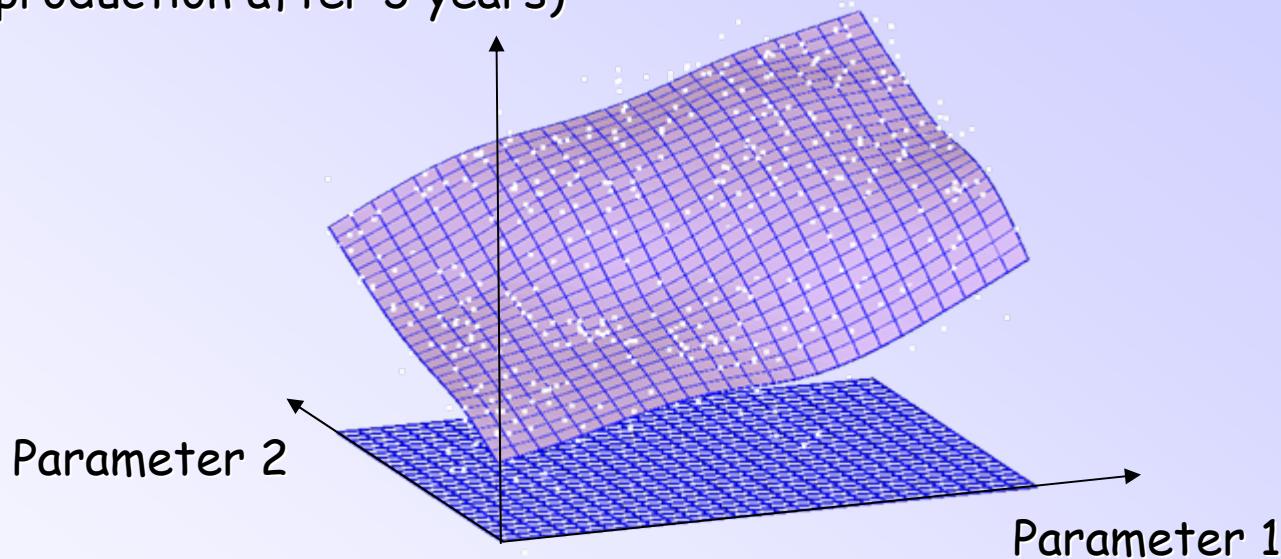
3.3- Inverting reservoir geometry using production data

[Suzuki et al, 2006]

Another approach to explore uncertainty: response surfaces

[Fetel, 2006]

Response obtained by FD flow simulation
(e.g., production after 3 years)



Sampling with experimental design

2 problems:

- Computationally expensive
- handling discrete parameters ?

Taking into Account Secondary Data

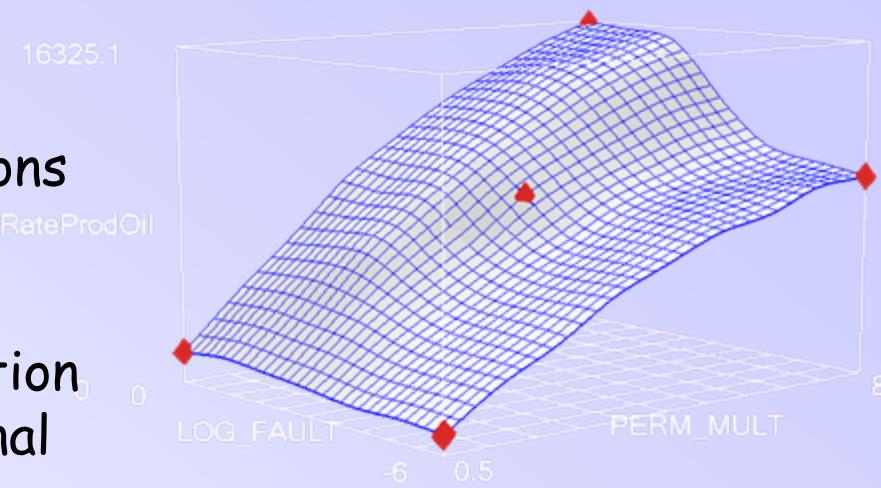
[Fetel 2006]

Combination of

- Complete flow simulations
- TOF swept volume estimations

Algorithms

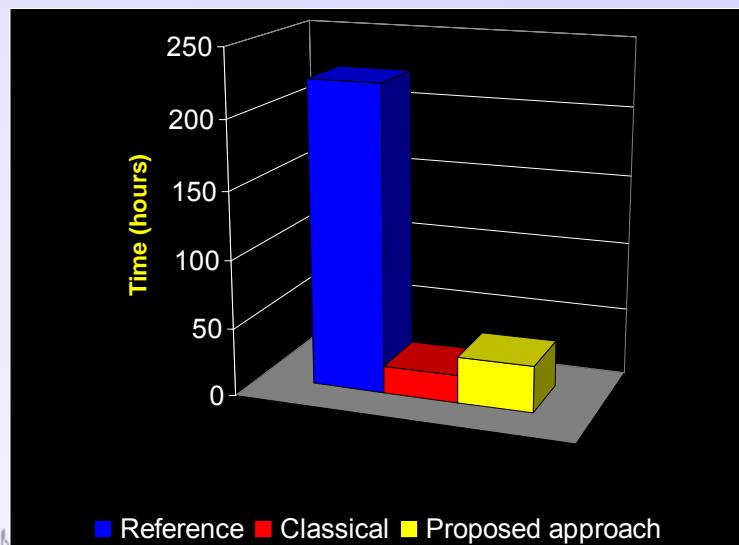
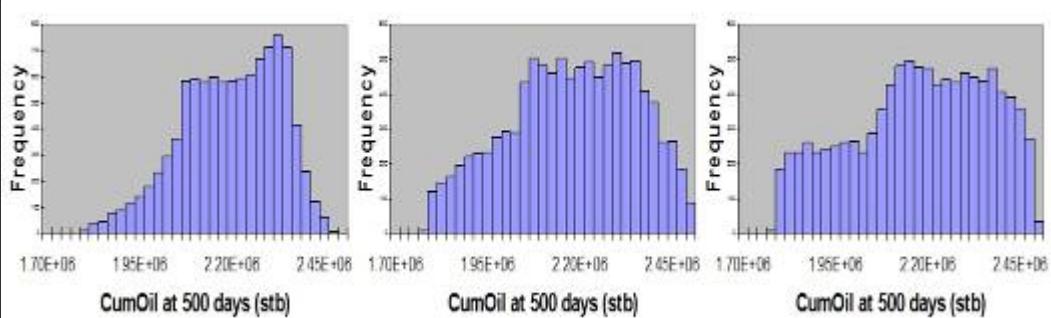
- Discrete Smooth Interpolation
- Dual Kriging With an External Drift



Without secondary
data

DSI

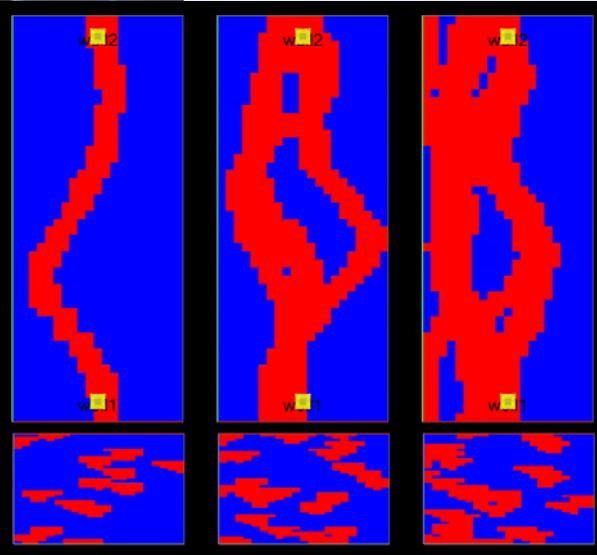
Reference



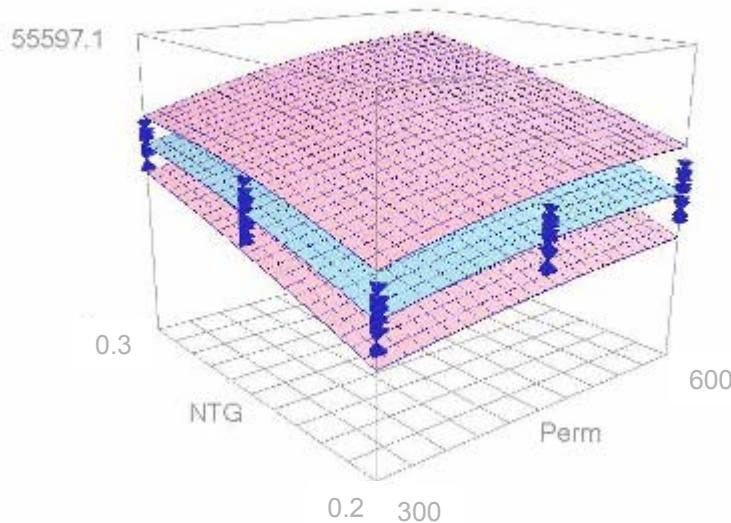
Managing Stochastic Uncertainty

[Fetel 2006]

Discrete parameters represented as dispersion of the response surface (Gaussian model)



Production at 400 days



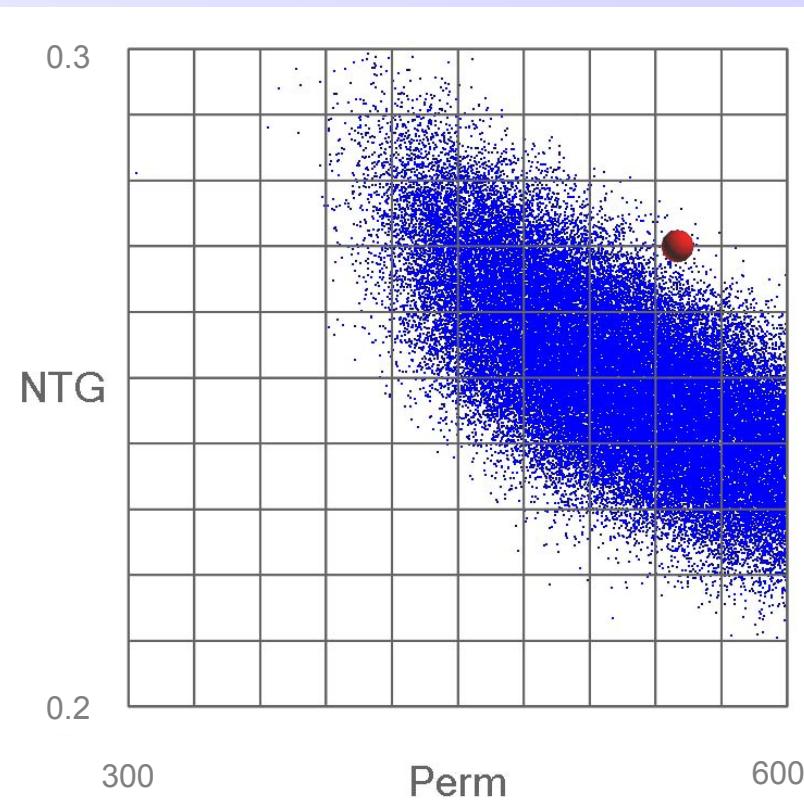
Possible to use MC sampling à la Tarantola to get posterior parameter distribution

Stochastic Response surfaces and Bayesian inversion

[Fetel 2006]

When production data are available,
Monte Carlo sampling à la Tarantola provides
posterior parameter distribution

$$p(m | d = d_0) = k p_0(x) \theta(d = d_0 | m)$$





3. Applications to inverse problems

3.1- Inverting fault slip using surface restoration

[Caumon and Muron, 2006]

3.2- Response surfaces in reservoir engineering

[Fetel et al, 2006]

3.3- Inverting reservoir geometry using production data

[Suzuki et al, 2006]

Goal

[Suzuki et al, 2006]

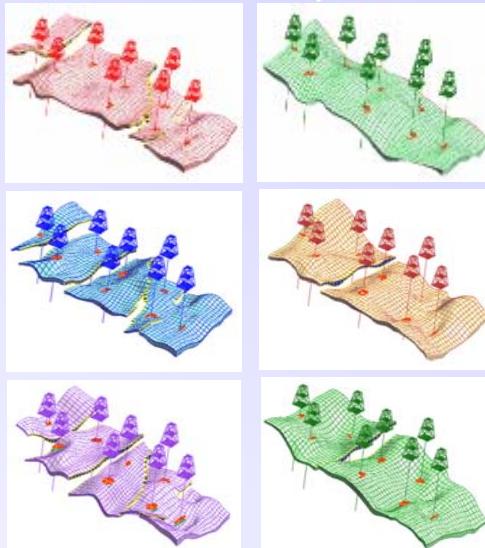
Multiple prior
structural models
= search space

Posterior
structural
models

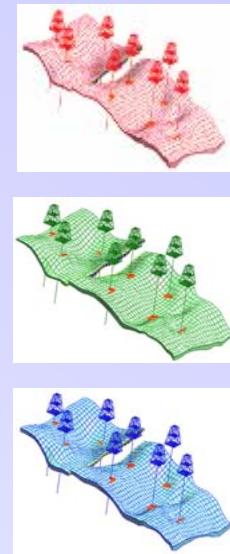
Sensitivity
on migration
parameters

Structural
scenarii

Structural
interpretation
Stochastic
Perturbation



History
matching



- [Samson et al 1996]
[Charles et al 2001]
[Thore et al 2002]
[Zhang & Caumon 2006]

Discrete search, using
neighborhood algorithm

1/ Define a distance between models

[Suzuki et al, 2006]

Model 1



Model 2



Model 3



Model 4



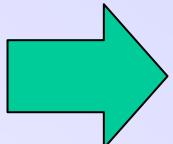
d_{12}

d_{13}

d_{14}

d_{34}

d_{24}



Similarity distance matrix

	1	2	3	4
1	0	d_{12}	d_{13}	d_{14}
2	d_{12}	0	d_{23}	d_{24}
3	d_{13}	d_{23}	0	d_{34}
4	d_{14}	d_{24}	d_{34}	0

d_{ij} : similarity distance

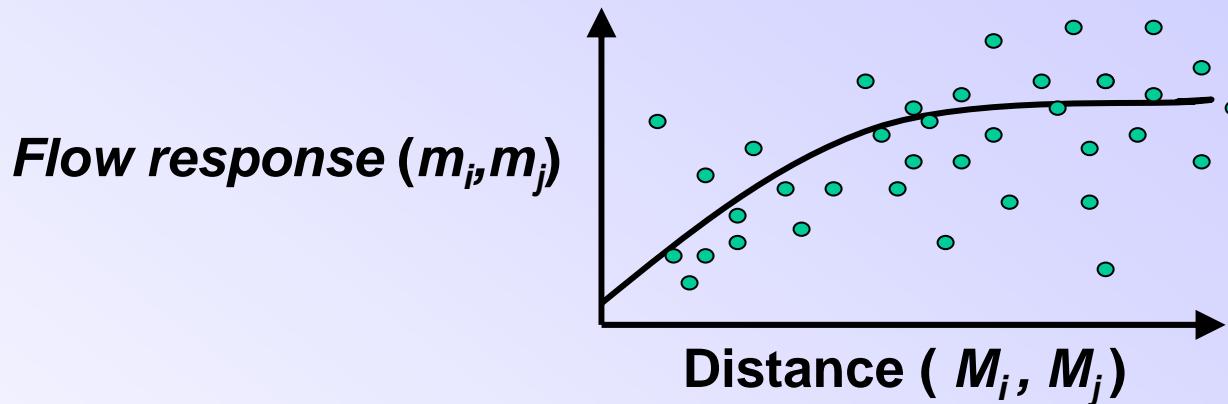
Hausdorff Distance :

$$d_H(M_i, M_j) = \text{MAX}_{\mathbf{p}_i \in M_i} \{ \text{MIN}_{\mathbf{p}_j \in M_j} \{ \mathbf{p}_i, \mathbf{p}_j \} \}$$

2/ Hypothesis

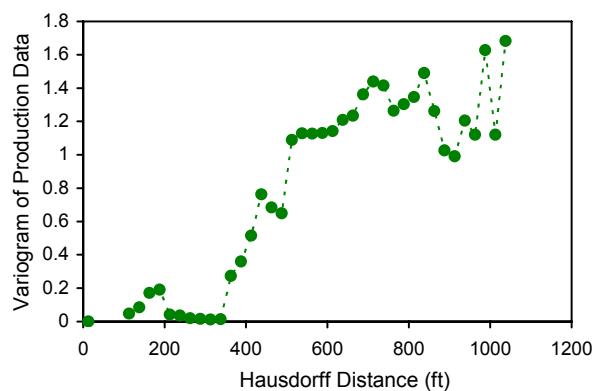
[Suzuki et al, 2006]

Small distance \sim similar flow response

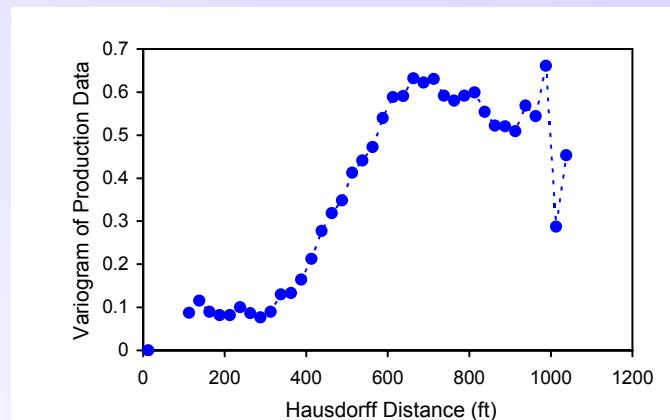


Experimental “production” variograms on 400 models:

Pressure



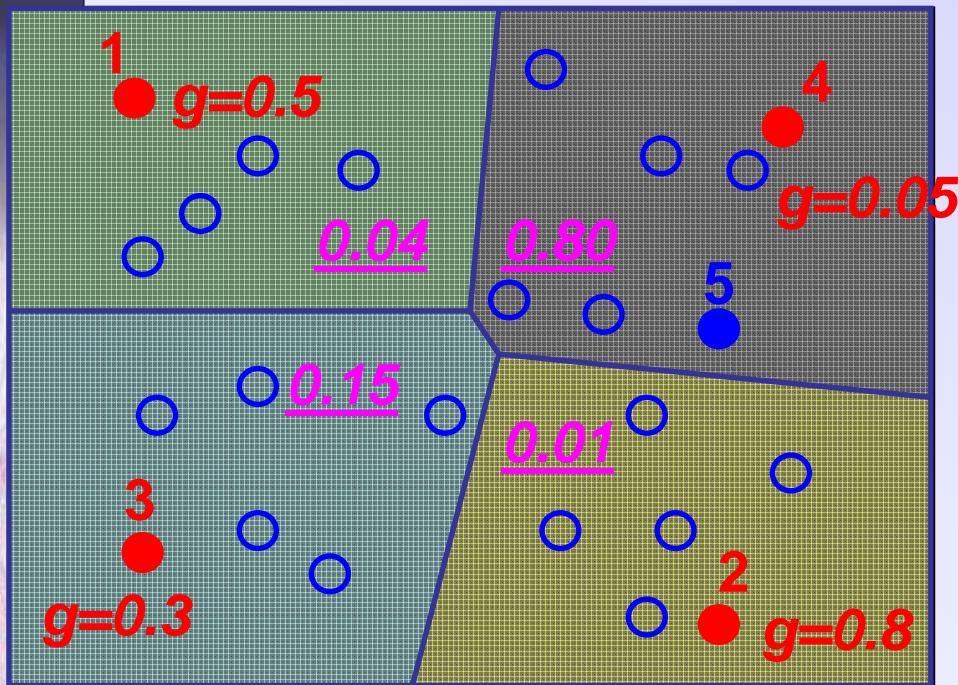
Water cut



Neighborhood Algorithm

[Sambridge 1995]

- Simulate flow on a few models far away from each other
→ evaluate objective function $g(t,m)$



○ Prior model

$g(t,m) = \text{Production mismatch}$

Selection probability

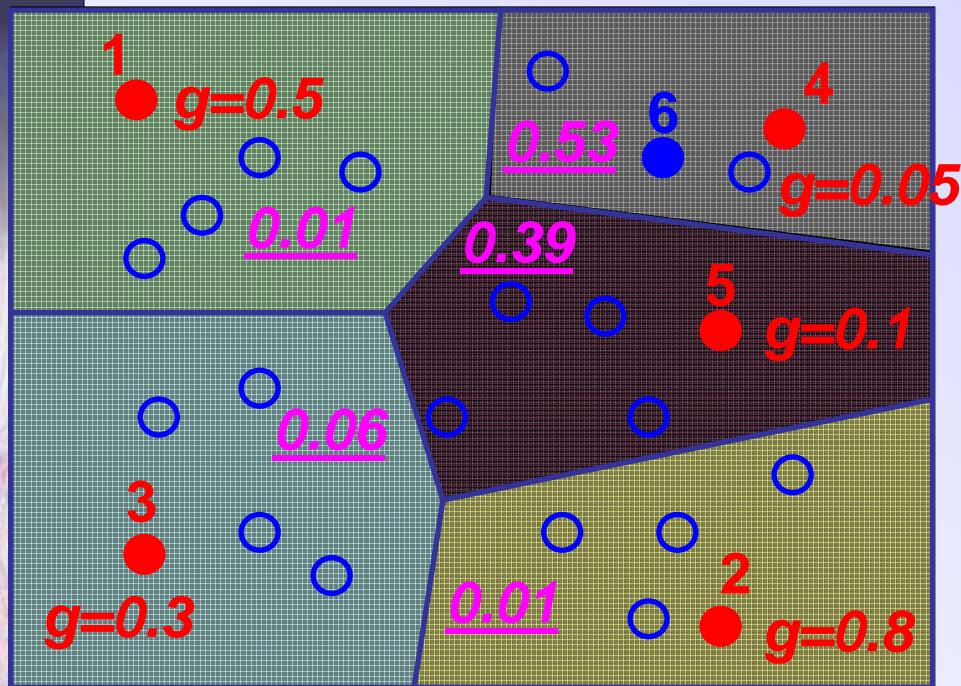
$$p(m_i) = \exp\left\{-\frac{1}{T} \frac{g(m_t, m_i)}{M}\right\}$$

- Define clusters in model space
- Assign selection probability and randomly draw next model → 5

Neighborhood Algorithm

[Sambridge 1995]

- Simulate flow on model 5 → evaluate objective function $g(t,m)$



○ Prior model

$g(t,m) = \text{Production mismatch}$

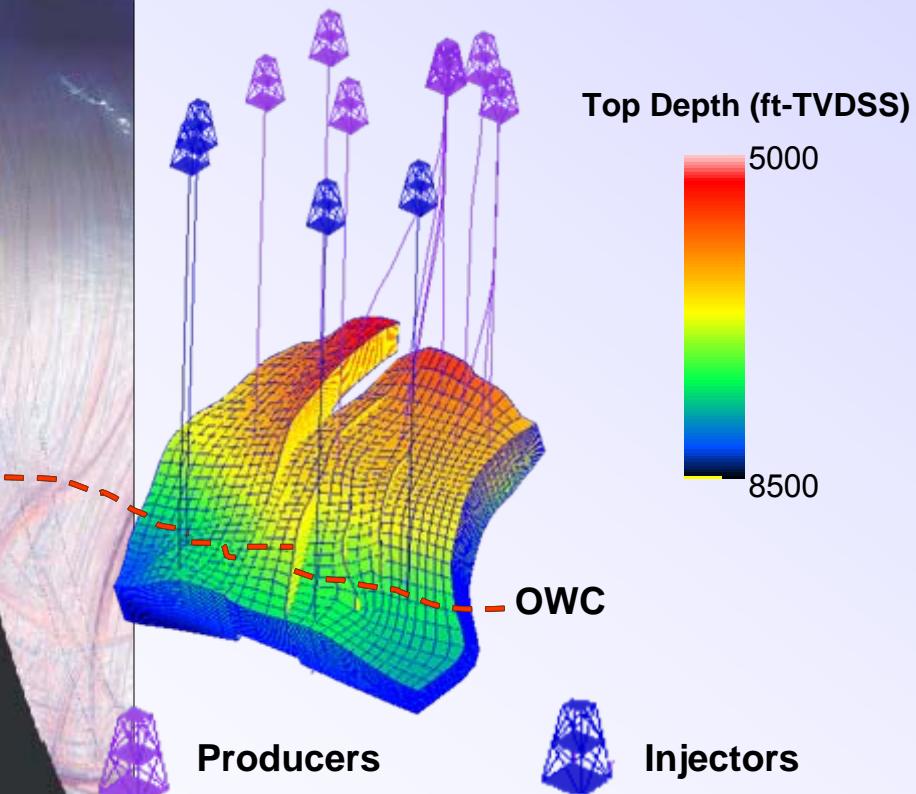
Selection probability

$$p(m_i) = \exp\left\{-\frac{1}{T} \frac{g(m_t, m_i)}{M}\right\}$$

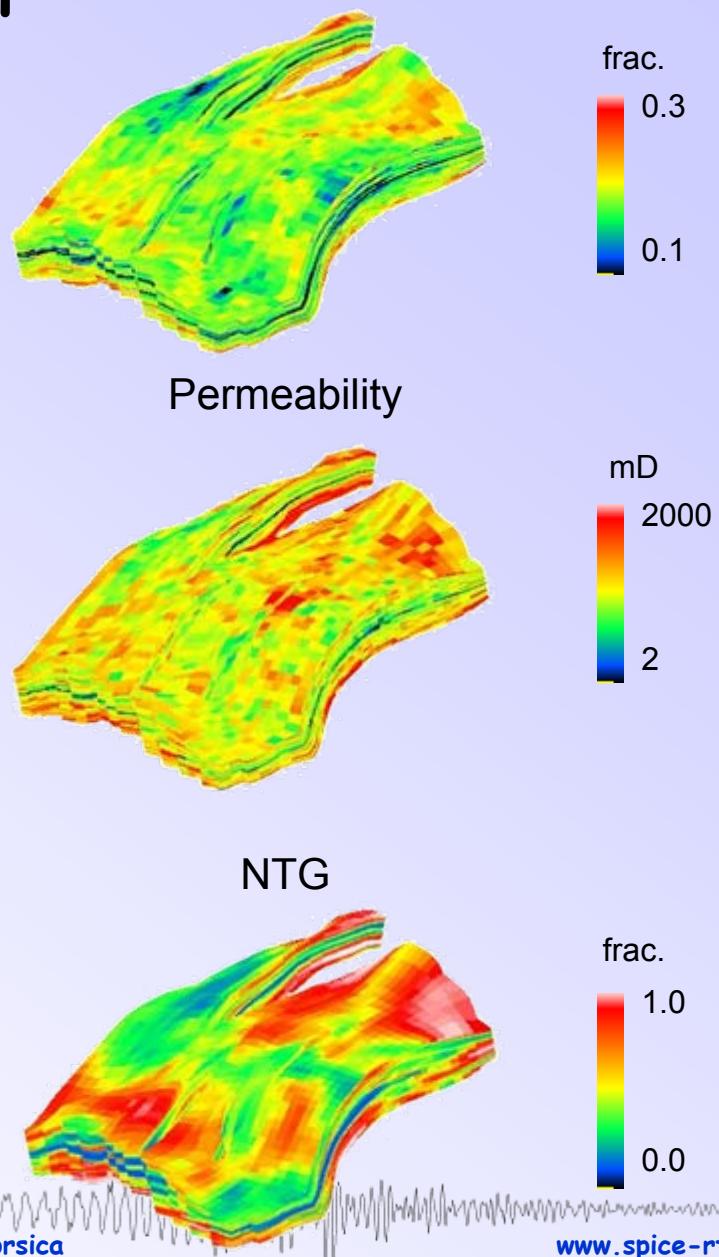
- Update clusters in model space
- Recompute selection probabilities and repeat

Example

- ‘True’ reservoir



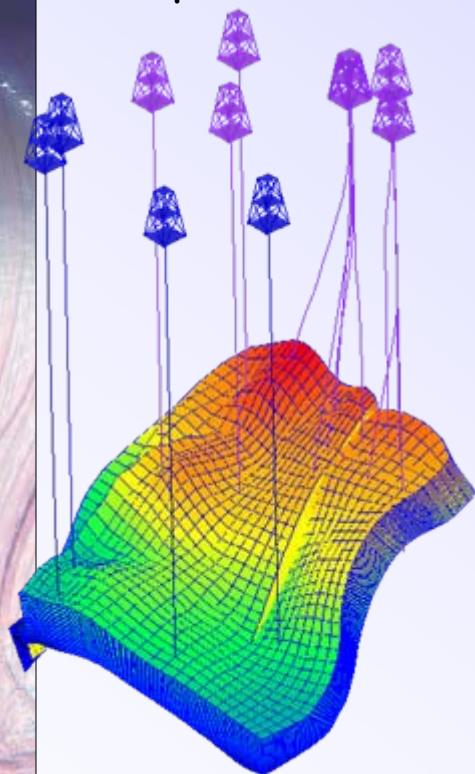
10 producers & 4 injectors



Prior structural uncertainty

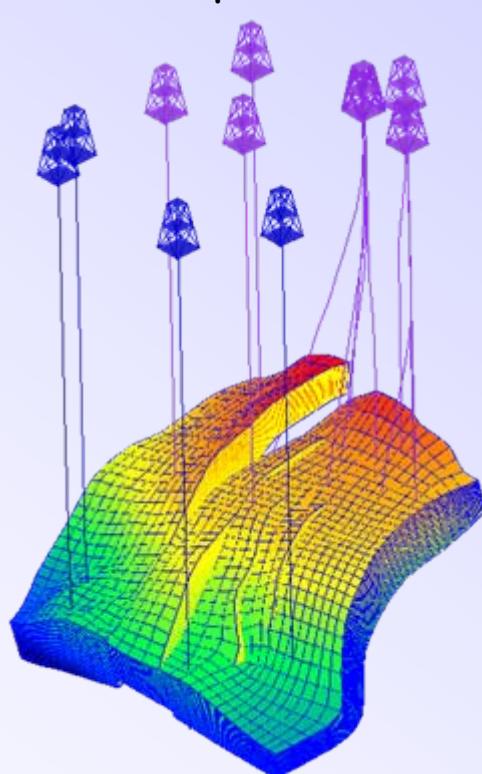
3 interpretations

Interpretation 1



2 faults

Interpretation 2

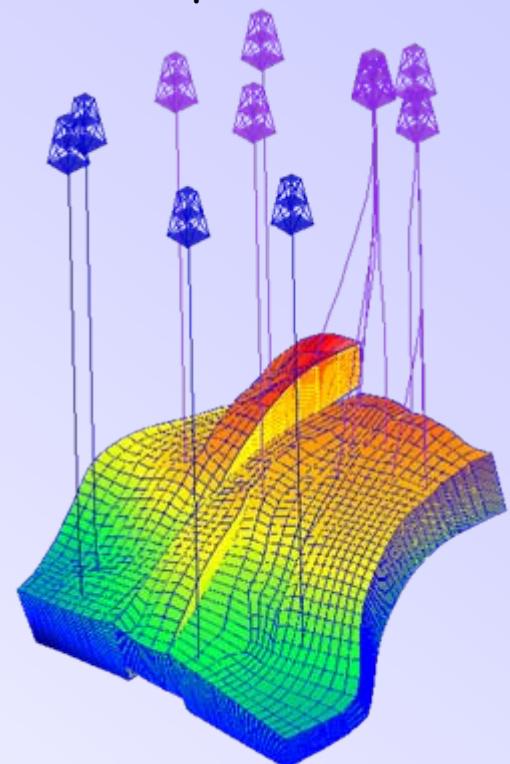


4 faults

Reference :

excluded from the search

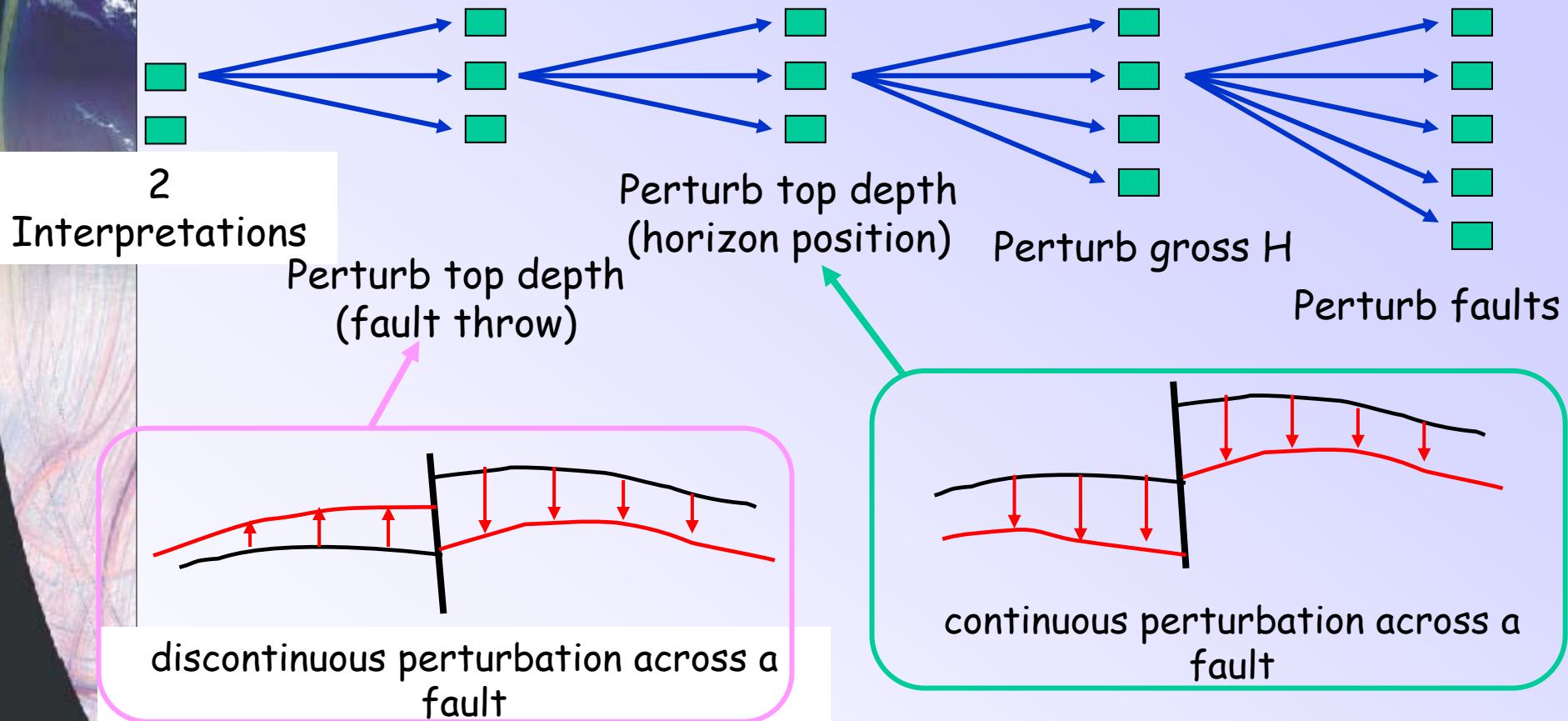
Interpretation 3



5 faults

Prior structural uncertainty

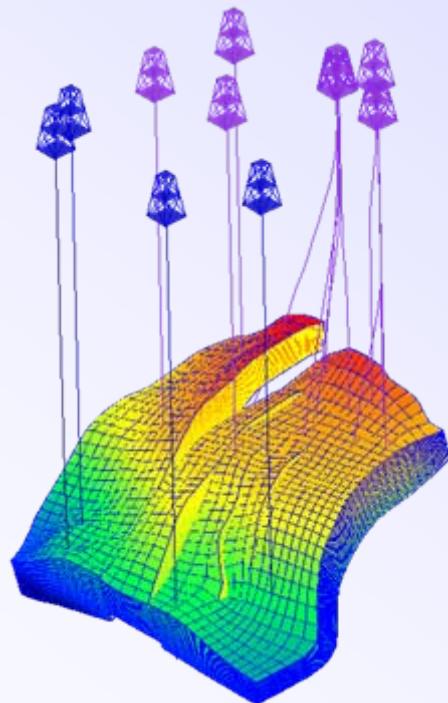
Stochastic perturbation of horizons/faults



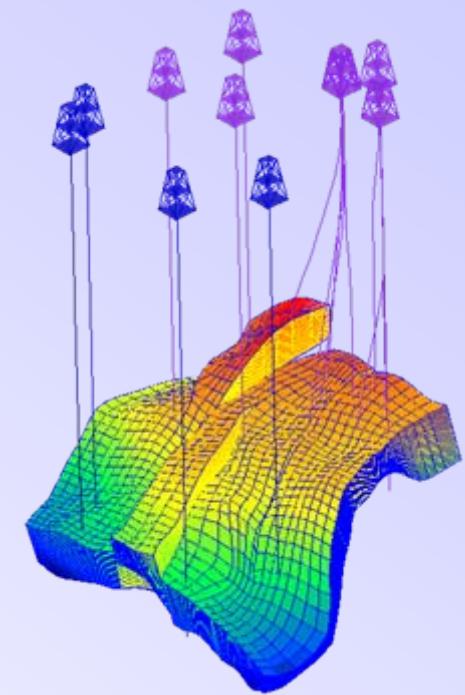
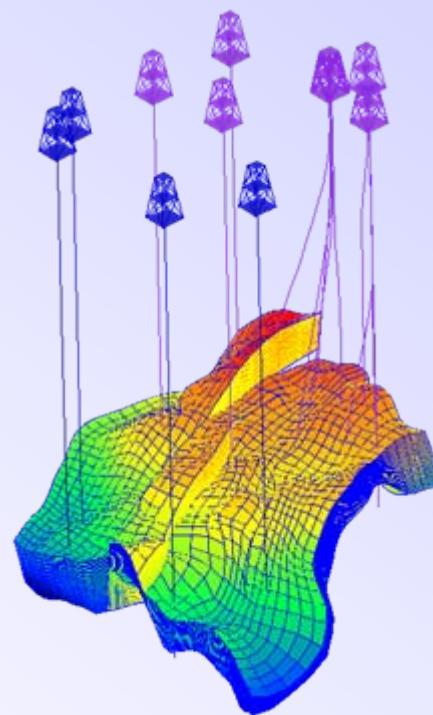
Total of 432 structural models

Results

Reference
structure

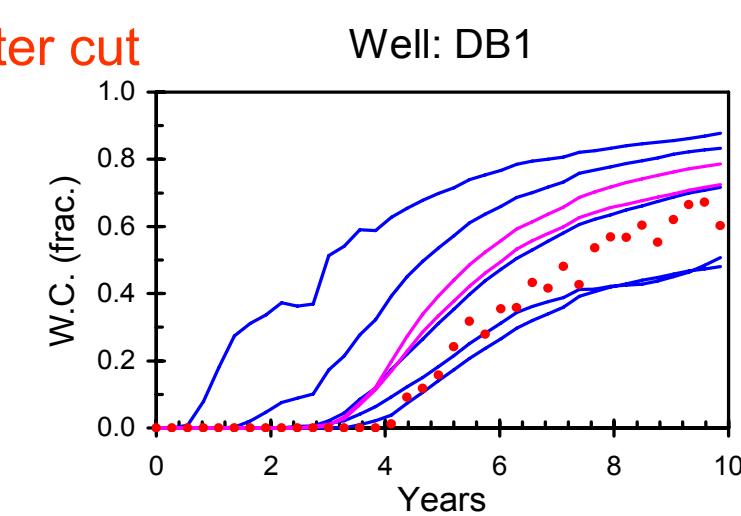
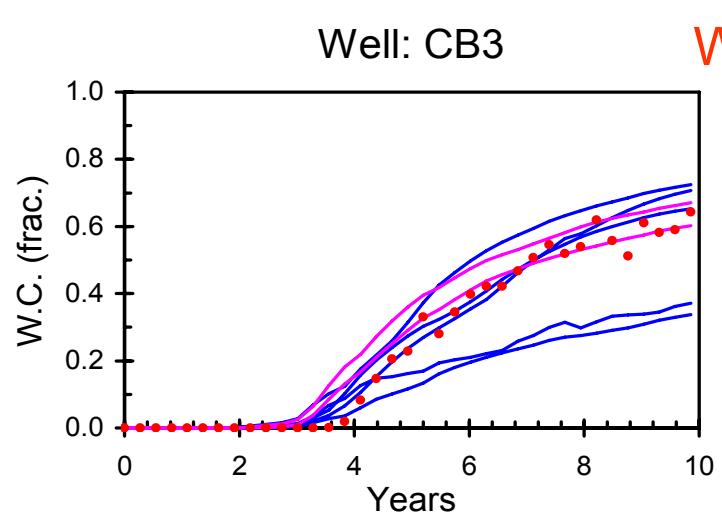
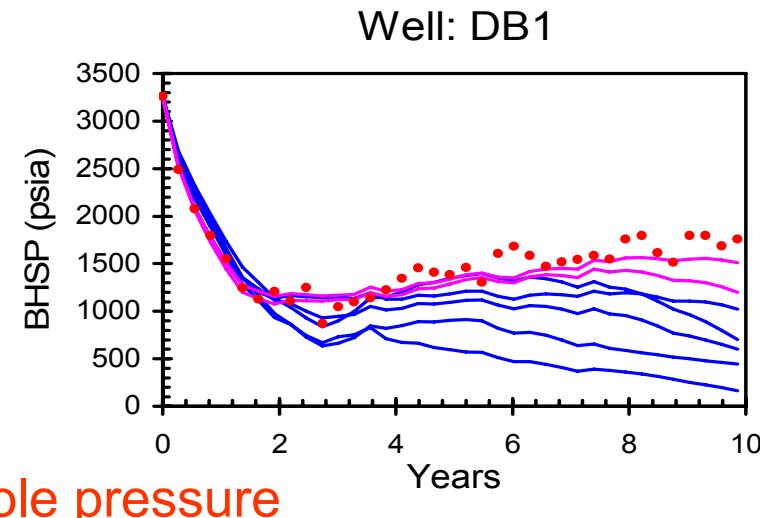
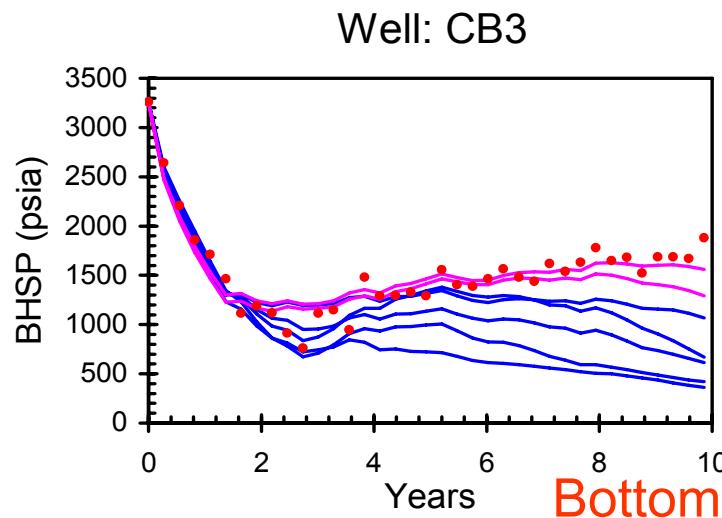


Two history matched models



47 flow simulations
(23.5 / HM model)

Results



● Field data

— Initial runs

— History matched



Conclusions & Challenges

- Ill-posed inverse problem
- Need for:
 - Efficient optimization / sampling algorithms
 - Representing uncertainty to study risks
 - Quantitative Geology
 - Confronting all information from different disciplines
- Key issue: finding a good model parameterization
 - At small and local scales: Geological parameters
- Are "details" important ?
 - Case-specific answer
 - Parsimony principle to be rethought when modeling uncertainties
 - Upscaling techniques may provide a sound answer

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Gocad Consortium (www.gocad.org)

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- Academic members
- Past and present team members

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