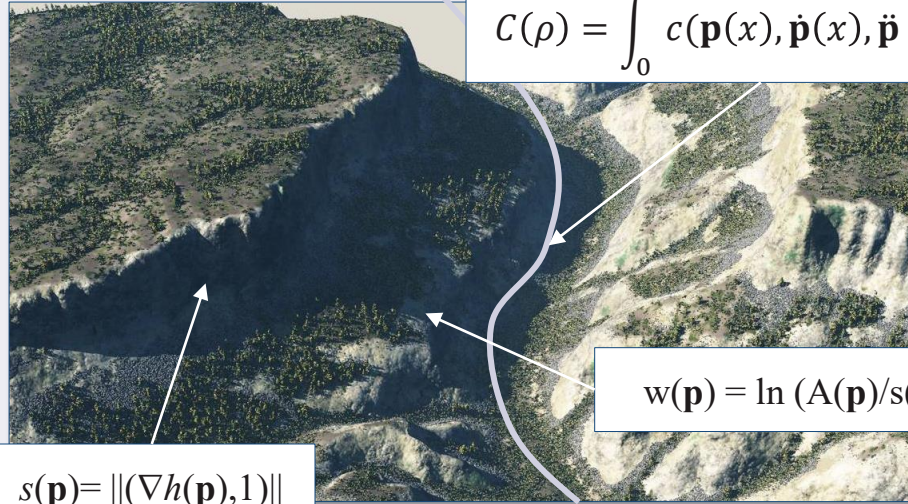


# Digital World Modeling

From mathematics ...

$$C(\rho) = \int_0^1 c(\mathbf{p}(x), \dot{\mathbf{p}}(x), \ddot{\mathbf{p}}(x)) dx$$



$$s(\mathbf{p}) = \|(\nabla h(\mathbf{p}), 1)\|$$

$$w(\mathbf{p}) = \ln(A(\mathbf{p})/s(\mathbf{p}))$$

... to the screen

E. Galin  
Université Lyon 1

# Digital World Modeling

## Data Structures

Procedural Modeling

Erosion Simulation

Procedural Road Generation

Vegetation and Ecosystems

Growth models

Aging and weathering

Classification

Surfaces

Volumes

Analysis

## Verrous scientifiques et techniques

Terrains de très grande dimensions à différentes résolutions

Terrain géologiquement corrects

Prise en compte des différents matériaux

Détails géométriques (rochers, cailloux)



Surplombs



Détails



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# Introduction

Classification

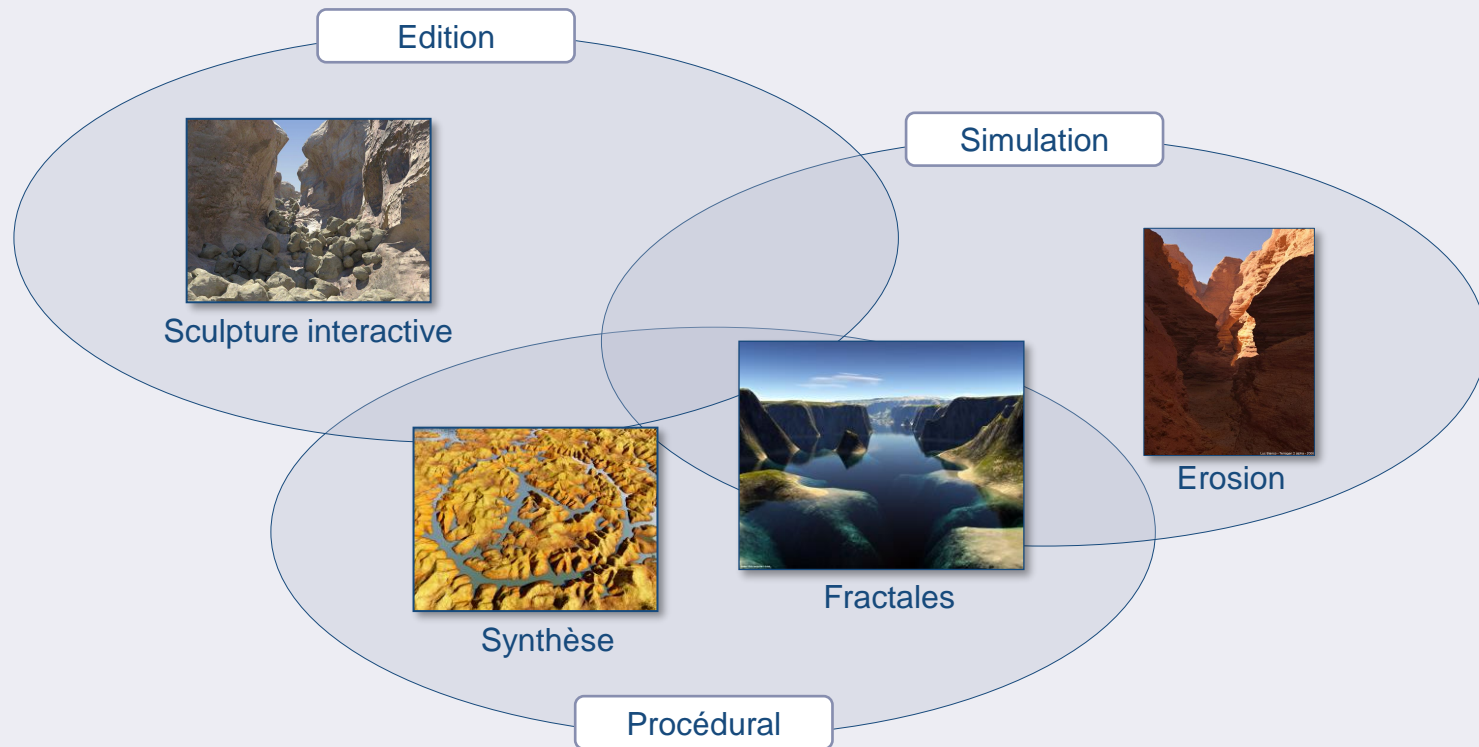
Surfaces

Volumes

Analysis

## Techniques de création

Méthodes de génération et de reconstruction



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## Challenges

Realism  
Variety of landforms  
Range of scale  
Control and authoring

## Constraints

Memory  
Speed

# Classification

Classification

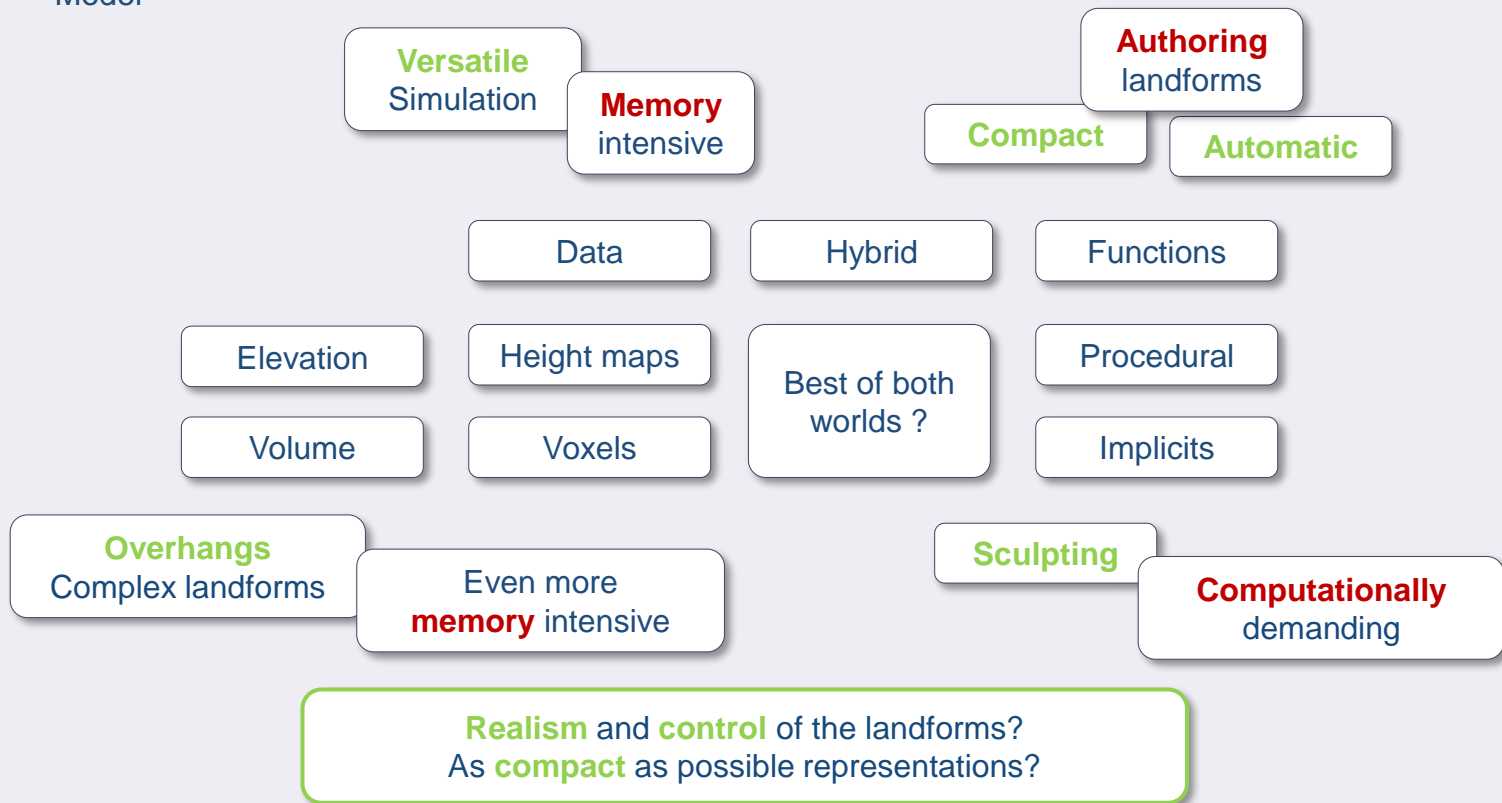
Surfaces

Volumes

Analysis

## Criteria

Categories of landforms  
Model



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# Classification

Classification

Surfaces

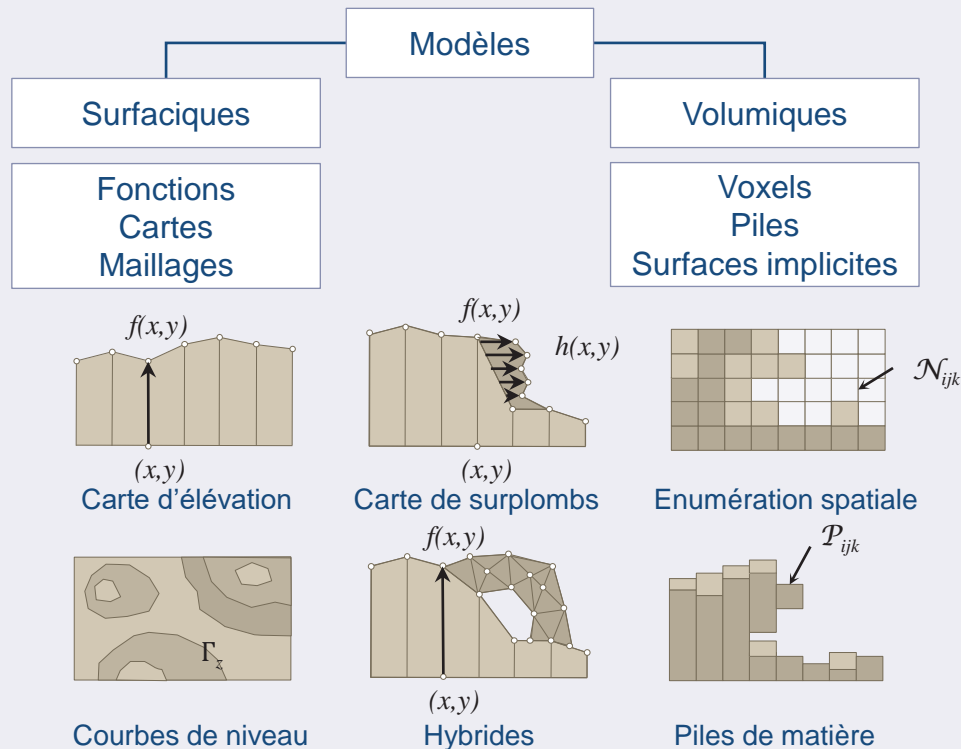
Volumes

Analysis

## Structure de données

Représentation surfacique : hauteur du relief

Modèles volumiques : différents matériaux en surface et en profondeur



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# Elevation functions



# Function representation

Classification

Surfaces

Volumes

Analysis

## Elevation functions

Explicit function  $h : \mathbf{R}^2 \rightarrow \mathbf{R}$ , direct elevation  $h(\mathbf{p})$

Compact model representation

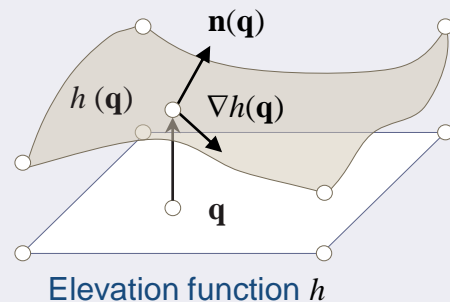
Gradient  $\nabla h$  defines the steepest slope vector

$$s(\mathbf{p}) = |\nabla h(\mathbf{p})|$$

Slope

$$\mathbf{n}(\mathbf{p}) = (-\nabla h(\mathbf{p}), 1)$$

Normal, normalize  $\hat{\mathbf{n}} = \mathbf{n}/|\mathbf{n}|$



Computing  $h$  (on the fly) may be **demanding**  
**Control** of landforms, authoring



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# Metrics

Classification

Surfaces

Volumes

Analysis

## Curvature

For a general elevation function  $z = h(x, y)$

Partial derivatives

$$\kappa = \frac{h_{xx}h_{yy} - h_{xy}^2}{(1 + h_x^2 + h_y^2)^2}$$

Gaussian curvature

$$\mu = \frac{(1 + h_y^2)h_{xx} - 2h_xh_yh_{xy} + (1 + h_x^2)h_{yy}}{2(1 + h_x^2 + h_y^2)^{3/2}}$$

Mean curvature

## Profile and planform curvature

Profile curvature  $\kappa_{\text{pro}}$  is in the direction of the steepest slope  $\nabla h$

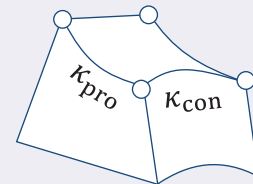
Planform or contour curvature  $\kappa_{\text{con}}$  is orthogonal to  $\nabla h$

$$\kappa_{\text{pro}} = -\frac{h_{xx}h_x^2 + 2h_{xy}h_xh_y + h_{yy}h_y^2}{(h_x^2 + h_y^2)(1 + h_x^2 + h_y^2)^{3/2}}$$

Rate of change of slope

$$\kappa_{\text{con}} = -\frac{h_{xx}h_y^2 - 2h_{xy}h_xh_y + h_{yy}h_x^2}{(h_x^2 + h_y^2)^{3/2}}$$

Divergence of a flow on the surface



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# Heightfields

# Height fields

Classification

Surfaces

Volumes

Analysis

## Structure

**Versatile** model (generation, simulation)

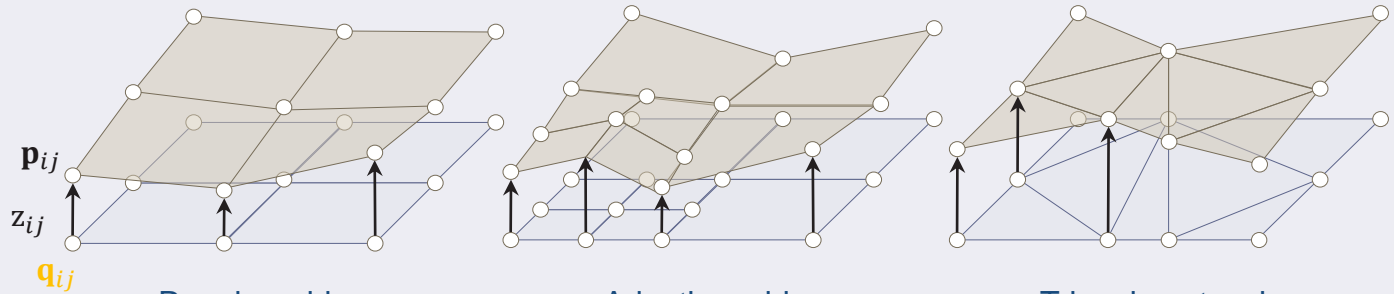
Elevation reconstructed from elevation  $z_{ij}$

Discrétisation régulière ou irrégulière (adaptative) de  $\Omega$

On définit pour  $\mathbf{q}_{ij} \in \Omega = B(\mathbf{a}, \mathbf{b})$  les élévations  $z_{ij} = h(\mathbf{q}_{ij})$

$$\mathbf{p}_{ij} = (\mathbf{q}_{ij}, z_{ij} = h(\mathbf{q}_{ij}))$$

$$\mathbf{q}_{ij} = \mathbf{a} + \left( \frac{(\mathbf{b}_x - \mathbf{a}_x) i}{n_x - 1}, \frac{(\mathbf{b}_y - \mathbf{a}_y) j}{n_y - 1} \right)$$



Regular grid

Adaptive grid

Triangle network

L'élévation  $h(\mathbf{p})$  à l'intérieur des cellules de  $\Omega$  est définie par interpolation des valeurs aux sommets

## Note

Memory demanding model : storage increases in  $O(n^2)$

Algorithms **do not scale** for large terrains with a high resolution

1k × 1k  
4Mb, ≤ 1s

16k × 16k  
1Gb, ≥ 2h



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# Metrics

Classification

Surfaces

Volumes

Analysis

## Profile and planform curvature

Formulas can be derived from the general equations  $z = h(x, y)$

Recall that partial derivatives can be approximated as

$$h_x \approx \frac{h_{i+1,j} - h_{i-1,j}}{2\varepsilon}$$

$$h_{xx} \approx \frac{h_{i+1,j} + h_{i-1,j} - 2h_{ij}}{\varepsilon^2}$$

$$h_{xy} \approx \frac{h_{i+1,j+1} + h_{i-1,j-1} - h_{i+1,j-1} - h_{i-1,j+1}}{4\varepsilon^2}$$

Surface  $S$  can be approximated [Evans 1980] by a bi-variate quadratic surface  $Q$

$$z = a_{20}x^2 + a_{02}y^2 + a_{11}xy + a_{10}x + a_{01}y + a_{00}$$

$$a_{20} = (h_1 + h_3 + h_4 + h_6 + h_7 + h_9 - 2(h_2 + h_5 + h_8))/6\delta^2$$

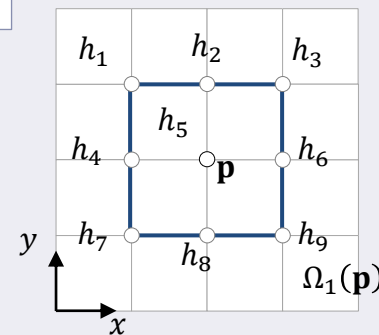
$$a_{02} = (h_1 + h_2 + h_3 + h_7 + h_8 + h_9 - 2(h_4 + h_5 + h_6))/6\delta^2$$

$$a_{11} = (h_3 + h_7 - h_1 - h_9)/4\delta^2$$

$$a_{10} = (h_3 + h_6 + h_9 - h_1 - h_4 - h_7)/6\delta$$

$$a_{01} = (h_1 + h_2 + h_3 - h_7 - h_8 - h_9)/6\delta$$

$$a_{00} = (2(h_2 + h_4 + h_6 + h_8) - (h_1 + h_3 + h_7 + h_9) + 5h_5)/9$$



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# Height fields

Classification

Surfaces

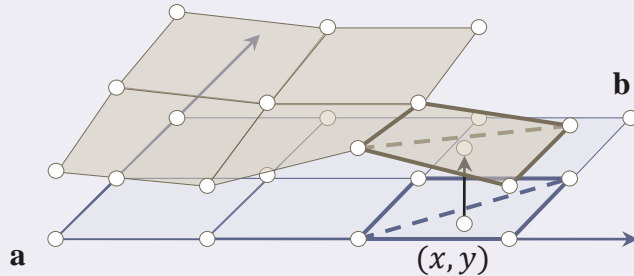
Volumes

Analysis

## Elevation computation

Elevation  $z_{ij}$  is stored for  $\mathbf{q}_{ij} \in \Omega$

Compute  $h(\mathbf{p})$  by bilinear interpolation



```
class HeightField
{
protected:
  Vector a, b;    // Bounding box
  int nx, ny;    // Discretization
  double z[];    // Array of heights
public:
  double Height(const double&, const double&);
  double HeightGrid(int, int);
  // ...
};
```

```
double HeightField::Height(const double& x,
const double& y)
{
```

```
  // Local coordinates
```

```
  double u=(x-a[0])/(b[0]-a[0]);
```

```
  double v=(y-a[1])/(b[1]-a[1]);
```

```
  // Cell location within grid
```

```
  int nu=int(u*nx);
```

```
  int nv=int(v*ny);
```

```
  // Local coordinates within cell
```

```
  u=u-nu*(b[0]-a[0])/nx;
```

```
  v=v-nv*(b[1]-a[1])/ny;
```

```
  if (u+v<1)
```

```
  {
```

```
    return (1-u-v)*HeightGrid(i,j)
```

```
    +u*HeightGrid(i+1,j)
```

```
    +v*HeightGrid(i,j+1);
```

```
  }
```

```
  else
```

```
  {
```

```
    return (u+v-1)*HeightGrid(i+1,j+1)
```

```
    +(1-v)*HeightGrid(i+1,j)
```

```
    +(1-u)*HeightGrid(i,j+1);
```

```
  }
```

```
  }
```



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# Limitations

Classification

Surfaces

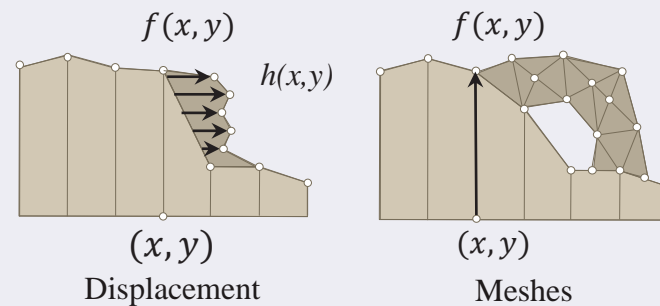
Volumes

Analysis

## Limitations of elevation models

Overhangs and cliffs

Specific displacement or meshes for vertical parts



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Ghost Recon Wildlands



# Layered Models

# Layered representations

Classification

Surfaces

Volumes

Analysis

## Concept

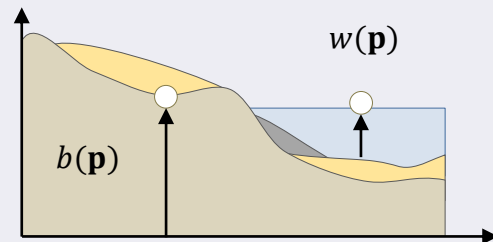
Bedrock elevation  $b$  is augmented with the thickness  $t_i$  of other material layers

$$h(\mathbf{p}) = b(\mathbf{p}) + \sum_{i \in L} t_i(\mathbf{p})$$

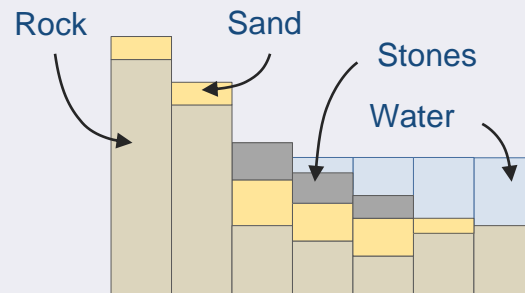
## Applications

Erosion simulation produce fallen rocks or sediments

Ecosystems may use material layers



Elevation functions



Discrete layer stacks



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Benes *et al.* Layered data representation for visual simulation of terrain erosion. *Spring Conference on Computer Graphics*, 2001.  
Musgrave *et al.* The synthesis and rendering of eroded fractal terrains. *Computer Graphics*, 23, 3, 1989.

# Layered representations

Classification

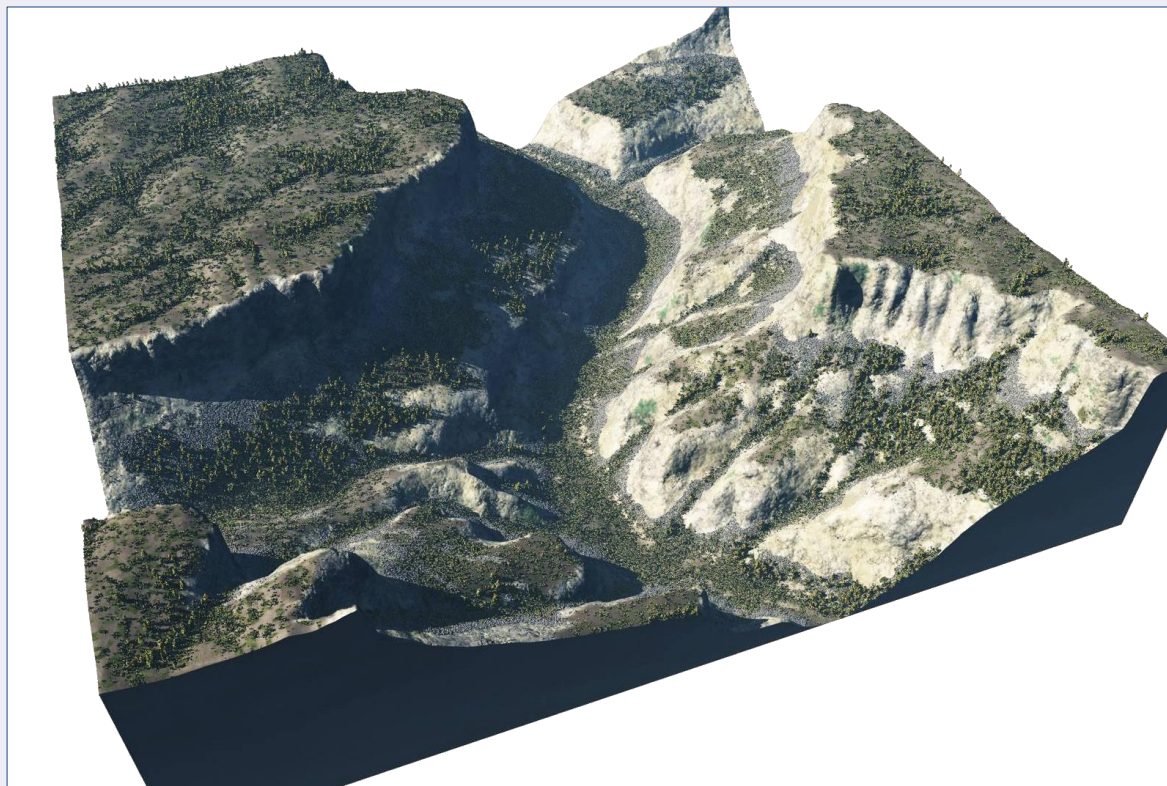
Surfaces

Volumes

Analysis

## Combined terrain ecosystem simulation

Interacting layers



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# Volumetric models

# Voxels

Classification

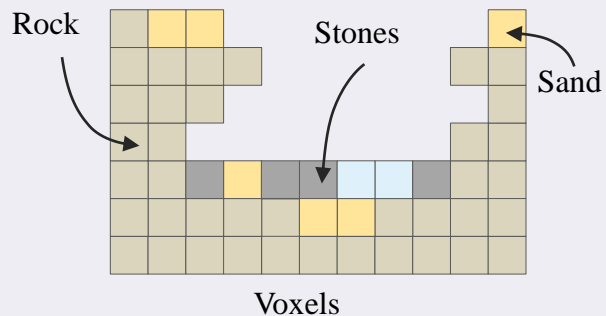
Surfaces

Volumes

Analysis

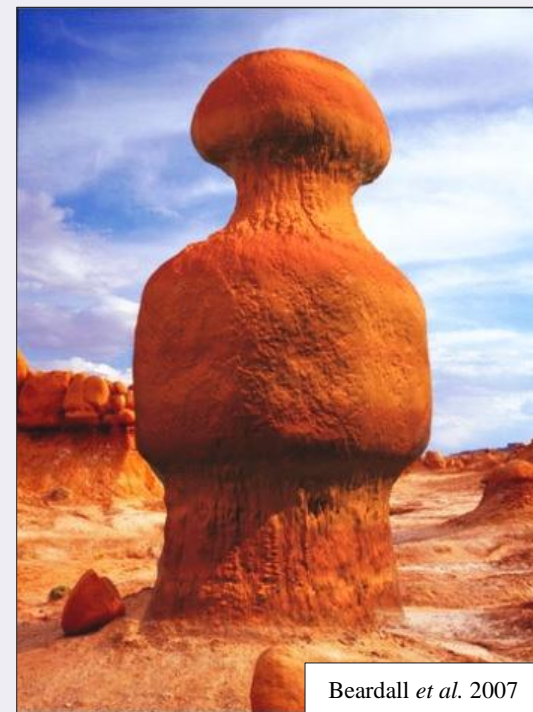
## Model

Material function  $\mu(\mathbf{p})$  defined in a voxel grid [Jones2010]



Allows **sculpting** and **simulations**

Memory demanding



Jones *et al.* Directable weathering of concave rock using curvature estimation. *Transactions on Visualization and Computer Graphics*, **16** (1), 2010  
Beardall *et al.* Goblins by spheroidal weathering. *Eurographics Workshop on Natural Phenomena*, 2007



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# Hybrid representations

Classification

Surfaces

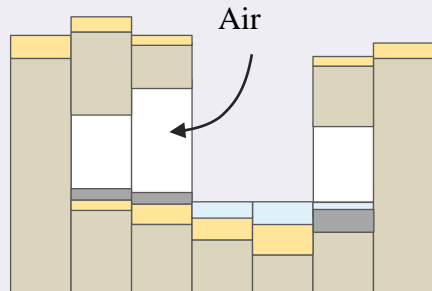
Volumes

Analysis

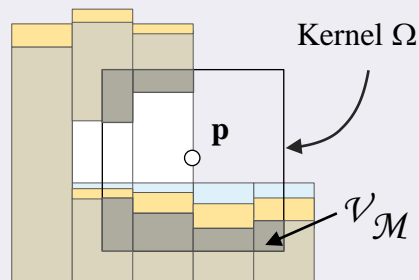
## Smoothed layered stack

Layered materials with air allow the creation of overhangs and cavities [Peytavie2009]

Implicit model : convolution  $\mu(\mathbf{p}) = 0$  for air,  $\mu(\mathbf{p}) = 1$  for material



Layer stacks with overhangs



Layer stacks

$$\text{Convolution } f = 2\mu * k - 1$$

$$\text{Fast computation } \mu * k = \frac{V_M}{V_\Omega}$$



Peytavie et al. 2009

Peytavie et al. Arches: a framework for modeling complex terrains. *Computer Graphics Forum*, 28, 2, 2009



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# Hybrid representations

Classification

Surfaces

Volumes

Analysis



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# Hybrid representations

Classification

Surfaces

Volumes

Analysis

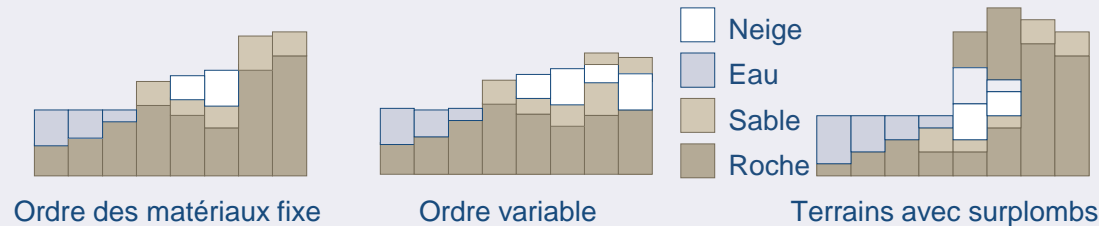
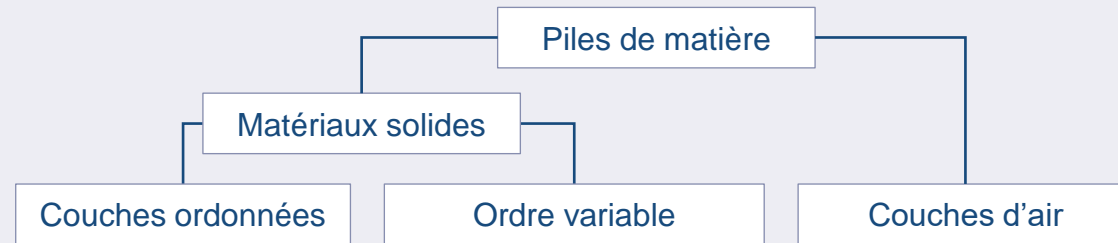
## Principe

Un terrain est une grille de piles de matériaux

L'élévation finale correspond à la hauteur totale de la pile

Lorsque l'ordre est fixe, on simplifie la structure en une superposition de cartes de matière

$$h = \sum_{0 \leq i \leq n} h_i \quad h_i: \Omega \subset \mathbf{R}^2 \rightarrow \mathbf{R}$$



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# Hybrid representations

Classification

Surfaces

Volumes

Analysis

## Structures de données

Comparaison entre plusieurs cartes  
d'élévations et une structure dynamique

```
class LayerField
{
protected:
  Vector a, b;    // Bounding box
  int nx, ny;    // Discretization
  double rock[]; // Array of heights for
rock layer
  double sand[]; // Array of heights for
sand
  double water[]; // Array of heights for
water
public:
  double Height(const double&,const
double&);
  double HeightGrid(int,int);
  // ...
};
```

```
class Material    // Definition of a single cell
{
protected:
  double h;      // Height of material in cell
  int type;      // Material type
public:
  // ...
};

class MaterialStack // Stack of cells
{
protected:
  Material stack[]; // Array of different materials
  int n;           // Size of array
public:
  // ...
};

class MaterialStackField // Array of stacks of cells
{
protected:
  Vector a, b;    // Bounding box
  int nx, ny;    // Discretization
  MaterialStack array[]; // Array of material stacks
public:
  // ...
};
```



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# Hybrid representations

Classification

Surfaces

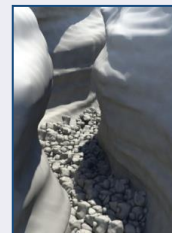
Volumes

Analysis

## Structure

Modèle hybride combinant surface implicite – modèle discret  
Combinaison pour l'édition et la simulation

	Implicite	Discret
Roche	Sculpture Fissures	
Matériaux granuleux		Dépôt Erosion Stabilisation
Liquides		Remplissage Ecoulement Phases



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# Hybrid representations

Classification

Surfaces

Volumes

Analysis

## Structure de données

Caractérisation volumique en piles de matière  $g$

Lissage de la surface par convolution par un noyau  $h$  à support compact

$$S = \{\mathbf{p} \in \mathbb{R}^2, f(\mathbf{p}) = 0\}$$

$$f(\mathbf{p}) = \frac{i(\mathbf{p})}{4\sigma} - 1$$

$$i(\mathbf{p}) = g * h(\mathbf{p}) = \int_{\mathbb{R}^3} g(\mathbf{p})h(\mathbf{p} - \mathbf{q})d\mathbf{q}$$

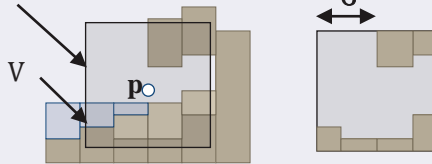
$$g(\mathbf{p}) = \begin{cases} 1 & \text{si } \mathbf{p} \in M \\ 0 & \text{sinon} \end{cases}$$

Squelette

$$h(\mathbf{p}) = \begin{cases} 1 & \text{si } |\mathbf{q}|_{\infty} \leq \sigma \\ 0 & \text{sinon} \end{cases}$$

Noyau

Support de convolution  $\Omega$  de volume  $V_{\Omega}$



$$f(\mathbf{p}) = \frac{2V}{V_{\Omega}} - 1$$



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A. Peytavie, E. Galin, J. Grosjean, S. Mérillou. Arches: a Framework for Modeling Complex Terrains. *Computer Graphics Forum (Proceedings of Eurographics)*, **28**(2), 457-467, 2009.

# Hybrid representations

Classification

Surfaces

Volumes

Analysis

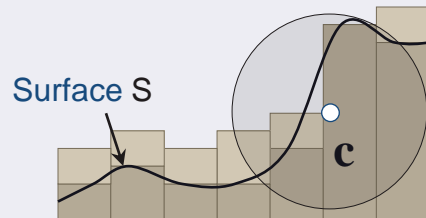
## Combinaison des modèles implicites et discrets

Créer une primitive avec un centre  $c$

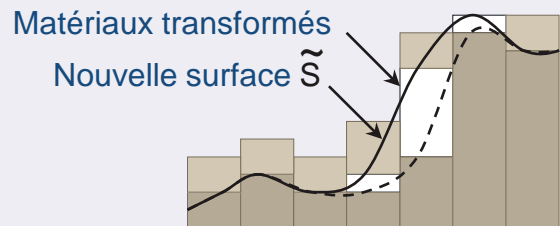
Mélange avec la primitive implicite

Discrétisation de la surface implicite en piles

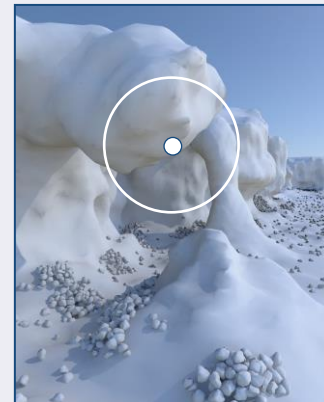
Stabilisation



Couches initiales



Couches modifiées



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# Hybrid representations

Classification

Surfaces

Volumes

Analysis

## Smoothed layered stack

Layered materials with air allow the creation of overhangs and cavities

Implicit model created by a convolution



Peytavie *et al.* Procedural generation of rock piles using aperiodic tiling. *Computer Graphics Forum* 28, 7, 2009



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# Implicit Surfaces

Classification

Surfaces

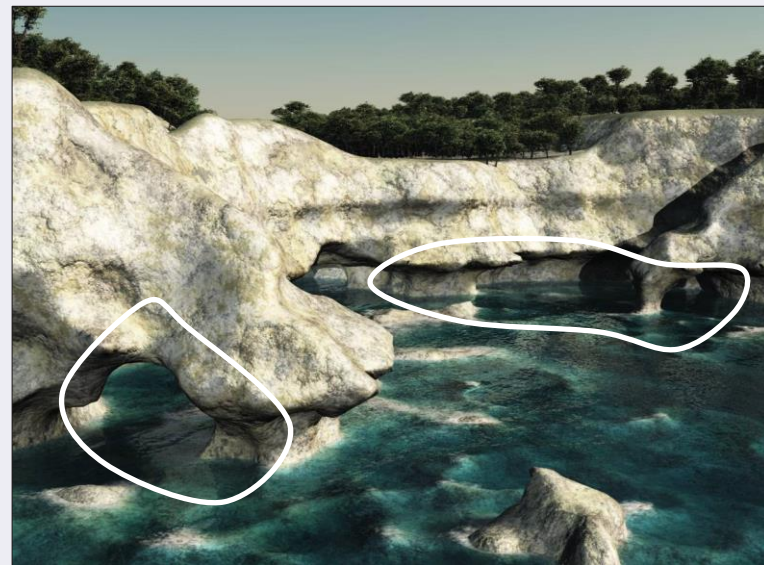
Volumes

Analysis

## Field function

Find good primitives and operators for carving landforms

Cliffs, overhangs, caves



Need for effective **operators** and **primitives**



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# Conclusion

Classification

Surfaces

Volumes

Analysis

## Height fields and layered height fields

**Conspicuous** in terrain modeling

**Versatile** for a variety of generation methods

## Function-based models

Useful for modeling some **specific landforms**

Modeling large landscapes with a high resolution



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