# LP fitting approach for reconstructing parametric surfaces from points clouds

### **Thibault Marzais**, Yan Gerard, Rémy Malgouyres

LLAIC IUT département Informatique BP 86 63173 AUBIÈRE CEDEX FRANCE marzais@llaic3.u-clermont1.fr

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### Introduction

#### Geometric modeling

Many ways to represent an object in a computer

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### Introduction

#### Geometric modeling

Many ways to represent an object in a computer

An object can be modelized as

- a point cloud
- a voxels set
- a mesh
- parametric surfaces (Bézier, B-Spline)

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↓ complex level

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### Introduction

#### Geometric modeling

Many ways to represent an object in a computer

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#### A problem of geometric modeling

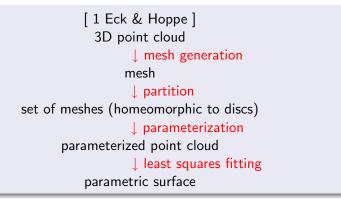
A problem of reverse engeneering is passing from point cloud (issued from a scanner) to parametric surface (CAD)

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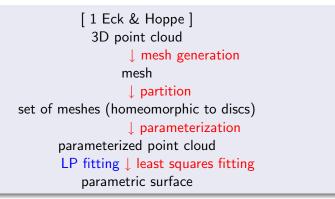
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↓ complex level

### Introduction



### Introduction



# Outline

- Definitions
  - Definitions : Parametric surfaces
  - Definitions : Bézier surfaces
  - Definitions : B-Spline surfaces
  - Definitions : Linear program

## 2 Surface fitting

- Generality
- Approximate reconstruction
- Approximate reconstruction : Least square fitting
- Approximate reconstruction : LP fitting

## 3 Results

- Protocole
- Results

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Definitions : Parametric surfaces Definitions : Bézier surfaces Definitions : B-Spline surfaces Definitions : Linear program

### Definition of some parametric surfaces

### A definition of some parametric surfaces

$$Q(s,t) = \sum_{i=1}^{n} P_i f_i(s,t)$$

with

- Basis of fonctions  $f_i : \mathbb{R}^2 \mapsto \mathbb{R}$
- Control points  $P_i \in \mathbb{R}^3$

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## Bézier surfaces

A Bézier surface is a parametric surface. The used basis function is the tensor product of Bernstein polynomials :

$$B_{i,n}(t) = \binom{n}{i} * t^i * (1-t)^{n-i}$$

Expression of a Bézier surface of degre n,m

$$Q(s,t) = \sum_{i=1}^{n} \sum_{j=1}^{m} P_{i,j} B_{i,n}(s) B_{j,m}(t)$$

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# B-Splines surfaces - 1/2

#### Data

- Let k & l be two integers (degree of the surface).
- Let *m* & *n* be two integers (order of the surface).
- Let  $S = \{s_0, \ldots, s_{m+k-1}\}$ ,  $T = \{t_0, \ldots, t_{n+l-1}\}$  two knot vectors, with  $s_0 \le s_1 \le \ldots \le s_{m+k-1}$ ,  $t_0 \le t_1 \le \ldots \le t_{n+l-1}$ .
- A B-Spline surface is a parametric surface. The used basis function is the tensor product of Cox de Boor functions defined by:

$$N_{i,r}(t) = \frac{t-t_i}{t_{i+r-1}-t_i}N_{i,r-1}(t) + \frac{t_{i+r}-t}{t_{i+r}-t_{i+1}}N_{i+1,r-1}(t)$$

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B-Splines surfaces - 2/2

Expression of a B-Spline surface of order n,m, degree k,l

$$Q: [s_{k-1}, s_m] \times [t_{l-1}, t_n] \longrightarrow \mathbb{R}^3$$

$$(s, t) \longmapsto Q(s, t)$$

$$= \sum_{i=0}^m \sum_{j=0}^n P_{i,j} N_{i,k}(s) N_{j,l}(t)$$

#### Remark

Fonctions  $N_{i,r}(t)$  are piecewise polynomials with compact support. B-Spline surfaces offer local control of the surface.

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### Linear program

#### Definition

• a linear program is an optimization problem :

Minimize (linear cost fonction) linear constraints

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### Linear program

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Example

$$\begin{array}{l} \underset{x,y}{Min} (5x + 7y) \\ 3x - 9y \leq 2 \\ 8x + 12y \leq 7 \\ -5x + 8y \leq 3 \end{array}$$

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#### Generality

Approximate reconstruction Approximate reconstruction : Least square fitting Approximate reconstruction : LP fitting

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#### Our problem of reconstruction

parameterized point cloud LP fitting ↓ least squares fitting parametric surface

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#### Our problem of reconstruction

parameterized point cloud LP fitting ↓ least squares fitting parametric surface

#### Input

- points  $M_k$ ,  $1 \le k \le N$
- parameters values  $s_k, t_k$  associated to  $M_k$
- basis of functions  $f_i \ 1 \le i \le n$

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#### Output

• control points  $P_i$  of a parametric surface  $Q(s,t) = \sum_{i=1}^{n} P_i f_i(s,t)$ 

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#### What is an ideal solution ?

$$\forall k, \ Q(s_k, t_k) = M_k$$

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#### The exact reconstruction system

$$Q(s_k, t_k) = M_k \quad \forall k$$

$$\iff$$

$$\sum_{i=1}^{n} P_i f_i(s_k, t_k) = M_k \quad \forall k$$

$$\iff$$

$$\sum_{i=1}^{n} P_i^{\times} f_i(s_k, t_k) = x_k \quad \forall k$$

$$\sum_{i=1}^{n} P_i^{\vee} f_i(s_k, t_k) = y_k \quad \forall k$$

$$\implies$$

 $A * P^{x} = X$  $A * P^{y} = Y$  $A * P^{z} = Z$ 

Solving the three systems gives an exact reconstruction

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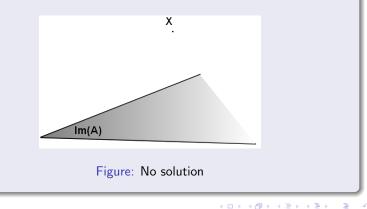


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#### x-coordinate system

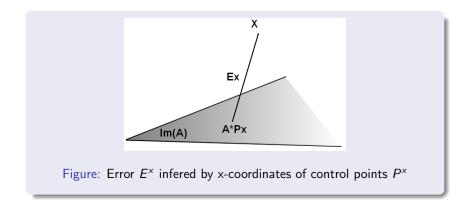
Let us consider the first system :  $A * P^x = X$ In general, there is no exact solution.



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## Error $E^x$ inferred by $P^x$



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# Least square fitting [2]

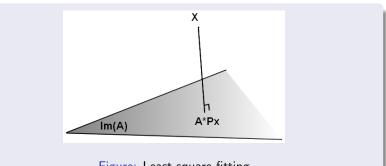


Figure: Least square fitting

Minimize euclidian norm  $E^{x}$ Orthogonal projection of X onto Im(A)

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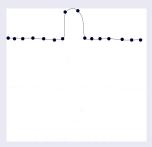
#### Features of least square fitting

• A distant point can be considered as noise

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#### Features of least square fitting

- A distant point can be considered as noise
- Example : bone excrescence



### Figure: Bone Excrescence

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#### Features of least square fitting

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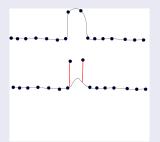


Figure: Bone Excrescence, Least squares fitting

• Least squares fitting minimizes mean error.

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#### Features of least square fitting

- A distant point can be considered as noise
- Example : bone excrescence

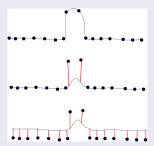


Figure: Bone Excrescence, a better solution according to uniform error

• If we consider uniform norm, there exists better solutions

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### Our approach : uniform approach

#### uniform approach

Instead of minimizing euclidian norm of  $E^x = A * P^x - X$ , we minimize its uniform norm :

$$\underset{P^{x}}{Min}\left(||E^{x}||_{\infty}\right)$$

Generality Approximate reconstruction Approximate reconstruction : Least square fitting Approximate reconstruction : LP fitting

### Toward linear program

$$\begin{cases} \underset{P^{x}}{\text{Min}}(||E^{x}||_{\infty}) \\ \iff & \begin{cases} \underset{P^{x}}{\text{Min}}\left(M_{ax}|E_{i}^{x}|\right) \\ \\ \iff & \begin{cases} \underset{P^{x},h}{\text{Min}}(h) \\ -h \leq E_{i}^{x} \leq +h \ \forall i \end{cases} \\ \\ \iff & \begin{cases} \underset{P^{x},h}{\text{Min}}(h) \\ -h * 1 \leq A * P^{x} - X \leq h * 1 \end{cases} \end{cases}$$

Thus, the problem is formulated by a linear program.

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Protocole Results

### Tests

### Surface generation

- Bézier surfaces
- B-Spline surfaces
- sphere

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Protocole Results

### Tests

### Surface generation

- Bézier surfaces
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### Perturbation

Gaussian noise on

- points  $M_k$
- parameters  $s_k$ ,  $t_k$

Protocole Results

### Compare the results

#### Points $M_k$

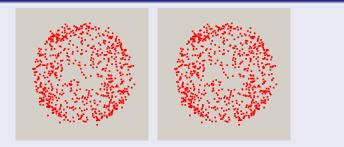


Figure: Results of reconstruction, left LP, right LSF

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### Compare the results

#### Points $M_k$ , Surface Q

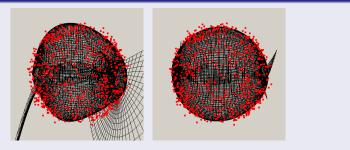


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### Compare the results

### Points $M_k$ , Surface Q and deviation vectors

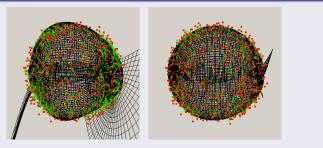


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### Compare the results

#### Data processing

- We pick deviation vectors  $M_k Q(s_k, t_k)$
- We compute their euclidian norm
- We put them in an histogram

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Protocole Results



Figure: Favourable case of reconstruction (top LP, bottom LSF)

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Protocole Results



Figure: Unfavourable case of reconstruction (top LP, bottom LSF)

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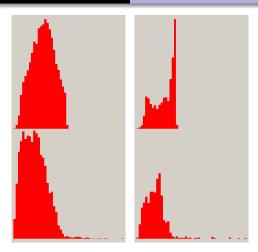


Figure: Usual case of reconstruction (top LP, bottom LSF)

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Protocole Results

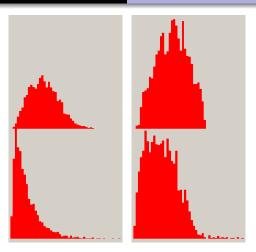


Figure: Usual case of reconstruction with disturbed data (top LP, bottom LSF)

#### Conclusion

- LP fitting is an alternative to Least square fitting
- Useful for surface reconstruction with a fixed tolerance on the error [3, Weiss & al]

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#### references

[1] Eck, M. and Hoppe, H. (1996). Automatic reconstruction of B-Spline surfaces of arbitrary topological type.

[2] Farin, G. (2002). Curves and surfaces for CAGD: a practical guide.

[3] Weiss, V., Andor, L., Renner, G., and Varady, T. (2002). Advanced surface fitting techniques.

# Any questions ?

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