

Approximating Implicit Curves on Plane and Surface Triangulations with Affine Arithmetic

Afonso Paiva ICMC-USP

Seminários de Verão - IMPA 2014

Collaborators







Filipe Nascimento (ICMC-USP)
Luiz Henrique de Figueiredo (IMPA)
Jorge Stolfi (UNICAMP)

Overview

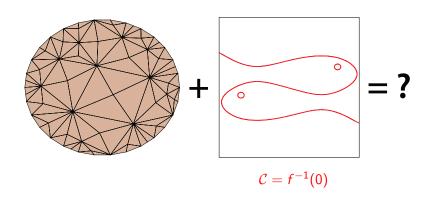
Problem Setup

Given a planar or surface triangulation \mathcal{T} and $f: \mathbb{R}^d \to \mathbb{R}$, compute a *robust* adaptive polygonal approximation of the curve given implicitly by f on $\mathcal{T}: \mathcal{C} = \{\mathbf{x} \in \mathcal{T}: f(\mathbf{x}) = 0\}$.

Overview

Problem Setup

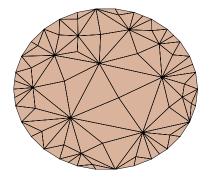
Given a planar or surface triangulation \mathcal{T} and $f: \mathbb{R}^d \to \mathbb{R}$, compute a *robust* adaptive polygonal approximation of the curve given implicitly by f on $\mathcal{T}: \mathcal{C} = \{\mathbf{x} \in \mathcal{T}: f(\mathbf{x}) = 0\}$.



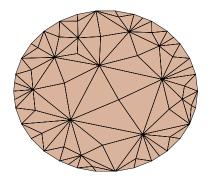
► Curve location:

ightharpoonup Curve location: intersection between ${\cal C}$ and the triangles of ${\cal T}$

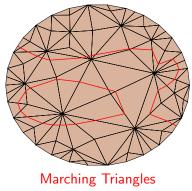
ightharpoonup Curve location: intersection between ${\cal C}$ and the triangles of ${\cal T}$



▶ Curve location: intersection between $\mathcal C$ and the triangles of $\mathcal T$ What criteria?

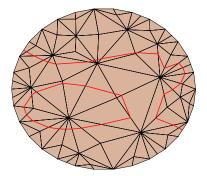


▶ Curve location: intersection between C and the triangles of T What criteria?



 $\# \triangle = 101$

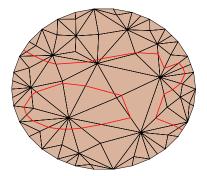
- ▶ Curve location: intersection between C and the triangles of T What criteria?
- ► Mesh refinement:



Marching Triangles

$$\#\triangle=101$$

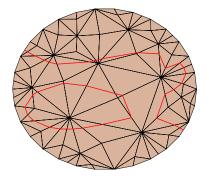
- ▶ Curve location: intersection between C and the triangles of T What criteria?
- ▶ Mesh refinement: small triangles ⇒ more details



Marching Triangles

$$\#\triangle=101$$

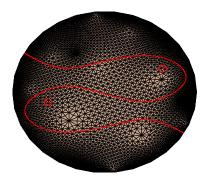
- ▶ Curve location: intersection between C and the triangles of T What criteria?
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient?



Marching Triangles

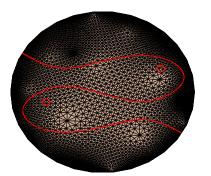
$$\#\triangle=101$$

- ▶ Curve location: intersection between C and the triangles of T What criteria?
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient?



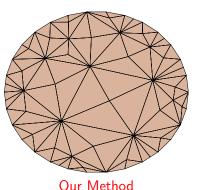
Marching Triangles $\#\triangle = 12928$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!



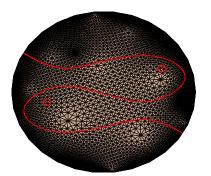
Marching Triangles $\#\triangle = 12928$





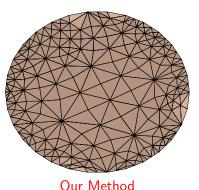
 $\#\triangle=101$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!



Marching Triangles $\#\triangle = 12928$

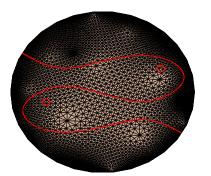




 $\#\triangle=376$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!

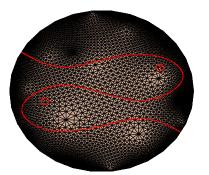
level 2



Marching Triangles $\#\triangle = 12928$



- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!

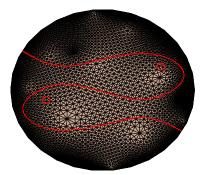


Marching Triangles $\#\triangle = 12928$



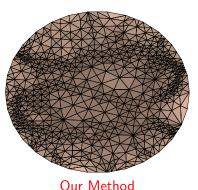
level 3 Our Method $\#\triangle = 930$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!



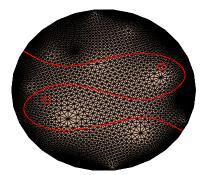
Marching Triangles $\#\triangle = 12928$



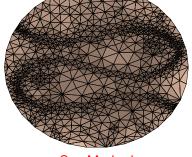


 $\# \triangle = 1314$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!

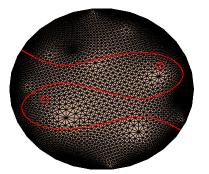


Marching Triangles $\#\triangle = 12928$



level 5 Our Method $\#\triangle = 1759$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!



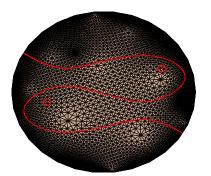
Marching Triangles $\#\triangle = 12928$



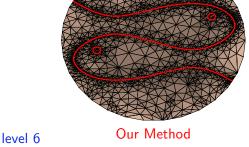


Our Method $\#\triangle = 2431$

- ► Curve location: intersection between C and the triangles of T What criteria? Our goal: spatial adaptation!
- ► Mesh refinement: small triangles ⇒ more details How small? How efficient? Our goal: geometric adaptation!



Marching Triangles $\#\triangle = 12928$



 $\# \triangle = 2431$

► Numerical oracles

- ► Numerical oracles
 - Is this triangle away from the curve?

- ► Numerical oracles
 - Is this triangle away from the curve?
 - ▶ Is the curve approximately flat inside the triangle?

- ► Numerical oracles
 - Is this triangle away from the curve?
 - ▶ Is the curve approximately flat inside the triangle?

► Self-validated arithmetic methods

- Numerical oracles
 - Is this triangle away from the curve?
 - ▶ Is the curve approximately flat inside the triangle?

- Self-validated arithmetic methods
 - ▶ Robust interval estimative for *f* with guarantee certificate:

$$F(X) \supseteq f(X) = \{f(x,y) : (x,y) \in X\}$$

- Numerical oracles
 - Is this triangle away from the curve?
 - ▶ Is the curve approximately flat inside the triangle?

- Self-validated arithmetic methods
 - ▶ Robust interval estimative for *f* with guarantee certificate:

$$F(X) \supseteq f(X) = \{f(x,y) : (x,y) \in X\}$$

▶ $0 \notin F(X) \Rightarrow \text{cell } X \text{ is away from curve}$

- Numerical oracles
 - Is this triangle away from the curve?
 - ▶ Is the curve approximately flat inside the triangle?

- Self-validated arithmetic methods
 - ▶ Robust interval estimative for *f* with guarantee certificate:

$$F(X) \supseteq f(X) = \{f(x,y) : (x,y) \in X\}$$

- ▶ $0 \notin F(X) \Rightarrow \text{cell } X \text{ is away from curve}$
- ► Interval arithmetic (IA) and affine arithmetic (AA)

▶ Introduced by Comba and Stolfi in SIBGRAPI'93

- ▶ Introduced by Comba and Stolfi in SIBGRAPI'93
- Represents a quantity z with an affine form:

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$$

- Introduced by Comba and Stolfi in SIBGRAPI'93
- ▶ Represents a quantity *z* with an *affine form*:

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$$

where $z_i \in \mathbb{R}$ and the *noise symbols* $\varepsilon_i \in [-1,1]$ represent independent sources of uncertainty

Good alternative to replace IA in graphics applications

- Introduced by Comba and Stolfi in SIBGRAPI'93
- ▶ Represents a quantity *z* with an *affine form*:

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$$

- Good alternative to replace IA in graphics applications
 - AA has ability to handle correlations

- ▶ Introduced by Comba and Stolfi in SIBGRAPI'93
- ▶ Represents a quantity *z* with an *affine form*:

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$$

- ▶ Good alternative to replace IA in graphics applications
 - ▶ AA has ability to handle correlations
 - AA provides tighter interval estimative

- Introduced by Comba and Stolfi in SIBGRAPI'93
- ▶ Represents a quantity *z* with an *affine form*:

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$$

- Good alternative to replace IA in graphics applications
 - AA has ability to handle correlations
 - AA provides tighter interval estimative
 - AA provides additional geometric information

- Introduced by Comba and Stolfi in SIBGRAPI'93
- ▶ Represents a quantity *z* with an *affine form*:

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$$

- Good alternative to replace IA in graphics applications
 - AA has ability to handle correlations
 - AA provides tighter interval estimative
 - AA provides additional geometric information
 - ► Good AA libraries in C/C++ available

AA Operations

► Affine operations

► Affine operations

$$\hat{x} \pm \hat{y} = (x_0 \pm y_0) + (x_1 \pm y_1)\varepsilon_1 + \cdots + (x_n \pm y_n)\varepsilon_n$$

► Affine operations

- $\hat{x} \pm \hat{y} = (x_0 \pm y_0) + (x_1 \pm y_1)\varepsilon_1 + \cdots + (x_n \pm y_n)\varepsilon_n$
- $\qquad \alpha \widehat{x} = (\alpha x_0) + (\alpha x_1)\varepsilon_1 + \dots + (\alpha x_n)\varepsilon_n, \text{ with } \alpha \in \mathbb{R}$

Affine operations

$$\hat{x} \pm \hat{y} = (x_0 \pm y_0) + (x_1 \pm y_1)\varepsilon_1 + \cdots + (x_n \pm y_n)\varepsilon_n$$

$$\hat{x} \pm \beta = (x_0 \pm \beta) + x_1 \varepsilon_1 + \dots + x_n \varepsilon_n$$
, with $\beta \in \mathbb{R}$

Affine operations

$$\hat{x} \pm \hat{y} = (x_0 \pm y_0) + (x_1 \pm y_1)\varepsilon_1 + \cdots + (x_n \pm y_n)\varepsilon_n$$

$$\hat{x} \pm \beta = (x_0 \pm \beta) + x_1 \varepsilon_1 + \dots + x_n \varepsilon_n$$
, with $\beta \in \mathbb{R}$

► We can compute arbitrary formulas on affine forms

- Affine operations
 - $\widehat{x} \pm \widehat{y} = (x_0 \pm y_0) + (x_1 \pm y_1)\varepsilon_1 + \cdots + (x_n \pm y_n)\varepsilon_n$

 - $\hat{x} \pm \beta = (x_0 \pm \beta) + x_1 \varepsilon_1 + \dots + x_n \varepsilon_n$, with $\beta \in \mathbb{R}$

- ► We can compute arbitrary formulas on affine forms
 - ▶ non-affine operations ⇒ minimax approximation

► AA algorithms can input and output intervals

- ► AA algorithms can input and output intervals
- ► AA form ⇒ IA form

- ► AA algorithms can input and output intervals
- ► AA form ⇒ IA form
 - $\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n$

- ► AA algorithms can input and output intervals
- ► AA form ⇒ IA form
 - $\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n \Rightarrow z \in [\hat{z}] := [z_0 \delta, z_0 + \delta]$ where $\delta = |z_1| + \dots + |z_n|$

- ► AA algorithms can input and output intervals
- ► AA form ⇒ IA form

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n \Rightarrow z \in [\hat{z}] := [z_0 - \delta, z_0 + \delta]$$
 where $\delta = |z_1| + \dots + |z_n|$

► IA form ⇒ AA form

- ► AA algorithms can input and output intervals
- ► AA form ⇒ IA form

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n \Rightarrow z \in [\hat{z}] := [z_0 - \delta, z_0 + \delta]$$
 where $\delta = |z_1| + \dots + |z_n|$

- ► IA form ⇒ AA form
 - $z \in [a, b]$

- ► AA algorithms can input and output intervals
- ► AA form ⇒ IA form
 - $\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2 + \dots + z_n \varepsilon_n \Rightarrow z \in [\hat{z}] := [z_0 \delta, z_0 + \delta]$ where $\delta = |z_1| + \dots + |z_n|$
- ► IA form ⇒ AA form
 - ▶ $z \in [a, b] \Rightarrow \hat{z} = z_0 + z_1 \varepsilon_1$ where $z_0 = (a + b)/2$ $z_1 = (b - a)/2$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \hat{x} = \hat{t} = 1 + \varepsilon_1$$

 $y \approx \hat{y} = (\hat{t})^2 = (1 + \varepsilon_1)^2$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \widehat{x} = \widehat{t} = 1 + \varepsilon_1$$

 $y \approx \widehat{y} = (\widehat{t})^2 = (1 + \varepsilon_1)^2$

$$\hat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \widehat{x} = \widehat{t} = 1 + \varepsilon_1$$

$$y \approx \widehat{y} = (\widehat{t})^2 = (1 + \varepsilon_1)^2$$

$$\widehat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

 $= 1 + 2\varepsilon_1 + (0.5 + 0.5\varepsilon_2)$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \widehat{x} = \widehat{t} = 1 + \varepsilon_1$$

$$y \approx \widehat{y} = (\widehat{t})^2 = (1 + \varepsilon_1)^2$$

$$\widehat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

$$= 1 + 2\varepsilon_1 + (0.5 + 0.5\varepsilon_2)$$

$$= 1.5 + 2\varepsilon_1 + 0.5\varepsilon_2$$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \widehat{x} = \widehat{t} = 1 + \varepsilon_1$$

$$y \approx \widehat{y} = (\widehat{t})^2 = (1 + \varepsilon_1)^2$$

$$\widehat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

$$= 1 + 2\varepsilon_1 + (0.5 + 0.5\varepsilon_2)$$

$$= 1.5 + 2\varepsilon_1 + 0.5\varepsilon_2$$

$$= 1.5 + 2\varepsilon_1 \pm 0.5$$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \widehat{x} = \widehat{t} = 1 + \varepsilon_1$$

$$y \approx \widehat{y} = (\widehat{t})^2 = (1 + \varepsilon_1)^2$$

$$\widehat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

$$= 1 + 2\varepsilon_1 + (0.5 + 0.5\varepsilon_2)$$

$$= 1.5 + 2\varepsilon_1 + 0.5\varepsilon_2$$

$$= 1.5 + 2\varepsilon_1 \pm 0.5$$

Replacing ε_1 by x-1:

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \hat{x} = \hat{t} = 1 + \varepsilon_1$$

$$y \approx \hat{y} = (\hat{t})^2 = (1 + \varepsilon_1)^2$$

$$\hat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

$$= 1 + 2\varepsilon_1 + (0.5 + 0.5\varepsilon_2)$$

$$= 1.5 + 2\varepsilon_1 + 0.5\varepsilon_2$$

$$= 1.5 + 2\varepsilon_1 \pm 0.5$$

Replacing
$$\varepsilon_1$$
 by $x-1$:
 $r: y = 2x$
 $s: y = 2x - 1$

curve:
$$\gamma(t) = (t, t^2)$$
 with $t \in [0, 2]$

$$x \approx \hat{x} = \hat{t} = 1 + \varepsilon_1$$

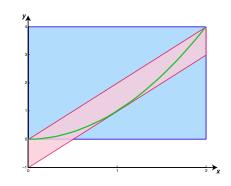
$$y \approx \hat{y} = (\hat{t})^2 = (1 + \varepsilon_1)^2$$

$$\hat{y} = 1 + 2\varepsilon_1 + (\varepsilon_1)^2$$

$$= 1 + 2\varepsilon_1 + (0.5 + 0.5\varepsilon_2)$$

$$= 1.5 + 2\varepsilon_1 + 0.5\varepsilon_2$$

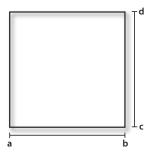
$$= 1.5 + 2\varepsilon_1 \pm 0.5$$

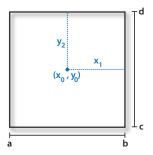


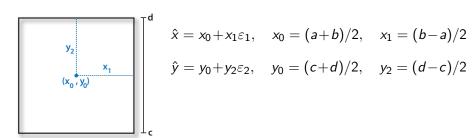
Replacing ε_1 by x-1:

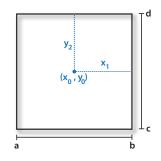
$$r: y = 2x$$
$$s: v = 2x - 1$$

On axis-aligned rectangles:









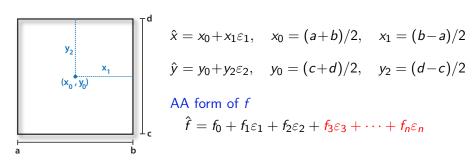
$$\hat{x} = x_0 + x_1 \varepsilon_1, \quad x_0 = (a+b)/2, \quad x_1 = (b-a)/2$$

$$\hat{y} = y_0 + y_2 \varepsilon_2, \quad y_0 = (c+d)/2, \quad y_2 = (d-c)/2$$
AA form of f

$$\hat{f} = f_0 + f_1 \varepsilon_1 + f_2 \varepsilon_2 + f_3 \varepsilon_3 + \dots + f_n \varepsilon_n$$

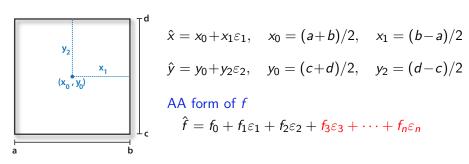
$$\hat{f} = f_0 + f_1 \varepsilon_1 + f_2 \varepsilon_2 + f_3 \varepsilon_3 + \dots + f_n \varepsilon$$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



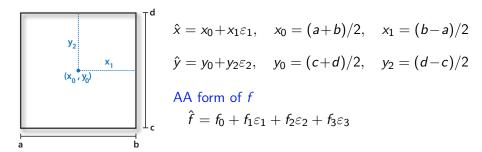
 $\varepsilon_3, \ldots, \varepsilon_n$ are noise symbols related to non-affine operations

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



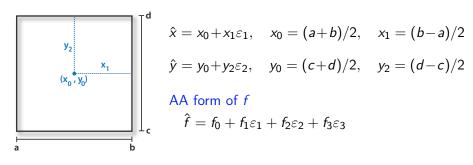
higher-order terms can be condensed \Rightarrow $f_3 = |f_3| + \cdots + |f_n|$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



higher-order terms can be condensed \Rightarrow $f_3 = |f_3| + \cdots + |f_n|$

On axis-aligned rectangles: we need to evaluate $f(\square)$ with AA



$$\hat{x} = x_0 + x_1 \varepsilon_1, \quad x_0 = (a+b)/2, \quad x_1 = (b-a)/2$$

$$\hat{y} = y_0 + y_2 \varepsilon_2, \quad y_0 = (c+d)/2, \quad y_2 = (d-c)/2$$

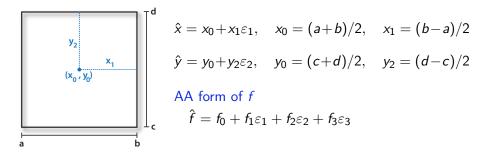
AA form of
$$f$$

$$\hat{f} = f_0 + f_1 \varepsilon_1 + f_2 \varepsilon_2 + f_3 \varepsilon_3$$

Spatial criteria

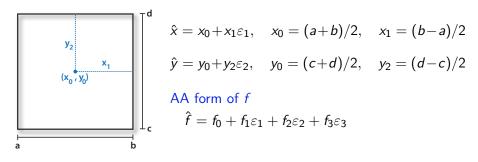
$$0 \notin [\hat{f}(\square)] \Rightarrow \mathtt{discard}(\square)$$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



Geometric bounds using the AA form of \hat{f}

On axis-aligned rectangles: we need to evaluate $f(\square)$ with AA



$$\hat{x} = x_0 + x_1 \varepsilon_1, \quad x_0 = (a+b)/2, \quad x_1 = (b-a)/2$$

$$y = y_0 + y_2 \varepsilon_2, \quad y_0 = (c+d)/2, \quad y_2 = (d-c)/2$$

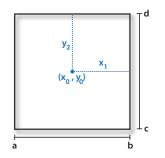
$$\hat{f} = f_0 + f_1 \varepsilon_1 + f_2 \varepsilon_2 + f_3 \varepsilon_3$$

Geometric bounds using the AA form of \hat{f}

the graph of z = f(x, y) over \square is sandwiched between the planes:

$$z = f_0 + f_1 \varepsilon_1 + f_2 \varepsilon_2 \pm f_3$$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



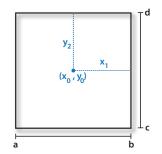
$$\varepsilon_1 = \frac{x - x_0}{x_1} \qquad \varepsilon_2 = \frac{y - y_0}{y_2}$$

Geometric bounds using the AA form of \hat{f}

the graph of z = f(x, y) over \square is sandwiched between the planes:

$$z = f_0 + f_1 \underline{\varepsilon_1} + f_2 \underline{\varepsilon_2} \pm f_3$$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



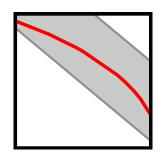
$$\varepsilon_1 = \frac{x - x_0}{x_1} \qquad \varepsilon_2 = \frac{y - y_0}{y_2}$$

Geometric bounds using the AA form of \hat{f}

z in cartesian coordinates:

$$z = f_0 + \frac{f_1}{x_1}(x - x_0) + \frac{f_2}{y_2}(y - y_0) \pm f_3$$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



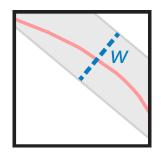
$$\varepsilon_1 = \frac{x - x_0}{x_1} \qquad \varepsilon_2 = \frac{y - y_0}{y_2}$$

Geometric bounds using the AA form of \hat{f}

f is zero inside the strip defined by the two parallel lines:

$$0 = f_0 + \frac{f_1}{x_1}(x - x_0) + \frac{f_2}{y_2}(y - y_0) \pm f_3$$

On axis-aligned rectangles: we need to evaluate $f(\Box)$ with AA



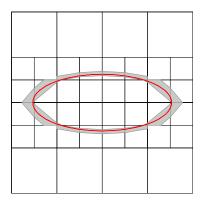
The width between the lines

$$w = \frac{2f_3}{\sqrt{\left(\frac{f_1}{x_1}\right)^2 + \left(\frac{f_2}{y_2}\right)^2}}$$

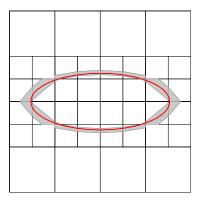
Geometric bounds using the AA form of \hat{f}

f is zero inside the strip defined by the two parallel lines:

$$0 = f_0 + \frac{f_1}{x_1}(x - x_0) + \frac{f_2}{y_2}(y - y_0) \pm f_3$$

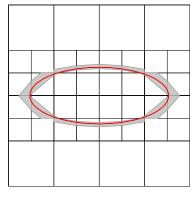


$$\frac{x^2}{6} + y^2 = 1$$



wide strips \Rightarrow high curvature

$$\frac{x^2}{6} + y^2 = 1$$



wide strips \Rightarrow high curvature

Geometric criteria

$$w > threshold \Rightarrow \mathtt{subdivide}(\square)$$

$$\frac{x^2}{6} + y^2 = 1$$

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

ightharpoonup requires the evaluation ∇f using IA and automatic differentiation

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

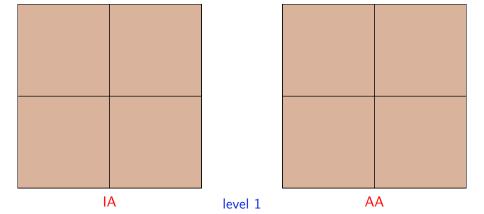
IA

level 0

AA

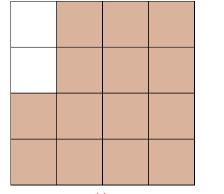
Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

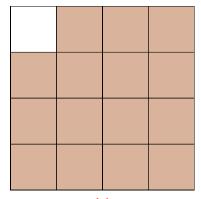
- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree



Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

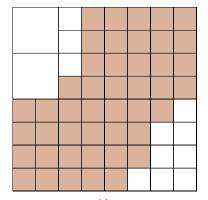


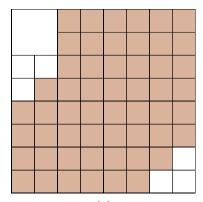


IA level 2 AA

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

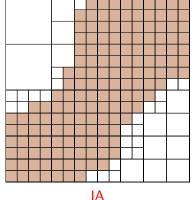


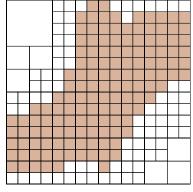


IA level 3 AA

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree



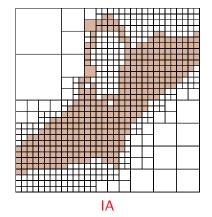


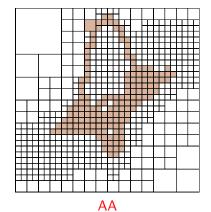
level 4

AA

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

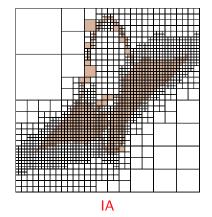


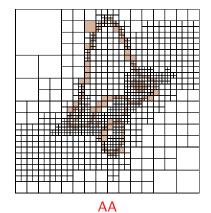


level 5

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

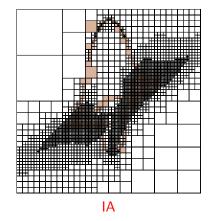


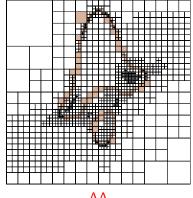


level 6

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- \triangleright requires the evaluation ∇f using IA and automatic differentiation
- adaptive quadtree



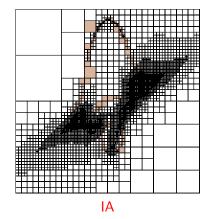


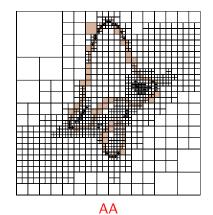
level 7

AA

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

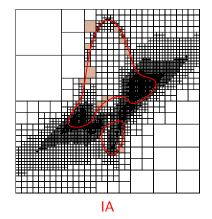


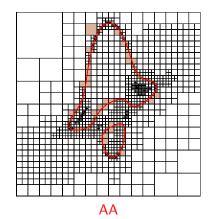


level 8

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree

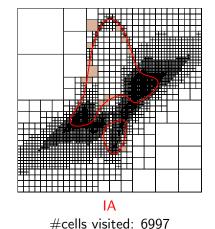




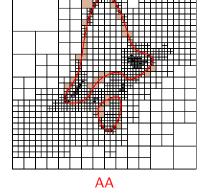
level 8

Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree



level 8



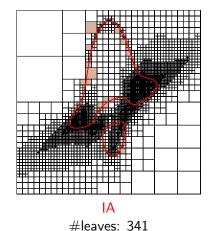
#cells visited: 1697

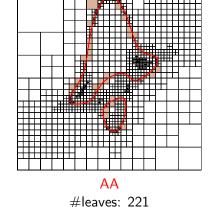
Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

lacktriangleright requires the evaluation abla f using IA and automatic differentiation

level 8

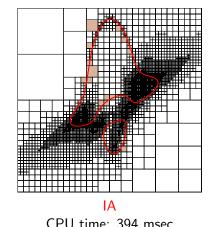
adaptive quadtree





Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

- lacktriangleright requires the evaluation abla f using IA and automatic differentiation
- adaptive quadtree



level 8

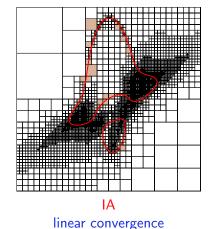
AA CPU time: 139 msec

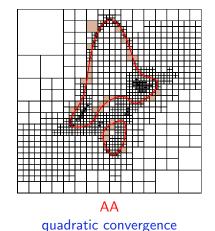
Comparing with IA: method proposed by Lopes et al. in SIBGRAPI 2001

lacktriangleright requires the evaluation abla f using IA and automatic differentiation

level 8

adaptive quadtree

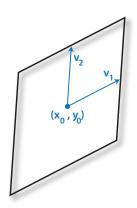




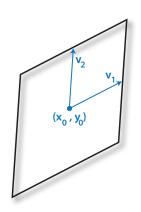
On parallelograms:

On parallelograms:

On parallelograms:

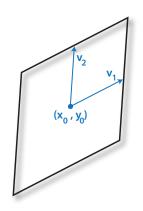


On parallelograms:



$$v_1 = (x_1, y_1)$$
 $v_2 = (x_2, y_2)$

On parallelograms:

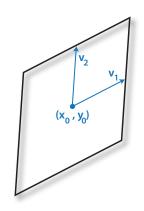


$$v_1 = (x_1, y_1)$$
 $v_2 = (x_2, y_2)$

$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$
 $\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$

On parallelograms:

evaluate $f(\lozenge)$ with AA \Rightarrow write ε_1 and ε_2 in terms of x and y



$$v_1 = (x_1, y_1)$$
 $v_2 = (x_2, y_2)$

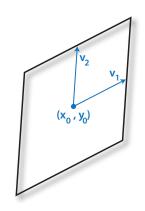
$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$
 $\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$

In matrix form

$$\left[\begin{array}{c} x \\ y \end{array}\right] = \left[\begin{array}{c} x_0 \\ y_0 \end{array}\right] + \left[\begin{array}{cc} x_1 & x_2 \\ y_1 & y_2 \end{array}\right] \cdot \left[\begin{array}{c} \varepsilon_1 \\ \varepsilon_2 \end{array}\right]$$

On parallelograms:

evaluate $f(\lozenge)$ with AA \Rightarrow write ε_1 and ε_2 in terms of x and y



$$v_1 = (x_1, y_1)$$
 $v_2 = (x_2, y_2)$

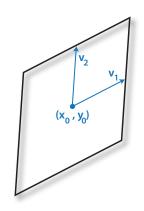
$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$
 $\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$

In matrix form

$$\begin{bmatrix} \varepsilon_1 \\ \varepsilon_2 \end{bmatrix} = \begin{bmatrix} x_1 & x_2 \\ y_1 & y_2 \end{bmatrix}^{-1} \cdot \begin{bmatrix} x - x_0 \\ y - y_0 \end{bmatrix}$$

On parallelograms:

evaluate $f(\lozenge)$ with AA \Rightarrow write ε_1 and ε_2 in terms of x and y



$$v_1 = (x_1, y_1)$$
 $v_2 = (x_2, y_2)$

$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$
 $\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$

In matrix form

$$\left[\begin{array}{c} \varepsilon_1 \\ \varepsilon_2 \end{array}\right] = \left[\begin{array}{cc} x_1 & x_2 \\ y_1 & y_2 \end{array}\right]^{-1} \cdot \left[\begin{array}{c} x - x_0 \\ y - y_0 \end{array}\right]$$

the matrix is invertible \iff the parallelogram is not degenerate

On triangles:

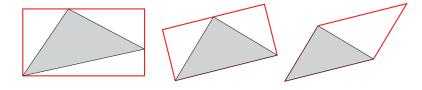
On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

▶ include a triangle into a parallelogram

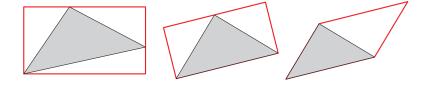
On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

► include a triangle into a parallelogram



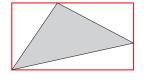
On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

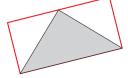
- ► include a triangle into a parallelogram
 - evaluate f outside of its domain

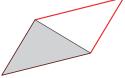


On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

- ► include a triangle into a parallelogram
 - evaluate f outside of its domain
 - it does not work for surfaces

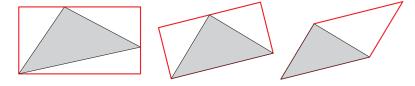






On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

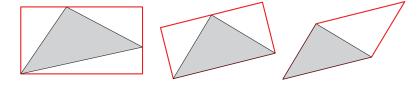
- ► include a triangle into a parallelogram
 - evaluate f outside of its domain
 - it does not work for surfaces



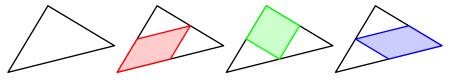
split a triangle in three parallelograms

On triangles: replace the evaluation of $f(\triangle) \Rightarrow f(\lozenge)$ with AA

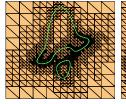
- ▶ include a triangle into a parallelogram
 - evaluate f outside of its domain
 - it does not work for surfaces

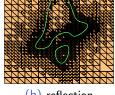


split a triangle in three parallelograms

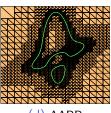


Bounding Implicit Curves with Strips on \triangle









(a) decomposition

(b) reflection

(c) smallest BB

(d) AABB

strategy	time	output	visited	leaves	AA	seg
а	33	1445	1805	250	4604	502
b	25	2909	3878	298	3878	298
С	28	3392	4522	318	4522	318
d	25	2882	3842	316	3842	316

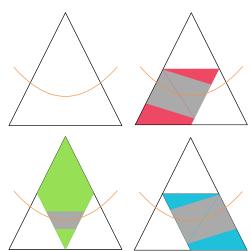
```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
        if w_i \leq \epsilon_{user}, for all i then
            Approximate (\triangle)
        else
            \triangle_i \leftarrow Subdivide(\triangle)
            for each i, Explore(\triangle_i)
        end
    end
end
```

```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
        if w_i \leq \epsilon_{user}, for all i then
            Approximate(\triangle)
        else
            \triangle_i \leftarrow Subdivide(\triangle)
            for each i, Explore(\triangle_i)
        end
    end
end
```

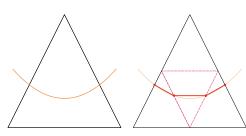
```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
        if w_i \leq \epsilon_{user}, for all i then
            Approximate(\triangle)
        else
            \triangle_i \leftarrow Subdivide(\triangle)
            for each i, Explore(\triangle_i)
        end
    end
end
```

```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
        if w_i \leq \epsilon_{user}, for all i then
            Approximate(\triangle)
        else
            \triangle_i \leftarrow Subdivide(\triangle)
            for each i, Explore(\triangle_i)
        end
    end
end
```

```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
        if w_i \leq \epsilon_{user}, for all i then
            Approximate(\triangle)
        else
            \triangle_i \leftarrow Subdivide(\triangle)
            for each i, Explore(\triangle_i)
        end
    end
end
```

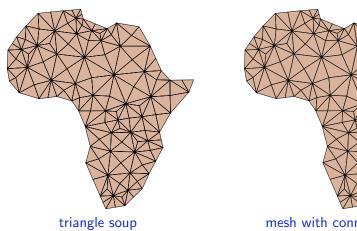


```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
        if w_i \leq \epsilon_{user}, for all i then
            Approximate(\triangle)
        else
            \triangle_i \leftarrow Subdivide(\triangle)
            for each i, Explore(\triangle_i)
        end
    end
end
```

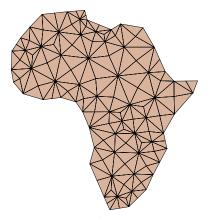


```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
       if w_i \leq \epsilon_{user}, for all i then
           Approximate(\triangle)
       else
           \triangle_i \leftarrow Subdivide(\triangle)
           for each i, Explore(\triangle_i)
       end
    end
end
                                                            linear interpolation bissection method
```

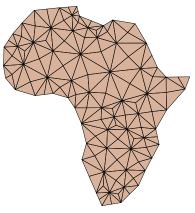
```
procedure Explore(\triangle)
    \Diamond_1, \Diamond_2, \Diamond_3 \leftarrow Parallelograms(\triangle)
    \hat{f}_i \leftarrow f(\lozenge_i) with AA
   if 0 \in [\hat{f}_i] for some i then
        w_i \leftarrow \text{width of } \hat{f} \text{ in } \Diamond_i
       if w_i \leq \epsilon_{user}, for all i then
           Approximate(\triangle)
       else
           \triangle_i \leftarrow Subdivide(\triangle)
           for each i, Explore(\triangle_i)
       end
    end
end
                                                            linear interpolation bissection method
```



mesh with connecticity

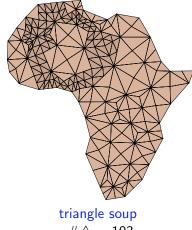


triangle soup midpoint splitting

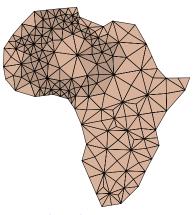


mesh with connecticity $\sqrt{3}$, J_1^a , 4-8 meshes, ...

Our method does not care what mesh subdivision method is used

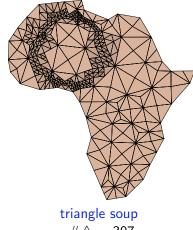


 $\#\triangle=193$

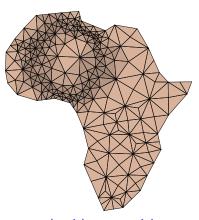


mesh with connecticity $\#\triangle=193$

Our method does not care what mesh subdivision method is used

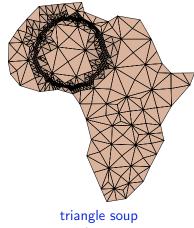


 $\# \triangle = 307$

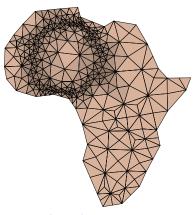


mesh with connecticity $\#\triangle=325$

Our method does not care what mesh subdivision method is used

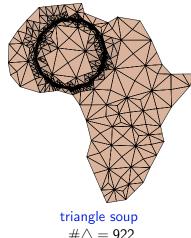


 $\#\triangle=512$

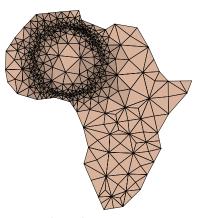


mesh with connecticity $\#\triangle=427$

Our method does not care what mesh subdivision method is used

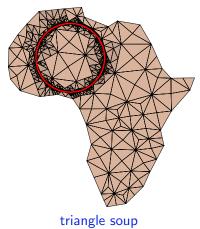


 $\#\triangle = 922$

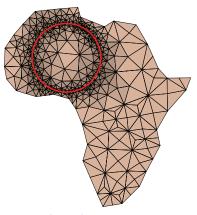


mesh with connecticity $\#\triangle = 574$

Our method does not care what mesh subdivision method is used

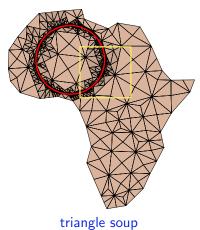


triangle soup $\#\triangle = 1384$

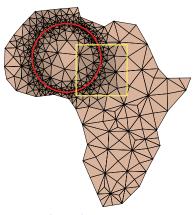


 $\begin{array}{c} \text{mesh with connecticity} \\ \#\triangle = 779 \end{array}$

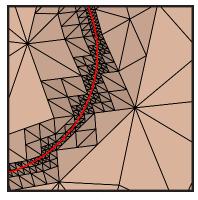
Our method does not care what mesh subdivision method is used



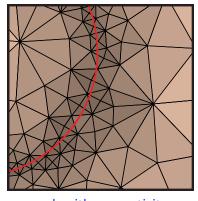
triangle soup $\#\triangle = 1384$



mesh with connecticity $\#\triangle = 779$

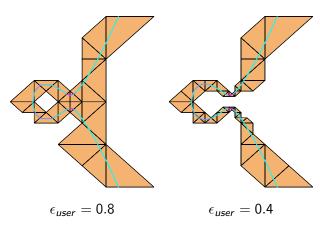


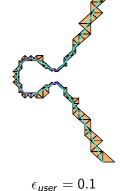
triangle soup $\#\triangle = 1384$



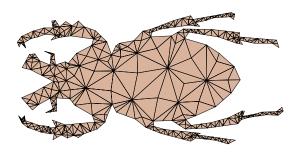
mesh with connecticity $\#\triangle = 779$

The effect of the geometric criteria on the curve in a triangular quadtree

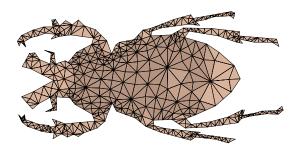




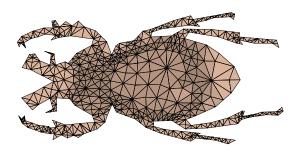
$$y^2 - x^3 + x = 0.5$$



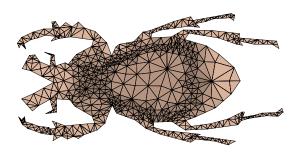
$$(x+1)^3(1-x)-4y^4=0$$



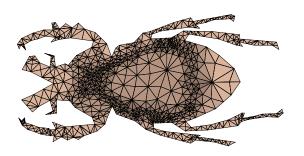
$$(x+1)^3(1-x)-4y^4=0$$



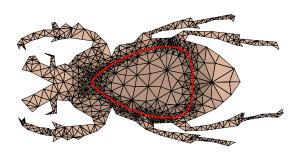
$$(x+1)^3(1-x)-4y^4=0$$



$$(x+1)^3(1-x)-4y^4=0$$



$$(x+1)^3(1-x)-4y^4=0$$



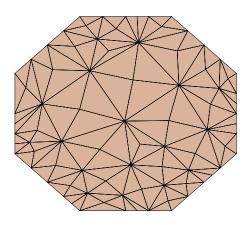
level 4

$$\# \triangle_{\it in} = 940$$

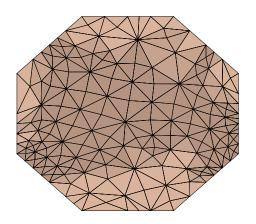
 $\# \triangle_{\it out} = 1771$

 $\mathsf{CPU}\ \mathsf{time} = \mathsf{280}\ \mathsf{msec}$

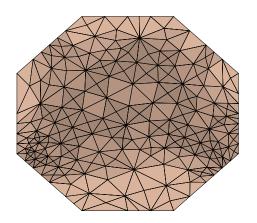
$$(x+1)^3(1-x)-4y^4=0$$



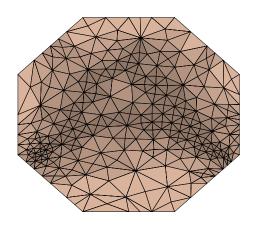
$$y^{2}(0.75^{2} - x^{2}) - (x^{2} + 1.5y - 0.75^{2})^{2} = 0$$



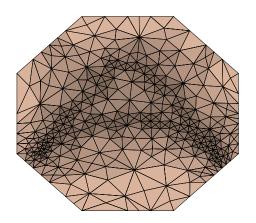
$$y^{2}(0.75^{2}-x^{2})-(x^{2}+1.5y-0.75^{2})^{2}=0$$



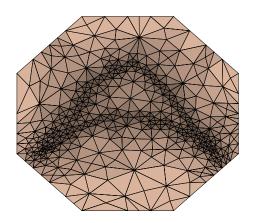
$$y^{2}(0.75^{2} - x^{2}) - (x^{2} + 1.5y - 0.75^{2})^{2} = 0$$



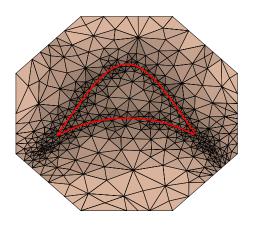
$$y^{2}(0.75^{2}-x^{2})-(x^{2}+1.5y-0.75^{2})^{2}=0$$



$$y^{2}(0.75^{2} - x^{2}) - (x^{2} + 1.5y - 0.75^{2})^{2} = 0$$



$$y^{2}(0.75^{2} - x^{2}) - (x^{2} + 1.5y - 0.75^{2})^{2} = 0$$

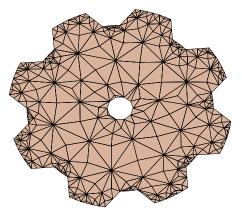


level 5

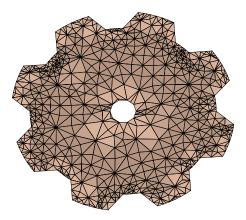
$$\begin{aligned} \#\triangle_{\textit{in}} &= 126 \\ \#\triangle_{\textit{out}} &= 1168 \end{aligned}$$

 $\mathsf{CPU}\ \mathsf{time} = 123\ \mathsf{msec}$

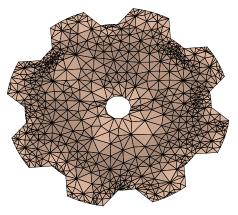
$$y^{2}(0.75^{2} - x^{2}) - (x^{2} + 1.5y - 0.75^{2})^{2} = 0$$



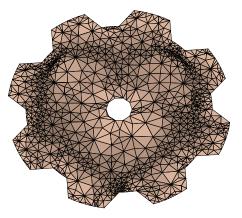
$$(x^2 + y^2 - 1)^3 - x^2y^3 = 0$$



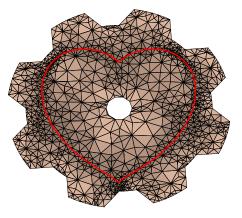
$$(x^2 + y^2 - 1)^3 - x^2y^3 = 0$$



$$(x^2 + y^2 - 1)^3 - x^2y^3 = 0$$



$$(x^2 + y^2 - 1)^3 - x^2y^3 = 0$$



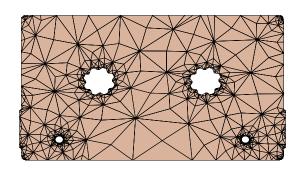
level 3

$$\#\triangle_{\textit{in}} = 1424$$

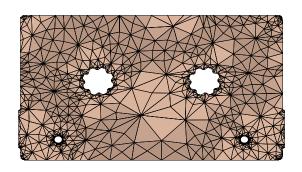
$$\#\triangle_{\textit{out}} = 3298$$

CPU time = 547 msec

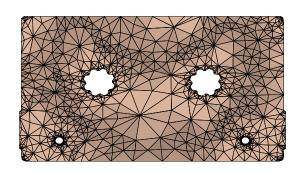
$$(x^2 + y^2 - 1)^3 - x^2y^3 = 0$$



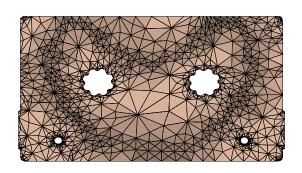
$$(y-x^2+1)^4+(x^2+y^2)^4-1=0$$



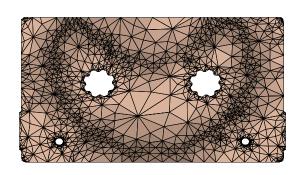
$$(y-x^2+1)^4+(x^2+y^2)^4-1=0$$



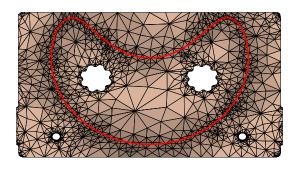
$$(y-x^2+1)^4+(x^2+y^2)^4-1=0$$



$$(y-x^2+1)^4+(x^2+y^2)^4-1=0$$



$$(y-x^2+1)^4+(x^2+y^2)^4-1=0$$



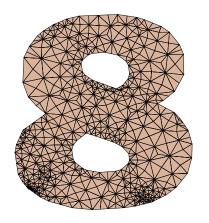
level 4

$$\# \triangle_{\textit{in}} = 1006$$

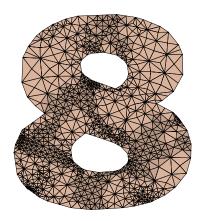
 $\# \triangle_{\textit{out}} = 2134$

 $\mathsf{CPU}\ \mathsf{time} = \mathsf{391}\ \mathsf{msec}$

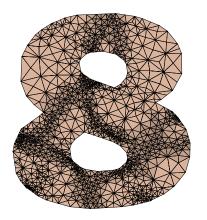
$$(y-x^2+1)^4+(x^2+y^2)^4-1=0$$



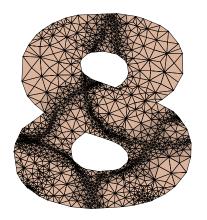
$$(xy + \cos(x + y))(xy + \sin(x + y)) = 0$$



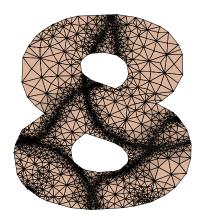
$$(xy + \cos(x + y))(xy + \sin(x + y)) = 0$$



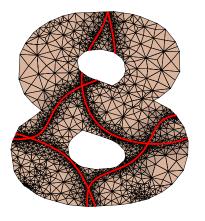
$$(xy + \cos(x + y))(xy + \sin(x + y)) = 0$$



$$(xy + \cos(x + y))(xy + \sin(x + y)) = 0$$



$$(xy + \cos(x + y))(xy + \sin(x + y)) = 0$$



level 4

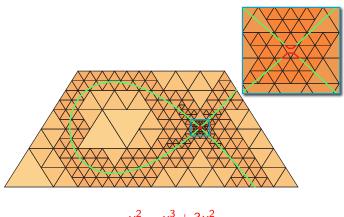
$$\#\triangle_{\textit{in}} = 1032$$

$$\#\triangle_{\textit{out}} = 3897$$

 $\mathsf{CPU}\ \mathsf{time} = \mathsf{454}\ \mathsf{msec}$

$$(xy + \cos(x + y))(xy + \sin(x + y)) = 0$$

Our method detects the non-manifold region...



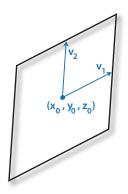
$$y^2 = x^3 + 3x^2$$

...even when the singularity is not recovered!

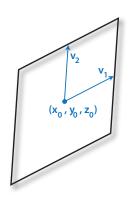
On parallelograms in 3D:

On parallelograms in 3D:

On parallelograms in 3D:

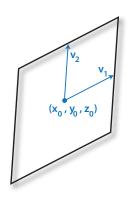


On parallelograms in 3D:



$$v_1 = (x_1, y_1, z_1)$$
 $v_2 = (x_2, y_2, z_2)$

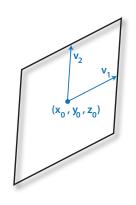
On parallelograms in 3D:



$$v_1 = (x_1, y_1, z_1)$$
 $v_2 = (x_2, y_2, z_2)$
 $\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$
 $\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$
 $\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2$

On parallelograms in 3D:

evaluate $f(\lozenge)$ with AA \Rightarrow write ε_1 and ε_2 in terms of x, y and z



$$v_1 = (x_1, y_1, z_1) v_2 = (x_2, y_2, z_2)$$

$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$

$$\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$$

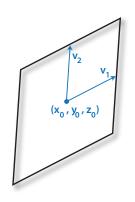
$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2$$

In matrix form

$$\begin{bmatrix} x \\ y \\ z \end{bmatrix} = \begin{bmatrix} x_0 \\ y_0 \\ z_0 \end{bmatrix} + \begin{bmatrix} x_1 & x_2 \\ y_1 & y_2 \\ z_1 & z_2 \end{bmatrix} \cdot \begin{bmatrix} \varepsilon_1 \\ \varepsilon_2 \end{bmatrix}$$

On parallelograms in 3D:

evaluate $f(\lozenge)$ with AA \Rightarrow write ε_1 and ε_2 in terms of x, y and z



$$v_1 = (x_1, y_1, z_1) v_2 = (x_2, y_2, z_2)$$

$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$

$$\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$$

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2$$

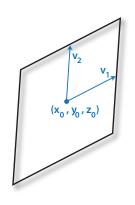
In matrix form

$$\begin{bmatrix} \varepsilon_1 \\ \varepsilon_2 \end{bmatrix} = \begin{bmatrix} x_1 & x_2 \\ y_1 & y_2 \\ z_1 & z_2 \end{bmatrix}^+ \cdot \begin{bmatrix} x - x_0 \\ y - y_0 \\ z - z_0 \end{bmatrix}$$

 $\mathbf{B}^+ = (\mathbf{B}^{\mathsf{T}}\mathbf{B})^{-1}\mathbf{B}^{\mathsf{T}}$ is the pseudoinverse of a matrix \mathbf{B}

On parallelograms in 3D:

evaluate $f(\lozenge)$ with AA \Rightarrow write ε_1 and ε_2 in terms of x, y and z



$$v_1 = (x_1, y_1, z_1) v_2 = (x_2, y_2, z_2)$$

$$\hat{x} = x_0 + x_1 \varepsilon_1 + x_2 \varepsilon_2$$

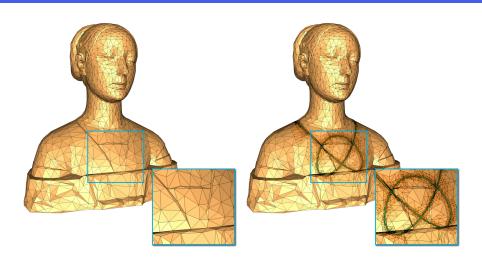
$$\hat{y} = y_0 + y_1 \varepsilon_1 + y_2 \varepsilon_2$$

$$\hat{z} = z_0 + z_1 \varepsilon_1 + z_2 \varepsilon_2$$

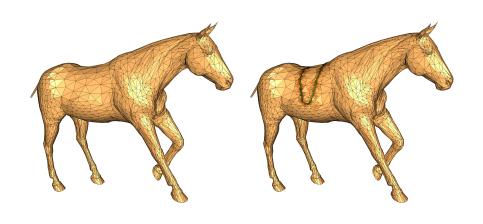
In matrix form

$$\begin{bmatrix} \varepsilon_1 \\ \varepsilon_2 \end{bmatrix} = \begin{bmatrix} x_1 & x_2 \\ y_1 & y_2 \\ z_1 & z_2 \end{bmatrix}^+ \cdot \begin{bmatrix} x - x_0 \\ y - y_0 \\ z - z_0 \end{bmatrix}$$

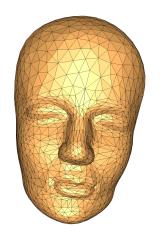
the matrix has full rank \iff the parallelogram is not degenerate

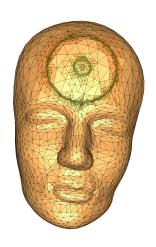


$$y^2(3+2y) - (x^2-1)^2 = 0$$

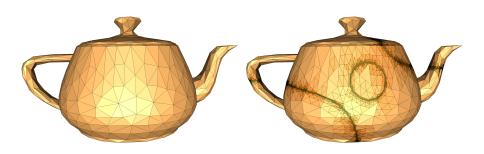


$$x^2 - 48y^2 = 8z = 0$$

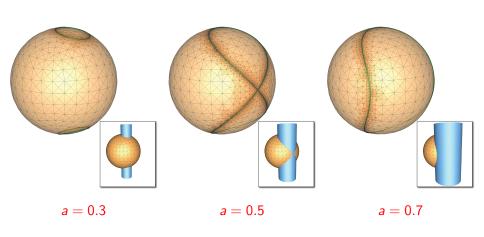




$$xy^2(1-\sqrt{xy^2}) = 0.04$$



$$(xy-2)(x^2+y^2-1)=0$$

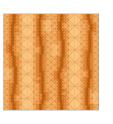


$$(x-a)^2 + y^2 = a^2$$

Results: implicit × parametric









hyperboloid given implicitly by
$$x^2 - y^2 - z^2 = 1$$

Klein bottle given parametrically by

$$x(u, v) = (2.7 + \cos(u)\sin(v) - \sin(u)\sin(2v))\cos(u),$$

$$y(u, v) = (2.7 + \cos(u)\sin(v) - \sin(u)\sin(2v))\sin(u),$$

$$z(u, v) = \sin(u)\sin(v) + \cos(u)\sin(2v),$$

Approximating Implicit Curves on Plane and Surface Triangulations with Affine Arithmetic





Questions?

Thanks!