

# Fast high-resolution drawing of algebraic curves and surfaces

Nuwan Herath Mudiyansele

Thesis supervised by Guillaume Moroz and Marc Pouget

Université de Lorraine, CNRS, Inria, LORIA, Nancy, France

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# Overview

- 1 Implicit curve drawing
- 2 Previous work
- 3 Our approach
- 4 Fast multipoint evaluation
- 5 Algorithms
- 6 Experiments

Implicit curve drawing

# Scientific visualization

Some scientific visualization applications:

- modeling
- medical imaging
- mechanism design

Goal: build an intuition and get an understanding of the data



3D CT reconstruction of distal tibia fracture



Industrial robots from KUKA by Mixabest  
(CC BY-SA 3.0)

# Implicit curve drawing problem

## General problem

Discrete representation of an implicit curve on a fixed grid

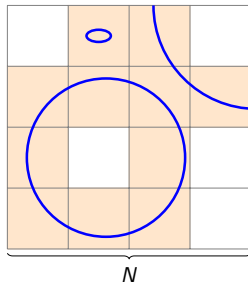
- **Input:**

- ▶ function  $F$
- ▶ resolution  $N$
- ▶ visualization window

Implicit curve defined as the solution set

$$\{(x, y) \in \mathbb{R}^2 \mid F(x, y) = 0\}$$

- **Output:** drawing (set of pixels)



# Implicit curve drawing problem

Our focus

Discrete representation of an **algebraic curve** on a fixed grid

- **Input:**

- ▶ **bivariate polynomial**  $P$  of **partial degree**  $d$
- ▶ resolution  $N$
- ▶ **window**  $[-1, 1] \times [-1, 1]$

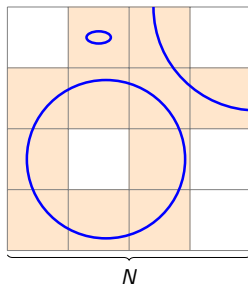
**Algebraic curve** defined as the solution set

$$\{(x, y) \in \mathbb{R}^2 \mid P(x, y) = 0\}$$

- **Output:** drawing (set of pixels)

*Goal:* fast high-resolution drawing of high degree algebraic curves

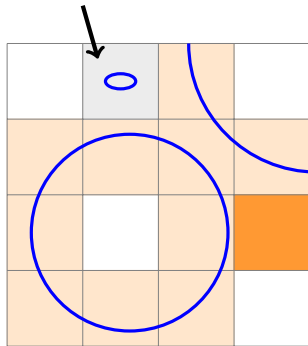
- $d \approx 100 \quad \longrightarrow \quad d^2 \approx 10,000$  monomials
- $N \approx 1,000$



## Correctness of the drawing

For numerical reasons, there may be some:

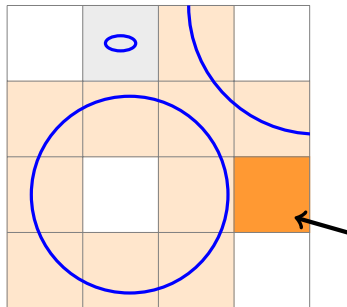
- **False negative** pixels



## Correctness of the drawing

For numerical reasons, there may be some:

- **False negative** pixels
- **False positive** pixels





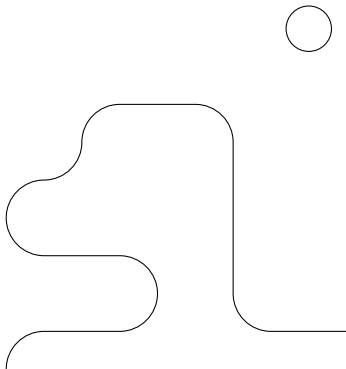
Previous work

# Marching squares

## The idea

2D variant of the widely used marching cubes algorithm [Lorensen & Cline, 1987]

Implicit curve defined by  $P(X, Y) = 0$





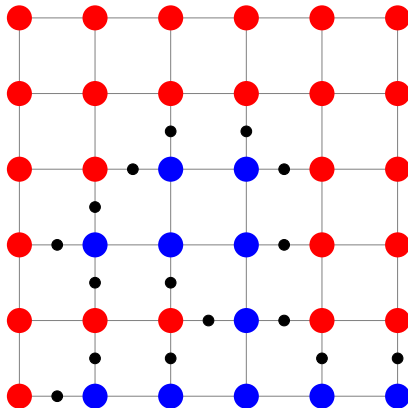


# Marching squares

## The idea

2D variant of the widely used marching cubes algorithm [Lorensen & Cline, 1987]

Implicit curve defined by  $P(X, Y) = 0$











# Marching squares

## Complexity

Complexity (number of elementary operations)

Naive evaluation

$$\theta(d^2 N^2)$$

$d$  partial degree

$N$  resolution of the grid

## Arithmetic complexity of the marching squares

With partial evaluation of  $P(x, y)$ , assuming  $d < N$

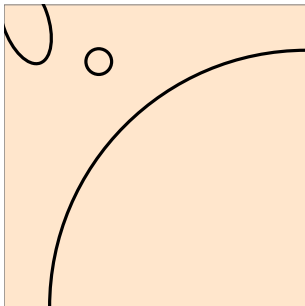
$$\theta(dN^2)$$

Slow for high resolutions. . .

Can we have an algorithm in  $O(dN)$ ?

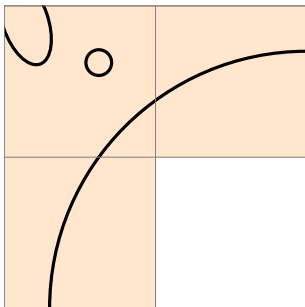
# Adaptive subdivision

Local refinements of the grid



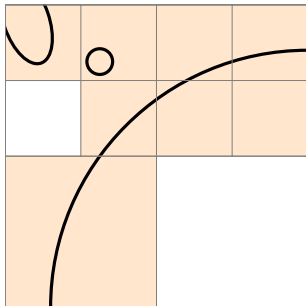
# Adaptive subdivision

Local refinements of the grid



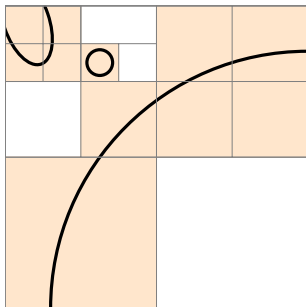
# Adaptive subdivision

Local refinements of the grid



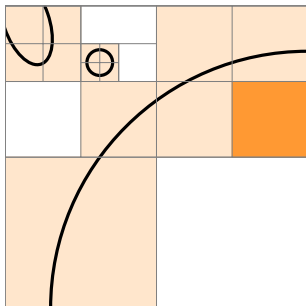
# Adaptive subdivision

Local refinements of the grid



# Adaptive subdivision

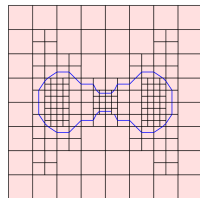
Local refinements of the grid



# Methods providing topological correctness

## Adaptive 2D subdivision with interval arithmetic

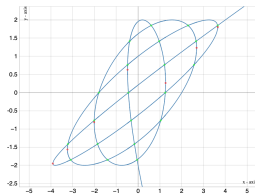
- [Snyder, 1992]
- [Plantinga & Vegter, 2004]
- [Burr et al., 2008]
- [Lin & Yap, 2011]
- ...



[Lin & Yap, 2011]

## Cylindrical algebraic decomposition (CAD)

- [Gonzalez-Vega & Necula, 2002]
- [Eigenwillig et al., 2007]
- [Alberti et al., 2008]
- [Cheng et al., 2009]
- [Kobel & Sagraloff, 2015]
- [Diatta et al., 2018]
- ...



<https://isotop.gamble.loria.fr/>

## Our approach



# A prerequisite

## Interval arithmetic

For  $I = [\underline{I}, \bar{I}]$  and  $J = [\underline{J}, \bar{J}]$ ,

- $I + J = [\underline{I} + \underline{J}, \bar{I} + \bar{J}]$
- $I - J = [\underline{I} - \bar{J}, \bar{I} - \underline{J}]$
- ...

# A prerequisite

## Interval arithmetic

For  $I = [\underline{I}, \bar{I}]$  and  $J = [\underline{J}, \bar{J}]$ ,

- $I + J = [\underline{I} + \underline{J}, \bar{I} + \bar{J}]$
- $I - J = [\underline{I} - \bar{J}, \bar{I} - \underline{J}]$
- ...

Evaluation of the function  $f(X) = X^2 - X = (X - 1)X$  on the interval  $[0, 2]$

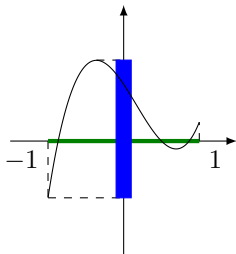
- $[0, 2]^2 - [0, 2] = [0, 4] - [0, 2] = [-2, 4]$
- $([0, 2] - 1) \cdot [0, 2] = [-1, 1] \cdot [0, 2] = [-2, 2]$

# Interval arithmetic

## Inclusion property

$$P(X) = 2X^3 - X^2 - 1.5X + 0.75$$

How to compute  $P(I)$  for  $I = [-1, 1]$ ?



$x$	-1	$x_1 = \frac{1-\sqrt{10}}{6}$	$x_2 = \frac{1+\sqrt{10}}{6}$	1		
$P'(x)$		+	0	-	0	+
$P(x)$	$P(-1)$	$P(x_1)$	$P(x_2)$	$P(1)$		

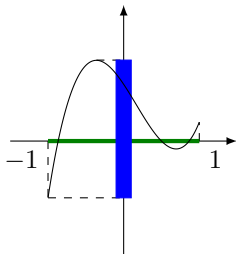
$$P(I) = [-0.75, 1.06 \dots]$$

# Interval arithmetic

## Inclusion property

$$P(X) = 2X^3 - X^2 - 1.5X + 0.75$$

How to compute  $P(I)$  for  $I = [-1, 1]$ ?



$$\begin{aligned}\square P(I) &= 2[-1, 1]^3 - [-1, 1]^2 - 1.5[-1, 1] + 0.75 \\ &= [-5.25, 5.25]\end{aligned}$$

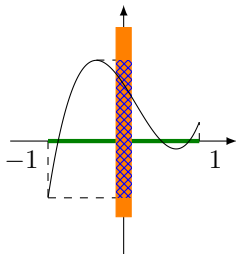
$$P(I) = [-0.75, 1.06\dots]$$

# Interval arithmetic

## Inclusion property

$$P(X) = 2X^3 - X^2 - 1.5X + 0.75$$

How to compute  $P(I)$  for  $I = [-1, 1]$ ?



$$P(I) = [-0.75, 1.06 \dots]$$

$$\begin{aligned}\square P(I) &= 2[-1, 1]^3 - [-1, 1]^2 - 1.5[-1, 1] + 0.75 \\ &= [-5.25, 5.25]\end{aligned}$$

With Horner's scheme:

$$\begin{aligned}\square P(I) &= ((2[-1, 1] - 1)[-1, 1] - 1.5)[-1, 1] + 0.75 \\ &= [-3.75, 5.25]\end{aligned}$$

$$P(I) \subseteq \square P(I)$$

# Interval arithmetic

Convergence property

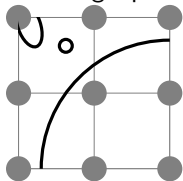
## Convergence at a point

With  $x \in [a, b]$

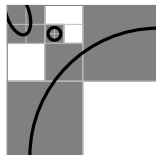
$$\lim_{[a,b] \rightarrow [x,x]=\{x\}} \square P([a, b]) = P(x)$$

# Our approach: guaranteed intersection with the grid

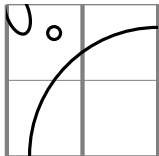
Marching squares



Adaptive subdivision



New approach: evaluation along fibers



⇒ Make it **fast** and provide **some guarantees**

# Two algorithms

## Edge drawing

- *evaluation in  $X$*   
Chebyshev nodes  
multipoint evaluation with IDCT
- *subdivision in  $Y$*   
naive root finding method

Guarantees

False positive and false negative pixels

## Pixel drawing

- *evaluation in  $X$*   
Chebyshev nodes  
multipoint evaluation with IDCT  
Taylor approximation
- *subdivision in  $Y$*   
naive root finding method

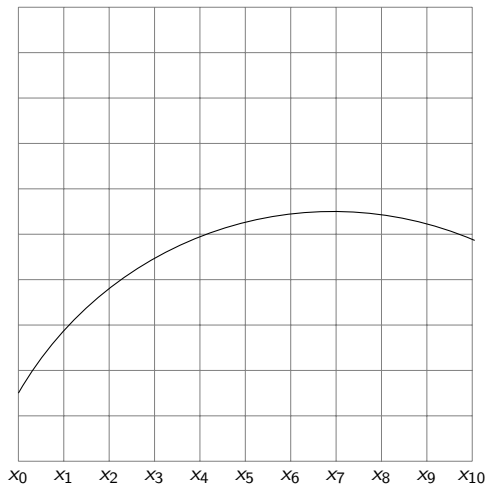
Guarantees

False positive pixels *only*



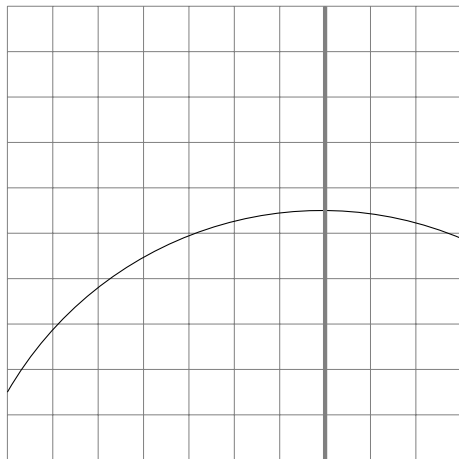
## Subdivisions along a fiber

$$P(x_k, Y) = \sum a_j Y^j$$



## Subdivisions along a fiber

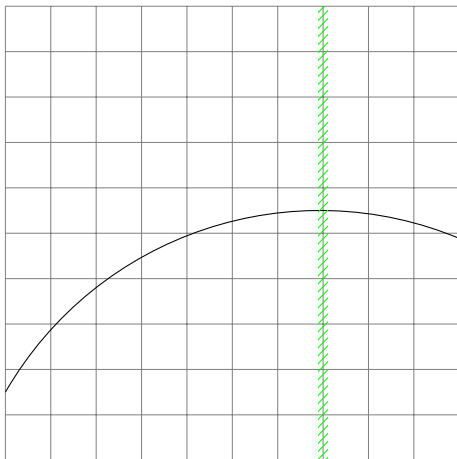
$$P(x_k, Y) = \sum a_j Y^j$$



$P(x_7, Y)$

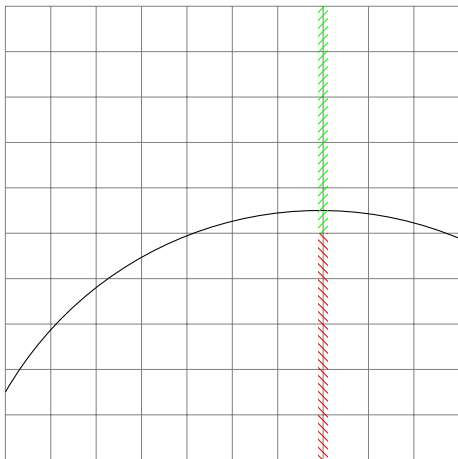
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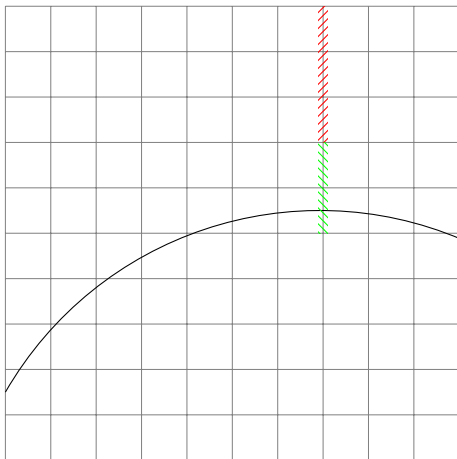
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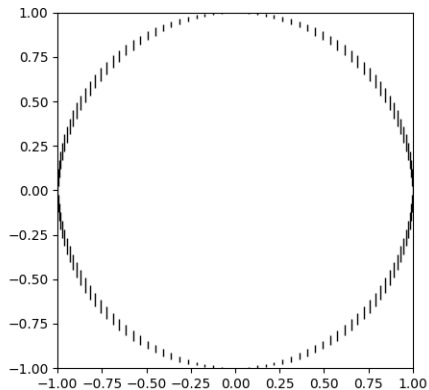


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✓

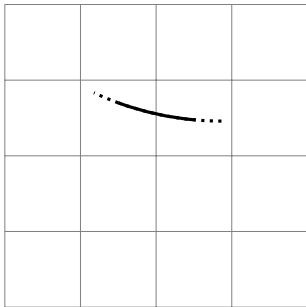
## An example

$$X^2 + Y^2 - 1 = 0$$



Resolution  $N = 64$

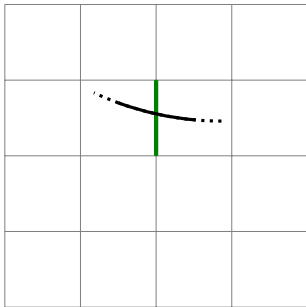
Pixel lighting  
Edge drawing



# Pixel lighting

## Edge drawing

- Detect a crossing between two consecutive nodes of the grid

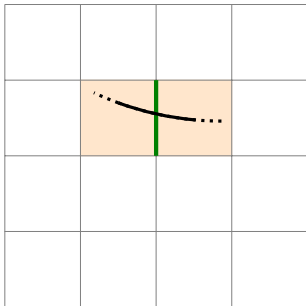




# Pixel lighting

## Edge drawing

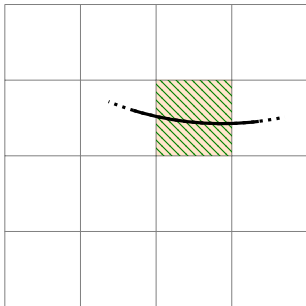
- Detect a crossing between two consecutive nodes of the grid
- Light the adjacent pixels



# Pixel lighting

## Pixel drawing

- Detect a crossing in pixel of the grid
- Light that pixel

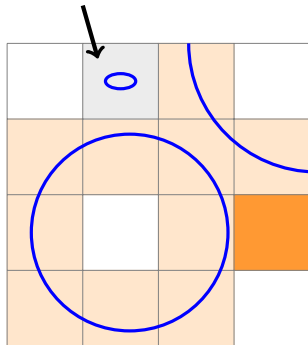


# False positive and false negative pixels

## Edge drawing

Some incorrect pixels:

- **False negative** when a connected component lies inside of a pixel



# False positive and false negative pixels

## Edge drawing

Some incorrect pixels:

- **False negative** when a connected component lies inside of a pixel
- **False positive** when the evaluation on an edge of a pixel is close to zero  
That occurs for a segment  $S$  when

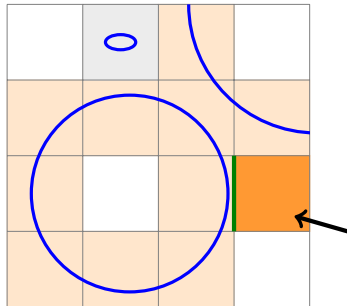
$$0 \in \square P(S) + [-E, E]$$

Certification of segments that are not crossed:

$$0 \notin \square P(S) + [-E, E]$$

⇓

$$0 \notin P(S)$$



# False positive and false negative pixels

## Pixel drawing

Some incorrect pixels:

- ~~False negative~~ when a connected component lies inside of a pixel
- **False positive** when the evaluation on an edge of a pixel is close to zero  
That occurs for a segment  $S$  when

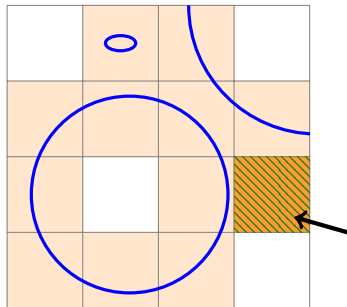
$$0 \in \square P(S) + [-E, E]$$

Certification of segments that are not crossed:

$$0 \notin \square P(S) + [-E, E]$$

$\Downarrow$

$$0 \notin P(S)$$



Fast multipoint evaluation

# A prerequisite to fast multipoint evaluation

## Chebyshev polynomials

### Definition

The Chebyshev polynomials  $(T_k)$  verify  $\forall k \in \mathbb{N}, T_k(\cos \theta) = \cos(k\theta)$

### The first three Chebyshev polynomials

$$\cos(0 \cdot \theta) = 1$$

$$\cos(1 \cdot \theta) = \cos(\theta)$$

$$\cos(2 \cdot \theta) = 2 \cos(\theta)^2 - 1$$

$$T_0 = 1$$

$$T_1 = X$$

$$T_2 = 2X^2 - 1$$

# A prerequisite to fast multipoint evaluation

Chebyshev polynomials

## Definition

The Chebyshev polynomials  $(T_k)$  verify  $\forall k \in \mathbb{N}, T_k(\cos \theta) = \cos(k\theta)$

## Lemma

*An arbitrary polynomial  $p$  of degree  $d$  can be written in terms of the Chebyshev polynomials:*

$$p(X) = \sum_{k=0}^d \alpha_k T_k(X)$$



# A prerequisite to fast multipoint evaluation

Chebyshev polynomials

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The Chebyshev polynomials ( $T_k$ ) verify  $\forall k \in \mathbb{N}, T_k(\cos \theta) = \cos(k\theta)$

## Lemma

*An arbitrary polynomial  $p$  of degree  $d$  can be written in terms of the Chebyshev polynomials:*

$$p(X) = \sum_{k=0}^d \alpha_k T_k(X)$$

## Lemma

*For  $N \in \mathbb{N}$ , a polynomial  $p$  of degree  $d$  can be evaluated on the Chebyshev nodes  $(c_n)_{0 \leq n \leq N-1}$  using the IDCT:*

$$(p(c_n))_{0 \leq n \leq N-1} = \frac{1}{2}(\alpha_0, \dots, \alpha_0) + \text{IDCT}((\alpha_k)_{0 \leq k \leq N-1})$$

# A prerequisite to fast multipoint evaluation

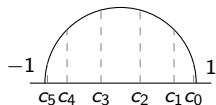
## Chebyshev nodes

### Definition

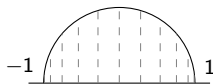
For  $N \in \mathbb{N}$ , the Chebyshev nodes are

$$c_n = \cos\left(\frac{2n+1}{2N}\pi\right), \quad n = 0, \dots, N-1$$

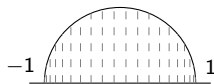
They are the roots of  $T_N$



$N = 6$



$N = 11$

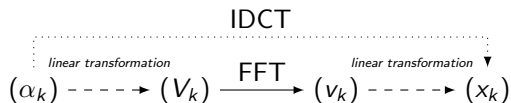


$N = 20$

# Inverse Discrete Cosine Transform

Inverse Discrete Cosine Transform (IDCT):  $\alpha_k \rightarrow x_n$

$$x_n = \frac{1}{2}\alpha_0 + \sum_{k=1}^{N-1} \alpha_k \cos \left[ \frac{\pi k(2n+1)}{2N} \right]$$



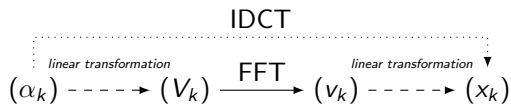
$\Rightarrow$  Fast thanks to the **Fast Fourier Transform (FFT)** algorithm in  $O(N \log_2 N)$

[Makhoul, 1980]

# Inverse Discrete Cosine Transform

Inverse Discrete Cosine Transform (IDCT):  $\alpha_k \rightarrow x_n$

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⇒ Fast thanks to the **Fast Fourier Transform (FFT)** algorithm in  $O(N \log_2 N)$

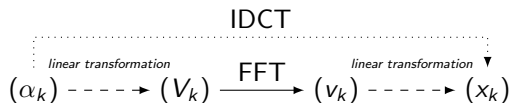
[Makhoul, 1980]

$$p(c_n) = \sum_{k=0}^{N-1} \alpha_k T_k \left( \cos \left( \frac{2n+1}{2N} \pi \right) \right)$$

# Inverse Discrete Cosine Transform

Inverse Discrete Cosine Transform (IDCT):  $\alpha_k \rightarrow x_n$

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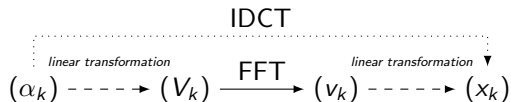
[Makhoul, 1980]

$$p(c_n) = \sum_{k=0}^{N-1} \alpha_k T_k \left( \cos \left( \frac{2n+1}{2N} \pi \right) \right) = \sum_{k=0}^{N-1} \alpha_k \cos \left[ \frac{\pi k(2n+1)}{2N} \right]$$

# Inverse Discrete Cosine Transform

Inverse Discrete Cosine Transform (IDCT):  $\alpha_k \rightarrow x_n$

$$x_n = \frac{1}{2}\alpha_0 + \sum_{k=1}^{N-1} \alpha_k \cos \left[ \frac{\pi k(2n+1)}{2N} \right]$$



⇒ Fast thanks to the **Fast Fourier Transform (FFT)** algorithm in  $O(N \log_2 N)$

[Makhoul, 1980]

$$p(c_n) = \frac{1}{2}\alpha_0 + \frac{1}{2}\alpha_0 + \sum_{k=1}^{N-1} \alpha_k \cos \left[ \frac{\pi k(2n+1)}{2N} \right]$$

$$(p(c_n))_{0 \leq n \leq N-1} = \frac{1}{2}(\alpha_0, \dots, \alpha_0) + \text{IDCT}((\alpha_k)_{0 \leq k \leq N-1})$$

# Error of the IDCT

[Makhoul, 1980] and [Brisebarre et al., 2020, Theorem 3.4] yield

## Theorem (H., Moroz, Pouget, 2022)

Assume radix-2, precision- $p$  arithmetic, with rounding unit  $u = 2^{-p}$ . Let  $\hat{x}$  be the computed  $2^n$ -point IDCT of  $\alpha \in \mathbb{C}^{2^n}$ , and let  $x$  be the exact value. Then

$$\|\hat{x} - x\|_\infty = n\|\alpha\|_\infty O(u).$$

Table: IDCT error bounds for  $p = 53$  (double precision)

$N = 2^n$	1,024	2,048	4,096	8,192	16,384	32,768
$\ \hat{x} - x\ _\infty / \ \alpha\ _\infty$	7.97e-15	8.84e-15	9.72e-15	1.06e-14	1.15e-14	1.23e-14

# Algorithms



## General idea: edge enclosure

Illustration

$$P(X, Y) = \sum \left( \sum a_{i,j} X^i \right) Y^j = \sum p_j(X) Y^j$$

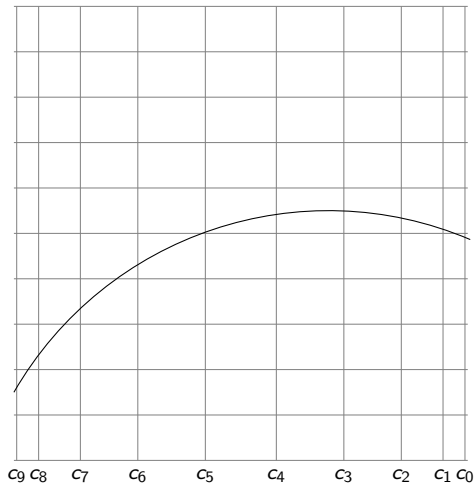
$$p_j(X) = \sum a_{i,j} X^i = \sum \alpha_{i,j} T_i(X)$$

$$(p_j(c_n))_{0 \leq n \leq N-1} = \frac{1}{2}(\alpha_{0,j}, \dots, \alpha_{0,j}) + \text{IDCT}((\alpha_{k,j})_{0 \leq k \leq N-1})$$

## General idea: edge enclosure

Illustration

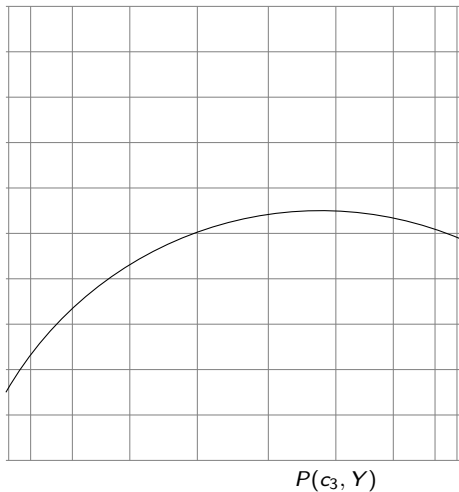
$$P(c_n, Y) = \sum p_j(c_n) Y^j$$



## General idea: edge enclosure

Illustration

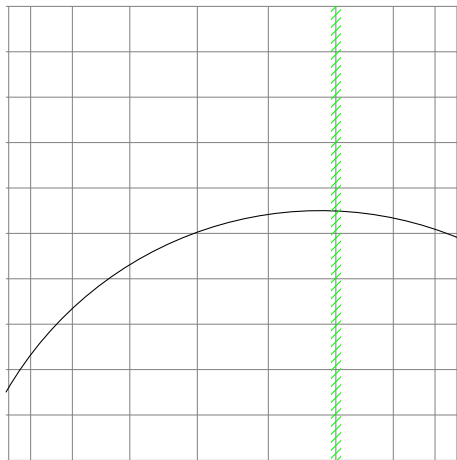
$$P(c_3, Y) = \sum p_j(c_3) Y^j$$



## General idea: edge enclosure

Illustration

$$P(c_3, Y) = \sum p_j(c_3) Y^j$$

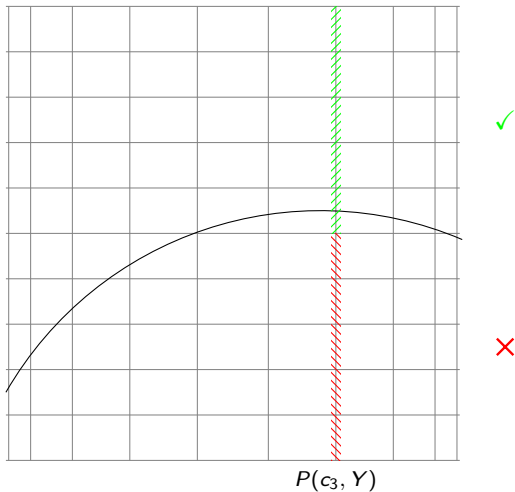


$P(c_3, Y)$

# General idea: edge enclosure

Illustration

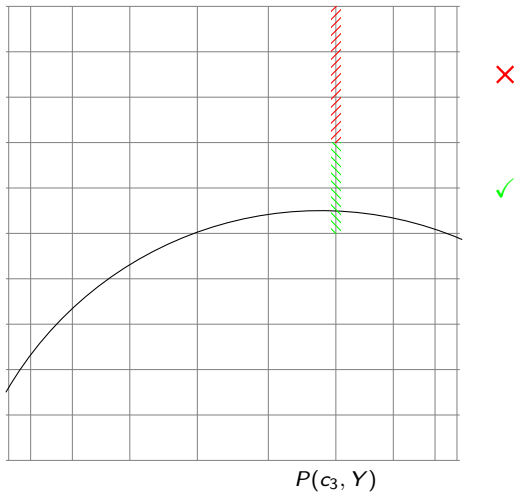
$$P(c_3, Y) = \sum p_j(c_3) Y^j$$



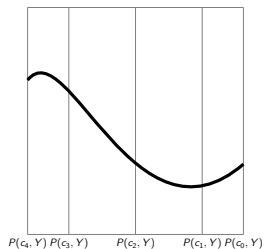
# General idea: edge enclosure

Illustration

$$P(c_3, Y) = \sum p_j(c_3) Y^j$$



## An edge enclosing algorithm

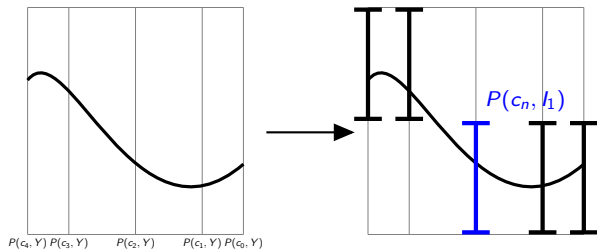


IDCT multipoint evaluation in  $X$   
at  $c_0, c_1 \dots$

subdivision in  $Y$

IDCT multipoint evaluation of the partial polynomials of  $P(X, Y) = \sum p_j(X)Y^j$

## An edge enclosing algorithm



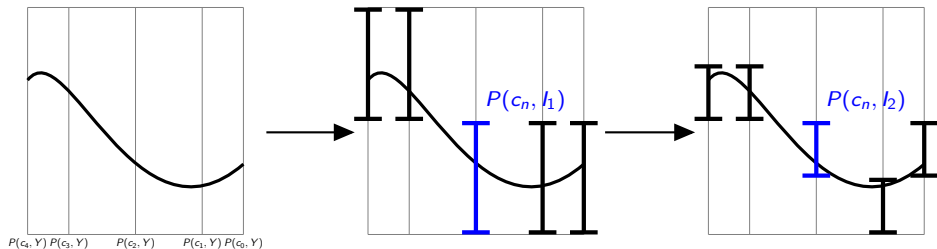
IDCT multipoint evaluation in  $X$   
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# An edge enclosing algorithm



IDCT multipoint evaluation in  $X$   
at  $c_0, c_1 \dots$

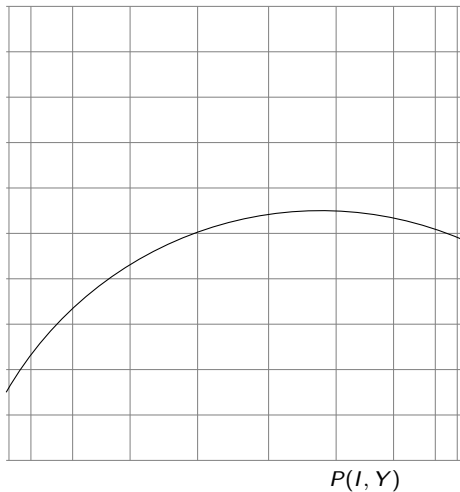
subdivision in  $Y$

IDCT multipoint evaluation of the partial polynomials of  $P(X, Y) = \sum p_j(X)Y^j$

## General idea: pixel enclosure

Illustration

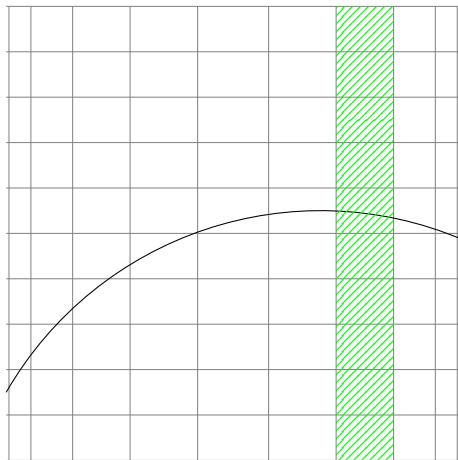
$$P(I, Y) = \sum p_j(I) Y^j$$



## General idea: pixel enclosure

Illustration

$$P(I, Y) = \sum p_j(I) Y^j$$

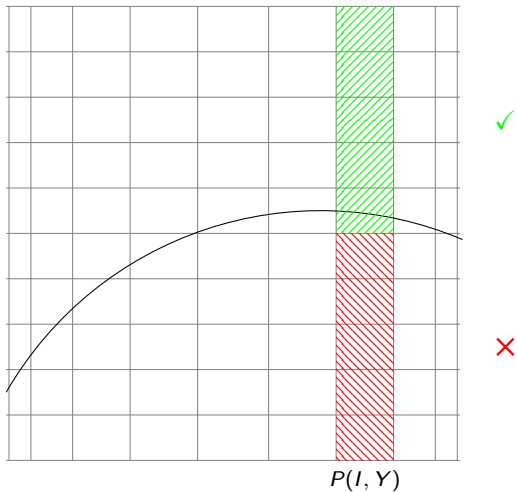


$P(I, Y)$

# General idea: pixel enclosure

Illustration

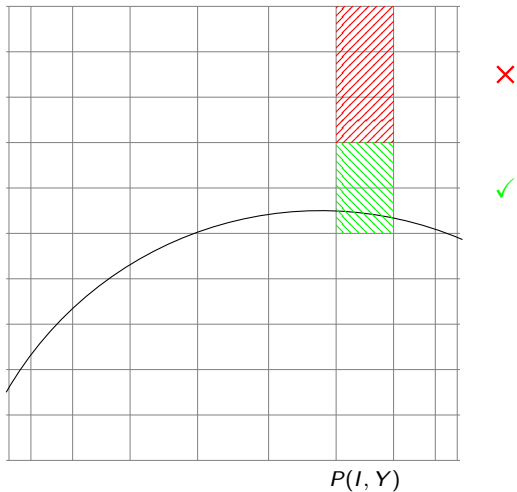
$$P(I, Y) = \sum p_j(I) Y^j$$



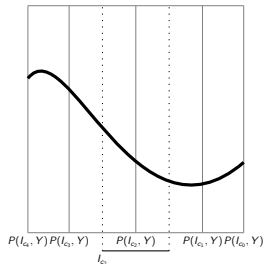
# General idea: pixel enclosure

Illustration

$$P(I, Y) = \sum p_j(I) Y^j$$



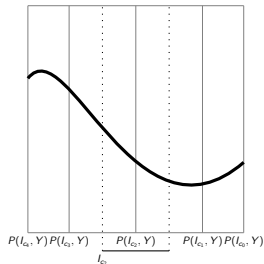
# A pixel enclosing algorithm



IDCT multipoint evaluation in  $X$   
around  $c_0, c_1 \dots$

subdivision in  $Y$

## A pixel enclosing algorithm



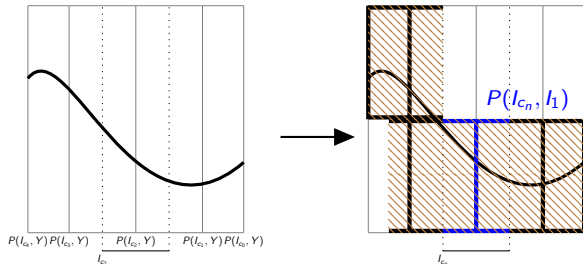
IDCT multipoint evaluation +  
Taylor approximation in  $X$

subdivision in  $Y$

Taylor expansion of the partial polynomials of  $P(X, Y) = \sum p_j(X) Y^j$

$$\left| p(c_n + r) - \left( p(c_n) + rp'(c_n) + \cdots + \frac{r^m}{m!} p^{(m)}(c_n) \right) \right| \leq \max_{I_{c_n}} |p^{(m+1)}| \frac{|r|^{(m+1)}}{(m+1)!}$$

## A pixel enclosing algorithm



IDCT multipoint evaluation +  
Taylor approximation in  $X$

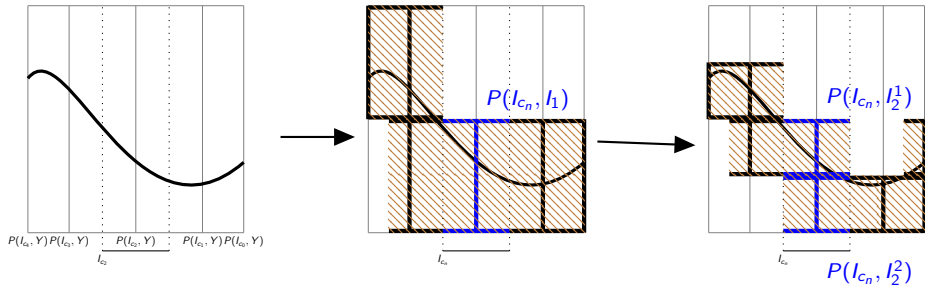
subdivision in  $Y$

Taylor expansion of the partial polynomials of  $P(X, Y) = \sum p_j(X) Y^j$

$$\left| p(c_n + r) - \left( p(c_n) + rp'(c_n) + \cdots + \frac{r^m}{m!} p^{(m)}(c_n) \right) \right| \leq \max_{I_{c_n}} |p^{(m+1)}| \frac{|r|^{(m+1)}}{(m+1)!}$$



# A pixel enclosing algorithm



IDCT multipoint evaluation +  
Taylor approximation in  $X$

subdivision in  $Y$

Taylor expansion of the partial polynomials of  $P(X, Y) = \sum p_j(X) Y^j$

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# Complexities

## Arithmetic complexities

multipoint evaluation and subdivision  $O(d^3 + dN \log_2(N) + dNT)$

multipoint Taylor approximation and subdivision  $O(md^3 + mdN \log_2(N) + dNT)$

$d$  partial degree

$N$  resolution

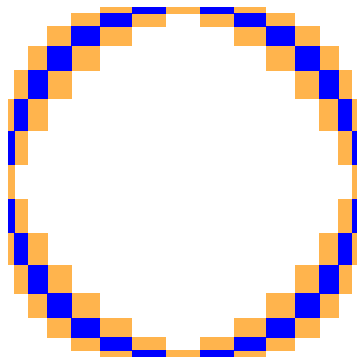
$T$  maximum number of nodes of the subdivision trees over all vertical fibers / stripes

With a constant number of branches in the window, we expect  $T = O(\log_2(N))$

# Experiments

# Pixel classification

- crossed: blue
- not crossed: white
- undecided: yellow



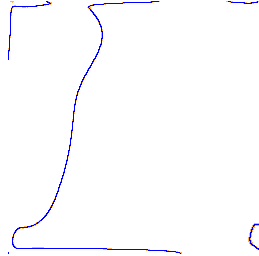
# Drawing for two families of polynomials

Experiments on smooth curves  $\rightarrow$  random polynomials

$\xi_{i,j}$ : random coefficients in  $[-100, 100]$

Kac polynomial

$$P(X, Y) = \sum_{i+j=0}^d \xi_{i,j} X^i Y^j$$



Kostlan-Shub-Smale (KSS) polynomial

$$P(X, Y) = \sum_{i+j=0}^d \sqrt{\frac{d!}{i!j!(d-i-j)!}} \xi_{i,j} X^i Y^j$$



## Drawing for two families of polynomials

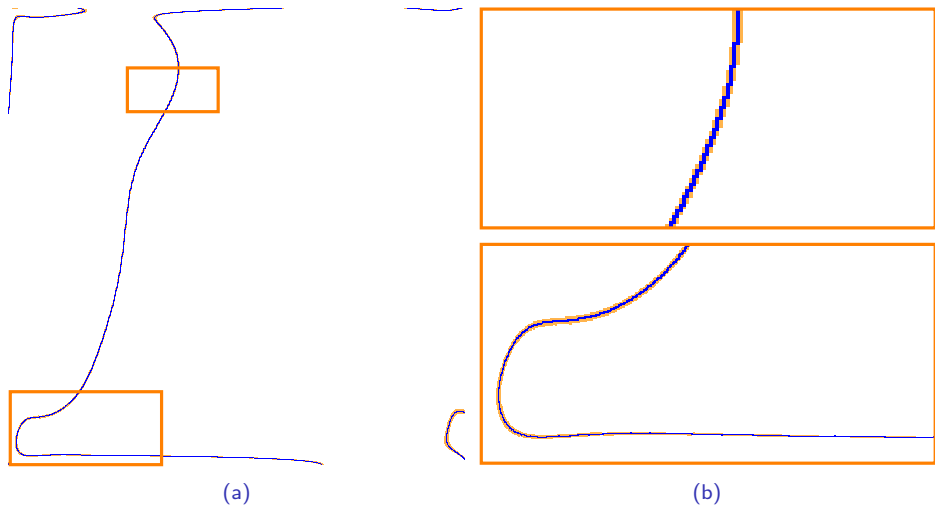


Figure: Kac polynomial of degree  $d = 110$  at a resolution  $N = 1,024$ ,  $\frac{b}{b+y} = 24\%$

## Drawing for two families of polynomials

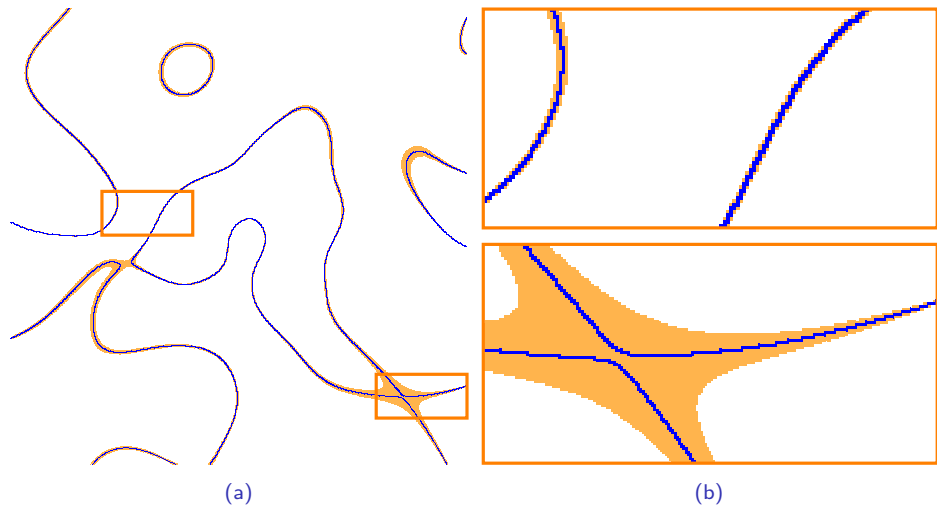


Figure: KSS polynomial of degree  $d = 40$  at a resolution  $N = 1,024$ ,  $\frac{b}{b+y} = 19\%$

# Comparison to state-of-the-art software

## Our methods

- edge drawing → curve enclosing edges
- pixel drawing → curve enclosing pixels

false positive and false negative  
false positive

## Some similar methods

- scikit / NumPy → marching squares
- MATLAB → could not find the method used
- ImplicitEquations → 2D adaptive subdivision

false negative  
false negative?  
false positive

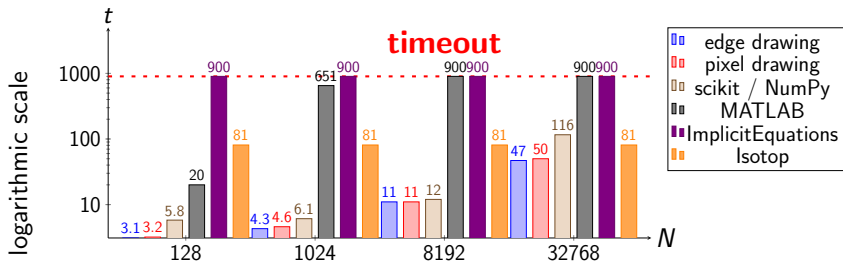
## A topologically correct method

- Isotop → cylindrical algebraic decomposition



# Timing

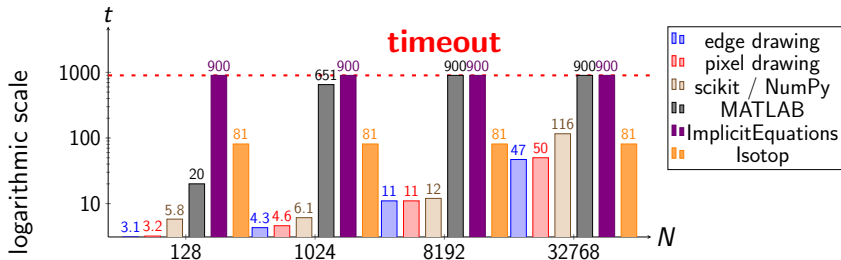
Comparison for a polynomial



Computation times for a **Kac** polynomial of degree 40 (in seconds)

# Timing

Comparison for a polynomial



Computation times for a **Kac** polynomial of degree 40 (in seconds)

scikit:  $O(dN^2)$

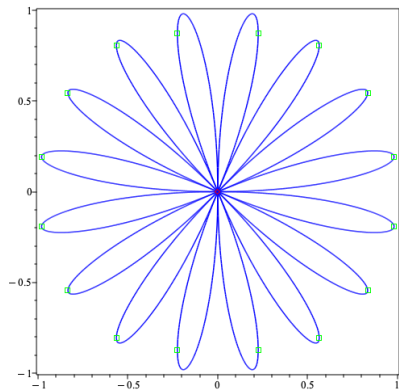
Our methods:  $O(dNT)$   
as expected  $T = O(\log_2(N))$

no guarantee  
slow when  $d$  and  $N$  are large

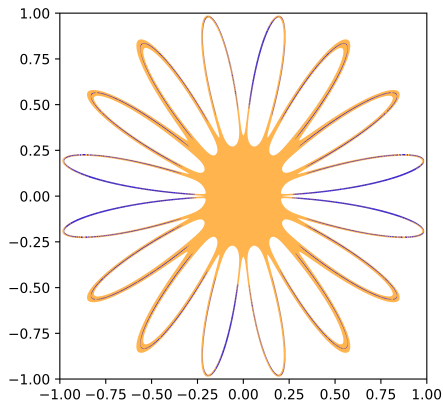
**guarantees**  
**fast** when  $d$  and  $N$  are large

# Output for a singular curve

Curve:  $\text{dfold}_{8,1}$  from Challenge 14 of Oliver Labs[13][37] ( $d = 18$ )



Isotop



Pixel drawing

# Conclusion

## Contributions

- Two algorithms
  - ▶ enclosure of the edges
  - ▶ enclosure of the pixels
- Fast implicit curve and surface algorithms for high resolutions: faster than marching squares and marching cubes
- Better guarantees on the drawing than marching squares
- Ability to handle high degrees ( $d > 20$ ) and high resolutions ( $N > 1000$ )

## Future work

- Can the thickness of the drawing be controlled?
- Could we have a faster subdivision with other root finding methods?
- Can the multipoint evaluation improve Plantinga and Vegter's algorithm?

# Timing

A CAD approach: Isotop

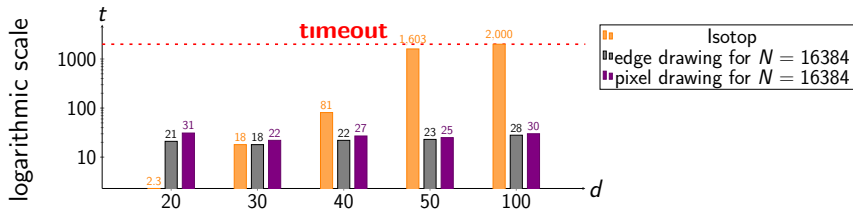


Figure: Computation times for a Kac polynomials (in seconds)