

Certified Algebraic Path Tracking with Algpath

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Ouragan seminar

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Certified path tracking

F



Parametrized polynomial system

Certified homotopy continuation

Input: F

Certified path tracking

Point in \mathbb{C}^n



$$F_0(\zeta_0) = 0$$



Parametrized polynomial system

Certified homotopy continuation

Input: F, ζ_0

Certified path tracking

Unique continuous extension



$$F_t(\zeta_t) = 0, \quad \forall t \in [0, 1]$$



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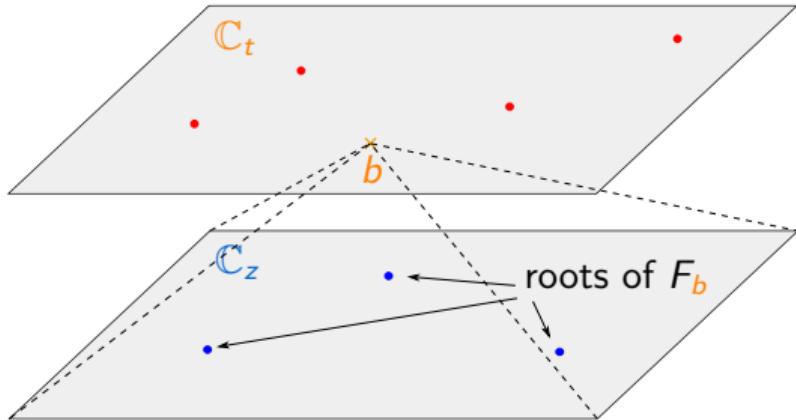
Parametrized polynomial system

Certified homotopy continuation

Input: F, ζ_0

Output: A “certified approximation” of ζ

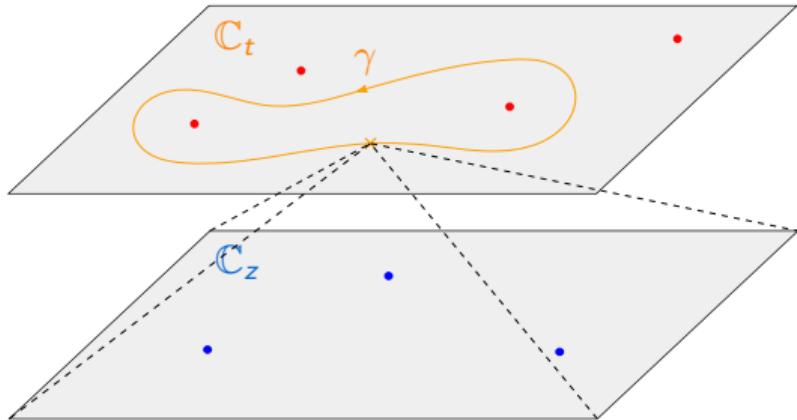
Motivation



Setup

- Let $g \in \mathbb{C}[t, z]$ ($n = \deg_z(g)$),
- define $F_t(z) = g(t, z)$.
- Let $b \in \mathbb{C} \setminus \Sigma$ be a base point,

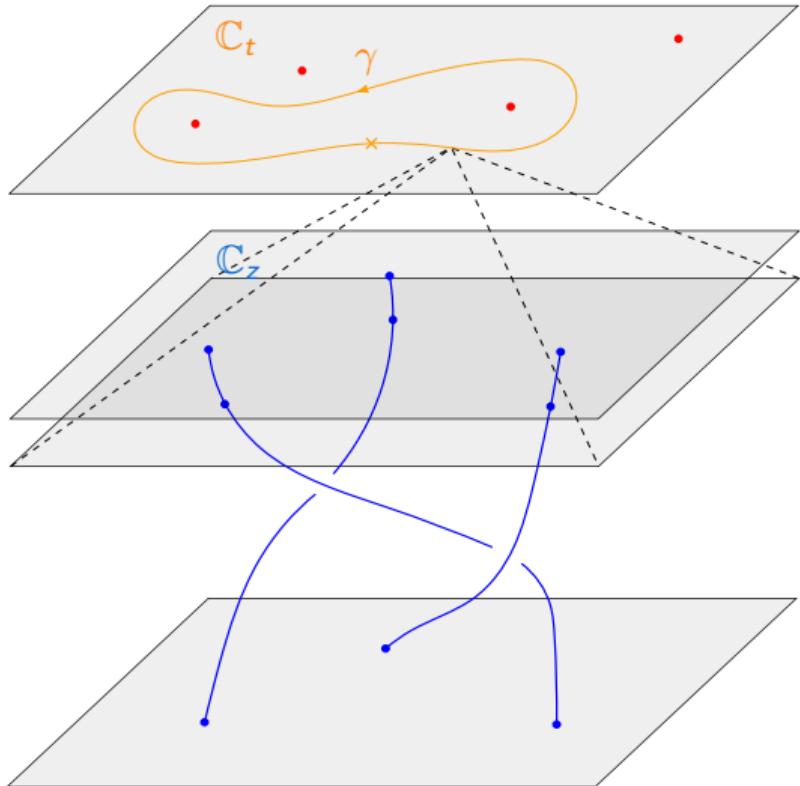
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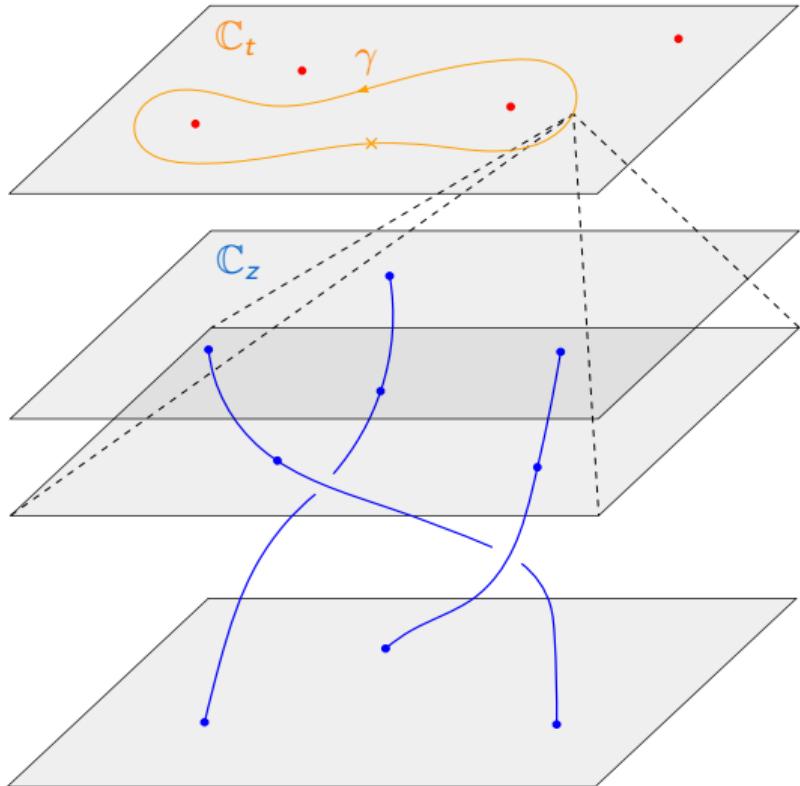
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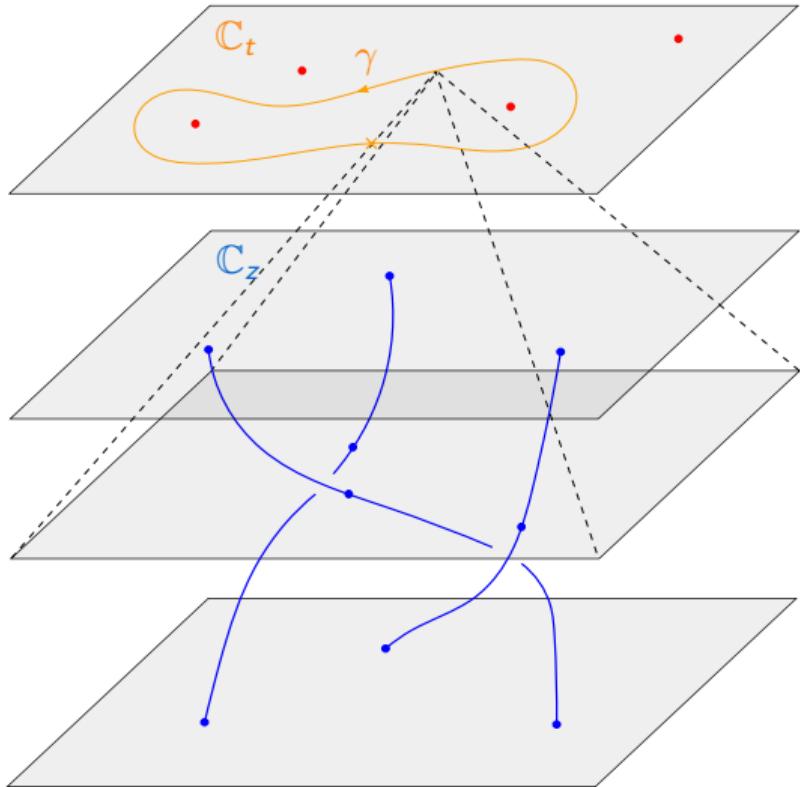
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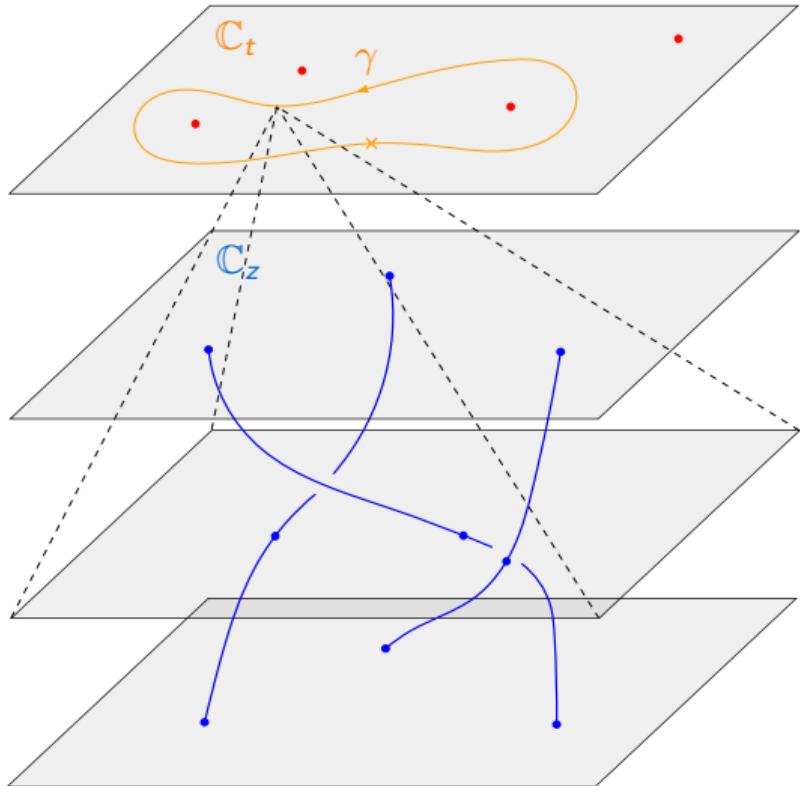
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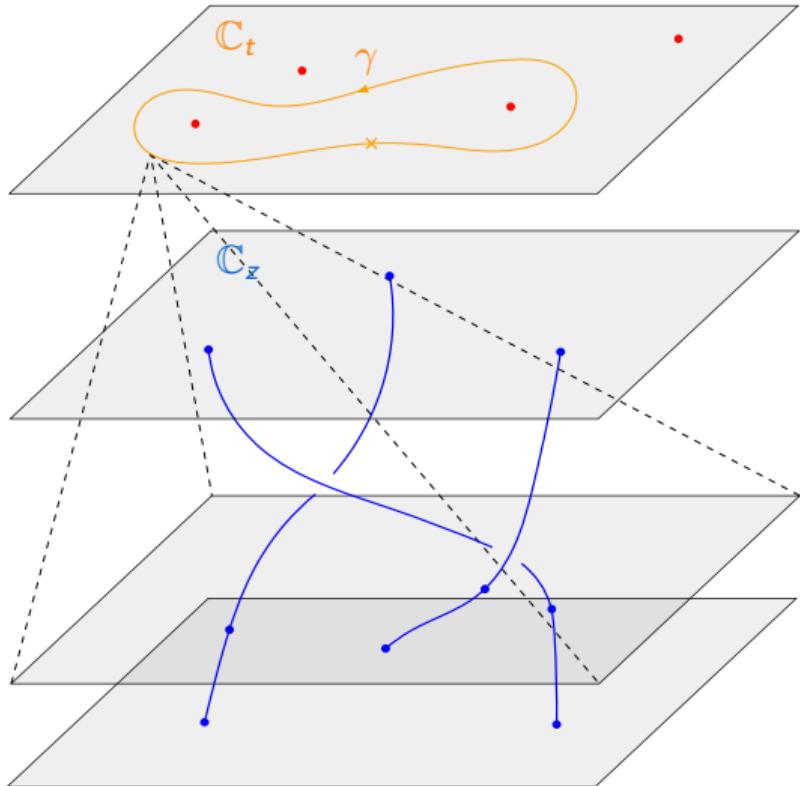
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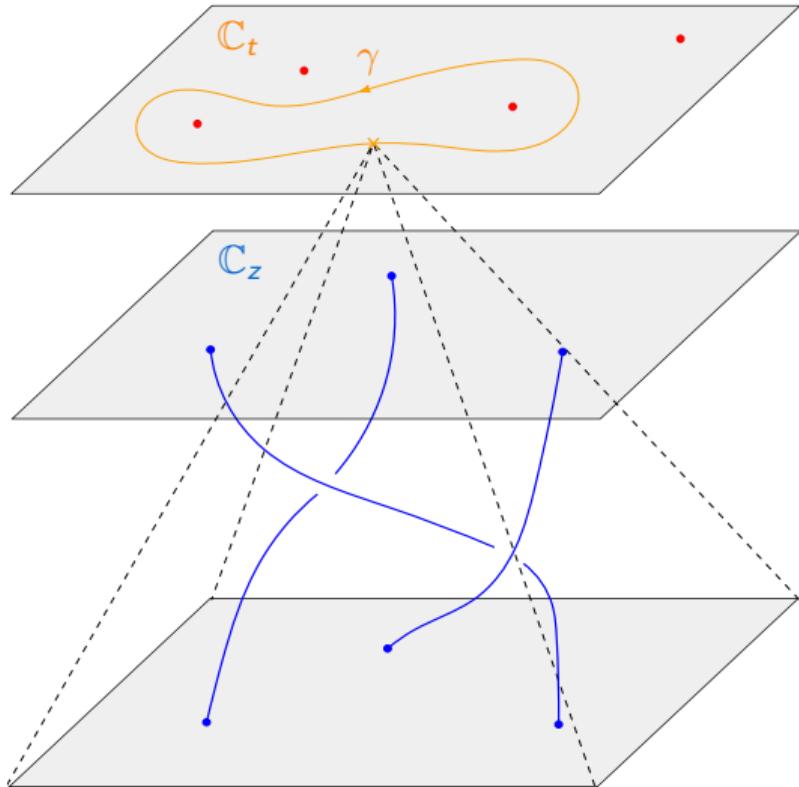
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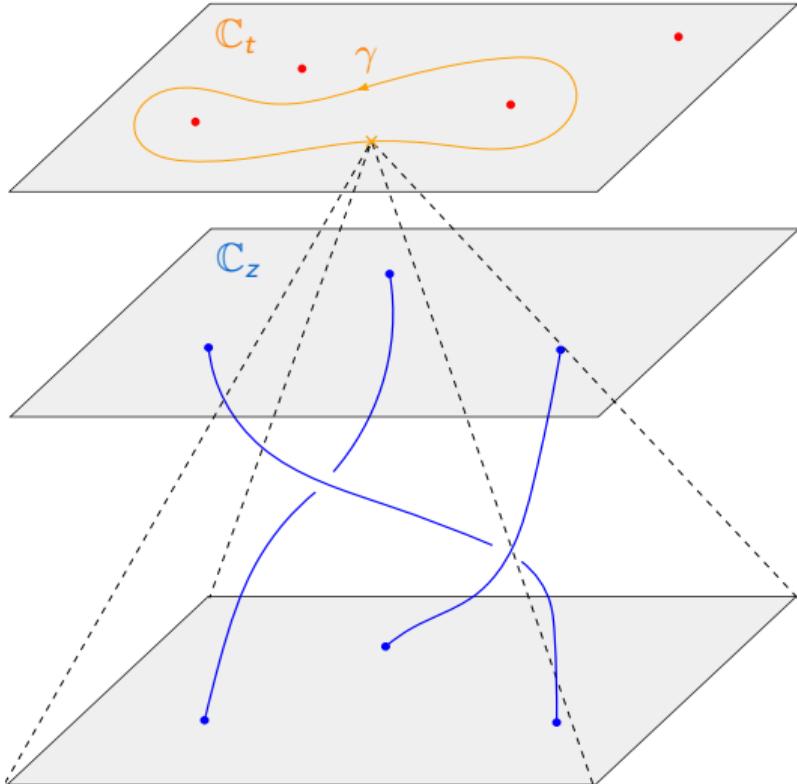
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Algorithmic goal

Input: g, γ

Output: the associated braid

Previous work

Noncertified path trackers

- PHCpack by Verschelde (1999)
- Bertini by Bates, Sommese, Hauenstein, and Wampler (2013)
- HomotopyContinuation.jl by Breiding and Timme (2018)

Certified path trackers using Smale's alpha-theory

- NAG for M2 by Beltrán and Leykin (2012, 2013)

Certified path trackers in one variable

- Marco-Buzunariz and Rodríguez (2016)
- Kranich (2016)
- Xu, Burr, and Yap (2018)

Certified path trackers using interval arithmetic

- Kearfott and Xing (1994)
- van der Hoeven (2015) *Krawczyk operator + Taylor models*
- Duff and Lee (2024) *similar to us but independent work*

Interval arithmetic

Problem

Given $f \in \mathbb{R}[x]$, I and J intervals, check $f(I) \subseteq J$.

Sufficient solution

- Define interval binary operations \boxplus and \boxtimes that take two intervals, give an interval and is such that for all $x \in I$, $y \in J$,

$$x + y \in I \boxplus J, xy \in I \boxtimes J.$$

- Write f as a composition of binary operations and replace each operation by its interval counterpart (interval extension), then plug I and check if the result is contained in J.
! This is only a sufficient condition.

Computational model

- Interval endpoints: \mathbb{Q} ,
- $[a, b] \boxplus [c, d] = [a + c, b + d]$,
- $[a, b] \boxtimes [c, d] = [\min\{ac, ad, bc, bd\}, \max\{ac, ad, bc, bd\}]$.

Pros and cons

- ✓ Good theoretical properties.
- ✗ Coefficient swell.

Computational model

- Interval endpoints: $\{\text{IEEE-754 64-bits floating-point numbers}\}$,
- $[a, b] \boxplus [c, d] = [\underline{a+c}, \overline{b+d}]$,
- $[a, b] \boxtimes [c, d] = [\min\{\underline{ac}, \underline{ad}, \underline{bc}, \underline{bd}\}, \max\{\overline{ac}, \overline{ad}, \overline{bc}, \overline{bd}\}]$.

Pros and cons

- ✓ Fast.
- ✗ Bad theoretical properties.
- ✗ Not enough representable numbers.

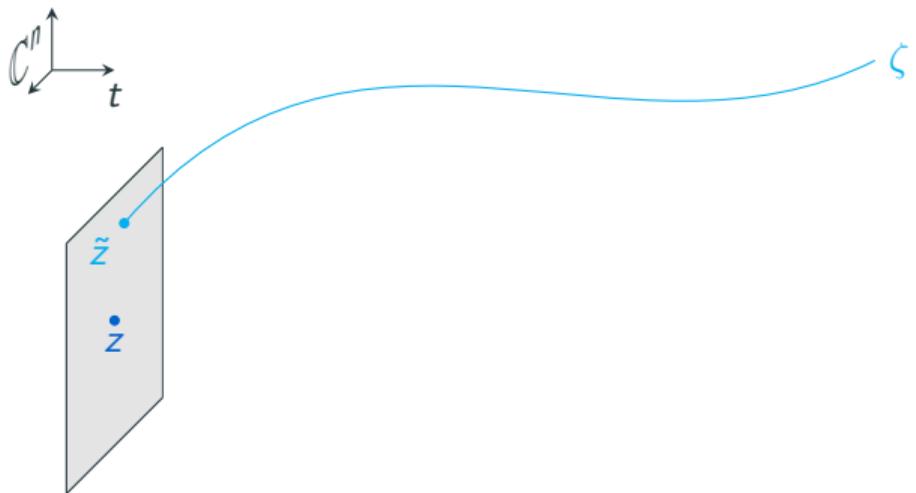
Computational model

- Interval endpoints: $\{m2^e \in \mathbb{R} : m, e \in \mathbb{Z}\}$,
- precision $P \in \mathbb{Z}_>$ (number of bits) that can be changed at will,
- interval operations: endpoints rounding done at precision P .

Pros and cons

- ✓ Good theoretical properties as $P \rightarrow \infty$.
- ✓ Fast when we can maintain low precision.
- ⚙️ Need to carefully manage P in the algorithms to ensure termination.

The folklore meta-algorithm



$F : \mathbb{C} \times \mathbb{C}^n \rightarrow \mathbb{C}^n$, $F_t(z) = F(t, z)$,
 m isolates a zero of F_0 .

```
def track(F, m):
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2  while t < 1:
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3      m ← refine(F_t, m)
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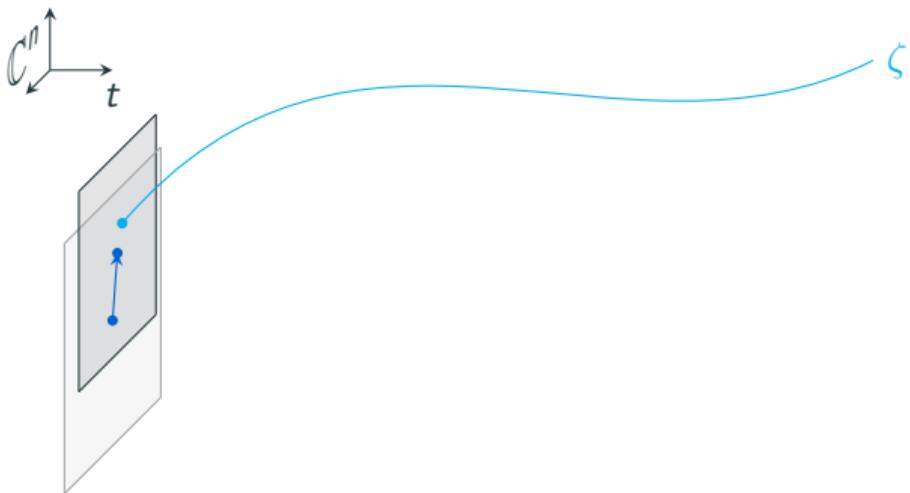
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4      δ ← extend(F, t, m)
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5      t ← t + δ
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6      append (t, m) to L
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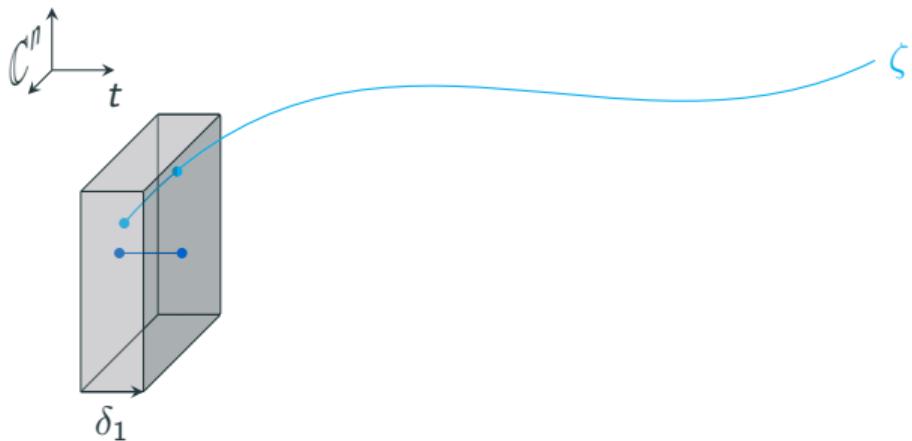
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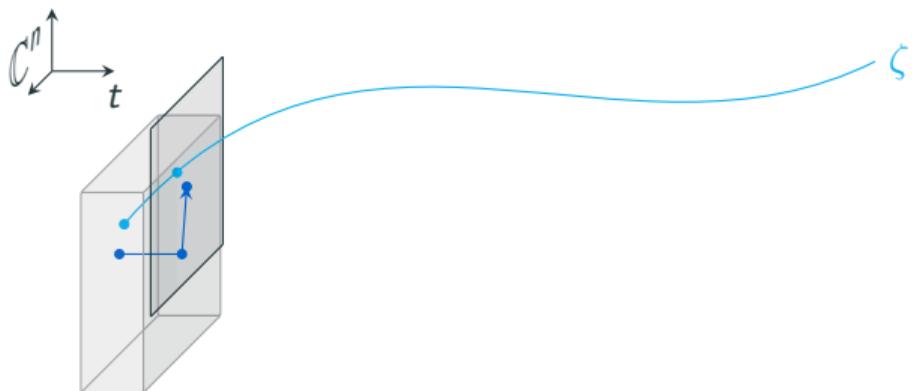
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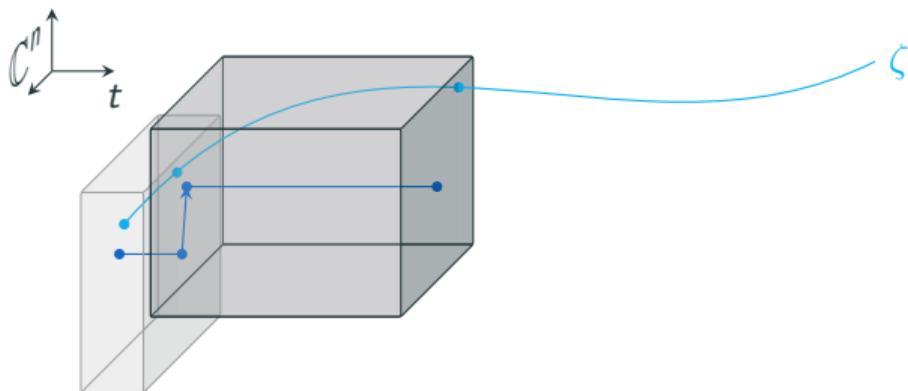
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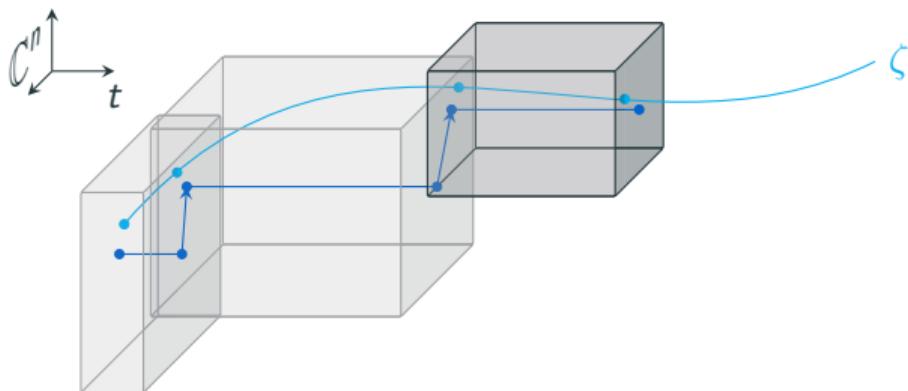
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Moore boxes, the datastructure for isolating boxes

Root isolation criterion (Krawczyk 1969, Moore 1977, Rump 1983)

- $f : \mathbb{C}^n \rightarrow \mathbb{C}^n$ polynomial, $\rho \in (0, 1)$,
- $z \in \mathbb{C}^n$, $A \in \mathbb{C}^{n \times n}$, $B \subseteq \mathbb{C}^n$ a ball of center 0,

such that for all $u, v \in B$,

$$-A \cdot f(z) + [I_n - A \cdot df(z + u)]v \in \rho B.$$

Then f has a unique zero in $z + \rho B$.

Moore boxes, the datastructure for isolating boxes

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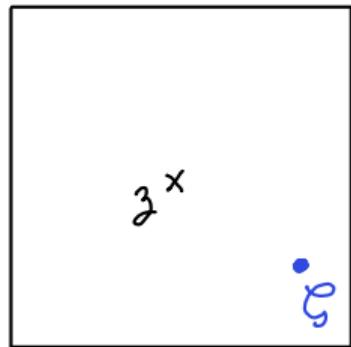
Proof sketch

We show that $\varphi : z + \rho B \rightarrow \mathbb{C}^n$ defined by $\varphi(w) = w - Af(w)$ is a ρ -contraction map with values in $z + \rho B$.

Definition

A ρ -Moore box for f is a triple (z, B, A) which satisfies Moore's criterion.

Refinement of Moore boxes

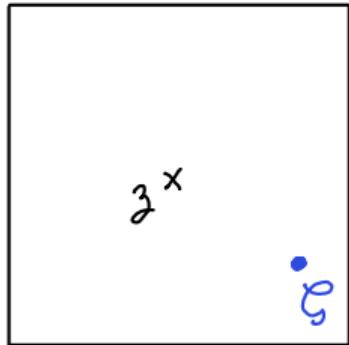


Strategy

(z, B, A) a $\frac{7}{8}$ -Moore box for f , ζ its associated zero.

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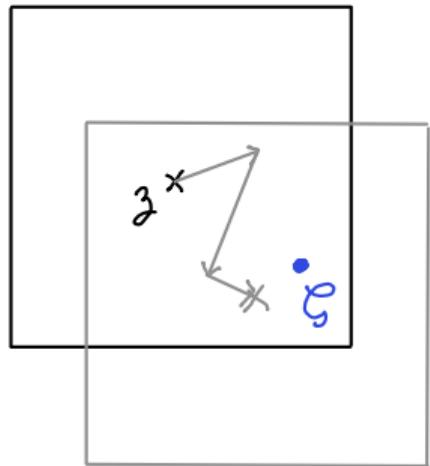
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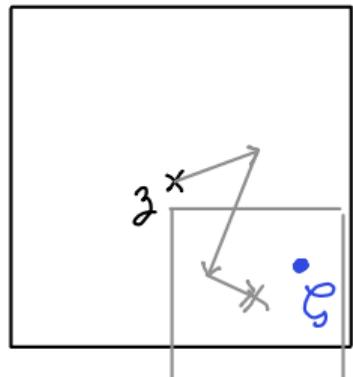
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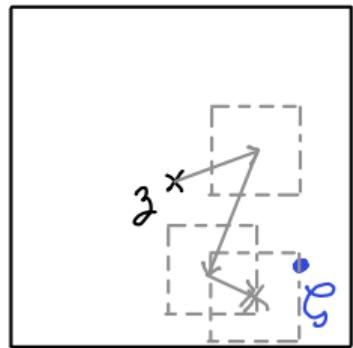
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How do we handle numerical errors?

Refinement of Moore boxes

```
def refine(f, z, B, A):
```

```
1    $\mathcal{U} \leftarrow A; B \leftarrow 2B$ 
2   while not  $-A \cdot f(z) + [I - A \cdot df(z + B)] B \subseteq \frac{1}{8}B$ 
3     if  $-\mathcal{U}f(z) \subseteq \frac{1}{512}B$ : # left term is small
4        $B \leftarrow \frac{1}{2}B$ 
5     else: # left term is big
6        $z \leftarrow z - \mathcal{U}f(z)$ 
7        $A \leftarrow Jf(z)^{-1}$  # unchecked arithmetic
8   return z, B, A
```

Input

- $f : \mathbb{C}^n \rightarrow \mathbb{C}^n$ polynomial,
- z, B, A a $\frac{7}{8}$ -Moore box for f .

Output

A $\frac{1}{8}$ -Moore box for f with same associated zero as z, B, A .

Refinement of Moore boxes

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def refine(f, z, B, A):
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```
1    $U \leftarrow A$ ;  $B \leftarrow 2B$ ; shrink_cnt  $\leftarrow 0$ 
2   while not  $-A \cdot f(z) + [I - A \cdot df(z + B)] B \subseteq \frac{1}{8}B$ 
3     if  $-Uf(z) \subseteq \frac{1}{512}B$ : # left term is small
4        $B \leftarrow \frac{1}{2}B$ ; shrink_cnt  $\leftarrow$  shrink_cnt + 1
5     if shrink_cnt > 8:
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8      $\delta \leftarrow Uf(z)$ 
9     if width( $z - \delta$ ) >  $\frac{1}{40}$  mag( $\delta$ ):
10       increase working precision
11   else:
12      $z \leftarrow mid(z - \delta)$ ;
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14 return  $z, B, A$ 
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Output

A $\frac{1}{8}$ -Moore box for f with same associated zero as z, B, A .

Proposition

refine terminates and is correct.

Step validation

Input

- $F : \mathbb{C} \times \mathbb{C}^n \rightarrow \mathbb{C}^n$,
- $t \in [0, 1]$,
- (z, B, A) a $\frac{1}{8}$ -Moore box for F_t , returned by refine.

recall $F_s(z) = F(s, z)$

Output

$\delta > 0$ s.t. for all $s \in [t, t + \delta]$,
 (z, B, A) is a $\frac{7}{8}$ -Moore box for F_s .

```
def extend(F, t, δhint, z, B, A)
1 δ ← δhint; T ← [t, t + δ]
2 while not −AFT(z) + [I − AdFT(z + B)] B ⊆ 7/8B:
3   δ ← δ/2; T ← [t, t + δ]
4   if δ < 2-P: # P working precision in bits
5     increase working precision
6 return δ
```

Proposition

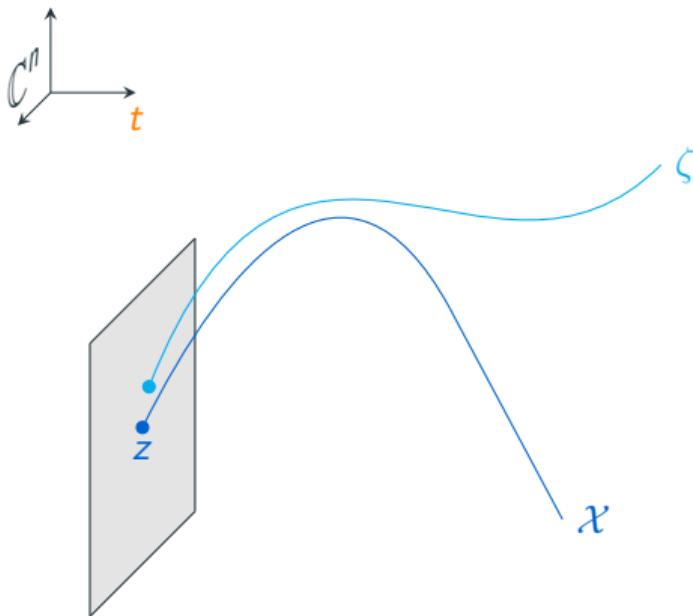
extend terminates and is correct.

Extending along a predictor

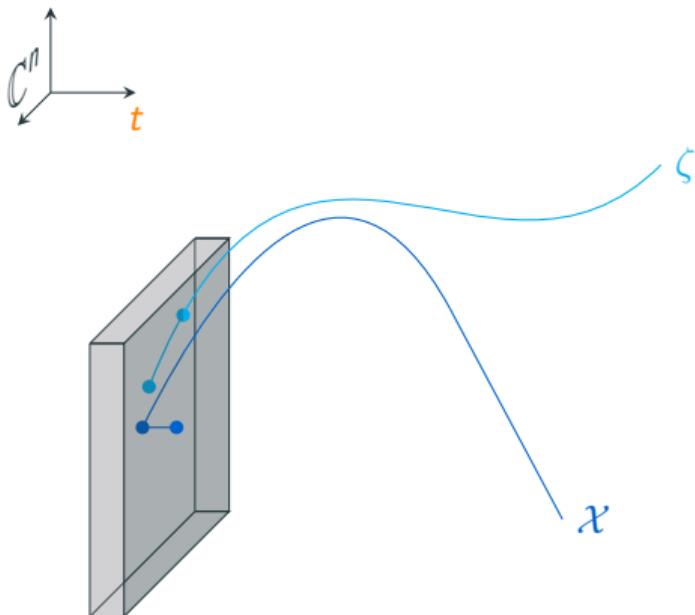
Predictor

A map $\mathcal{X} : \mathbb{R} \rightarrow \mathbb{C}^n$ such that $\mathcal{X}(0) = z$.

In practice, one should have $\mathcal{X}(s) \approx \zeta(t + s)$ around 0.



Extending along a predictor



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How to extend?

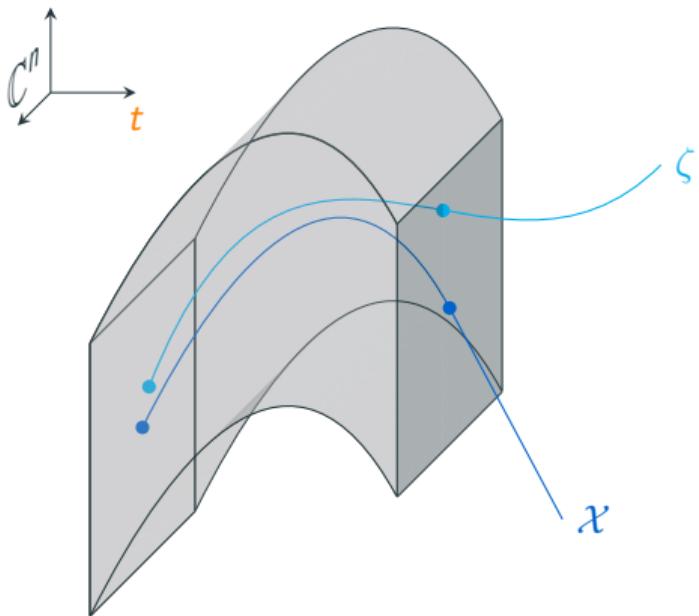
Pb: check that for all $s \in [0, \delta]$, (z, B, A) is a ρ -Moore box for F_{t+s} .

Soln: try

$$-AF_{t+\textcolor{red}{s}}(z) + [1 - AdF_{t+\textcolor{red}{s}}(z + B)]B \subseteq \rho B$$

where $\textcolor{red}{S} = [0, \delta]$.

Extending along a predictor



Predictor

A map $\mathcal{X} : \mathbb{R} \rightarrow \mathbb{C}^n$ such that $\mathcal{X}(0) = z$.

In practice, one should have $\mathcal{X}(s) \approx \zeta(t + s)$ around 0.

How to extend along \mathcal{X} ?

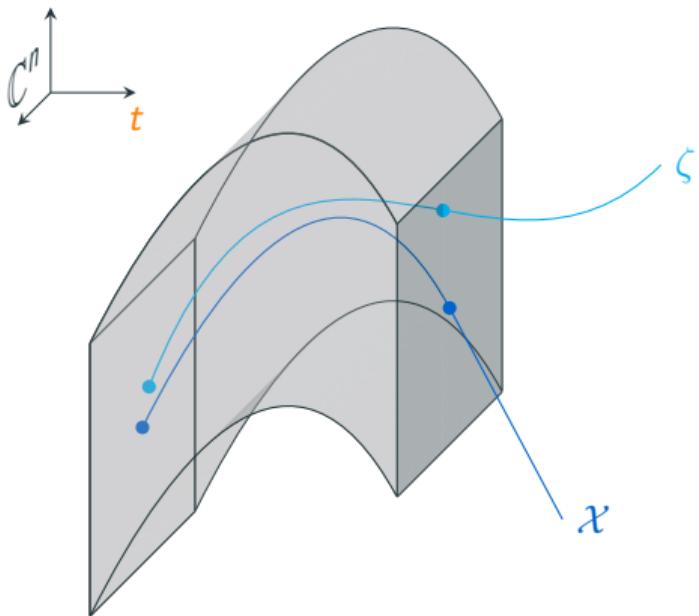
Pb: check that for all $s \in [0, \delta]$, $(\mathcal{X}(s), B, A)$ is a ρ -Moore box for F_{t+s} .

Soln? try

$$-AF_{t+s}(\mathcal{X}(S)) + [1 - AdF_{t+s}(\mathcal{X}(S) + B)]B \subseteq \rho B$$

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where $S = [0, \delta]$.

This is too strong! Way around the dependency problem: **Taylor models**

Taylor models with relative remainder

Definition

- A real interval S containing zero,
- a polynomial $P(\eta) = A_0 + A_1\eta + \cdots + A_{d+1}\eta^{d+1}$ where A_i is a (complex) interval.

d is the order of the Taylor model.

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A Taylor model (S, P) of degree d encloses a function $\mathcal{X} : \mathbb{R} \rightarrow \mathbb{C}$ if

$$\forall s \in S, \forall i \in 0, \dots, d+1, \exists a_i \in A_i \text{ s.t. } \mathcal{X}(s) = a_0 + a_1 s + \cdots + a_{d+1} s^{d+1}.$$

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Remark

If $J \subseteq S$, we have $\mathcal{X}(J) \subseteq P(J)$ (where $P(J)$ is computed using interval arithmetic).

Reduction

Let (S, P) be a Taylor model of order d .

Goal : reduce it order to $d - 1$, s.t. if (S, P) encloses a function, so does its reduction.

Solution : replace $A_d \eta^d + A_{d+1} \eta^{d+1}$ by $[A_d \boxplus (A_{d+1} \boxtimes S)] \eta^d$.

Arithmetic

Reduction

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Solution : replace $A_d \eta^d + A_{d+1} \eta^{d+1}$ by $[A_d \boxplus (A_{d+1} \boxtimes S)] \eta^d$.

Let (S, P) and (S, Q) be Taylor models of order d .

Sum

Component-wise sum of P and Q using \boxplus . **Compatible with sums of enclosed functions.**

Product

Usual product formula with P and Q , gives a Taylor model of order $2d + 1$, then reduce it to make it of order d . **Compatible with products of enclosed functions.**

Back to our problem

- (z, B, A) is a $\frac{1}{8}$ -Moore box for F_t ,
- $\mathcal{X} : \mathbb{R} \rightarrow \mathbb{C}^n$ polynomial s.t. $\mathcal{X}(0) = z$.

We want to check that for all $s \in [0, \delta]$, $(\mathcal{X}(s), B, A)$ is a $\frac{7}{8}$ -Moore box for F_{t+s} . i.e.

$$-A \cdot F_{t+s}(\mathcal{X}(s)) + [1 - A \cdot dF_{t+s}(\mathcal{X}(s) + B)]B \subseteq \frac{7}{8}B.$$

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Solution using Taylor models

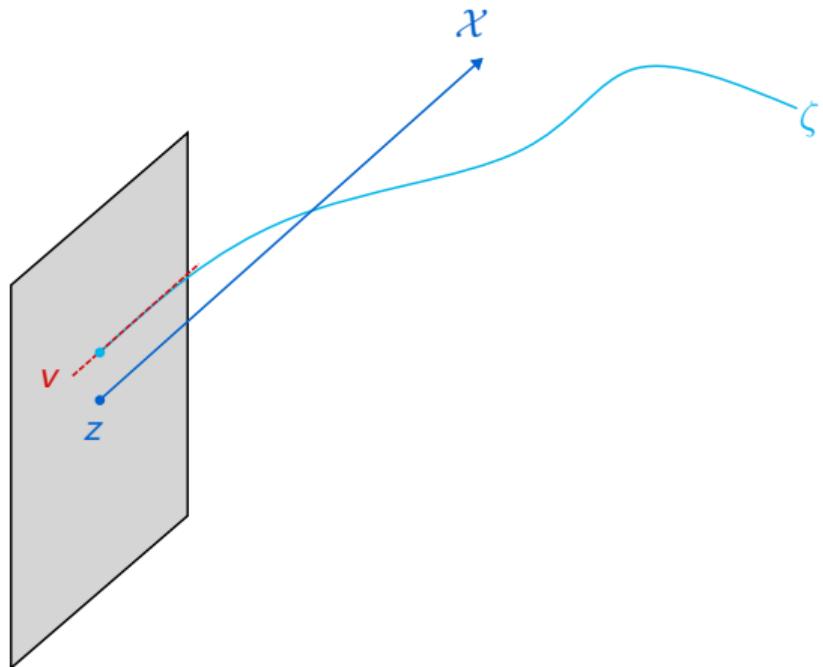
- Compute an order d taylor model \mathcal{K} on $[0, \delta]$ enclosing

$$s \mapsto -A \cdot F_{t+s}(\mathcal{X}(s)) + [1 - A \cdot dF_{t+s}(\mathcal{X}(s) + B)]B.$$

This is just Taylor model arithmetic !

- Check that $\mathcal{K}([0, \delta]) \subseteq \frac{7}{8}B$ (interval arithmetic).

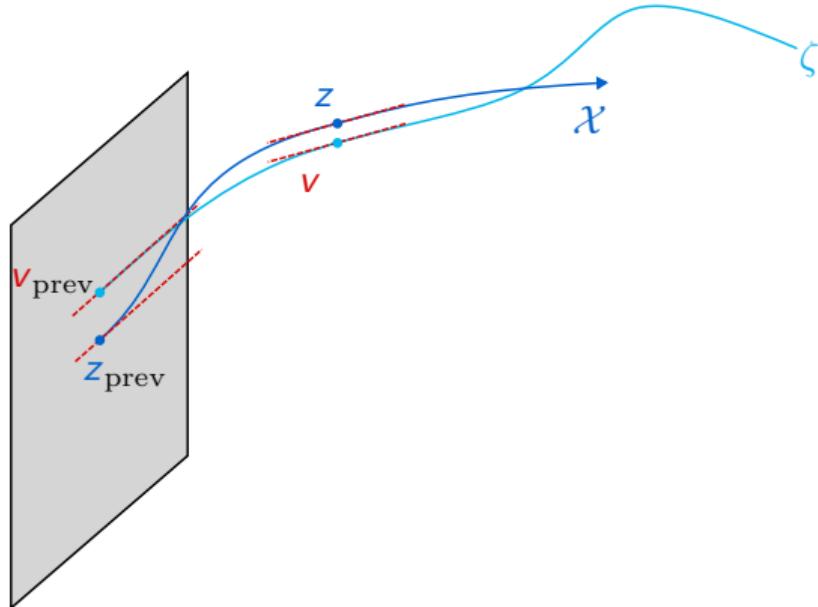
Choosing the right predictor



Tangent predictor

Idea: $-A \cdot \frac{\partial F}{\partial t}(t, z)$ is a good approximation of $\zeta'(t)$. Use it to do a order 1 correction.

Choosing the right predictor



Tangent predictor

Idea: $-A \cdot \frac{\partial F}{\partial t}(t, z)$ is a good approximation of $\zeta'(t)$. Use it to do a order 1 correction.

Hermite predictor

Idea: use previous point z_{prev} and previous tangent vector v_{prev} , z and v to do a Hermite cubic spline approximation.

Features

- **Rust** implementation,
- available at <https://gitlab.inria.fr/numag/algpath>,
- **SIMD double precision interval arithmetic** following Lambov (2008),
- **adaptive precision** using **Arb**¹,
- **mixed precision** between double precision and Arb **without overhead**.

¹Johansson, 2017.

Adaptive precision, in practice

Precision decreases

The algorithm presented only increases precision.

⚠️ High precision is computationally costly.

Can we introduce precision decreases?

```
def track( $F$ ,  $m$ ):  
    1    $t \leftarrow 0$ ;     $L \leftarrow []$   
    2   while  $t < 1$ :  
        3       decrease  $P$  by 1?  
        4        $m \leftarrow refine(F_t, m)$   
        5        $\delta \leftarrow extend(F, t, m)$   
        6        $t \leftarrow t + \delta$   
        7       append  $(t, m)$  to  $L$   
    8   return  $L$ 
```

Adaptive precision, in practice

Precision decreases

The algorithm presented only increases precision.

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Can we introduce precision decreases?

Computational model, again

- Precision is managed globally,
- a change of precision induces **no changes on data, only operations are changed**,
- precision of data is indirectly changed by performing operations on it.

```
def track(F, m):  
    1   t ← 0;    L ← []  
    2   while t < 1:  
        3       decrease P by 1!  
        4       m ← refine(Ft, m)  
        5       δ ← extend(F, t, m)  
        6       t ← t + δ  
        7       append (t, m) to L  
    8   return L
```

Mixed precision

Double precision SIMD interval arithmetic is faster than Arb, but it lacks the ability to manage precision...

Goal

Use double precision when possible, else use Arb. We want to have no overhead over double precision only.

- 💡 Data can either be double precision or Arb balls.
Operations manage arithmetic switch depending on precision
- ❗ Overhead
- ❗ Challenging implementation

```
enum MixedRI {  
    Fast(F64RI),  
    Accurate(Arb),  
}
```

Spacing arithmetic switches

One iteration of the main loop

```
1 def one_step( $F, m$ ): #  $m$  isolating box
2     try:
3         convert  $m$  to double precision
4         perform a corrector-predictor round at double precision
5     except:
6         convert  $m$  to Arb
7         perform a corrector-predictor round using Arb
```

Spacing arithmetic switches

One iteration of the main loop

```
1 def one_step(F, m): # m isolating box
2     try:
3         convert m to double precision
4         perform a corrector-predictor round at double precision
5     except:
6         convert m to Arb
7         perform a corrector-predictor round using Arb
```

Can we always convert m to Arb?

Can we always convert m to double precision when the working precision is 53?

Exact conversions

Exact conversions fail both ways !

Consider double precision interval $[-2^{-50}, 2]$. The exact ball associated is $[(1 - 2^{-51}) \pm (1 + 2^{-51})]$. $1 + 2^{-51}$ cannot be represented by a `mag_t`!

Remark

- Recall: a moore box is a triple (z, B, A) where $z \in \mathbb{C}^n$, $A \in \mathbb{C}^{n \times n}$ and B is given by its radius $r > 0$. In practice, represented by singleton intervals.
- Conversions of singleton intervals behave as expected!

name	dim.	max deg	algpath	algpath (fixed precision)
			time (s)	time (s)
dense	1	100	0.4	0.4
katsura	16	2	42 min	41 min
dense	2	50	588	588

Implementation details

We would like to avoid writing the algorithm for each arithmetic.

Challenges

- Rust is statically typed,
- our functions depend on the type of intervals (double precision, Arb balls) but also on higher level types (e.g. complex intervals, interval matrices),
- Rust's generics are interface based.

Still we tried

- + Very little code duplication.
- + Easy to integrate additional arithmetics.
- Lots of complicated interfaces trying to avoid “where clause” swell.
- High level generic functions require heavy setup for only a few lines of code.

Conclusion

Features

- Rust implementation available at <https://gitlab.inria.fr/numag/algpath>,
- **certified** corrector-predictor loop,
- relies on **interval arithmetic** and **Krawczyk's method**,
- **SIMD double precision interval arithmetic**,
- **adaptive precision** using **Arb**,
- **mixed precision** between double precision and Arb **without overhead**.

Todos

- Interface with Sage or Julia
- Avx512?

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