

# Braid computations using certified path tracking

---

Alexandre Guillemot, joint work with Pierre Lairez  
MATHEXP, Université Paris–Saclay, Inria, France

May 20, 2025 | Laboratoire de Mathématiques de Versailles



# Introduction

$F$   
↗

Parametrized polynomial system

Certified homotopy continuation

Input:  $F$

# Introduction

Point in  $\mathbb{C}^n$



$$F_0(\zeta_0) = 0$$



Parametrized polynomial system

Certified homotopy continuation

Input:  $F, \zeta_0$

# Introduction

Unique continuous extension



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



Parametrized polynomial system

Certified homotopy continuation

Input:  $F, \zeta_0$

# Introduction

Unique continuous extension



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



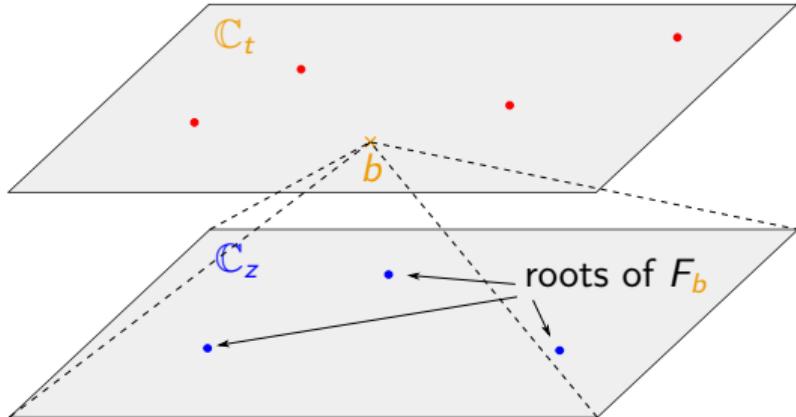
Parametrized polynomial system

## Certified homotopy continuation

**Input:**  $F, \zeta_0$

**Output:** A “certified approximation” of  $\zeta$

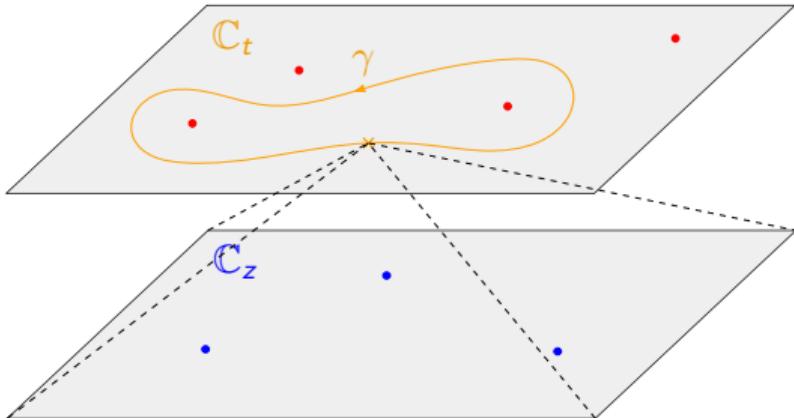
# Motivation: braid computations



## Setup

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

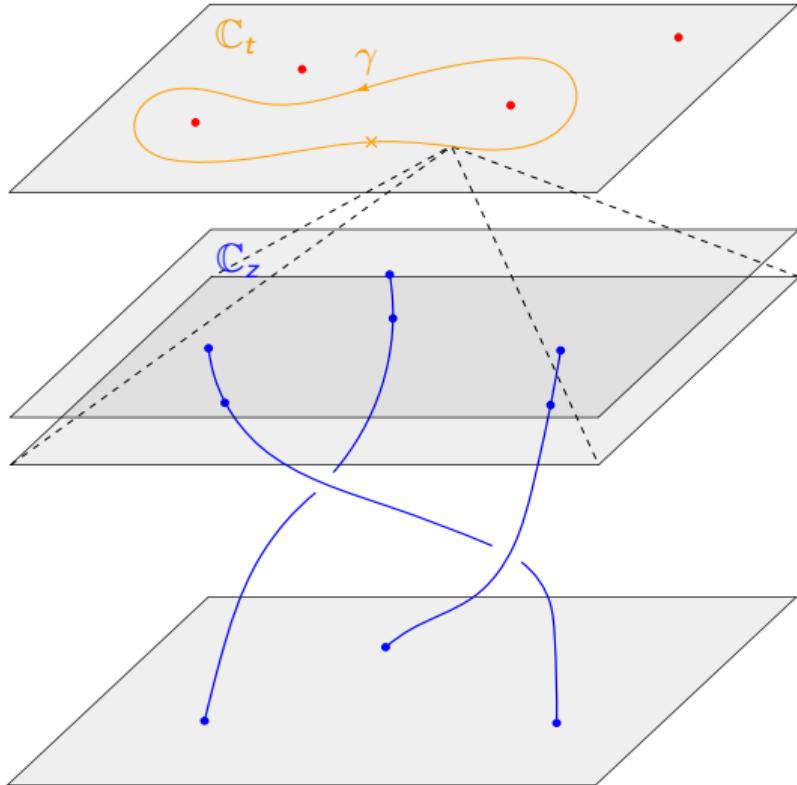
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .

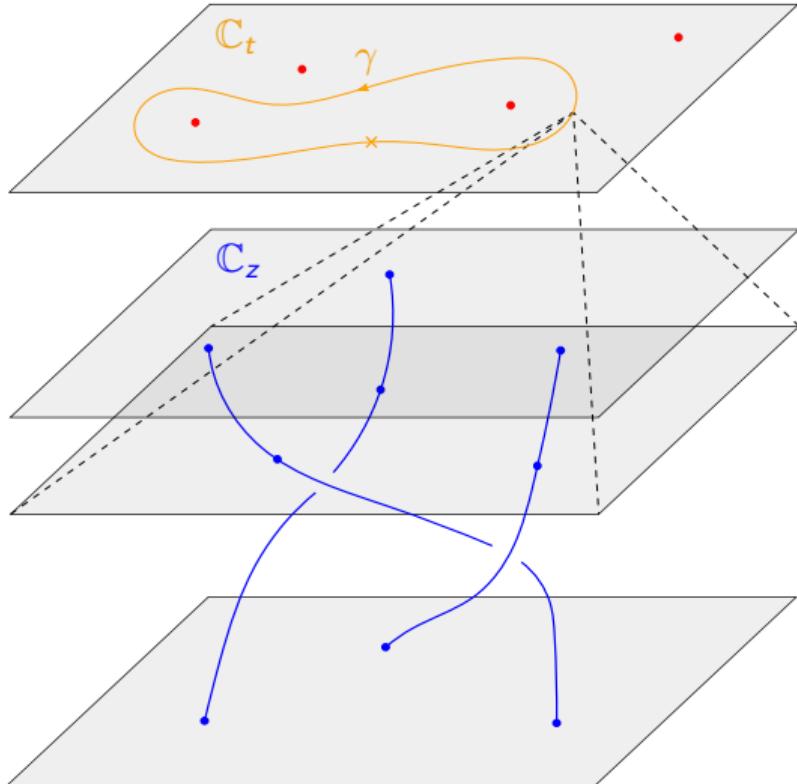
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

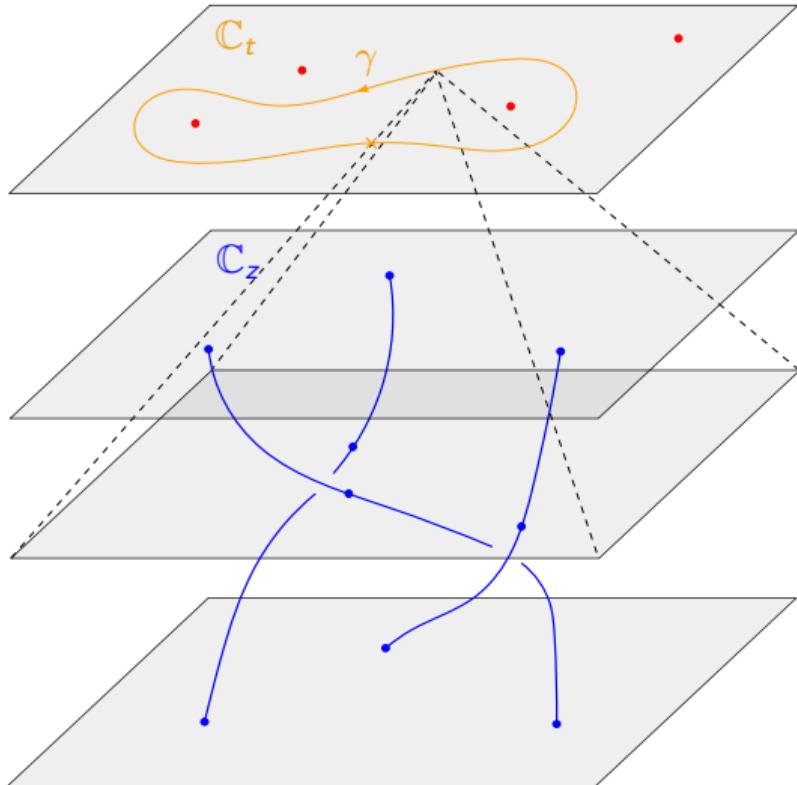
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

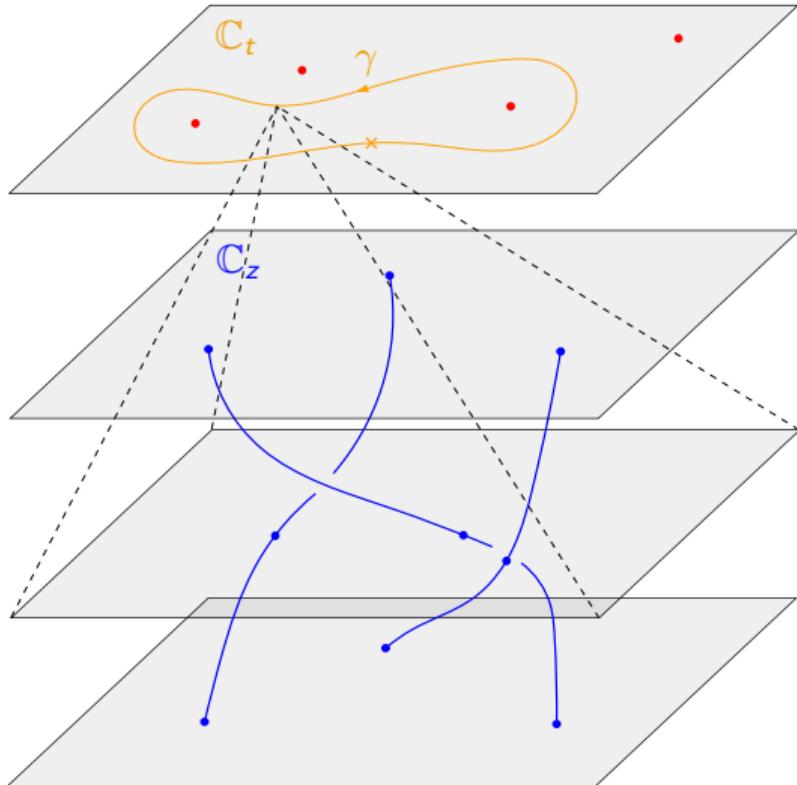
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

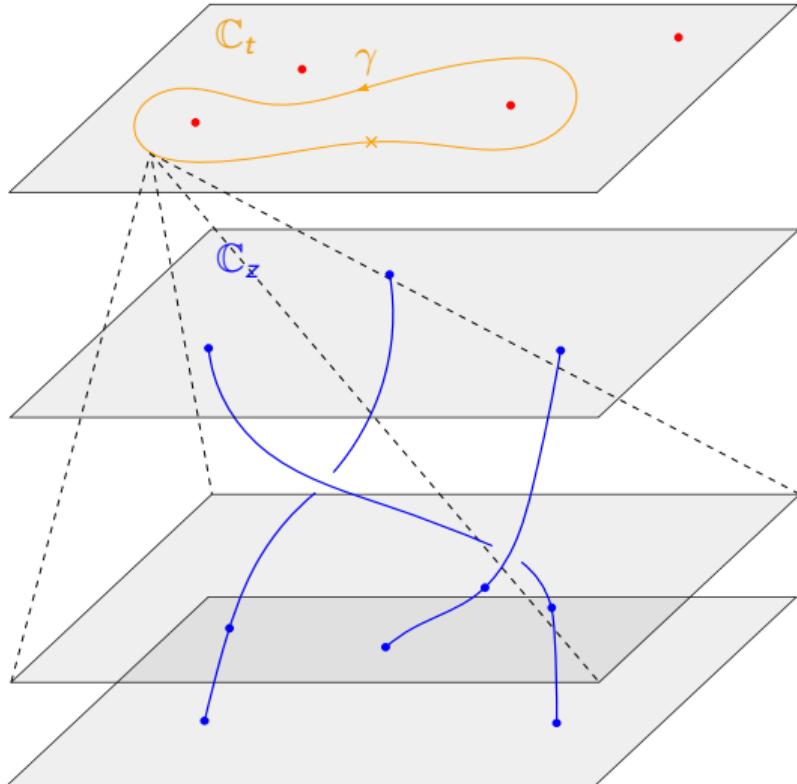
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

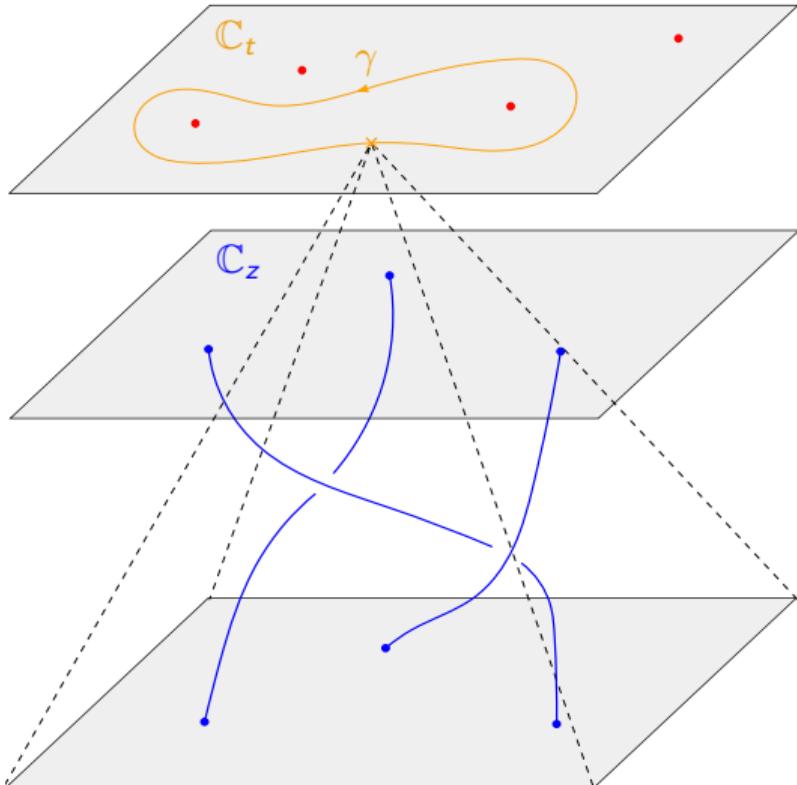
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

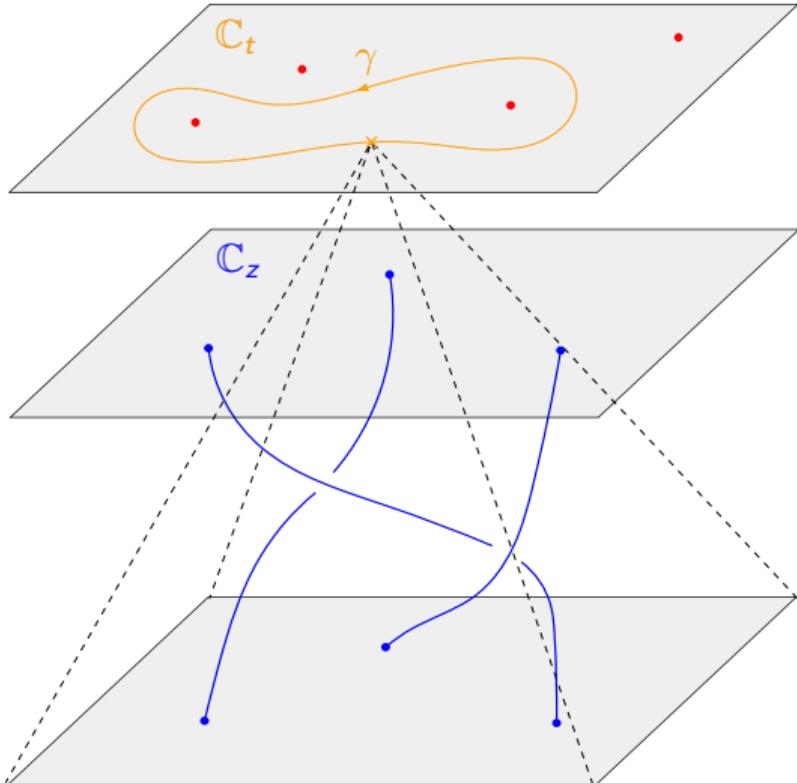
# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

# Motivation: braid computations



## Setup

- Let  $g \in \mathbb{C}[t, z]$ ,
- define  $F_t(z) = g(t, z)$ .
- Let  $b \in \mathbb{C} \setminus \Sigma$  be a base point,
- let  $\gamma : [0, 1] \rightarrow \mathbb{C} \setminus \Sigma$  be a loop starting at  $b$ .
- The displacement of all **roots** of  $F_t$  when  $t$  moves along  $\gamma$  defines a braid.

## Algorithmic goal

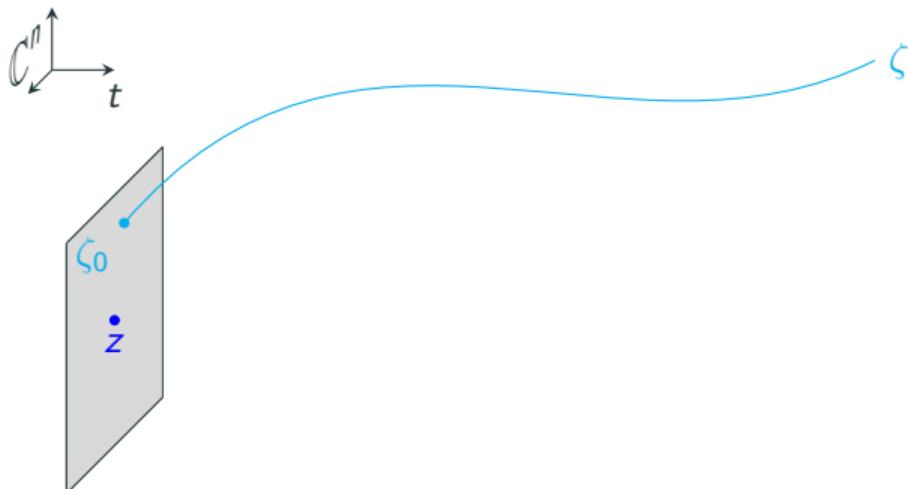
**Input:**  $g, \gamma$

**Output:** the associated braid

**Tool:** certified path tracking

## Generic corrector-predictor loop

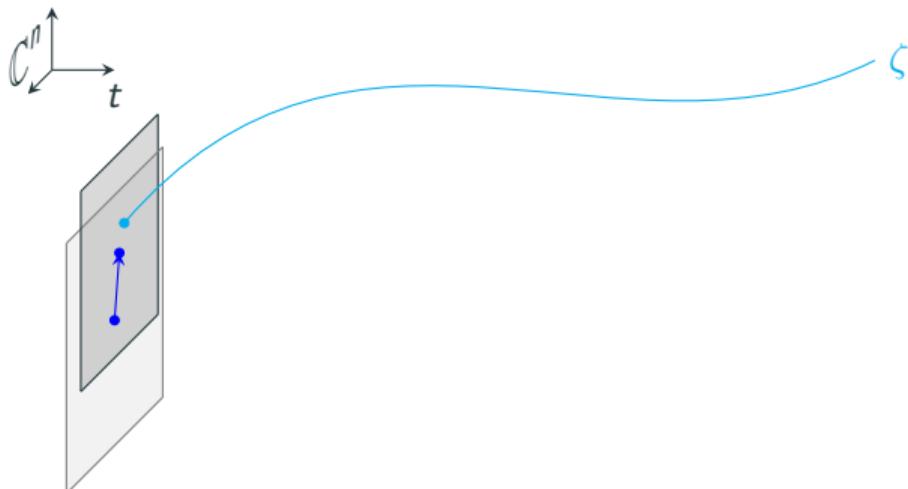
Recall: for all  $t \in [0, 1]$ ,  $F_t(\zeta_t) = 0$



```
def track(F, z):  
    1  t ← 0;    L ← []  
    2  while t < 1:  
    3      z ← refine(F_t, z)  
    4      δ ← validate(F, t, z)  
    5      t ← t + δ  
    6      append (t, z) to L  
    7  return L
```

## Generic corrector-predictor loop

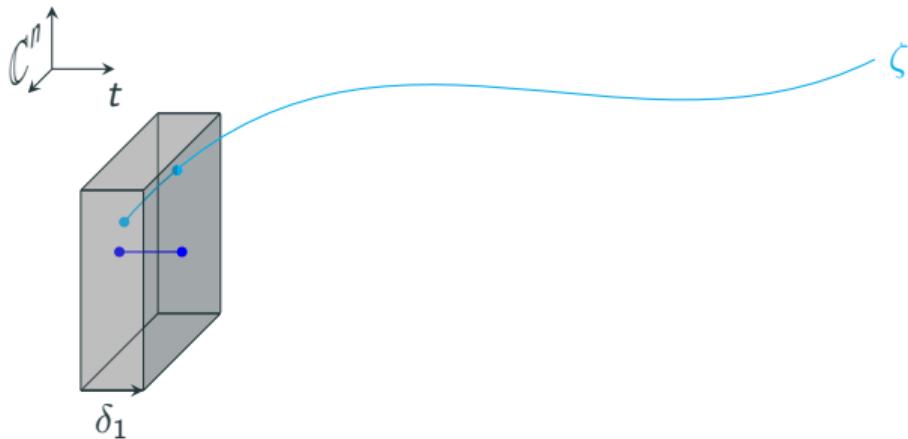
Recall: for all  $t \in [0, 1]$ ,  $F_t(\zeta_t) = 0$



```
def track(F, z):  
    1  t ← 0;    L ← []  
    2  while t < 1:  
    3      z ← refine(F_t, z)  
    4      δ ← validate(F, t, z)  
    5      t ← t + δ  
    6      append (t, z) to L  
    7  return L
```

## Generic corrector-predictor loop

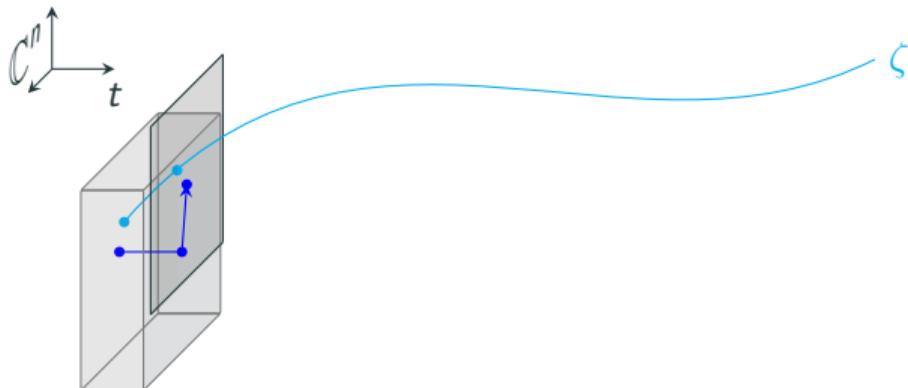
Recall: for all  $t \in [0, 1]$ ,  $F_t(\zeta_t) = 0$



```
def track(F, z):  
    1  t ← 0;    L ← []  
    2  while t < 1:  
    3      z ← refine(F_t, z)  
    4      δ ← validate(F, t, z)  
    5      t ← t + δ  
    6      append (t, z) to L  
    7  return L
```

## Generic corrector-predictor loop

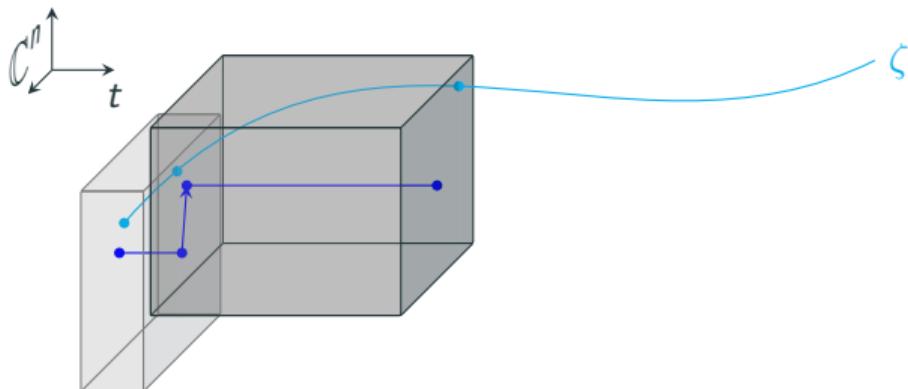
Recall: for all  $t \in [0, 1]$ ,  $F_t(\zeta_t) = 0$



```
def track(F, z):  
    1  t ← 0;    L ← []  
    2  while t < 1:  
    3      z ← refine(F_t, z)  
    4      δ ← validate(F, t, z)  
    5      t ← t + δ  
    6      append (t, z) to L  
    7  return L
```

## Generic corrector-predictor loop

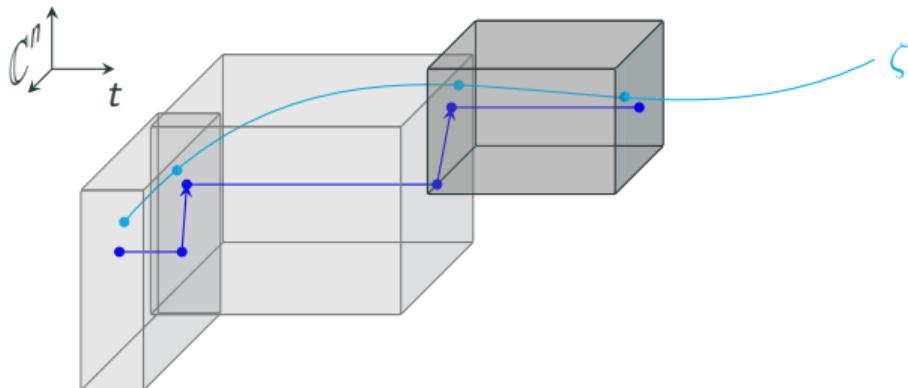
Recall: for all  $t \in [0, 1]$ ,  $F_t(\zeta_t) = 0$



```
def track(F, z):  
    1  t ← 0;    L ← []  
    2  while t < 1:  
    3      z ← refine(F_t, z)  
    4      δ ← validate(F, t, z)  
    5      t ← t + δ  
    6      append (t, z) to L  
    7  return L
```

# Generic corrector-predictor loop

Recall: for all  $t \in [0, 1]$ ,  $F_t(\zeta_t) = 0$



```
def track(F, z):  
    1  t ← 0;    L ← []  
    2  while t < 1:  
    3      z ← refine(F_t, z)  
    4      δ ← validate(F, t, z)  
    5      t ← t + δ  
    6      append (t, z) to L  
    7  return L
```

# Main tool: 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  $x \in A, y \in B$ ,

$$x + y \in A \boxplus B, xy \in A \boxtimes B$$

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

# Main tool: interval arithmetic

## Rational endpoints interval arithmetic

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

# Main tool: interval arithmetic

## Rational endpoints interval arithmetic

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

$$f = x^2 - x + 2, I = [0, 1]$$

- If we decompose  $f$  as  $(x \cdot x - x) + 2$ , we get  $[1, 3]$ .
- If we decompose  $f$  as  $x \cdot (x - 1) + 2$ , we get  $[1, 2]$ .
- Actually,  $f([0, 1]) = [1.75, 2]$ .

- ! Decomposition dependant, dependency issue, overestimation
- ! Coefficient swell (we will address this problem later...)

## 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  $u, v \in B$ ,

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

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

## 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,

$$-Af(z) + [\mathbf{I}_n - A \cdot Jf(z + B)]B \subseteq \rho B.$$

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

# 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,

$$-Af(z) + [I_n - A \cdot Jf(z + B)]B \subseteq \rho B.$$

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

## Proof sketch

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

## Definition

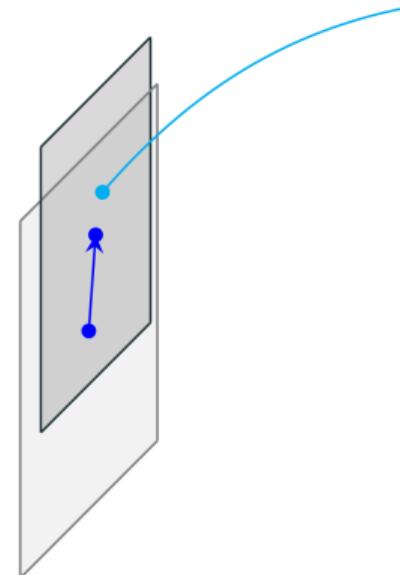
A  $\rho$ -Moore box for  $f$  is a triple  $(z, B, A)$  which satisfies Moore's criterion.

## Refine

**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  $z, B, A$ .

```
def refine(f, z, B, A):
    1   U ← A
    2   while not  $-A \cdot \square f(z) + [I - A \cdot \square Jf(z + B)] B \subseteq \frac{1}{8}B$ :
    3       if left term is small compared to  $\frac{1}{8}B$ :
    4           shrink  $B$ 
    5       else:
    6            $z \leftarrow z - Uf(z)$ 
    7            $A \leftarrow Jf(z)^{-1}$  # unchecked arithmetic
    8   return  $z, B, A$ 
```

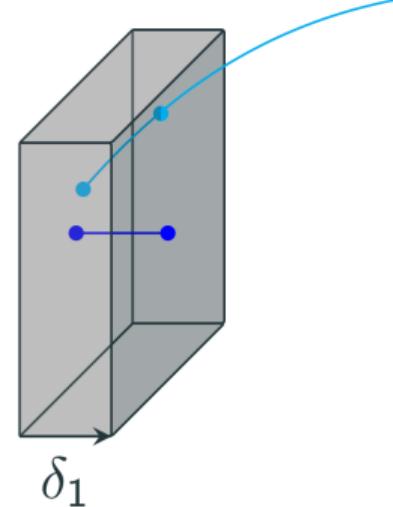


# Validate

**Input:**  $F : \mathbb{C} \times \mathbb{C}^n \rightarrow \mathbb{C}^n$  polynomial;  $t \in [0, 1]$ ;  $z, B, A$  a  $\frac{1}{8}$ -Moore box for  $F_t$ .  
**Output:**  $\delta > 0$  such that for all  $s \in [t, t + \delta]$ ,  $z, B, A$  is a  $\frac{7}{8}$ -Moore box for  $F_s$ .

```
def validate(F, t, z, B, A):
```

```
1   $\delta \leftarrow 1$ 
2   $T \leftarrow [t, t + \delta]$ 
3  while  $-A \cdot \square F_T(z) + [I - A \cdot \square JF_T(z + B)] B \not\subseteq \frac{7}{8}B$ :
4       $\delta \leftarrow \frac{\delta}{2}$ 
5       $T \leftarrow [t, t + \delta]$ 
6  return  $\delta$ 
```



# Important aspects that I did not address

## Model

- ✗ Rational endpoints: coefficient swell
- ✗ 64-bits float interval arithmetic: bad theoretical properties
- ✓ Arbitrary precision interval arithmetic: precision management allows for termination  
It requires careful handling!

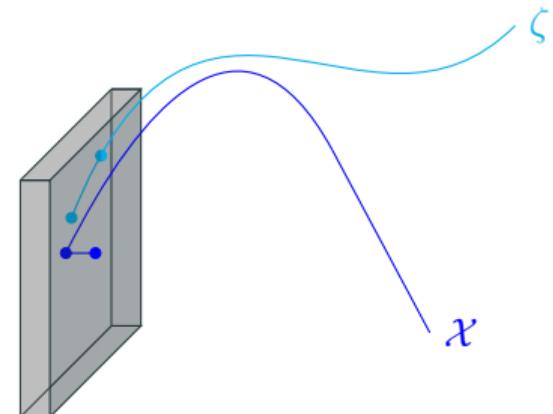
# Important aspects that I did not address

## Model

- ✗ Rational endpoints: coefficient swell
- ✗ 64-bits float interval arithmetic: bad theoretical properties
- ✓ Arbitrary precision interval arithmetic: precision management allows for termination  
It requires careful handling!

## Predictor

- ✗ Check that  $(z, B, A)$  is a Mb for  $F_t$  on  $T$



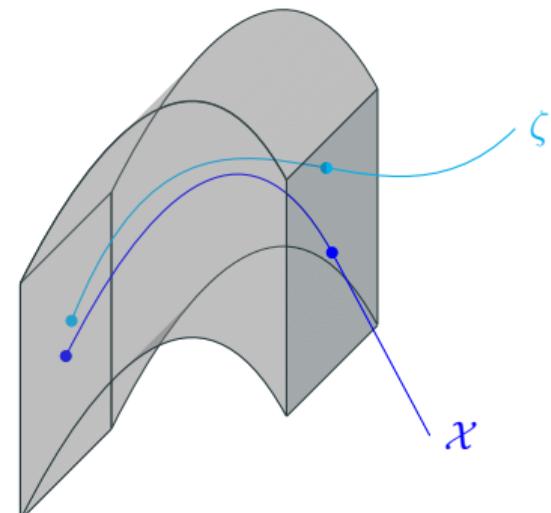
# Important aspects that I did not address

## Model

- ✗ Rational endpoints: coefficient swell
- ✗ 64-bits float interval arithmetic: bad theoretical properties
- ✓ Arbitrary precision interval arithmetic: precision management allows for termination  
It requires careful handling!

## Predictor

- ✗ Check that  $(z, B, A)$  is a Mb for  $F_t$  on  $T$
- ✓ Check that  $(\mathcal{X}(t), B, A)$  is a Mb for  $F_t$  on  $T$ .
- ! Replacing  $T$  by  $\mathcal{X}(T)$  in validate does not work:  
computing directly  $F_T(\mathcal{X}(T))$  suffers from the  
dependency problem (though  $F_s(\mathcal{X}(s)) \approx 0$ )
- 💡 Taylor models: “expand then evaluate”



# Implementation

Algpath is a Rust implementation of the presented algorithm.

## Generic implementation with respect to the interval arithmetic. Can use:

- 64-bit float endpoints. fast cannot increase precision
- Arb<sup>1</sup> (adaptive precision interval arithmetic library). can manage precision slower than float endpoints

## Mixed precision

At each iteration of the main loop, chooses between float endpoints or Arb for the next corrector predictor round, depending on precision. little overhead over float endpoints

## Predictor

Hermite's cubic predictor (degree 3)

---

<sup>1</sup>Johansson. “Arb: Efficient Arbitrary-Precision Midpoint-Radius Interval Arithmetic”.

## Benchmarks

name	dim	degree	HomotopyContinuation.jl			Algpath		
			time (s)	failures	max steps	time (s)	max prec.	max steps
dense	1	1000	11		100	27 min	59	24 k
dense	1	2000	48	3	79	2 h	62	71 k
katsura	21	$2^{20}$	5 h		468	89 h	65	13 k
resultants	3	$16 \cdot 4^2$	7.6		128	160	58	3510
resultants	2	$40 \cdot 5$	4.2	200		13 min	69	2205
structured *	3	$20^3$	3.7	12	164	6.3	56	634
structured *	3	$30^3$	3.5	92	133	97	71	820
$W_{20}$	1	20	2.4	20		3 h	118	2316 k
clustered (10, 5, 10)	1	50	3.8		153	153	70	17 k

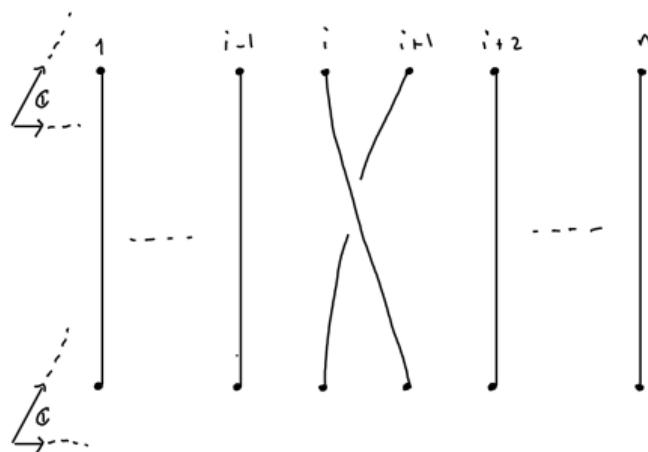
**Figure 1:** Total degree homotopy benchmarks. A \* means that only 100 random roots were tracked.

<sup>2</sup>Breiding and Timme. “HomotopyContinuation.Jl: A Package for Homotopy Continuation in Julia”.

# Introduction to braids

## Definition

The configuration space on  $n$  elements  $C_n$  is  $\{c \subset \mathbb{C} : \text{card}(c) = n\}$  (we call its elements configurations). The (geometric) braid group is  $B_n = \pi_1(C_n, \{1, \dots, n\})$ .



## Theorem [Artin, 1947]

The  $\sigma_i$ 's generate  $B_n$  (+ explicit relations).

## Goal

Given some data representing a braid (e.g. output of Algpather), decompose it in terms of the  $\sigma_i$ 's.

Figure 2: Standard generator  $\sigma_i$

# Computing a decomposition

**Input:**  $\gamma_1, \dots, \gamma_n$  continuous paths in  $\mathbb{C}$  such that  $\gamma_i(t) \neq \gamma_j(t)$  for all  $i \neq j$  and  $t \in [0, 1]$

**Output:** a decomposition in standard generators of the braid induced by the input

## Naive idea

Project on the real axis, process crossings in order.

- ! Multiple/non transversal crossings
- ! The output of Algpath is a piecewise tubular neighborhood around each strand. Each piece follows a degree three curve.

## Work in progress

- ✓ Refine the naive approach
- ⚙️ Prove correction and termination
- ⚙️ Implement and pipe the output of Algpath

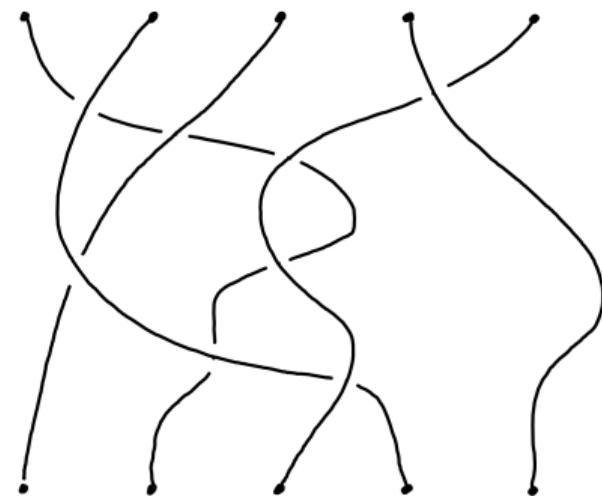


Figure 3:  $\sigma_4\sigma_1^{-1}\sigma_2^{-1}\sigma_3^{-1}\sigma_3\sigma_1\sigma_2\sigma_3^{-1}$

## References i

-  Artin, E. (1947). Theory of Braids. *Annals of Mathematics*, 48(1), 101–126.
-  Breiding, P., & Timme, S. (2018). HomotopyContinuation.jl: A Package for Homotopy Continuation in Julia. In J. H. Davenport, M. Kauers, G. Labahn, & J. Urban (Eds.), *Mathematical Software – ICMS 2018* (pp. 458–465). Springer International Publishing.
-  Johansson, F. (2017). Arb: Efficient Arbitrary-Precision Midpoint-Radius Interval Arithmetic. *IEEE Transactions on Computers*, 66(8), 1281–1292.
-  Krawczyk, R. (1969). Newton-Algorithmen zur Bestimmung von Nullstellen mit Fehlerschranken. *Computing*, 4(3), 187–201.
-  Moore, R. E. (1977). A Test for Existence of Solutions to Nonlinear Systems. *SIAM Journal on Numerical Analysis*, 14(4), 611–615. Retrieved February 19, 2024, from <https://www.jstor.org/stable/2156481>
-  Rump, S. M. (1983). SOLVING ALGEBRAIC PROBLEMS WITH HIGH ACCURACY. In U. W. Kulisch & W. L. Miranker (Eds.), *A New Approach to Scientific Computation* (pp. 51–120). Academic Press.

# Test data

We tested systems of the form  $g_t(z) = tf^\odot(z) + (1-t)f^\triangleright(z)$  ( $f^\triangleright$  is the start system,  $f^\odot$  is the target system).

## Target systems

- Dense:  $f_i^\odot$ 's of given degree with random coefficients
- Structured:  $f_i^\odot$ 's of the form  $\pm 1 + \sum_{i=1}^5 \left( \sum_{j=1}^n a_{i,j} z_j \right)^d$ ,  $a_{i,j} \in_R \{-1, 0, 1\}$
- Katsura family (sparse - high dimension - low degree)

## Start systems

- Total degree homotopies:  $f_i^\triangleright$ 's of the form  $\gamma_i(z_i^{d_i} - 1)$ ,  $\gamma_i \in_R \mathbb{C}$ ,  $d_i = \deg f_i^\odot$
- Newton homotopies:  $f^\triangleright(z) = f^\odot(z) - f^\odot(z_0)$