## PeACE

Polynômes et Applications via Calculs Efficaces

Matías R. Bender



#### Since 2019 - Postdoctoral researcher

Inst. für Mathematik - Technische Univ. Berlin Mentored by P. Bürgisser



#### 2016 - 2019 - Ph.D. in Informatics

LIP6 - Sorbonne Université

Algorithms for sparse polynomial systems:

Gröbner basis and resultants

Supervised by J.-C. Faugère & E. Tsigaridas

(Qualified in sections 25, 26, and 27 for MCF)

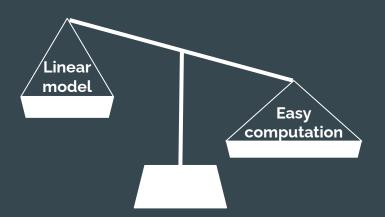


#### 2015 - M.Sc. in Computer Science

DC - FCEN - Universidad de Buenos Aires



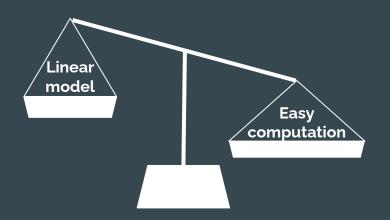
2014 - Exchange - Univ. Autónoma de Madrid



# Linear algebra

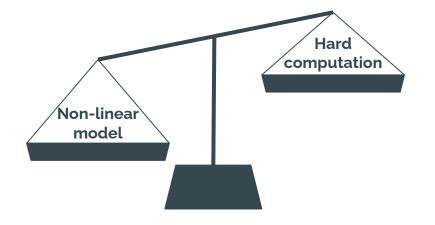
$$\left\{
\begin{array}{c}
3 \cdot x + 2 \cdot y = 5 \\
4 \cdot x - 3 \cdot y = 2
\end{array}
\right\}$$





# Linear algebra

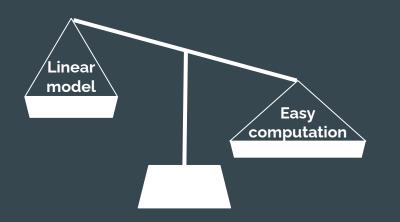
$$\left\{
\begin{array}{c}
3 \cdot x + 2 \cdot y = 5 \\
4 \cdot x - 3 \cdot y = 2
\end{array}
\right\}$$



# Non-linear algebra

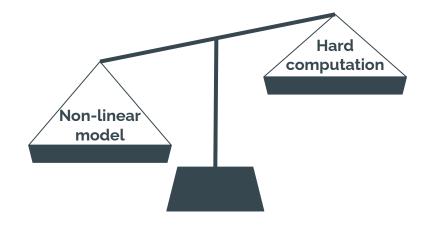
$$\left\{ \begin{array}{c} 3 \cdot x^2 + 4 \cdot x \cdot y + 2 \cdot y^2 + x + 2 \cdot y = 5 \\ 6 \cdot x^2 + 2 \cdot x \cdot y + 3 \cdot y^2 - x + 3 \cdot y = 9 \end{array} \right\}$$





# Linear algebra

$$\left\{
\begin{array}{c}
3 \cdot x + 2 \cdot y = 5 \\
4 \cdot x - 3 \cdot y = 2
\end{array}
\right\}$$



# Non-linear algebra

$$\left\{ \begin{array}{c} 3 \cdot x^2 + 4 \cdot x \cdot y + 2 \cdot y^2 + x + 2 \cdot y = 5 \\ 6 \cdot x^2 + 2 \cdot x \cdot y + 3 \cdot y^2 - x + 3 \cdot y = 9 \end{array} \right\}$$



**Pragmatic approach:** Use non-linear model, if we can compute with it

My objective: Study trade-off for non-linear systems in practice

Numerical paradigm (Since PhD) (Since Postdoc) Symbolic paradigm

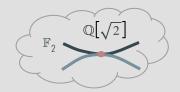
### Symbolic paradigm

**Exact computations** 

- Finite fields
- Algebraic extensions
- Degenerate situations

(Since PhD)

$$\sqrt{5+2\sqrt{6}}-\sqrt{3}=\sqrt{2}$$



Numerical paradigm

(Since Postdoc)

### Symbolic paradigm

(Since PhD)

 $\sqrt{5+2\sqrt{6}-\sqrt{3}}=\sqrt{2}$ 

Numerical paradigm

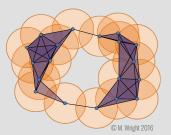
(Since Postdoc)

**Exact computations** 

- Finite fields
- Algebraic extensions
- Degenerate situations



Cryptography



Topological data analysis

Gröbner bases

### Symbolic paradigm

**Exact computations** 

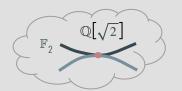
- Finite fields
- Algebraic extensions
- Degenerate situations

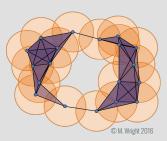


Cryptography

(Since PhD)

$$\sqrt{5+2\sqrt{6}}-\sqrt{3}=\sqrt{2}$$





Topological data analysis

Gröbner bases

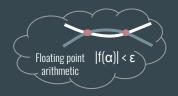
### Numerical paradigm

Numerical manipulations

- Inexact input
- Finite- and multi-precision
- Approximate solutions

(Since Postdoc)

$$\sqrt{5 + 2\sqrt{6}} - \sqrt{3} \approx 1.414214$$



### Symbolic paradigm

**Exact computations** 

- Finite fields
- Algebraic extensions
- Degenerate situations

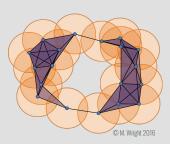


Cryptography

(Since PhD)

$$\sqrt{5+2\sqrt{6}}-\sqrt{3}=\sqrt{2}$$





Topological data analysis

Gröbner bases

### Numerical paradigm

Numerical manipulations

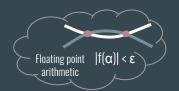
- Inexact input
- Finite- and multi-precision
- Approximate solutions



Geometric modeling

(Since Postdoc)

$$\sqrt{5+2\sqrt{6}} - \sqrt{3} \approx 1.414214$$





Computer vision

Symbolic-numeric algorithms, homotopy continuation

## Computing with polynomials → My research

Symbolic paradigm

(Since PhD)

**Publications** 

Journals 1 PhD

4 PhD + 1 Postdoc Proceedings of International Conferences

🙀 Distinguished student author award, ISSAC 2016

1 Postdoc **Preprints** 

Software

Muphasa (C++), Classifier-construction (Python)

Numerical paradigm

(Since Postdoc)

**Publications** 

Journals 2 Postdoc

New! Accepted paper in Mathematics of Computations - AMS

**Preprints** 1 Postdoc

Software

EigenvalueSolver.jl (Julia), sylvesterMEP (Matlab)



Invited tutorial in ISSAC 2022 (flagship conference on symbolic and algebraic computations)

#### Co-authors



J.-C. Faugère, E. Tsigaridas (INRIA Paris, advisors) A. Mantzaflaris (INRIA Sophia-Antipolis) L. Perret (LIP6. Sorbonne Université)



C. Haase, R. Schwieger, H. Siebert (FU Berlin) S. Telen (Max Planck Inst. for Math. in the Sciences)



O. Gäfvert (Oxford)



M. Lesnick (SUNY Albany)

# Simplified dictionary of algebraic tools

## Simplified dictionary of algebraic tools

Gröbner bases (arbitrary systems)

- Main algorithmic tool to manipulate polynomials exactly.
- Non-linear analog of row echelon form.





## Simplified dictionary of algebraic tools

Gröbner bases (arbitrary systems)

- Main algorithmic tool to manipulate polynomials exactly.
- Non-linear analog of row echelon form.
- They can solve polynomials or certify if no solutions.



Multiplication map (only finite solutions)

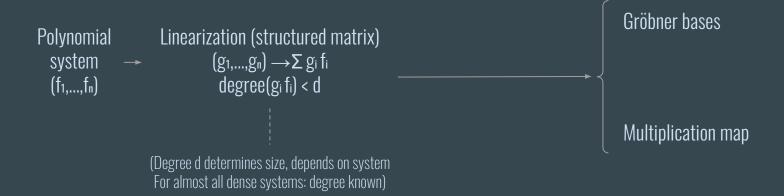
- Solve system by computing eigenvalues.
- Non-linear analog of companion matrix of univariate polynomial.
- Compatible with numerical computations!



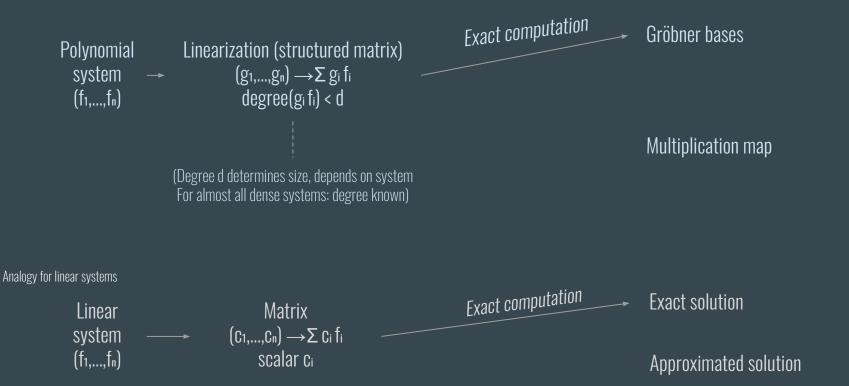


Polynomial Linearization (structured matrix) system 
$$(g_1,...,g_n) \to \Sigma \, g_i \, f_i$$
  $(f_1,...,f_n)$  degree( $g_i \, f_i$ ) < d Multiplication map



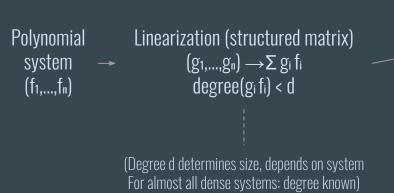






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(Important: speed up - exploit matrix structure)



Exact computation Gröbner bases

(e.g., Buchberger, Faugère, Lazard, Mora, Stillman...)

Multiplication map

Analogy for linear systems



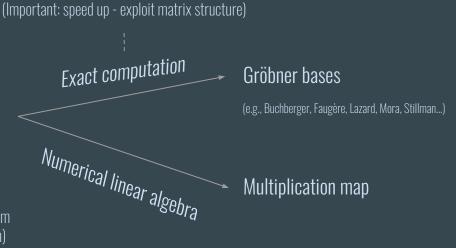
Matrix ---- (c1,...,cπ) →Σ ci fi scalar ci Exact computation

Exact solution

Approximated solution

Polynomial System System  $(g_1,...,g_n) \rightarrow \Sigma g_i f_i$   $(f_1,...,f_n)$  degree  $(g_i f_i) < d$  (Degree d determines size, depends on system

For almost all dense systems: degree known)



Analogy for linear systems

Linear system (f<sub>1,...,f<sub>n</sub>)</sub> Matrix → (c1,...,cn) →Σ ci fi scalar ci Exact computation

Numerical linear algebra

**Exact solution** 

Approximated solution

Polynomial system  $(g_1,...,g_n) \rightarrow \Sigma g_i$   $f_i$   $(g_1,...,g_n) \rightarrow \Sigma g_i$   $(g_1,...,g_n) \rightarrow$ 

Analogy for linear systems



Exact computation

Numerical linear algebra

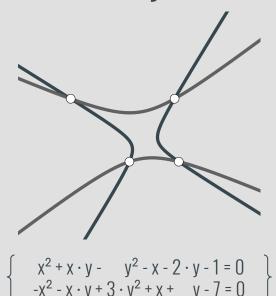
(Important: speed up - exploit matrix structure)

Exact solution

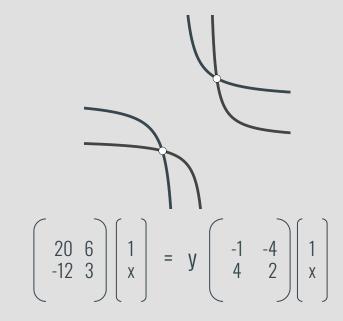
Approximated solution

# In practice, polynomials have structure

### **Generic system**



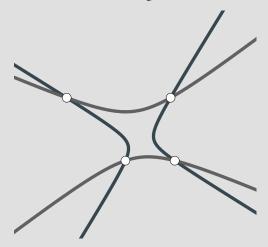
## Generalized eigenvalue problem



**Sparsity:** Polynomial with a few monomials

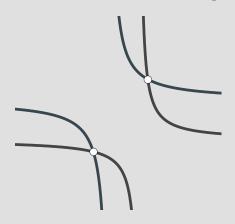
# In practice, polynomials have structure

### **Generic system**



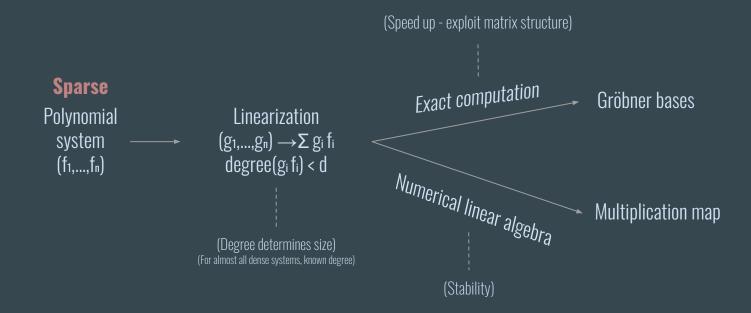
$$\begin{cases} x^2 + x \cdot y - y^2 - x - 2 \cdot y - 1 = 0 \\ -x^2 - x \cdot y + 3 \cdot y^2 + x + y - 7 = 0 \end{cases}$$

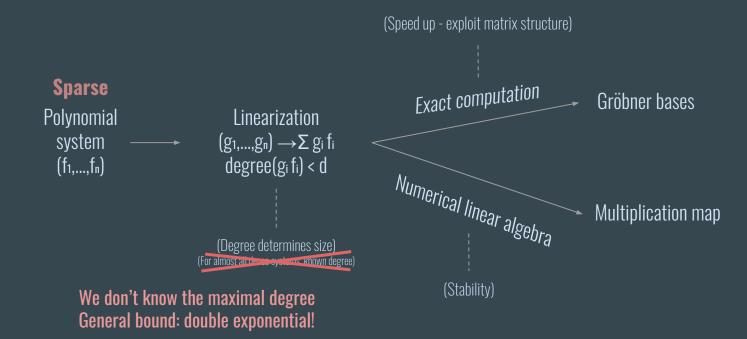
## Generalized eigenvalue problem



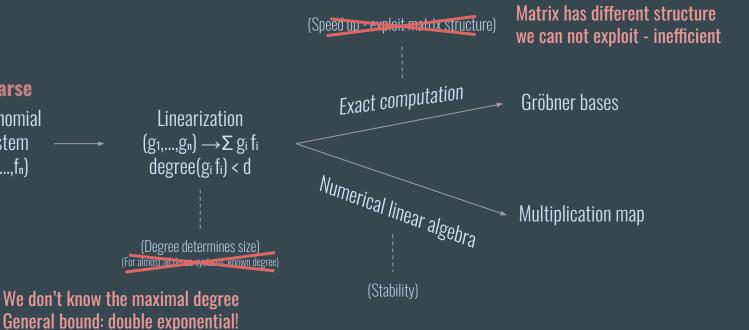
$$\left\{ \begin{array}{l} 0 \cdot x^2 - 4 \cdot x \cdot y - 0 \cdot y^2 + 6 \cdot x - y + 20 = 0 \\ 0 \cdot x^2 + 2 \cdot x \cdot y - 0 \cdot y^2 + 3 \cdot x + 4 \cdot y - 12 = 0 \end{array} \right\}$$

**Sparsity:** Polynomial with a few monomials





- Study special systems, e.g., bi- or weighted homogeneous.
- Discover the structure of the matrix "on the fly".



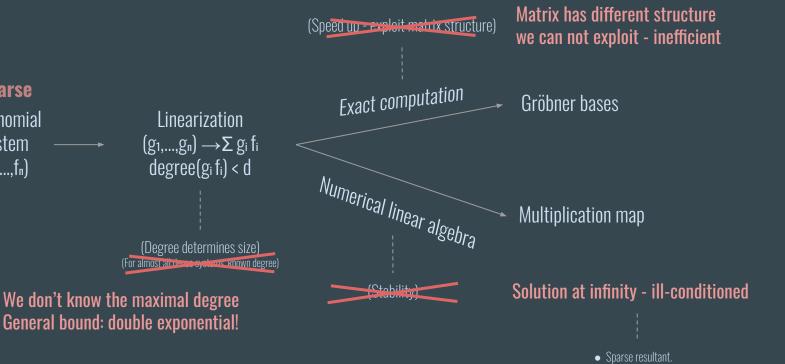
Sparse

**Polynomial** 

system

 $(f_1,...,f_n)$ 

- Study special systems, e.g., bi- or weighted homogeneous.
- Discover the structure of the matrix "on the fly".

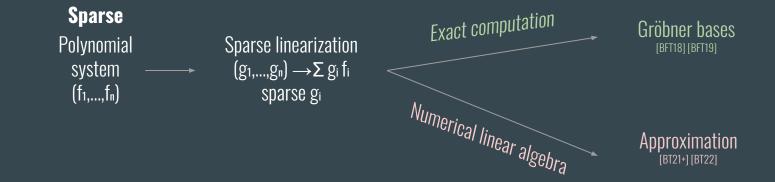


Sparse

**Polynomial** 

system

 $(f_1,...,f_n)$ 



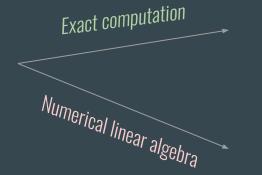
- during PhD
- during Postdoc

#### Sparse

Polynomial system (f1,...,fn)

Sparse linearization  $(g_1,...,g_n) \longrightarrow \Sigma g_i f_i$  sparse  $g_i$ 

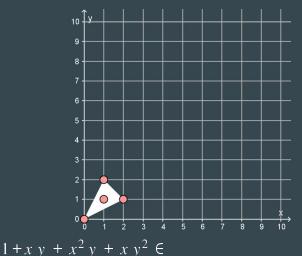
(e.g., Canny, Cox, D'Andrea, Dickenstein, Emiris, Sturmfels...'



Gröbner bases

Approximation [BT21+] [BT22]





 $\mathbb{C}[x,y]$ 

### **Contributions**

- during PhD
- during Postdoc

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PeACE: Polynomials & applications

March 15, 2022

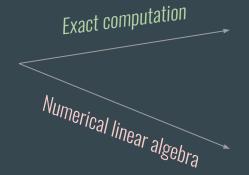
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#### Sparse

Polynomial system (f1,...,fn)

Sparse linearization (g<sub>1</sub>,...,g<sub>n</sub>) →Σ g<sub>i</sub> f<sub>i</sub> sparse g<sub>i</sub>

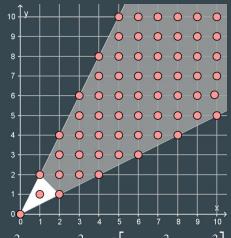
(e.g., Canny, Cox, D'Andrea, <u>D</u>ickenstein, Emiris, Sturmfels...'



Gröbner bases

Approximation [BT21+] [BT22]

#### Mathematical foundation $\rightarrow$ Toric geometry



• during PhD

• during Postdoc

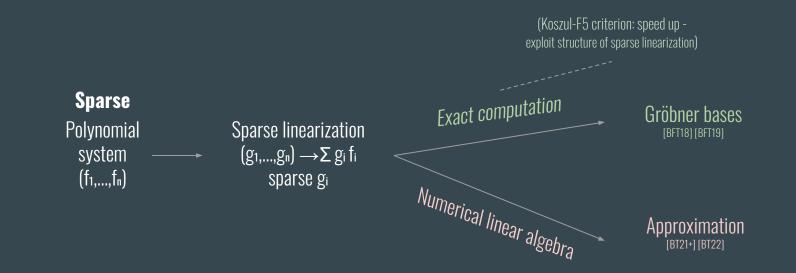
 $1+x\,y\,+\,x^2\,y\,+\,x\,y^2\in\mathbb{C}\big[x\,y,x^2\,y,x\,y^2\big]\subseteq\mathbb{C}\big[x,y\big]$ 

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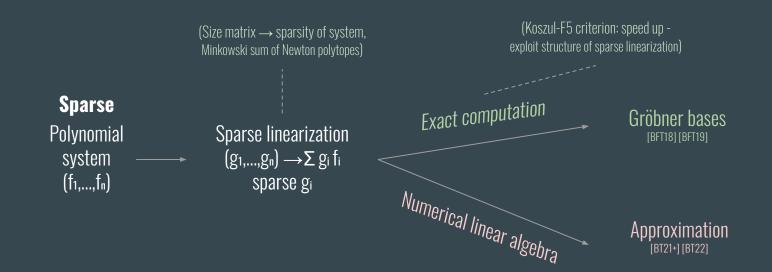
PeACE: Polynomials & applications

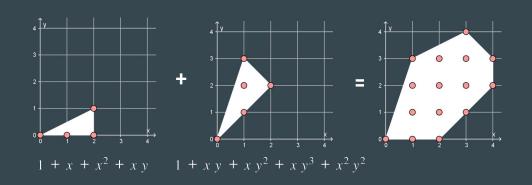
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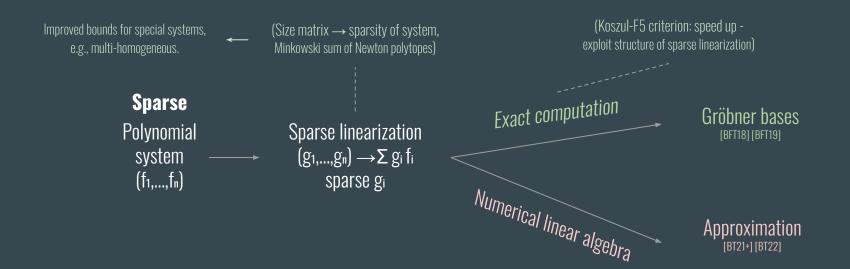


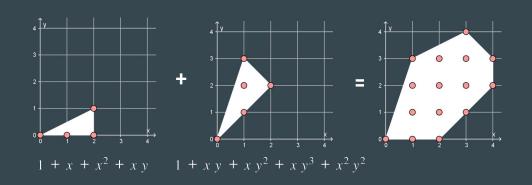
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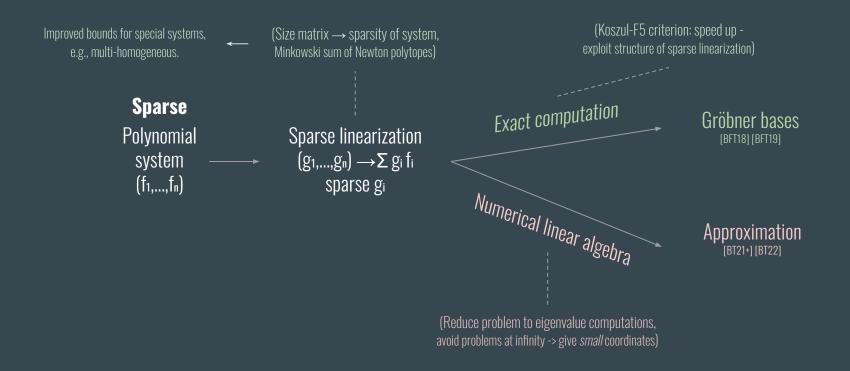


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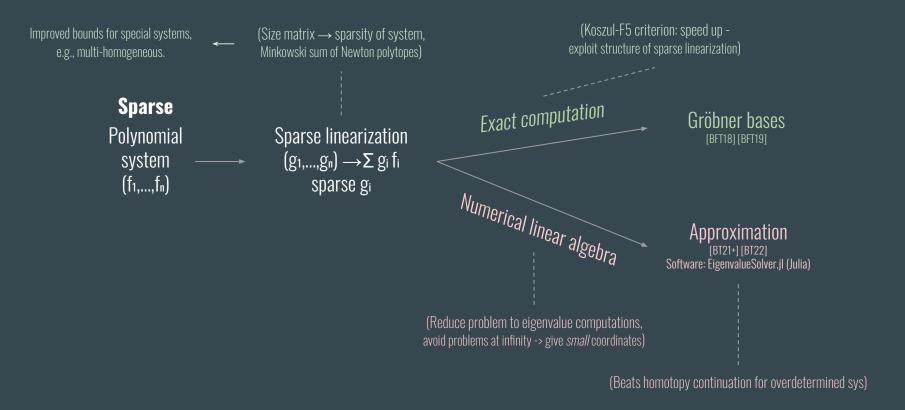




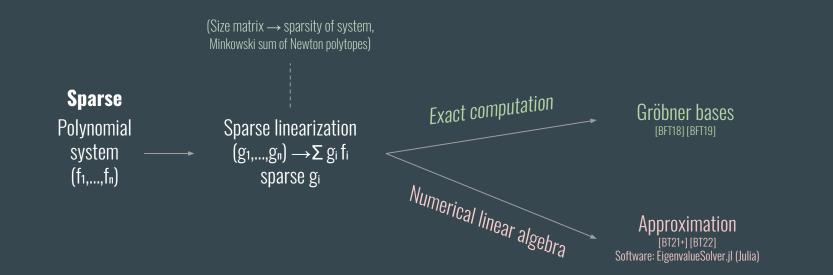
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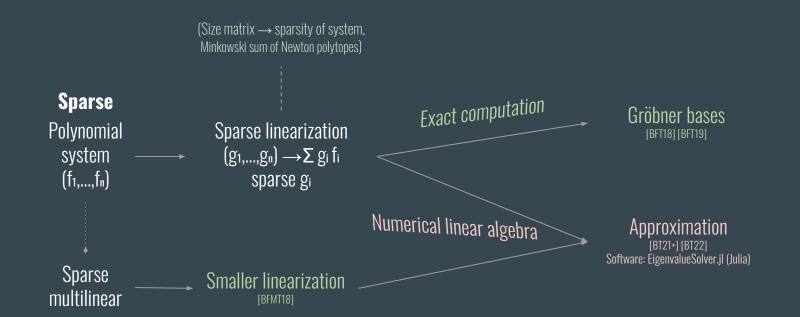
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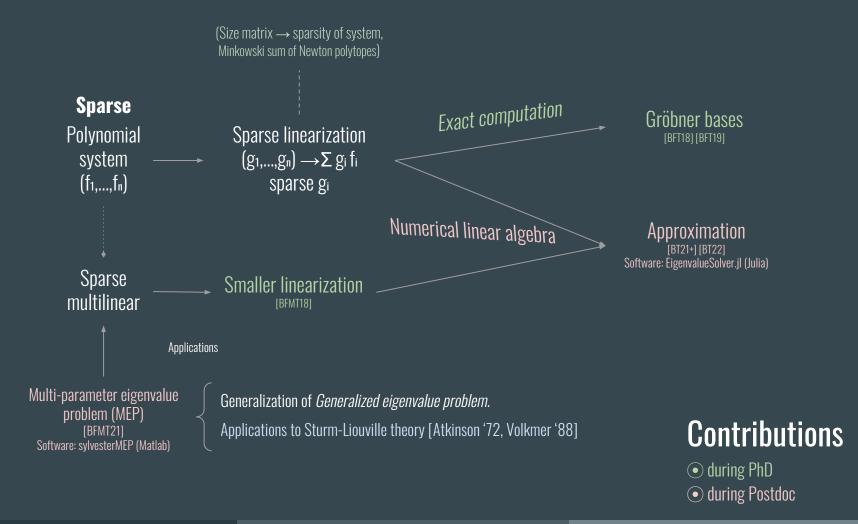
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- during PhD
- during Postdoc



- during PhD
- during Postdoc

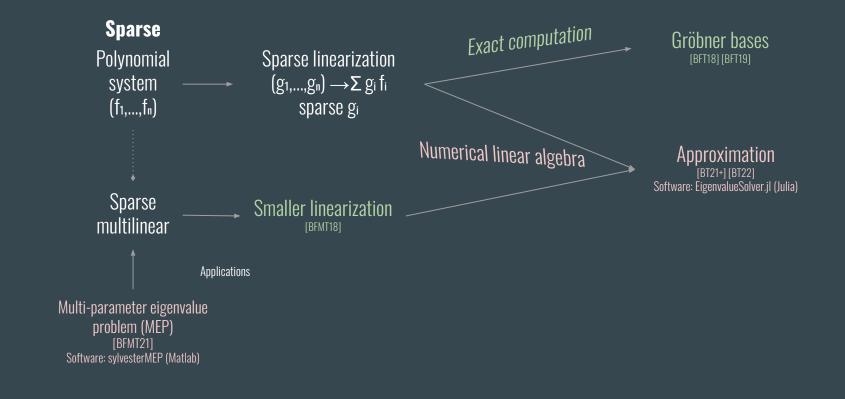


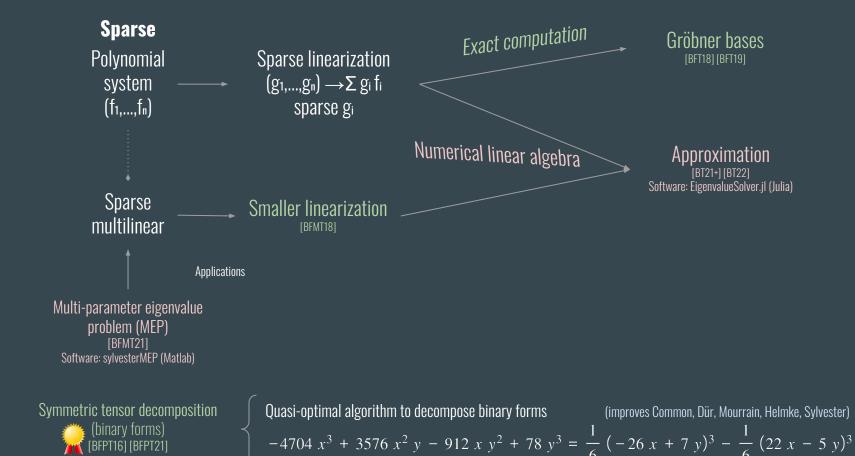
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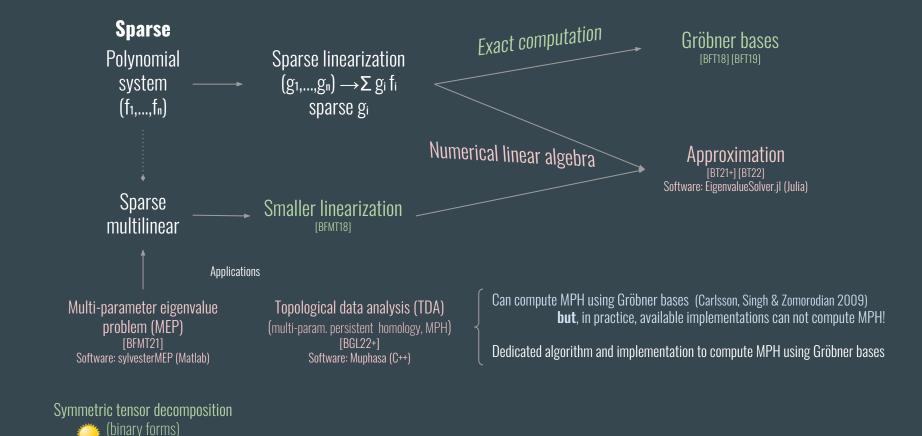
PeACE: Polynomials & applications

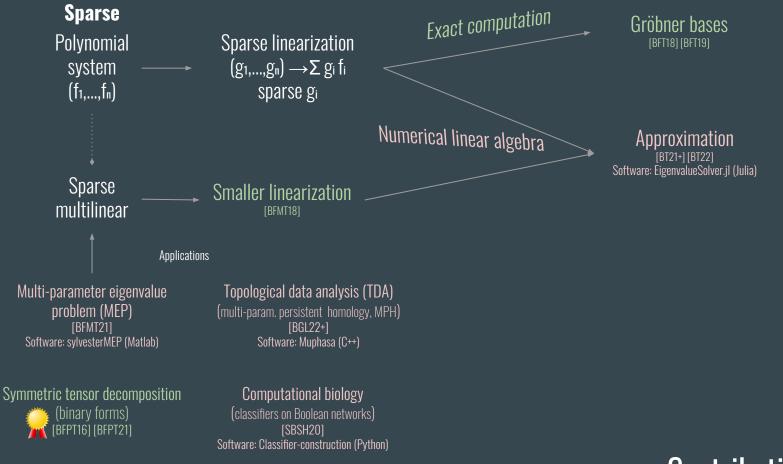
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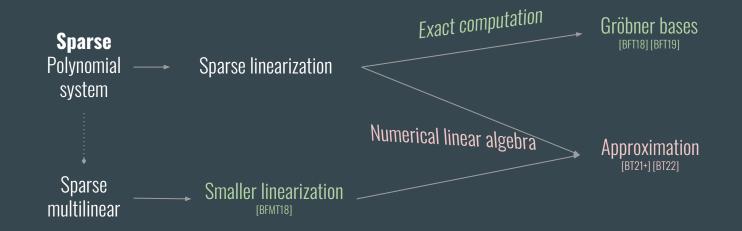
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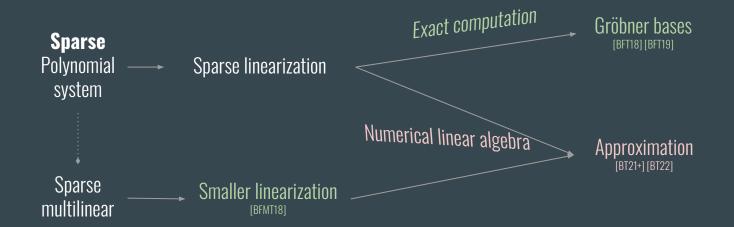


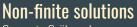




### Non-finite solutions

Compute Gröbner bases

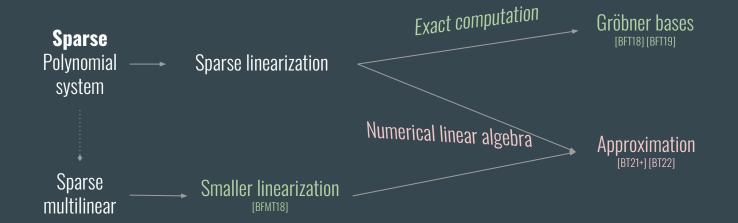




Compute Gröbner bases

#### **Efficient implementations**

C/C++ implementation, incorporate other linear algebra speed-ups (F4)

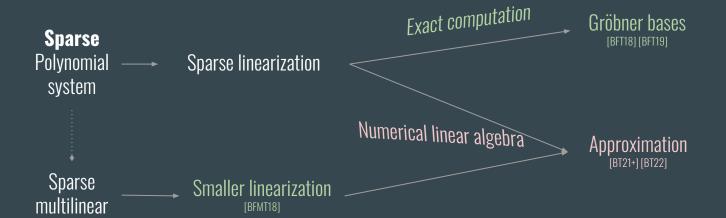


#### Non-finite solutions

Compute Gröbner bases

#### **Efficient implementations**

C/C++ implementation, incorporate other linear algebra speed-ups (F4)



### **Precision analysis**

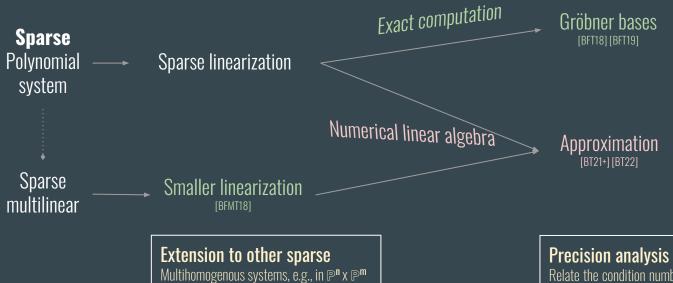
Relate the condition number of matrices to the conditioning of systems (missing in dense case also!)

#### Non-finite solutions

Compute Gröbner bases

#### **Efficient implementations**

C/C++ implementation, incorporate other linear algebra speed-ups (F4)



Relate the condition number of matrices to the conditioning of systems (missing in dense case also!)

#### Structured systems

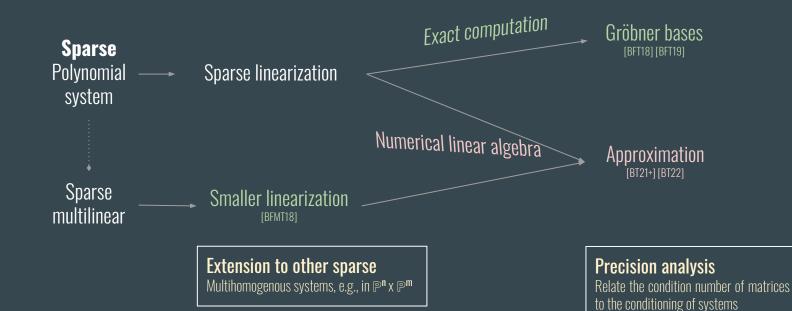
Use toric degenerations to treat them as sparse

#### Non-finite solutions

Compute Gröbner bases

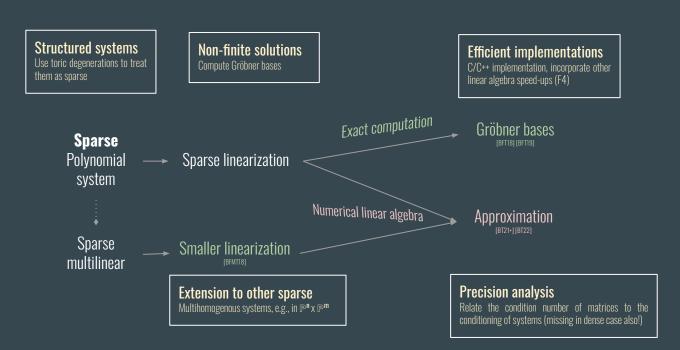
#### **Efficient implementations**

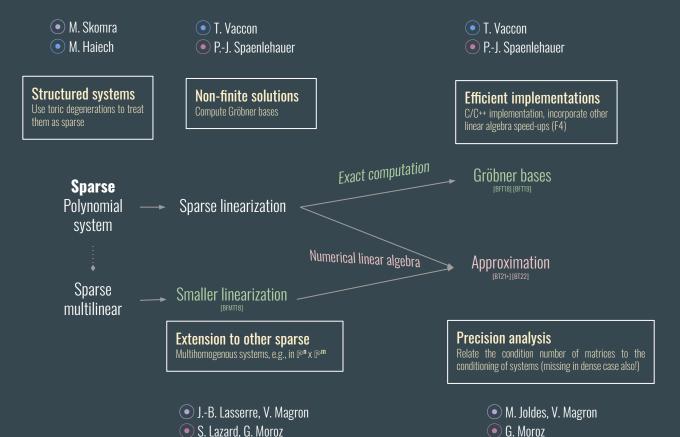
C/C++ implementation, incorporate other linear algebra speed-ups (F4)



# **Future** work

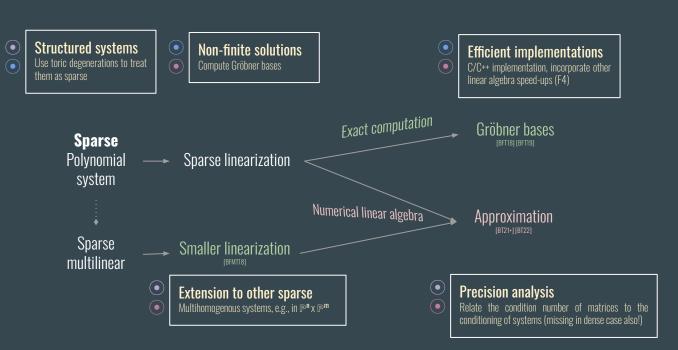
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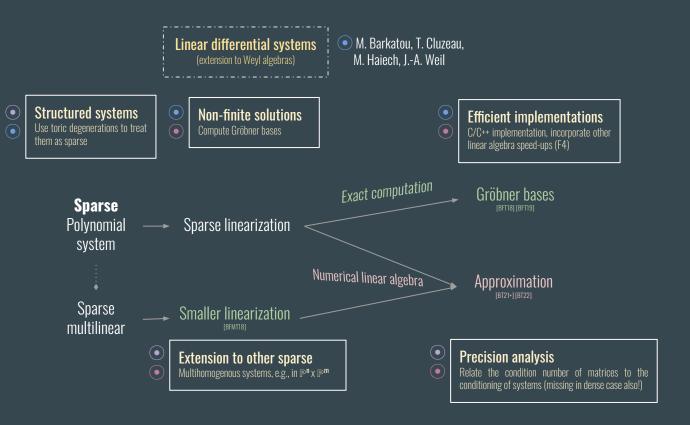
### Integration

- LAAS Toulouse
   Laboratoire d'Analyse et d'Architecture des Systèmes
- XLIM Limoges Institut de Recherche XLIM
- LORIA Nancy
   Laboratoire Lorrain de recherche en Informatique et ses Applications



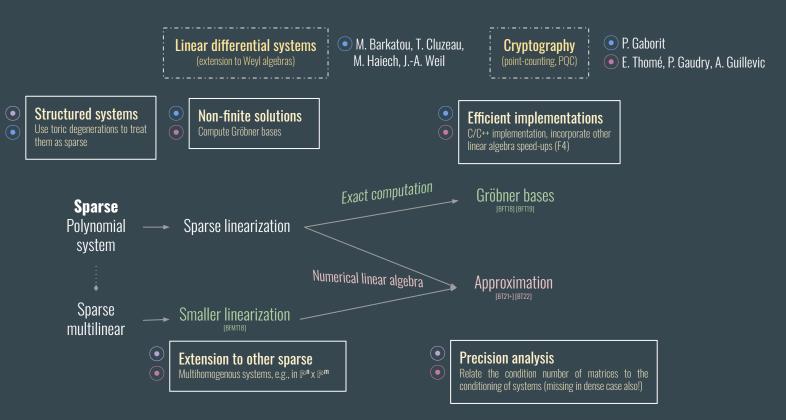
#### Integration

- LAAS (Toulouse)
- XLIM (Limoges)
- LORIA (Nancy)



Integration

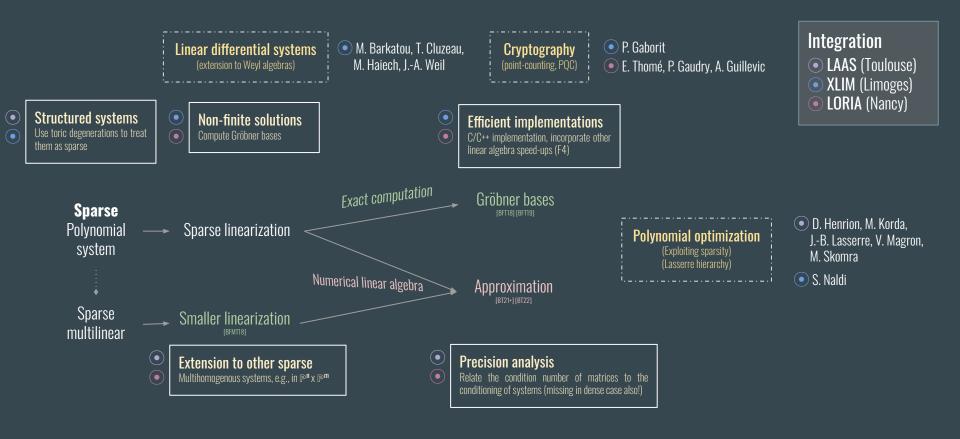
LAAS (Toulouse)XLIM (Limoges)LORIA (Nancy)

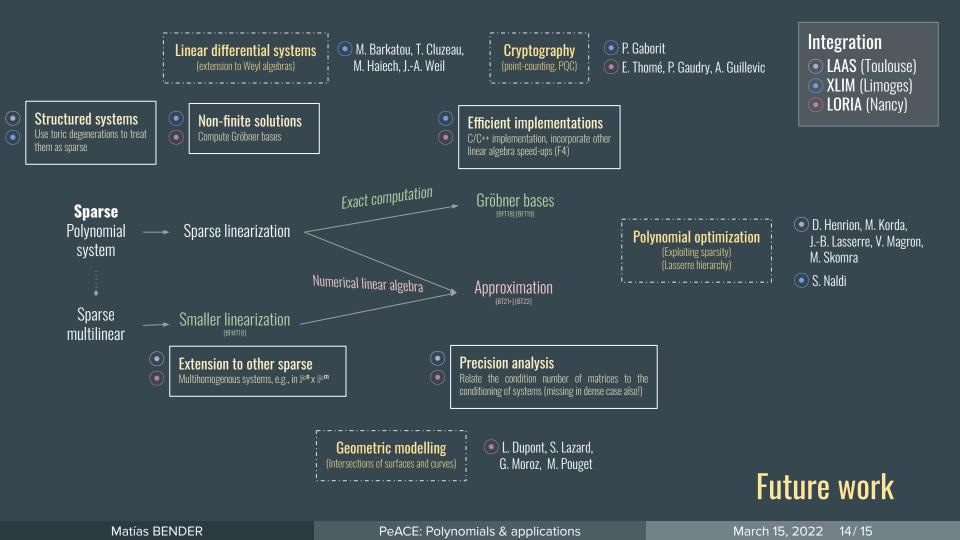


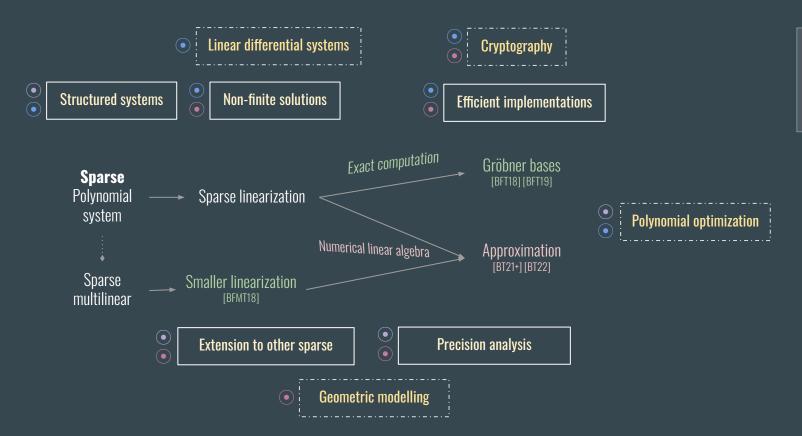
Integration

LAAS (Toulouse)

XLIM (Limoges) LORIA (Nancy)

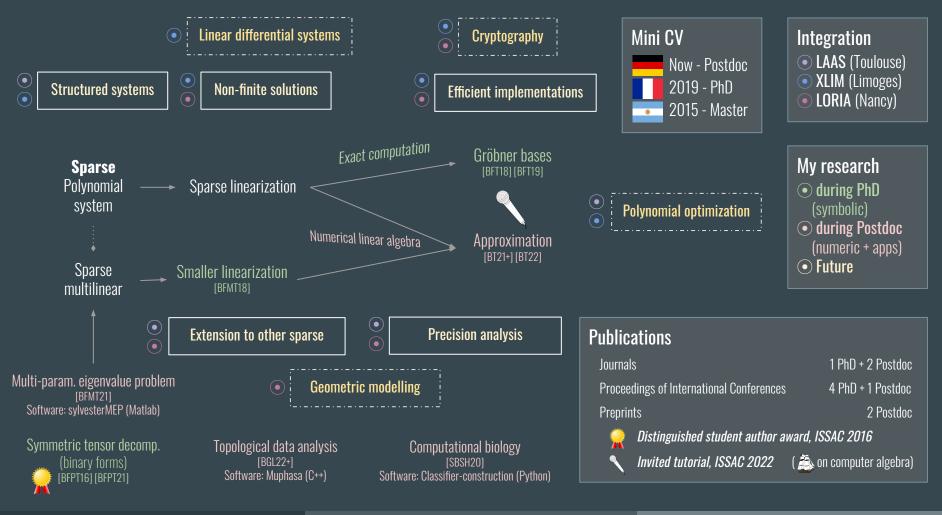






#### Integration

- LAAS (Toulouse)
- XLIM (Limoges)
- LORIA (Nancy)



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# **Publications**

#### **Journals**

- Toric Eigenvalue Methods for Solving Sparse Polynomial Systems. Matías R. Bender and Simon Telen. Mathematics of Computation AMS, 2022. In press. (Recently accepted)
- [BFMT21] Koszul-type determinantal formulas for families of mixed multilinear systems. Matías R. Bender, Jean-Charles Faugère, Angelos Mantzaflaris, and Elias Tsigaridas. SIAM Journal on Applied Algebra and Geometry, 2021.
- [BFPT21] A nearly optimal algorithm to decompose binary forms. Matías R. Bender, Jean-Charles Faugère, Ludovic Perret, and Elias Tsigaridas. Journal of Symbolic Computation, 2021.

#### International conferences

- [SBSH20] Classifier Construction in Boolean Networks Using Algebraic Methods. Robert Schwieger, Matías R. Bender, Heike Siebert, and Christian Haase. Computational Methods in Systems Biology, Lecture Notes in Computer Science, 2020.
- Gröbner Basis over Semigroup Algebras: Algorithms and Applications for Sparse Polynomial Systems. Matías R. Bender, Jean-Charles Faugère, and Elias Tsigaridas. Proceedings of the 44th International Symposium on Symbolic and Algebraic Computation, 2019.
- [BFMT18] Towards Mixed Gröbner Basis algorithms: the Multihomogeneous and Sparse case. Matías R. Bender, Jean-Charles Faugère, and Elias Tsigaridas. Proceedings of the 43th International Symposium on Symbolic and Algebraic Computation, 2018.
- Bilinear systems with two supports: Koszul resultant matrices, eigenvalues, and eigenvectors. Matías R. Bender, Jean-Charles Faugère, Angelos Mantzaflaris, and Elias Tsigaridas. Proceedings of the 43th International Symposium on Symbolic and Algebraic Computation, 2018.
- [BFPT16] A Superfast Algorithm to Decompose Binary Forms. Matías R. Bender, Jean-Charles Faugère, Ludovic Perret, and Elias Tsigaridas. Proceedings of the 41th International Symposium on Symbolic and Algebraic Computation, 2016 (Distinguished student author award)

#### **Preprints**

- [BGL22+] Efficient computation of multiparameter persistence. Matías R. Bender, Oliver Gäfvert, and Michael Lesnick. [kth:diva-294302], to be submitted
- Yet another eigenvalue algorithm for solving polynomial systems. Matías R. Bender and Simon Telen. [arXiv: 2105.08472], submitted.