

`msolve`

A new open source library for  
algebraic system solving

**by**

Jérémy Berthomieu (PoISys Team, LIP6, Sorbonne Université),  
Christian Eder (TU Kaiserslautern) and  
Mohab Safey El-Din (PoISys Team, LIP6, Sorbonne Université)

**joint work with**

Wolfram Decker (TU Kaiserslautern),  
Franz-Josef Pfreundt (Fraunhofer ITWM Kaiserslautern) and  
Bernd Sturmfels (Max-Planck-Institute Leipzig)

**#0**

What do we mean by algebraic solving?

In this talk:

Let's restrict to **zero-dimensional** ideals.

Three main steps

1. Compute the **reduced Gröbner basis**  $G$  for  $I$  w.r.t. some monomial order.  
(by default **degree reverse lexicographical**)

2. **Convert**  $G$  to the reduced Gröbner basis  $H$  for  $I$  w.r.t. the **lexicographical** order.

**3. Solve** the uniquely defined **univariate polynomial** from  $H$ .

Go on **recursively** substituting variables already solved for.

## Recap:

1. Compute the **reduced** Gröbner basis  $G$ .
2. **Convert** to lexicographical basis  $H$ .
3. **Solve** univariate polynomial in  $H$ .

Let's do this from back to front.

**#3**

An optimized univariate solver

## **Main method:**

Subdivision algorithm based on a variant of Vincent's theorem and Descartes' method

1. Find  $B \in \mathbb{N}$  such that all positive (real) roots are in  $[0, B]$ .
2. Rescale:  $[0, B] \longrightarrow [0, 1]$ .
3. Use Descartes' rule of sign to find number of real roots in  $[0, 1]$ :  
If  $> 1$ , split into  $[0, \frac{1}{2}]$  and  $[\frac{1}{2}, 1]$ , rescale, recursion.

## Main tricks for efficiency:

- ▶ Use 2-adic truncations of the coefficients.
- ▶ Apply **Taylor shift** using asymptotically fast algorithms:  
cross-over degree: 512,  
crucial degrees  $\geq 10,000$ .

## Note:

We target polynomials from Gröbner bases, i.e.

- ▶ **large degrees** and
- ▶ even **larger bit size coefficients**.

## Henrion-n

**Timings** in seconds, **ratio** is  $\frac{\text{Time xxx}}{\text{Time msolve}}$

deg.	# sols	msolve	Mathematica		Maple		SLV		tdescartes	
			time	ratio	time	ratio	time	ratio	time	ratio
6!	12	0.3	1.1	3.6	1.1	3.6	0.5	1.6	0.8	2.6
7!	12	57	533	9.3	296	5.2	339	5.9	112	1.9



## **Future plans:**

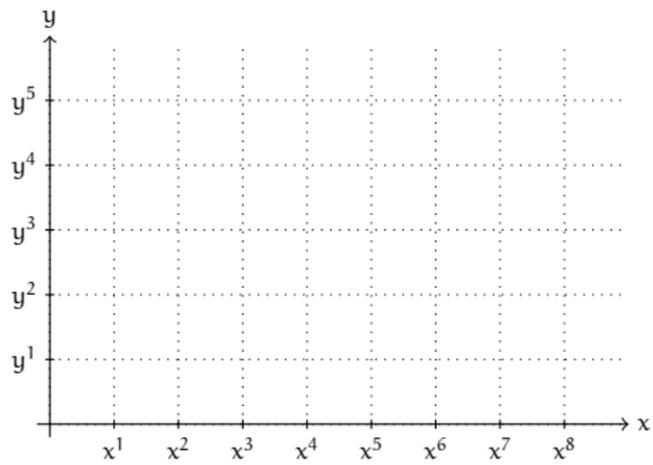
- ▶ Exploit FFT precomputations to speed up the asymptotically fast Taylor shift.
- ▶ Introduce Newton iterations for better performance on clusters of roots.

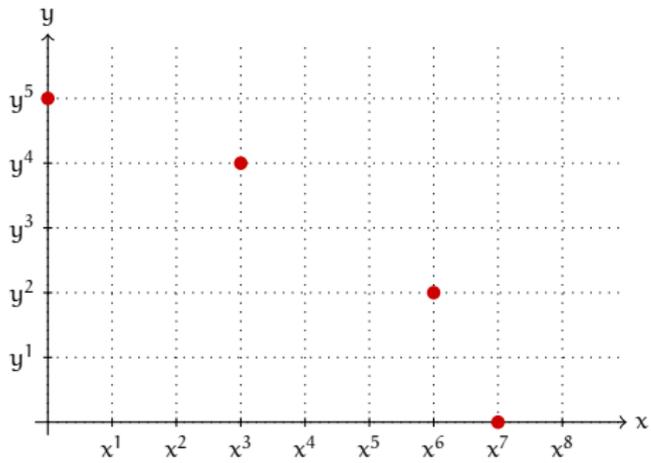
**#2**

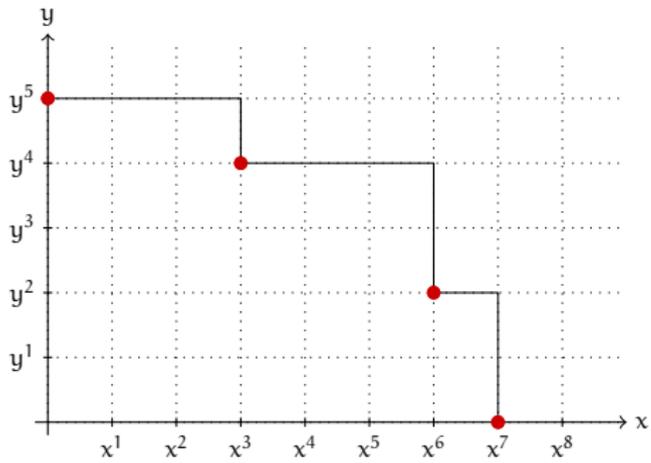
FGLM

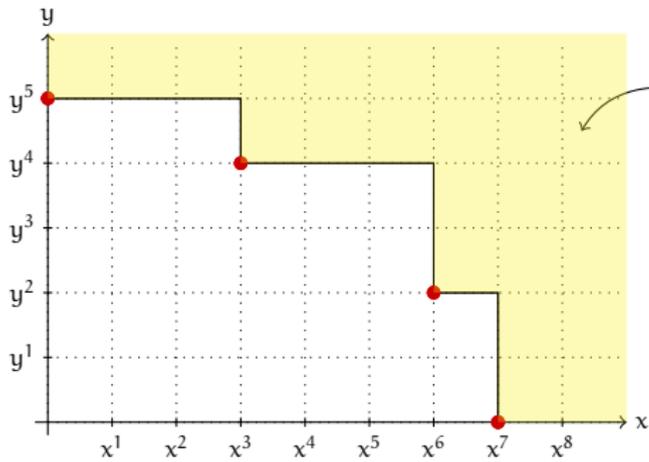
A sparse Gröbner basis conversion algorithm

If  $I$  is zero-dimensional  
we can go from  $\prec_1$  to  $\prec_2$   
**directly.**

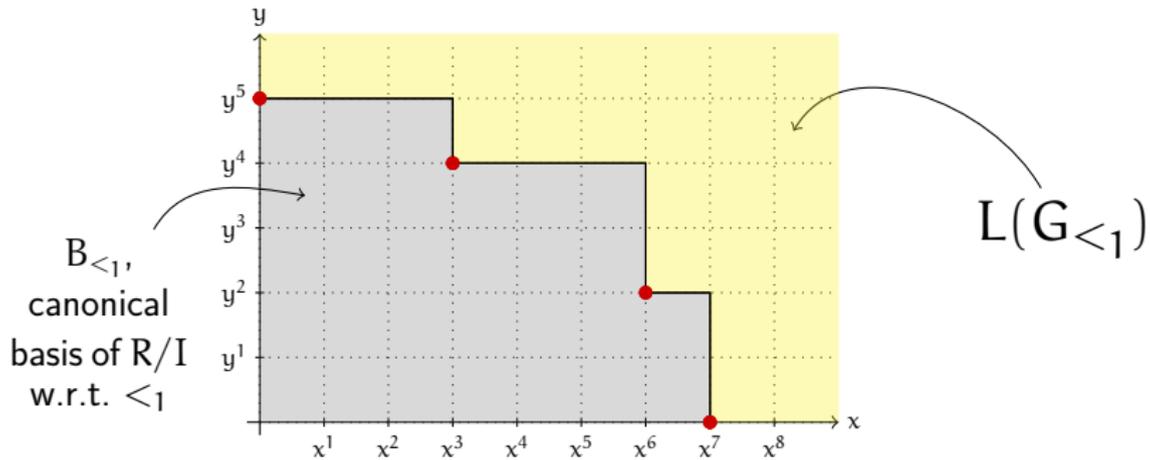








$L(G_{<_1})$



- ▶ Use multiplication matrices  $T_i \in \mathbb{K}^{D \times D}$ .
- ▶ Multiply all possible terms, sorted by  $<_2$ .
- ▶ Once we find a relation, we have a new element in  $G_{<_2}$ .

We use a **sparse** variant of FGLM  
due to Faugère and Mou.

Simplify again (for this talk):

Assume  $I$  is in **shape position**,  
i.e.  $G_{\text{LEX}}$  is given by

$$\{f_1(x_1), x_2 - f_2(x_1), \dots, x_n - f_n(x_1)\}$$

where  $\deg f_1 = D$ .

We first compute  $f_1(x_1)$  applying **Wiedemann's** algorithm:

- ▶ Generate a linearly recurring sequence  $s = [\langle \mathbf{r}, T_1^k \mathbf{e} \rangle : 0 \leq k \leq 2D - 1]$ .
- ▶ Apply **Berlekamp-Massey** algorithm to get the minimal polynomial  $\tilde{f}_1$ .

**Easiest case:** If  $\deg \tilde{f}_1 = D$  then  $\tilde{f}_1 = f_1$   
and  $I$  is in shape position.

- ▶ There exists a **deterministic** version of Wiedemann's algorithm.
- ▶ We can use **Berlekamp-Massey-Sakata** algorithm if  $I$  is not in shape position.

So we have constructed  $f_1(x_1)$ .

Now generate  $f_2(x_1), \dots, f_n(x_1)$ :

$$f_i(x_1) = \sum_{k=0}^{D-1} c_{i,k} x_1^k.$$

We want to have

$$x_i - f_i(x_1) = x_i - \sum_{k=0}^{D-1} c_{i,k} x_1^k \in I.$$

In other words:

$$\text{NF} \left( x_i - \sum_{k=0}^{D-1} c_{i,k} x_1^k \right) = 0.$$

Reinterpreting this in linear algebra:

$$v_i := T_i e = \sum_{k=0}^{D-1} c_{i,k} T_1^k e.$$

Try to reuse data already computed in  $s$ :

$$\langle \mathbf{r}, \mathbf{T}_1^j \mathbf{v}_i \rangle = \sum_{k=0}^{D-1} c_{i,k} \langle \mathbf{r}, \mathbf{T}_1^{k+j} \mathbf{e} \rangle$$

for  $0 \leq j \leq D - 1$ .

Entries  $\langle \mathbf{r}, \mathbf{T}_1^{k+j} \mathbf{e} \rangle$  generate a **Hankel matrix**.

There exists an efficient algorithm to solve these linear equations (Brent et al.)

## Main trick for efficiency

- ▶ Exploit **structure** of multiplication matrices, isolate **dense** parts and apply dense linear algebra using intrinsics (AVX2).

## Future plans

- ▶ Add Berlekamp-Massey-Sakata algorithm.
- ▶ Add efficient sparse resp. hybrid linear algebra.
- ▶ Optimize for 8-, 16- and 31-bit coefficients.

**#1**

Efficient Gröbner basis algorithms

Main algorithm at the moment:

**Faugère's F4 Algorithm**

$I = \langle f_1, \dots, f_m \rangle \subset K[x_1, \dots, x_n]$

$G \leftarrow \{f_1, \dots, f_m\}$

$P \leftarrow \{(f_i, f_j) \mid 1 \leq i < j \leq m\}$

While ( $P \neq \emptyset$ ) do

**Choose subset**  $L \subset P$ ,  $P \leftarrow P \setminus L$

$L \leftarrow$  **symbolic preprocessing**( $L, G$ )

$L \leftarrow$  **linear algebra**( $L$ )

**for**  $h \in L$  **with**  $\text{Im}(h) \notin L(G)$

$P \leftarrow P \cup \{(h, g) \mid g \in G\}$

$G \leftarrow G \cup \{h\}$

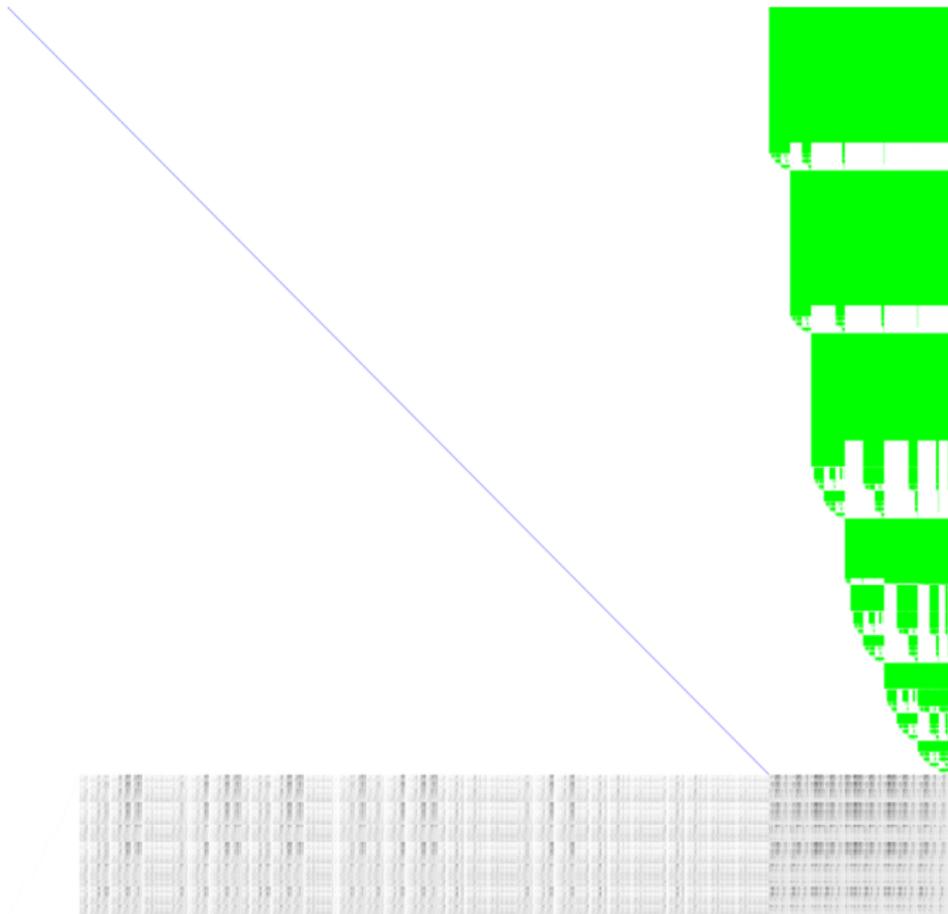
Return  $G$

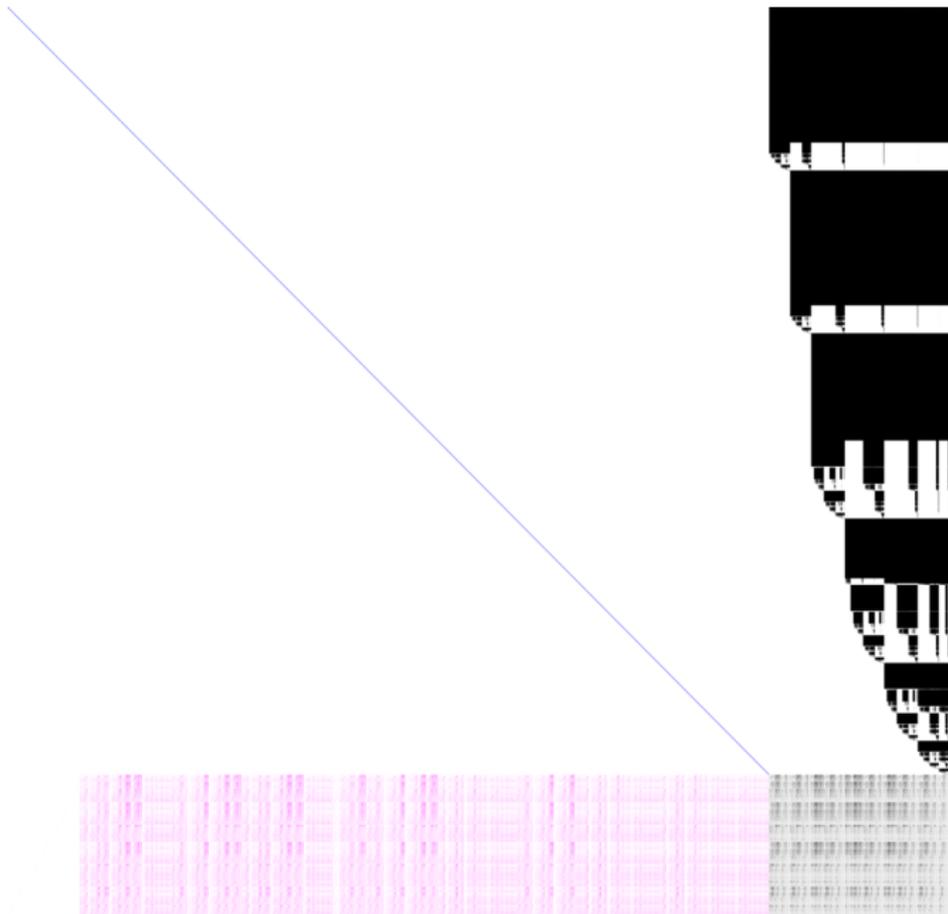
Special linear algebra (GBLA)

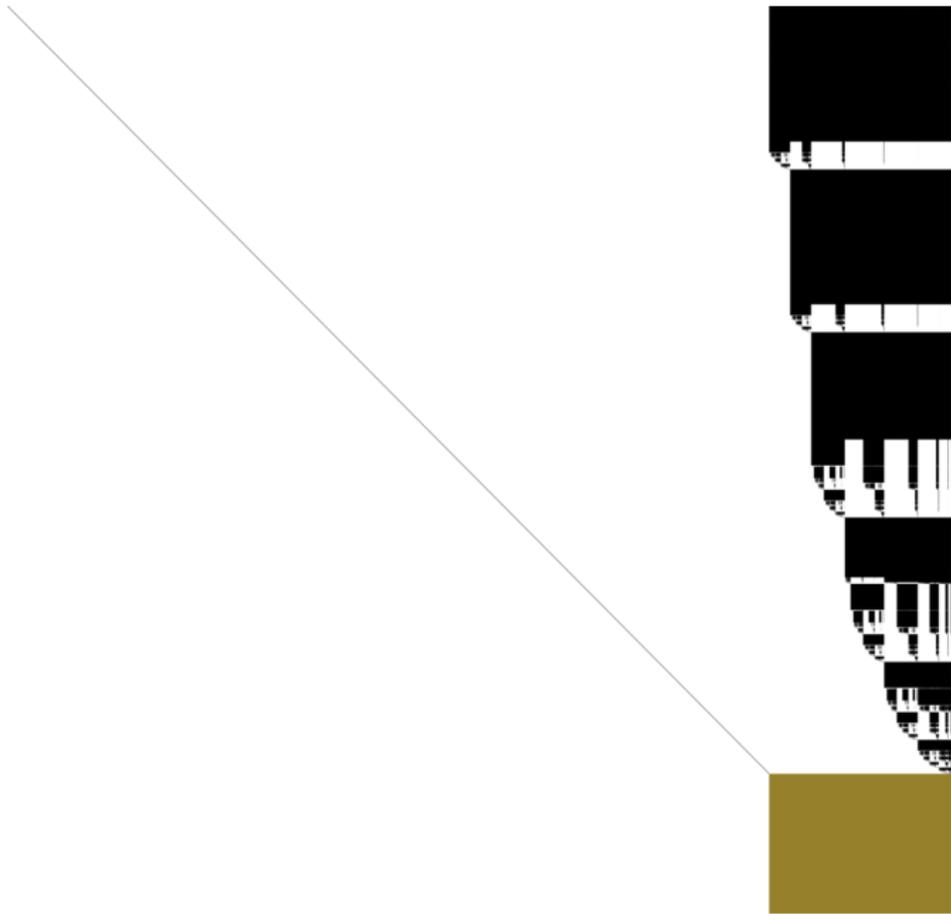
STATION	DATE	TIME	WIND	TEMP	REL. HUM.	SEA	WAVE	SWELL	WIND DIR	WAVE DIR	SWELL DIR	WAVE PERIOD	SWELL PERIOD	WAVE HEIGHT	SWELL HEIGHT	WAVE PERIOD	SWELL PERIOD	WAVE HEIGHT	SWELL HEIGHT
STATION 1	1980-01-01	00:00	10	15	80	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	01:00	12	16	75	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	02:00	15	17	70	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	03:00	18	18	65	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	04:00	20	19	60	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	05:00	22	20	55	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	06:00	25	21	50	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	07:00	28	22	45	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	08:00	30	23	40	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	09:00	32	24	35	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	10:00	35	25	30	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	11:00	38	26	25	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	12:00	40	27	20	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	13:00	42	28	15	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	14:00	45	29	10	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	15:00	48	30	5	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	16:00	50	31	0	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	17:00	52	32	-5	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	18:00	55	33	-10	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	19:00	58	34	-15	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	20:00	60	35	-20	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	21:00	62	36	-25	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	22:00	65	37	-30	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-01	23:00	68	38	-35	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	00:00	70	39	-40	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	01:00	72	40	-45	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	02:00	75	41	-50	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	03:00	78	42	-55	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	04:00	80	43	-60	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	05:00	82	44	-65	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	06:00	85	45	-70	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	07:00	88	46	-75	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	08:00	90	47	-80	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	09:00	92	48	-85	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	10:00	95	49	-90	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	11:00	98	50	-95	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	12:00	100	51	-100	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	13:00	102	52	-105	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	14:00	105	53	-110	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	15:00	108	54	-115	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	16:00	110	55	-120	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	17:00	112	56	-125	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	18:00	115	57	-130	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	19:00	118	58	-135	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	20:00	120	59	-140	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	21:00	122	60	-145	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	22:00	125	61	-150	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-02	23:00	128	62	-155	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	00:00	130	63	-160	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	01:00	132	64	-165	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	02:00	135	65	-170	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	03:00	138	66	-175	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	04:00	140	67	-180	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	05:00	142	68	-185	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	06:00	145	69	-190	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	07:00	148	70	-195	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	08:00	150	71	-200	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	09:00	152	72	-205	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	10:00	155	73	-210	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	11:00	158	74	-215	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	12:00	160	75	-220	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	13:00	162	76	-225	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	14:00	165	77	-230	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	15:00	168	78	-235	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	16:00	170	79	-240	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	17:00	172	80	-245	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	18:00	175	81	-250	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	19:00	178	82	-255	1	1	1	100	100	100	10	10	1	1	10	10	1	1
STATION 1	1980-01-03	20:00	180	83	-260	1	1	1	100	100	100	10	10						







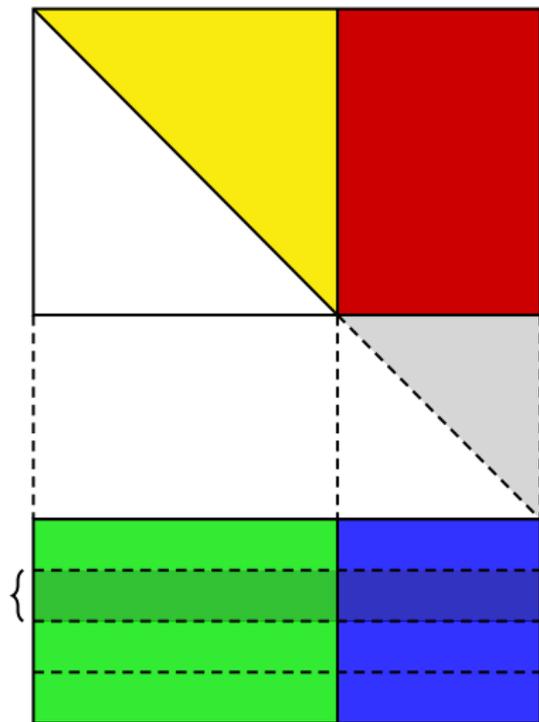




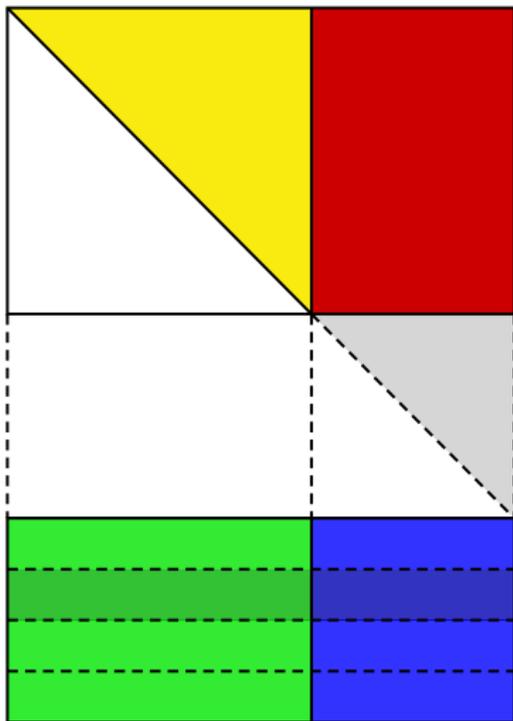


magma/maple/msolve **optimization**

Probabilistic linear algebra over finite fields

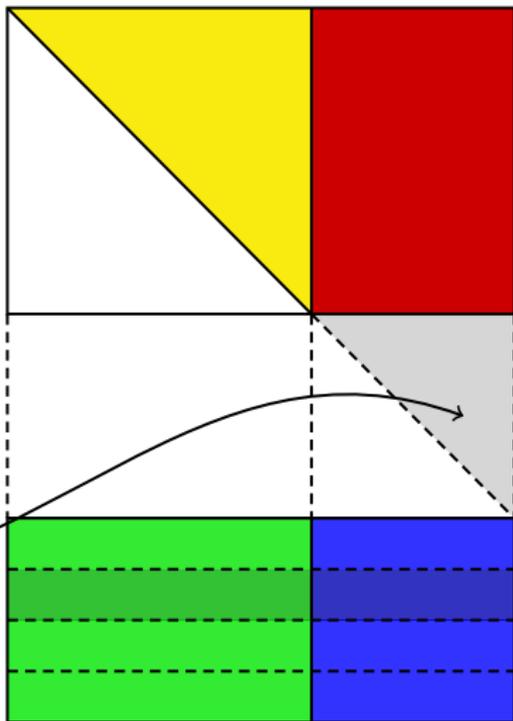


Take linear combinations



Take linear combinations

Add new pivots if found





Compare finite field DRL computations.

Benchmark	msolve		maple		magma	
	F4	FGLM	F4	FGLM	F4	FGLM
phuoc	2.99	3.59	3.71	4.09	3.42	182
katsura-15	1,688	1,460	2,891	2,112	2,088	7,138
katsura-16	13,511	12,041	21,912	15,895	16,838	56,314
cyclic-10	9,108	3,954	16,475	171	8,968	37,927
eco-14	54.3	17.1	65.3	36.5	56.1	105
eco-15	343	172	407	275	346	788
robotics	14,562	39,842	22,152	53,634	10,989	154,602
crit-d4-n9	754	1,297	991	—	505	5,967
crit-d4-n10	17,455	41,787	22,137	—	10,645	153,745
5-conics	1,372	24.1	1,526	35.1	871	964
bethe-15-7	913	1,002	1,115	1,462	1,305	3,406

Timings in seconds (finite field, DRL  $\rightarrow$  LEX, single core computation)

**Up next:**

Multi-modular computations over  $\mathbb{Q}$ .

## General idea

- ▶ Run F4 modulo several primes.
- ▶ Decide on good prime / bad prime computations.
- ▶ Lift results using rational reconstruction.
- ▶ Go on until reconstruction stabilizes.

First step can be done in two different approaches:

## Approach 1

Run all F4 computations **independently**  
(using probabilistic linear algebra).

## Approach 2

**Learn from first F4 computation, trace the run, remove useless data.**

Apply only **optimized** linear algebra in the following runs.

**Drawback** of tracing approach:

We cannot use probabilistic linear algebra in first run since we need to **recover zero reductions**.

## **Benefits** of tracing approach:

- ▶ Way more flexible in terms of reconstruction.
- ▶ Concurrent multi-modular computations possible.
- ▶ Way less memory consumption after first run.

Experimental results so far.

<b>Examples</b>	<b>msolve (tracer)</b>	<b>msolve (prob.)</b>	<b>maple</b>	<b>magma</b>
Katsura-10	37.1	61.8	1,278	82,540
Katsura-11	370	635	7,812	> 72h
Katsura-12	4,817	8,215	120,804	—
Katsura-13	81,295	128,242	> 120h	—
Katsura-14	1,286,602	2,135,227	—	—
Eco-12	831	1,400	4,287	—
Eco-13	11,935	19,032	66,115	—
Eco-14	161,537	248,272	> 240h	—
Noon-7	1,055	1,305	432	> 36h
Noon-8	65,125	69,980	5,997	> 72h
Phuoc-1	8,347	9,092	> 120h	—
Henrion-6	130.585	150.284	1,470.080	—
Henrion-7	124,850.102	139,195.781	> 240h	—
CritPts(3, 6, 2)	318	411	23,440	> 48h
CritPts(3, 7, 2)	8,136	10,667	> 240h	—
CritPts(4, 5, 3)	18,712	21,564	> 240h	—
CritPts(4, 6, 6)	54,746	72,552	> 240h	—
CritPts(3, 8, 2)	270,352	322,868	—	—

Single core computations, timings in seconds (if not otherwise stated)

## Roadmap

- ▶ Finish multi-modular implementation, hunt bugs, analyse efficiency: **right now**.
- ▶ Public beta phase: **early December 2020**.
- ▶ Open repository: **early 2021**.

## Upcoming features for `msolve`

- ▶ Julia interface to OSCAR (others, too)
- ▶ Better parallelization on CPUs
- ▶ F5 / signature-based algorithms
- ▶ New version of GBLA
- ▶ Dense linear algebra on GPUs
- ▶ You may have some other requests.

Thank you for your attention.

Questions? Remarks?