Linear algebra over integers and polynomials Similarities and differences



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Example: Linear solving over K: $K = \mathbb{Z}/(7)$, n = 5

$$A = \begin{bmatrix} 5 & 1 & 0 & 4 & 5 \\ 5 & 2 & 3 & 1 & 0 \\ 4 & 6 & 0 & 4 & 0 \\ 5 & 2 & 0 & 2 & 4 \\ 5 & 1 & 1 & 0 & 2 \end{bmatrix} \qquad b = \begin{bmatrix} 1 \\ 6 \\ 2 \\ 4 \\ 3 \end{bmatrix}$$

$$\det A = 3$$

$$A^{-1}b = \begin{bmatrix} 0 \\ 5 \\ 1 \\ 0 \\ 2 \end{bmatrix}$$
 Classical result: Both det A and $A^{-1}b$ over K can be computed in $O(n^{\theta})$ field operations, where θ is the exponent for matrix multiplication: $2 < \theta \le 3$.

Note: no expression swell over $\mathbb{Z}/(7)$

Example input over K[x]: n = 5, $d = 2 \implies$ expression swell

$$A = \begin{bmatrix} 6x^2 + x + 5 & 6x + 1 & 2x^2 & x + 4 & 3x^2 + 6x + 5 \\ 3x + 5 & 2x^2 + x + 2 & 6x^2 + 2x + 3 & 3x^2 + 2x + 1 & x^2 + 2x \\ 5x^2 + x + 4 & 6x^2 + 3x + 6 & 5x^2 + 2x & 5x^2 + 6x + 4 & 3x^2 + x \\ 6x^2 + 6x + 5 & 2x^2 + 3x + 2 & 3x^2 + 6x & 3x^2 + 2x + 2 & 5x^2 + 5x + 4 \\ 3x^2 + 2x + 5 & 5x^2 + 3x + 1 & 4x + 1 & 5x^2 + 4x & 2x^2 + 3x + 2 \end{bmatrix}$$

$$b = \begin{bmatrix} x^2 + x + 1 \\ 2x^2 + 2x + 6 \\ x^2 + 3x + 2 \\ 2x^2 + x + 4 \\ x^2 + 4x + 3 \end{bmatrix}$$

 $\det A = 6x^{10} + 6x^9 + x^8 + 3x^6 + x^5 + x^4 + 4x^2 + 2x + 3$ Degree is $n \times d$ where d is degrees in input matrix.

$$A^{-1}b = \begin{bmatrix} x^{10} + 2x^9 + 2x^8 + x^7 + 3x^6 + x^4 + 6x^3 + 3x \\ 5x^9 + x^8 + 6x^7 + x^5 + 4x^4 + 5x^3 + x^2 + 3x + 1 \\ 6x^{10} + x^9 + 3x^8 + 6x^7 + 3x^6 + 2x^5 + 2x^3 + 5x^2 + 3 \\ 5x^{10} + 3x^9 + 4x^8 + 3x^7 + 2x^6 + 3x^5 + 5x^4 + 6x \\ 3x^{10} + 3x^9 + 4x^7 + 5x^6 + 2x^5 + x + 6 \end{bmatrix}$$
(1/detA)

Example input over \mathbb{Z} : n = 5, $d = 3 \implies$ expression swell

$$A = \begin{bmatrix} 594 & 24 & 601 & 604 & 827 \\ 476 & 397 & 49 & 378 & 174 \\ 7 & 361 & 173 & 939 & 392 \\ 844 & 186 & 655 & 896 & 453 \\ 76 & 621 & 38 & 603 & 582 \end{bmatrix} \qquad b = \begin{bmatrix} 450 \\ 717 \\ 508 \\ 238 \\ 366 \end{bmatrix}$$

 $\det A = -26592243059232$

Integer size is about $n \times d$ where d is integer size in input.

$$A^{-1}b = \begin{bmatrix} -58686180258858 \\ 70644871354626 \\ 143314986631278 \\ -49969380574326 \\ -42023211987798 \end{bmatrix} (1/\det A)$$

The Analogy between K[x] and \mathbb{Z}

Polynomial Matrices

$\begin{bmatrix} 2x^{2} + 6x + 4 & 3x^{2} + 5x + 3 & 5x^{2} + 4x + 5 & 4x^{2} + 6 \\ 2x^{2} + x + 2 & 4x^{2} + 2x + 6 & 4x^{2} + 2x + 1 & x^{2} + 1 \\ 5x^{2} + 5 & 6x^{2} & x^{2} + 5x & 3x^{2} + 2x + 5 \\ x^{2} + 2x + 2 & x^{2} + 6x + 1 & 2x^{2} + 4x & 3x^{2} + x + 3 \end{bmatrix}$

Integer Matrices

19664807	10690059	33070261	56138821	58713392
53823071	62221765	74114539	5607878	80029954
11950057	75484063	79482486	69593769	30570790
98824481	20449787	47014924	31388867	24938143
53520576	86305734	90761911	92669416	28505719

 $\det = 362395834598355450125706557125187378860$

principal ideal domain linear growth in degrees count field operations principal ideal domain linear growth in word-lengths count machine word operations

Problems: Linear solving, Determinant, Canonical forms

Algorithms: Fraction-free elimination, Modulo determinant canonical form

Analogous fast algorithms for polynomials and integers [Modern Computer Algebra, von zur Gathen & Gerhard]

Polynomials

- 1. FFT based multiplication: $O(d(\log d)(\log \log d))$
- 2. Half-gcd algorithm: $O(d(\log d)^2(\log \log d))$
- 3. Rational function reconstruction
- 4. Evaluation and interpolation
- 5. Fast power series expansion

Integers

- 1. Schönhage Strassen FFT based multiplication
- 2. Fast continued fraction expansion
- 3. Rational number reconstruction
- 4. Homomorphic imaging and chinese remaindering
- 5. Fast radix conversion

Rational number/function reconstruction

$$\frac{10046631244}{15607862791} \equiv 27496514529040364884 \pmod{10^{21}}$$
$$\frac{5x^2 + 6x + 3}{x^2 + 4x + 3} \equiv 1 + 3x + 2x^2 + x^3 + 5x^4 \pmod{x^5}$$

Radix conversion and series expansion

$$\frac{10046631244}{15607862791} = 884 + 364(1000) + 40(1000^{2}) + 529(1000^{3}) + \cdots$$
$$\frac{5x^{2} + 6x + 3}{x^{2} + 4x + 3} = (1 + 3x) + (2 + x)x^{2} + (1 + 5x)x^{4} + \cdots$$

Matrix multiplication

Input: $n \times n$ matrices A and B filled with entries of size d

Output: C := AB

Cost: About $O(n^{\omega}d)$

Note: Entries in *C* will have size about 2*d*

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Note: Entries in *C* will have size about 2*d*

 $\begin{array}{ccc} & \underline{\text{Over K}} & \underline{\text{Over K}[x]} \\ \text{Input size} & O(n^2) & \overline{O(n^2d)} \\ \text{Output size} & O(n^2) & O(n^2d) \\ \text{Cost} & O(n^\omega) & O(n^\omega d) \end{array}$

Matrix multiplication

Input: $n \times n$ matrices A and B filled with entries of size d

Output: C := AB

Cost: About $O(n^{\omega}d)$

Note: Entries in *C* will have size about 2*d*

Major effort in past decade

Reduce cost of linalg over $\mathbb{Z}/K[x]$ to matrix multiplication

$$\begin{array}{ccc} \underline{\text{Classical}} & \underline{\text{Goal}} \\ O(n^{\omega+1}d) & \longrightarrow & O(n^{\omega}d) \end{array}$$

Main results from 2002–2005

2002 Storjohann LinSys/Det K[x] $O(n^{\omega}d)$ ⇒ high-order lifting 2003 Giorgi *et al* PopovForm K[x] $O(n^{\omega}d)$ ⇒ optimal lattice basis reduction Kaltofen & Villard CharPoly $K[x] / \mathbb{Z}$ $O(n^{2.697263}d)$ 2004 ⇒ baby steps giant steps block Krylov 2005 Storjohann LinSys/Det Z $O(n^{\omega}d)$ ⇒ extension of high-order lifting

Difference between K[x] and \mathbb{Z} : Linearization

Multiplication:

$$(f_0 + f_1 x + f_2 x^2) (g_0 + g_1 x + g_2 x^2) \rightarrow \begin{cases} f_0 & g_0 \\ f_1 f_0 & g_1 \\ f_2 f_1 f_0 & g_2 \\ f_2 f_1 & 0 \\ f_2 & 0 \end{cases}$$

Gcd computation:

$$\gcd(f_0 + f_1 x + f_2 x^2, g_0 + g_1 x + g_2 x^2) \rightarrow \begin{bmatrix} f_2 & f_1 & f_0 \\ f_2 & f_1 & f_0 \\ g_2 & g_1 & g_0 \\ g_2 & g_1 & g_0 \end{bmatrix}$$

Difference between K[x] and \mathbb{Z} : Non-Archimedean norm

Degree norm is non-Archimedean

$$\deg(f+g) \le \max(\deg f, \deg g)$$

Magnitude norm is Archimedean

$$|5+7| \le |5| + |7| = 13$$

Short products over K[x] and \mathbb{Z}

Compute $a \times b \mod x^2$

$$(5x^{3} + 3x^{2} + 2x + 1)(3x^{3} + 2x^{2} + 6x + 3) \equiv (2x + 1)(6x + 3)$$
$$\equiv 5x^{2} + 5x + 3$$
$$\equiv 5x + 3$$

Compute $a \times b \mod 10^2$

$$\begin{array}{c}
 a \\
 (20798983)(48130293) \equiv (83)(93) \\
 \equiv 8277 \\
 \equiv 77
\end{array}$$

Short products over K[x] and \mathbb{Z}

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$$\equiv 5x^{2} + 5x + 3$$
$$\equiv 5x + 3$$

Compute $a \times b \mod 10^2$

$$(20798983)(48130293) \equiv (83)(93)$$

$$\equiv 8277$$

$$\equiv 77$$

[2000, Mulders, On computing short products]

[2003, Hanrot & Zimmerman, A long note of Mulder's short product]

Compute leading two coefficients of $a \times b$

$$(5x^{3} + 3x^{2} + 2x + 1)(3x^{3} + 2x^{2} + 6x + 3) = x^{6} + 5x^{5} + 5x^{3} + \dots + 3$$

$$\Rightarrow (5x^{3} + 3x^{2})(3x^{3} + 2x^{2}) = x^{6} + 5x^{5} + 6x^{4}$$

Compute leading two coefficients of $a \times b$

$$(5x^{3} + 3x^{2} + 2x + 1)(3x^{3} + 2x^{2} + 6x + 3) = \underline{x^{6} + 5x^{5}} + 5x^{3} + \dots + 3$$

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Compute leading two digits of $a \times b$

$$\begin{array}{c}
 a & b \\
 (\underline{6453}9839)(\underline{4649}9832) = \underline{30}01091670807048
\end{array}$$

Compute leading two coefficients of $a \times b$

$$(5x^{3} + 3x^{2} + 2x + 1)(3x^{3} + 2x^{2} + 6x + 3) = \underline{x^{6} + 5x^{5}} + 5x^{3} + \dots + 3$$

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Compute leading two digits of $a \times b$

$$(\underline{6453}, \underline{9839})(\underline{4649}, \underline{9832}) = \underline{30}, \underline{01091670807048}$$

$$\Rightarrow (\underline{6453})(\underline{4649}) = \underline{29}, \underline{999999}$$

Compute leading two coefficients of $a \times b$

$$(5x^{3} + 3x^{2} + 2x + 1)(3x^{3} + 2x^{2} + 6x + 3) = \underline{x^{6} + 5x^{5}} + 5x^{3} + \dots + 3$$

$$\Rightarrow (5x^{3} + 3x^{2})(3x^{3} + 2x^{2}) = \underline{x^{6} + 5x^{5}} + 6x^{4}$$

Compute leading two digits of $a \times b$

$$(\underline{6453}9839)(\underline{4649}9832) = \underline{30}01091670807048$$

$$\Rightarrow (\underline{6453})(\underline{4649}) = \underline{29}999997$$

[1993, Krandick & Johnson, Efficient multiprecision floating point multiplication with optimal directional rounding]

Part II

High-order lifting and the sparse inverse formula

Alternative representations for the inverse of $A = \begin{bmatrix} 3 & 2 \\ x & 5 \end{bmatrix}$

$$A^{-1} = \begin{bmatrix} \frac{2}{6+2x} & \frac{2}{6+2x} \\ \frac{x}{6+2x} & \frac{4}{6+2x} \end{bmatrix}$$

$$= \begin{bmatrix} 1+x+x^2+x^3+\cdots & -1-x-x^2-x^3+\cdots \\ -x-x^2-x^3+\cdots & 1+x+x^2+x^3+\cdots \end{bmatrix}$$

$$= \begin{bmatrix} 1 & -1 \\ 0 & 1 \end{bmatrix} + \begin{bmatrix} 1 & -1 \\ -1 & 1 \end{bmatrix} x + \begin{bmatrix} 1 & -1 \\ -1 & 1 \end{bmatrix} x^2 + \cdots$$

The sparse inverse formula for $A = \begin{bmatrix} 1 - cx \end{bmatrix}$

Explicit inverse modulo x^{32}

$$(1-cx)^{-1} \mod x^{32} \equiv 1 + cx + c^2x^2 + c^3x^3 + c^4x^4 + c^5x^5 + \dots + c^{31}x^{31}$$

The sparse inverse formula for A = [1 - cx]

Explicit inverse modulo x^{32}

$$(1-cx)^{-1} \bmod x^{32} \equiv 1 + cx + c^2x^2 + c^3x^3 + c^4x^4 + c^5x^5 + \dots + c^{31}x^{31}$$
$$\equiv (1+cx)(1+c^2x^2)(1+c^4x^4)(1+c^8x^8)(1+c^{16}x^{16})$$

The sparse inverse formula for $A = \begin{bmatrix} 1 - cx \end{bmatrix}$

Explicit inverse modulo x^{32}

$$32 \text{ coefficients}$$

$$(1-cx)^{-1} \mod x^{32} = \overbrace{1+cx+c^2x^2+c^3x^3+c^4x^4+c^5x^5+\cdots+c^{31}x^{31}}^{32 \text{ coefficients}}$$

$$= \underbrace{(1+cx)(1+c^2x^2)(1+c^4x^4)(1+c^8x^8)(1+c^{16}x^{16})}_{5 \text{ coefficients}}$$

$$\underbrace{(1+c^2x)(1+c^2x^2)(1+c^4x^4)}_{R_1}(1+c^8x^8)(1+c^{16}x^{16})$$

$$\underbrace{(1-cx)^{-1} \bmod x^8}$$

Classical Hensel/Newton iteration (Quadratic lifting)

Example: Compute inverse of A = [1 - cx] over K[[x]]

Initialize: $A^{-1} \mod x^2 = 1 + cx$

Lift 1:

$$R_2 x^2 = I - A(1 + cx)$$
$$= c^2 x^2$$

$$A^{-1} \mod x^4 = (1+cx)(1+R_2x^2)$$

= $1+cx+c^2x^2+c^3x^3$

<u>Lift 2:</u>

$$R_4 x^2 = I - A(1 + cx + c^2 x^2 + c^3 x^3)$$

= $c^4 x^4$

$$A^{-1} \mod x^8 = (1 + cx + c^2x^2 + c^3x^3)(1 + R_4x^4)$$

= 1 + cx + c^2x^2 + c^3x^3 + c^4x^5 + c^5x^5 + c^6x^6 + c^7x^7

Computing the residues for A = 1 - cx

$$R_{2}x^{2} = I - A(1 + cx)$$

$$= c^{2}x^{2}$$

$$R_{4}x^{2} = I - A(1 + cx + c^{2}x^{2} + c^{3}x^{3})$$

$$= c^{4}x^{4}$$

$$R_{8}x^{8} = I - A(1 + cx + c^{2}x^{2} + c^{3}x^{3} + c^{4}x^{4} + c^{5}x^{5} + c^{6}x^{6} + c^{7}x^{7})$$

$$= c^{8}x^{8}$$

Computing the residues for A = 1 - cx

$$R_{2}x^{2} = I - A(1 + cx)$$

$$= c^{2}x^{2}$$

$$A^{-1} \mod x^{4}$$

$$R_{4}x^{2} = I - A(1 + cx + c^{2}x^{2} + c^{3}x^{3})$$

$$= c^{4}x^{4}$$

$$A^{-1} \mod x^{8}$$

$$R_{8}x^{8} = I - A(1 + cx + c^{2}x^{2} + c^{3}x^{3} + c^{4}x^{4} + c^{5}x^{5} + c^{6}x^{6} + c^{7}x^{7})$$

$$= c^{8}x^{8}$$

- If $\det A = d$ then R_2, R_4, R_8, \cdots have degree $\leq d 1$.
- Can use reverse short product \Rightarrow need only top d coefficients of $A^{-1} \mod x^*$

Computing the residue via reverse short product

- Let $A = 1 + 5x + 6x^2$
- Suppose we have

$$A^{-1} \mod x^{64} = 1 + 2x + 5x^3 + \dots + 2x^{61} + 5x^{62} + 5x^{63}$$

Exact formula for R_{64} :

$$R_{64}x^{64} = (1+5x+6x^2)(1+2x+5x^3+\dots+2x^{61}+5x^{62}+5x^{63}) - I$$
$$= 6x^{64}+2x^{65}$$

Computing the residue via reverse short product

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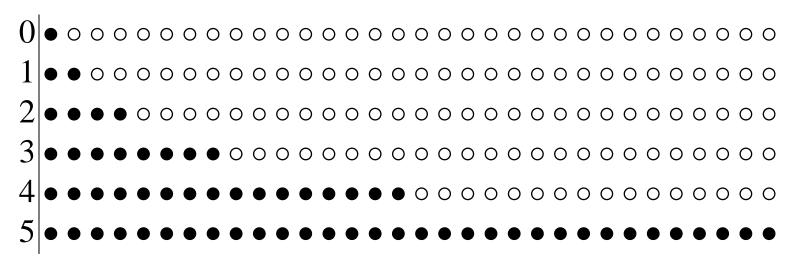
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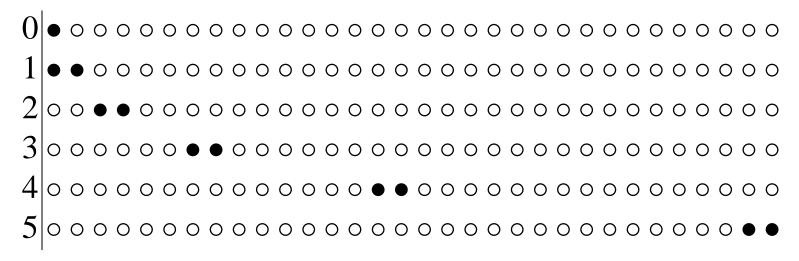
Reverse short product for R_{64} :

$$(1+5x+6x^2)(5x^{62}+5x^{63}) = 5x^{62}+2x^{63}+\underline{6x^{64}+2x^{65}}$$

Standard quadratic lifting



High-order component lifting



High-order lifting example: $A = 1 + 5x + 6x^2$

$$A^{-1} \bmod x^{128} = \underbrace{1 + \dots + 2x^{61} + 5x^{62} + 5x^{63}}_{L} + \underbrace{x^{64} + \dots + x^{125} + \underline{x^{126} + 2x^{127}}}_{Hx^{64}}$$

$$= (1 + \dots + 2x^{61} + 5x^{62} + 5x^{63})(1 + (1 + 5x)x^{64})$$

High-order lifting example: $A = 1 + 5x + 6x^2$

$$A^{-1} \bmod x^{128} = \underbrace{1 + \dots + 2x^{61} + 5x^{62} + 5x^{63}}_{L} + \underbrace{x^{64} + \dots + x^{125} + \underline{x^{126} + 2x^{127}}}_{Hx^{64}}$$

$$= (1 + \dots + 2x^{61} + 5x^{62} + 5x^{63})(1 + (1 + 5x)x^{64})$$

Via reverse short product

$$(2x^{61} + 5x^{62} + 6x^{63})(1+5x)x^{64} = 2x^{125} + x^{126} + 2x^{127} + 4x^{128}$$

• top d coefficient of L suffice to get top d-1 coefficients of H

Sparse inverse formula

Special case: deg A = 1

$$A^{-1} \mod x^{32} = (A^{-1} \mod x^4)(I + R_4 x^4)(I + R_8 x^8)(I + R_{16} x^{16})$$

General case: deg A = 3

$$A^{-1} \bmod x^8 = (A^{-1} \bmod x^4)(I + R_4 x^4) - M_4 x^8$$

$$A^{-1} \bmod x^{16} = (((A^{-1} \bmod x^4)(I + R_4 x^4) - M_4 x^8)(1 + R_8 x^8) - M_8 x^{16}$$

$$A^{-1} \bmod x^{32} = (A^{-1} \bmod x^{16})(1 + R_{16} x^{16}) - M_{16} x^{32}$$

Sparse inverse formula for integer matrices

Example for $7^{-1} \mod x^{32}$, x = 11

$$7^{-1} \mod x^{32}$$

= 904876146229395122376692251804252

$$= (((52(1-3x^2)+2x^4)(1-5x^4)+4x^8)(1-3x^8)+2x^{16})(1-5x^{16})+4x^{32}$$

General case:

- Formula exists for any $A \in \mathbb{Z}^{n \times n}$ provided $x \perp \det A$.
- $A^{-1} \mod x^n$ has size $O(n^3d)$.
- Sparse inverse formula for $A^{-1} \mod x^n$ has size $O(n^2(\log n)d)$.

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Q: How to compute reverse short products correctly over \mathbb{Z} ?

A: [2005, Storjohann, The shifted number system...]