

Quasi-Optimal Multiplication of Linear Differential Operators

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I Introduction

Product of Linear Differential Operators

P and Q : linear differential operators with polynomial coefficients in $\mathbb{K}[x]\langle\partial\rangle$. The product PQ is given by the relation of composition

$$\forall f \in \mathbb{K}[x], \quad PQ \cdot f = P \cdot (Q \cdot f).$$

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The commutation of this product is given by the Leibniz rule:

$$\partial x = x\partial + 1.$$

Complexity of the Product of Linear Differential Operators

The product of differential operator is a **complexity yardstick**.

The complexity of more involved, higher-level, operations on linear differential operators can be reduced to that of multiplication:

- LCLM, GCRD (van der Hoeven 2011)
- Hadamard product
- other closure properties for differential operators . . .

Previous complexity results

Product of operators in $\mathbb{K}[x]\langle\partial\rangle$ of orders $\leq r$ with polynomial coefficients of degrees $\leq d$ (i.e bidegrees (d,r)):

- Naive algorithm: $\mathcal{O}(d^2 r^2 \min(d,r))$ ops
- Takayama algorithm: $\tilde{\mathcal{O}}(dr \min(d,r))$ ops
- Van der Hoeven algorithm (2002): $\mathcal{O}((d+r)^\omega)$ ops using evaluations and interpolations.

ω is a feasible exponent for matrix multiplication ($2 \leq \omega \leq 3$)

$\tilde{\mathcal{O}}$ indicates that polylogarithmic factors are neglected.

Complexities for Unballanced Product

van der Hoeven 2011 + bound see next talk

Fast algorithms for LCLM or GCRD for operators of bidegrees (r,r) can be reduced to the multiplication of operators with polynomial coefficients of bidegrees (r^2,r) .

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Product of operators of bidegrees (r^2, r)

- Naive algorithm: $\mathcal{O}(r^7)$ ops
- Takayama algorithm: $\tilde{\mathcal{O}}(r^4)$ ops
- Van der Hoeven algorithm: $\mathcal{O}(r^{2\omega})$ ops

Contributions: New Algorithm for Unbalanced Product

New algorithm¹ for the product of operators in $\mathbb{K}[x]\langle\partial\rangle$ of bidegree (d,r) in

$$\tilde{O}(dr \min(d,r)^{\omega-2}).$$

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$$\tilde{O}(r^{\omega+1}) \text{ (instead of } \tilde{O}(r^4)\text{)}.$$

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Idea: Modify van der Hoeven algorithm using

- Instead of evaluations of operators on x^i , evaluations on $x^i \exp(\alpha x)$
- Use multipoint evaluations and interpolations
- Use fast algorithm for performing Hermite interpolation

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II New Vision of van der Hoeven Algorithm

Skew Product: a Linear Algebra Problem

$$QP = \sum_{i=0}^r q_i(x) \partial^i P$$

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We define

$$S_\ell(P) := \begin{pmatrix} P \\ \partial P \\ \vdots \\ \partial^{\ell-1} P \end{pmatrix},$$

then for Q of order r , we have,

$$S_1(QP) = S_1(Q) S_{r+1}(P).$$

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More generally, for any $\ell \geq 0$, we have:

$$S_\ell(QP) = S_\ell(Q) S_{r+\ell}(P).$$

Evaluations and Interpolation of Operator

$$S_\ell(P) := \begin{pmatrix} P \\ \partial P \\ \vdots \\ \partial^{\ell-1} P \end{pmatrix} = \begin{pmatrix} p_0 & p_1 & \cdots & p_r & 0 & \cdots & 0 \\ p'_0 & p'_1 + p_0 & \cdots & p'_r + p_{r-1} & p_r & 0 & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots & \ddots & 0 \\ p_0^{(\ell-1)} & \cdots & \cdots & \cdots & \cdots & \cdots & p_r \end{pmatrix}$$

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If P is an operator of bidegree (d,r) , we can compute P from $S_d(P)(0)$

Fast Computation of $S_\ell(P)(0)$

A remark from Bostan, Chyzak and Le Roux (ISSAC 2008)

$$\begin{aligned}
 & \begin{pmatrix} 1 & 0 & & & & 0 \\ 1 & 1 & 0 & & & 0 \\ 1 & 2 & 1 & 0 & & 0 \\ 1 & 3 & 3 & 1 & 0 & 0 \\ \vdots & & & \ddots & & \end{pmatrix} \begin{pmatrix} 0 & \cdots & 0 & p_0 & p_1 & \cdots & p_r \\ \vdots & 0 & p'_0 & p'_1 & \cdots & p'_r & 0 \\ 0 & \ddots & & & \ddots & 0 & \vdots \\ p_0^{(\ell-1)} & p_1^{(\ell-1)} & \cdots & p_r^{(\ell-1)} & 0 & \vdots & 0 \end{pmatrix} \\
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Applications:

- Computation of P from $S_d(P)(0)$ in $\mathcal{O}((r+d)^\omega)$ (in $\tilde{\mathcal{O}}(rd)$ using structured matrices)

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Applications:

- Computation of P from $S_d(P)(0)$ in $\mathcal{O}((r+d)^\omega)$ (in $\tilde{\mathcal{O}}(rd)$ using structured matrices)
- Computation of $S_d(P)(0)$ from P in $\mathcal{O}((r+d)^\omega)$ (in $\tilde{\mathcal{O}}(rd)$ using structured matrices)

Complexity of van der Hoeven Algorithm

Easy bound: If P and Q are of bidegrees (r,d) , QP is of bidegree $(2r,2d)$.

- Evaluation of $S_{2d+r}(P)(0)$ and $S_{2d}(Q)(0)$
- Matrix multiplication $S_{2d}(QP)(0) = S_{2d}(Q)(0) \cdot S_{2d+r}(P)(0)$
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III New Algorithm for the Unbalanced Product

Product using Multipoint Evaluations and Interpolation

New idea ($d > r$ and $d/r \in \mathbb{N}$):

We replace one multiplication of big matrices by several multiplications of smaller matrices

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- Evaluations of $S_{2r}(P)(0), S_{2r}(P)(1), \dots, S_{2r}(P)(2d/r - 1)$ and $S_r(Q)(0), S_r(Q)(1), \dots, S_r(Q)(2d/r - 1)$

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Hermite Evaluations and Interpolations

Sur la formule d'interpolation de *Lagrange*.

(Extrait d'une lettre de M. Ch. Hermite à M. Borchardt.)

Je me suis proposé de trouver un polynôme entier $F(x)$ de degré $n-1$, satisfaisant aux conditions suivantes:

$$F(a) = f(a), \quad F'(a) = f'(a), \quad \dots \quad F^{a-1}(a) = f^{a-1}(a),$$

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$$F(l) = f(l), \quad F'(l) = f'(l), \quad \dots \quad F^{l-1}(l) = f^{l-1}(l)$$

où $f(x)$ est une fonction donnée. En supposant:

$$\alpha + \beta + \dots + \lambda = n$$

la question comme on voit est déterminée, et conduira à une généralisation de la formule de *Lagrange* sur laquelle je présenterai quelques remarques.

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Application:

Evaluations and interpolation of $S_r(P)(i)$ for $i \in [0..2d/r - 1]$ in $\tilde{O}(rd)$ ops

New Algorithm when $d > r$

- Evaluations of $S_r(P)(0), S_r(P)(1), \dots, S_{2r}(P)(2d/r - 1)$ and $S_r(Q)(0), S_r(Q)(1), \dots, S_r(Q)(2d/r - 1)$
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Complexity of algorithm when $d > r$: $\tilde{\mathcal{O}}(dr^{\omega-1})$ arithmetic operations

Application when $r > d$

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Application, new algorithm for the product when $r > d$

- compute the canonical forms (x at left and ∂ at right) of $\varphi(P)$ and $\varphi(Q)$,
new algorithm in $\tilde{\mathcal{O}}(dr)$
- compute the product $M = \varphi(P)\varphi(Q)$ of operators $\varphi(P)$ and $\varphi(Q)$
in $\mathcal{O}(d^{\omega-1}r)$ using the previous algorithm
- return the (canonical form of the) operator $PQ = \varphi^{-1}(M)$
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Complexity of the product in $\tilde{\mathcal{O}}(d^{\omega-1}r)$ arithmetic operations when $r > d$

IV Conclusion

Contribution: better algorithm for the product of differential operator:

- Previous: $\mathcal{O}((d+r)^\omega)$ arithmetic operations
- New algorithm: $\mathcal{O}(rd \min(r,d)^{\omega-2})$ arithmetic operations

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The same algorithm works also for product of recurrence operators or q -difference operators.

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Perspective: Use of this fast product to improve algorithms to compute:

- differential operator canceling Hadamard product of series
- differential operator canceling product of series
- differential operator obtained by substitution with an algebraic function