

Lecture 6 (2023-02-09)

logistics: - part 1 due
- part 2 out tonight

last lecture: - polynomial families
- complexity classes
- reductions, completeness
- IMM, det are VBP complete
VQP-complete

Q: primitive ops with cost?
+, x, ÷ over \mathbb{F}

Q: primitive ops on $\mathbb{F}[x]$ also structures?
- $\mathbb{F}[x] \ni f, g$ deg d
- addition: $O(d)$ time
- multiplication:
- $O(d^2)$ time
↳ used in homog. circ

$$f(\bar{y}) = \sum_i H_i(\bar{y})$$

$$f(x, \bar{y}) = \sum_i H_i(\bar{y}) \cdot x^i \in \mathbb{F}[\bar{y}][x]$$

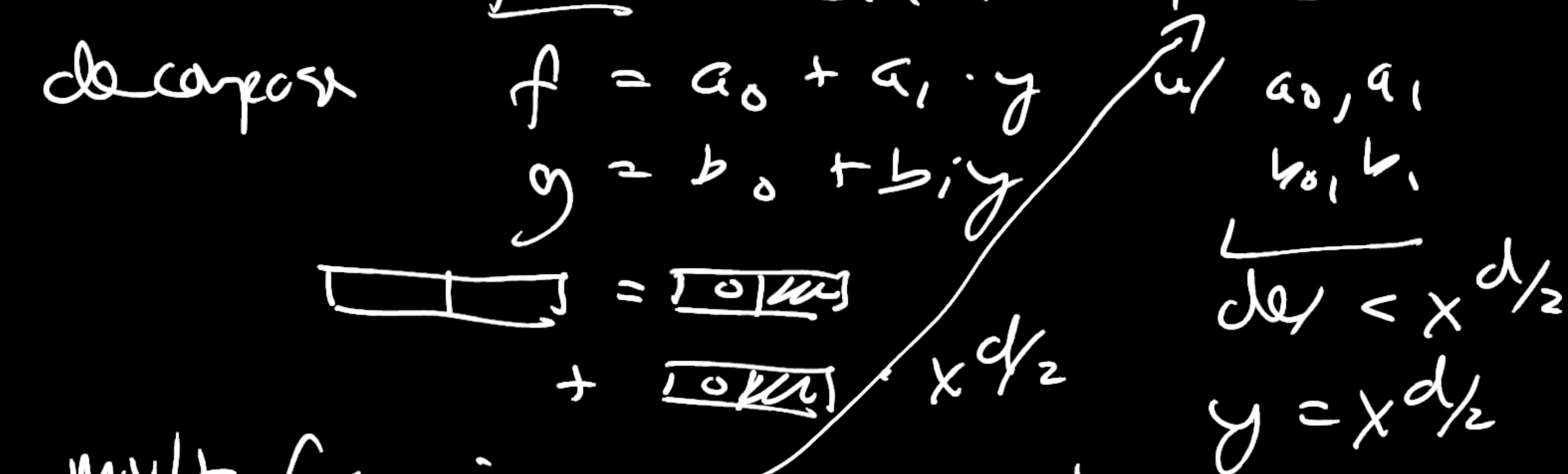
↑ coord

⇒ naive algo for
 $f(x, \bar{y}) \cdot g(x, \bar{y})$
is naive multiplication
in $\mathbb{F}[\bar{y}][x]$

- $O(d \log_2^3 < d^{1.58} \dots)$ [Karatsuba]

sketch: multiply $a_0 + a_1 y, b_0 + b_1 y$
- naively take 4 mult

- fact: can be $\sqrt{3}$ mult



mult f, g via recursively

$$T(d) \leq 3 \cdot T(d/2) + O(d)$$

$$\leq \dots \leq O(d \log_2^3)$$

- $O(d \lg d)$ if \mathbb{F} "supports" the fast Fourier transform
 ↳ has certain root of unity

rank: - not useful for homogeneous identity
 ↳ as FFT is not homogeneous,
 ↳ but can use it only (compute
 homogeneous parts w/o homs)

- $O(d \cdot \lg d \cdot \lg \lg d)$ for any \mathbb{F}
 - closely related to multiply in \mathbb{Z}

- $\mathbb{F}^{n \times n} \ni A, B$

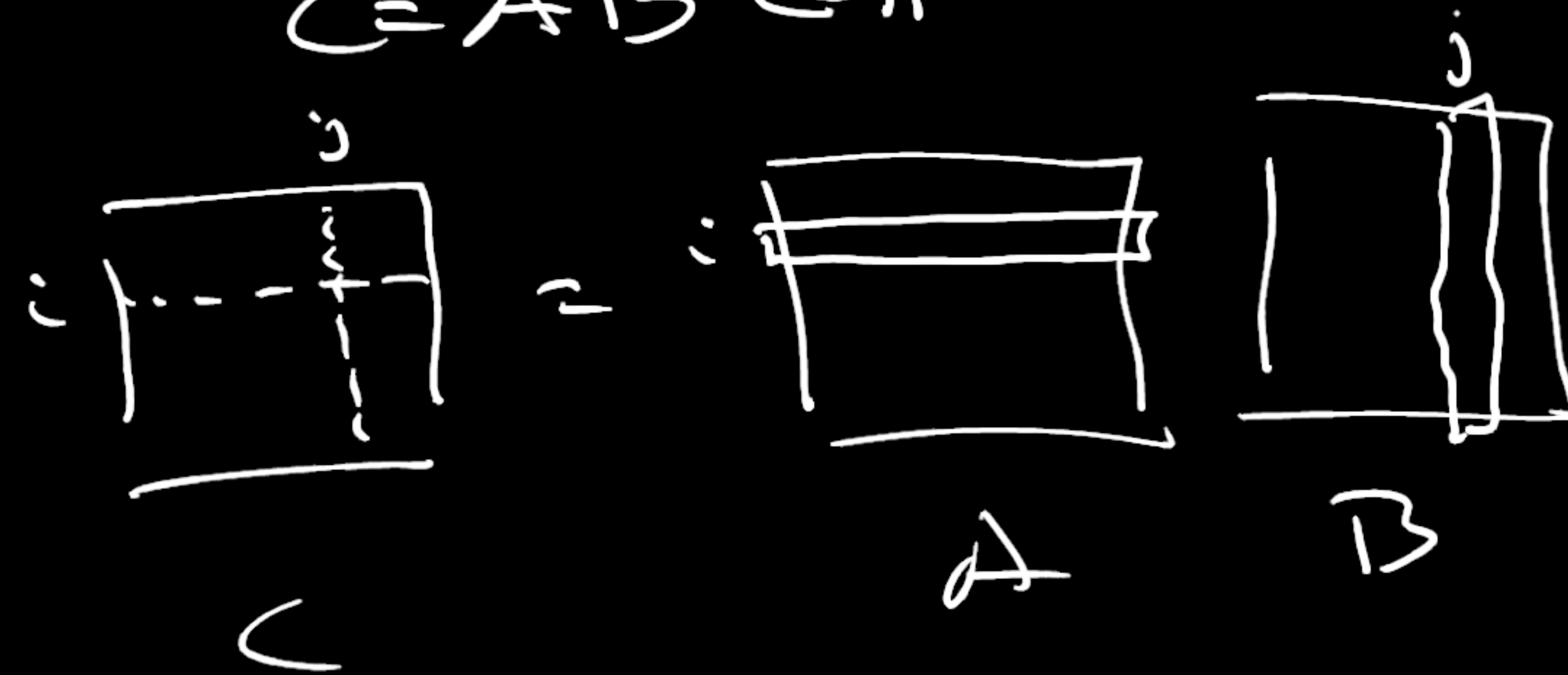
- addition: $O(n^2)$

- multiplication:

prop: matrix mult in $O(n^3)$ time

def: $A, B \in \mathbb{F}^{n \times n}$

$C = AB \in \mathbb{F}^{n \times n}$



$$C_{ij} = \sum_{k=1}^n A_{ik} B_{kj}$$

correctness: by def

complexity: n^2 entries

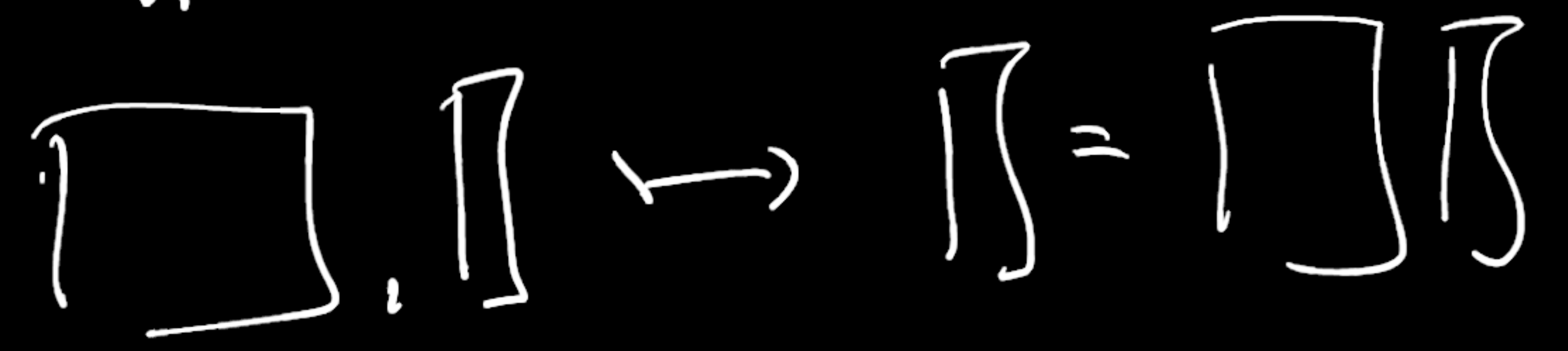
per entry: $O(n)$ mult

$O(n)$ add □

Q: do better?

A: sometimes naive algo is optimal

fact: $M \in \mathbb{F}^{n \times n}$, $v \in \mathbb{F}^n \mapsto Mv$ requires $\Omega(n^2)$ ops

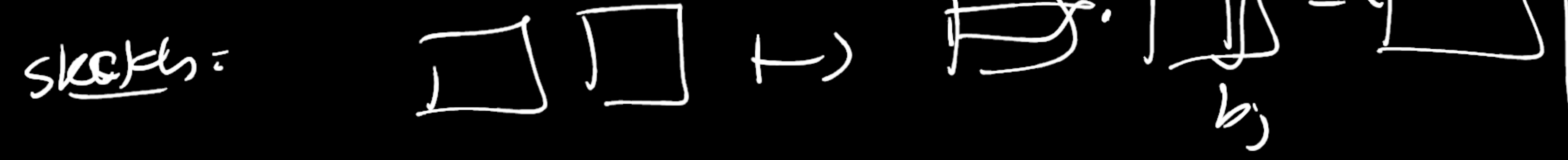


fact: $v \mapsto Mv$ requires $\Omega(n^2)$ ops for same M

A: solving disjoint problems on disjoint inputs "should be" independent

lem: $A, B \in \mathbb{F}^{n \times n} \mapsto A \cdot B$

is $A, b_1, \dots, b_n \in \mathbb{F}^n \mapsto Ab_1, \dots, Ab_n$



" \Rightarrow " matrix mult should take

$$\Omega(n^2) \cdot n = \Omega(n^3) \text{ op}$$

A: multiplication over $\mathbb{F}[x]$ has nontrivial algo, so matrix mult does as well

fact: $n \times n$ matrix mult is in $\mathcal{O}(n^{2.3729\dots})$ time

rank: widely used algorithmic tool

- algebraic algo - det
- solving linear systems of eqn $Ax=b$
- representation theory

- boolean problems
 - bipartite matching
 - graph detection
 - parsing context-free grammars

HW [Strassen 69] $n \times n$ matrix mult
 in $O(n^{\log_2 7} < n^{2.81...})$ time

idea: recursion
 conserve multiplications,
 possibly increase add

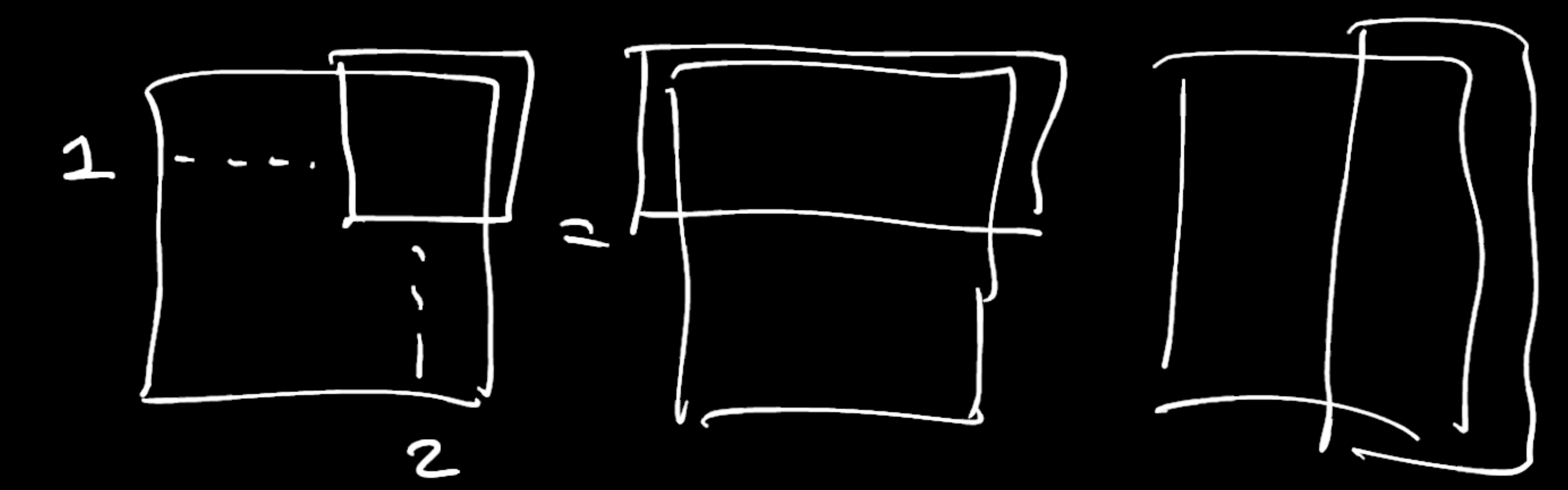
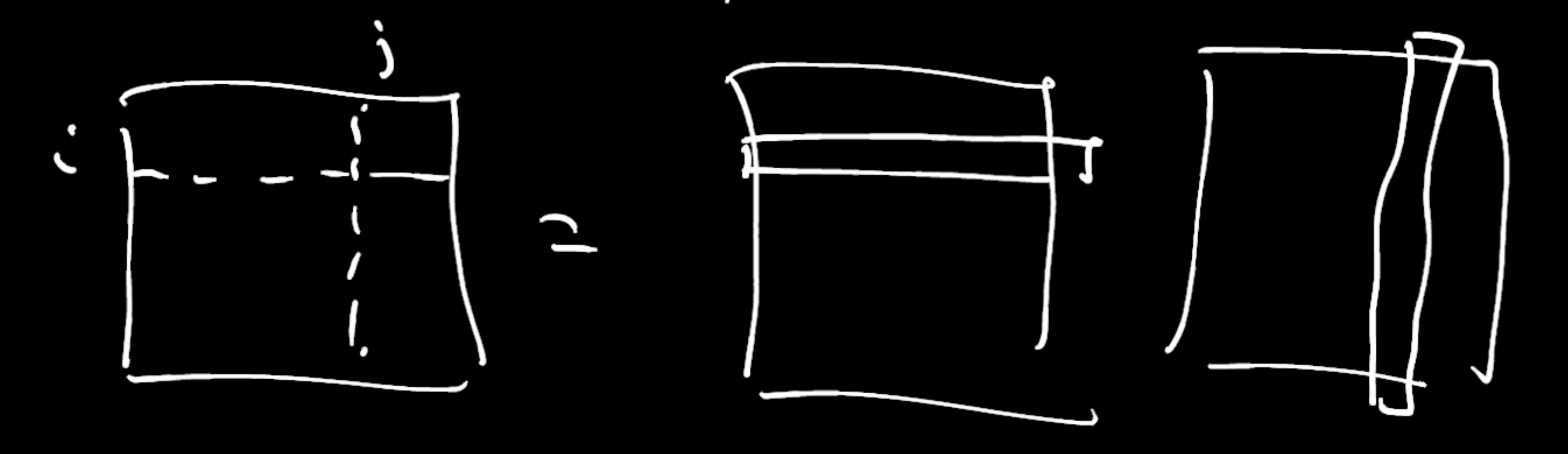
key [block multiplication]:

$$A = \begin{bmatrix} A^{11} & A^{12} \\ A^{21} & A^{22} \end{bmatrix} \quad B = \begin{bmatrix} B^{11} & B^{12} \\ B^{21} & B^{22} \end{bmatrix}$$

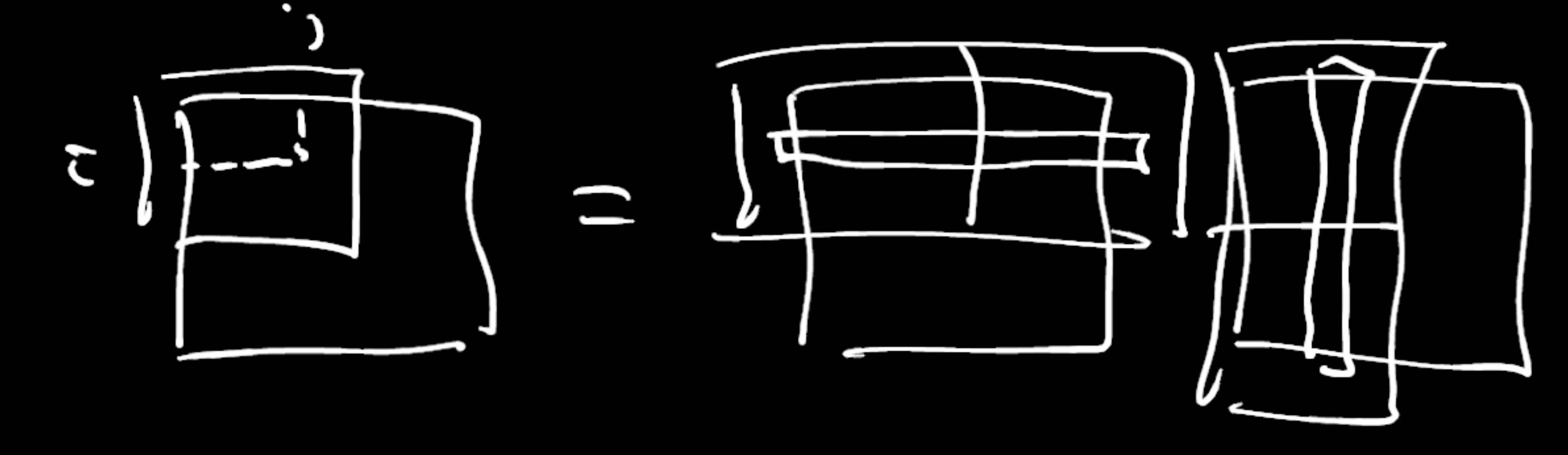
\checkmark $A^{(i,j)}$, $B^{(i,j)}$ $m \times m$, $n = 2m$

$$\Rightarrow C = AB \text{ has } C = \begin{bmatrix} C^{11} & C^{12} \\ C^{21} & C^{22} \end{bmatrix} \checkmark C^{(i,j)} \text{ } m \times m$$

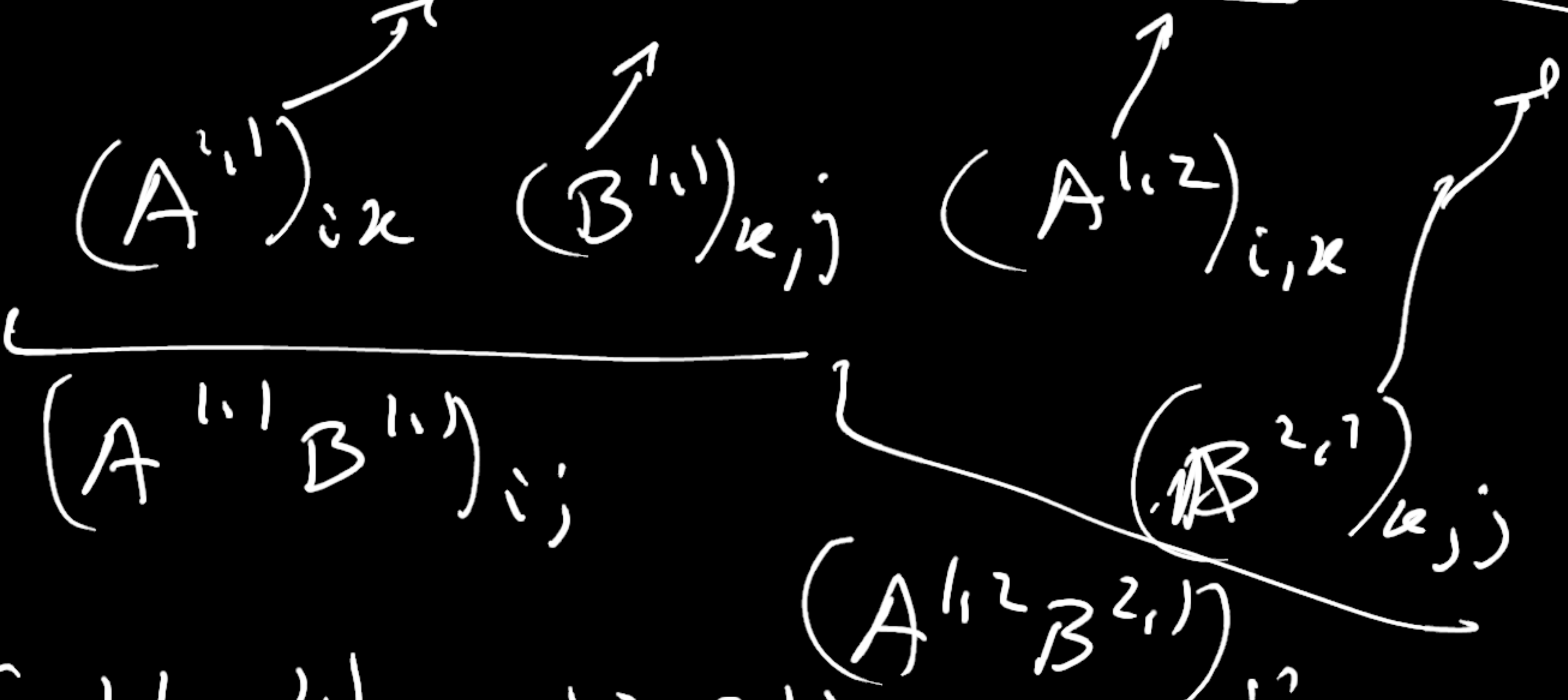
$$C^{(i,j)} = \sum_{k=1}^2 A^{(i,k)} B^{(k,j)}$$



sketch: let $i, j \leq m$



$$C^{(i,j)} = \sum_{k=1}^m A_{ik} B_{kj} + \sum_{k=1}^m A_{i,m+k} B_{m+k,j}$$



$$C^{11}_{i,j} = (A^{11} B^{11} + A^{12} B^{21})_{i,j}$$

$$C^{11} = A^{11} B^{11} + A^{12} B^{21}$$

work - $6m \equiv$ multiplying matrices w/ matrix entries
 "is a (large) matrix multiplication"

\Rightarrow recursion

- matrix multiplication does not exploit commutativity of matrix entries

len - 2×2 matrix multiplication can be performed using - 7 multiplications
 - 8 additions/subtractions

sketches

$$\begin{pmatrix} c_{11} & c_{12} \\ c_{21} & c_{22} \end{pmatrix} = \begin{pmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{pmatrix} \begin{pmatrix} b_{11} & b_{12} \\ b_{21} & b_{22} \end{pmatrix}$$

also: compute

$$p_1 = (a_{11} + a_{22})(b_{11} + b_{22})$$

$$p_2 = (a_{21} + a_{22}) \cdot b_{11}$$

$$p_3 = a_{11}(b_{12} - b_{21})$$

$$p_4 = a_{22}(-b_{11} + b_{21})$$

$$p_5 = (a_{11} + a_{12})b_{22}$$

$$p_6 = (-a_{11} + a_{21})(b_{11} + b_{12})$$

$$p_7 = (a_{12} - a_{21})(b_{21} + b_{22})$$

output

$$c_{11} = p_1 + p_4 - p_5 + p_7$$

$$c_{12} = p_3 + p_5$$

$$c_{21} = p_2 + p_6$$

$$c_{22} = p_1 + p_3 - p_2 + p_4$$

complexity: 7 multiplications
 8 add/subtract

correctness: new "clever"

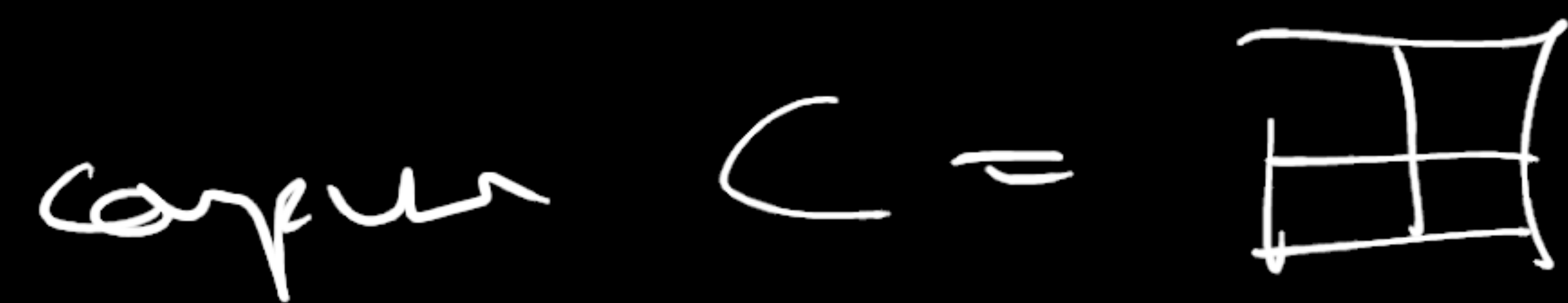
work = naive algo - 4 entries of C
 - per entry
 - 2 mult
 - 4 add
 \Rightarrow 8 mult, 4 add
 > 7 < 18

- disjoint of "disjoint problems" are independent

also: for A, B size $N=2^k$



blocks size $2^{k-1} = N/2$



via - 7 mults
- 18 adds

recursively
variety

correctness: clear

complexity = $T(N) \leq 7 \cdot T(N/2) + O(N^2)$
 $\leq \dots$
 $\leq O(N \log_2 7)$

for general N , embed A, B into matrix
size $2^{\lceil \log_2 N \rceil}$ via zero padding



\square

rank: disparity "independent
problems are independent"

today: - complexity of primitive ops

- matrix mult
- naive
- block
- Strassen

next lecture: bilinear complexity

by itself: pset 1 due
pset 2