

## 15-853: Algorithms in the Real World

### Clarification on cache-oblivious matrix multiplication

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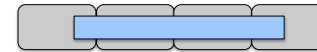
## Array storage

How many blocks does a size- $N$  array occupy?

- If it's aligned on a block (usually true for cache-aware), it takes exactly  $\lceil N/B \rceil$  blocks



- If you're unlucky, it's  $\lceil N/B \rceil + 1$  blocks. This is generally what you need to assume for cache-oblivious algorithms as you can't force alignment



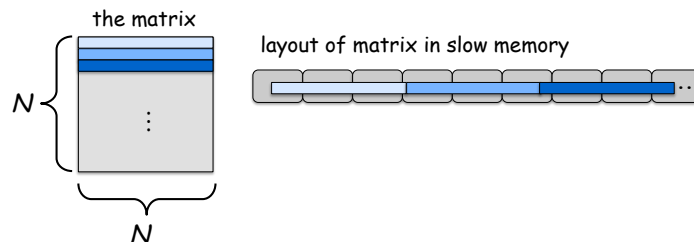
- In either case, it's  $\Theta(1 + N/B)$  blocks

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## Row-major matrix

If you look at the full matrix, it's just a single array, so rows appear one after the other



- So entire matrix fits in  $\lceil N^2/B \rceil + 1 = \Theta(1 + N^2/B)$  blocks

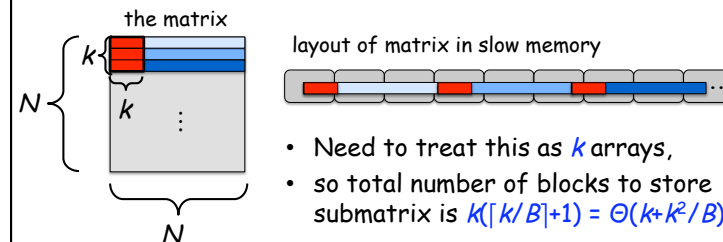
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## Row-major submatrix

(This is the part that was probably not clear)

- In a submatrix, rows are not adjacent in slow memory



- Need to treat this as  $k$  arrays,
- so total number of blocks to store submatrix is  $k(\lceil k/B \rceil + 1) = \Theta(k^2/B)$

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## Row-major submatrix

- Recall we had the recurrence

$$\text{Mult}(N) = 8 \text{Mult}(N/2) + \Theta(N^2/B) \quad (1)$$

The question is when does the base case occur here? Specifically, does a  $\Theta(\sqrt{M}) \times \Theta(\sqrt{M})$  matrix fit in cache, i.e., does it occupy at most  $M/B$  different blocks?

- If a  $\Theta(\sqrt{M}) \times \Theta(\sqrt{M})$  fits in cache, we stop the analysis at a  $\Theta(\sqrt{M})$  size — lower levels are free.

i.e.,  $\text{Mult}(\Theta(\sqrt{M})) = \Theta(M/B) \quad (2)$

- Solving (1) with (2) as a base case gives

$$\text{Mult}(N) = \Theta(N^2/B + N^3/B\sqrt{M})$$

load full  
submat  
in cache

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## Is that assumption correct?

Does a  $\Theta(\sqrt{M}) \times \Theta(\sqrt{M})$  matrix occupy at most  $\Theta(M/B)$  different blocks?

- We have a formula from before. A  $k \times k$  submatrix requires  $\Theta(k + k^2/B)$  blocks,
- so a  $\Theta(\sqrt{M}) \times \Theta(\sqrt{M})$  submatrix occupies roughly  $\sqrt{M} + M/B$  blocks
- The answer is "yes" only if  $\Theta(\sqrt{M} + M/B) = \Theta(M)$ .
  - iff  $\sqrt{M} \leq M/B$ , or  $M \geq B^2$ .
- If "no," analysis (base case) is broken — recursing into the submatrix will still require more I/Os.

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## Fixing the base case

We saw 2 fixes in class

- Just assume the tall cache assumption that  $M \geq B^2$ . Then the base case is correct, completing the analysis.
- Change the matrix layout to Z-morton:
  - In this layout, a submatrix *is* contiguous.
  - Here a recursive  $k \times k$  submatrix is a single subarray (fitting in  $\Theta(1 + k^2/B)$  blocks) not the multiple arrays (requiring  $\Theta(k + k^2/B)$  blocks) we had before.

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