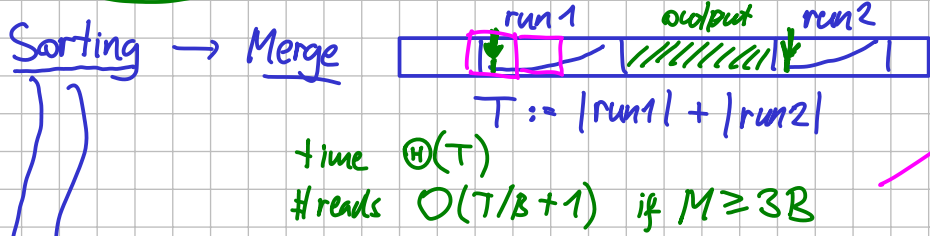


Cache models — cache-oblivious

I/O cache-aware

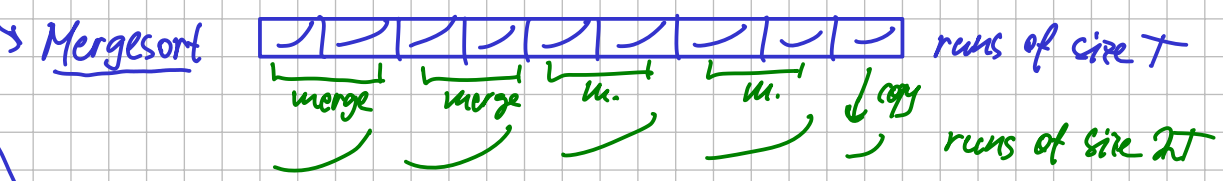
parameters:  $B \dots$  block size  
 $M \dots$  cache size

Linear scan  $O(N/B + 1)$  reads



we generally assume  $M \geq c \cdot B$

↑ arbitrary constant



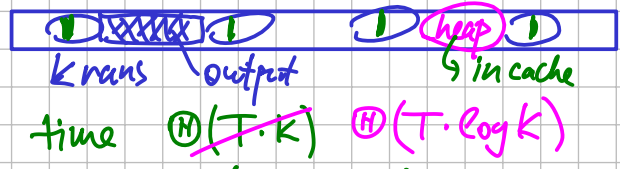
start with  $N$  runs of size 1 → after  $\log N$  steps we have 1 run (sorted)

1 step: time  $\Theta(N)$  whole: time  $\Theta(N \cdot \log N)$

#reads  $O(N/B + 1)$  → alg. #reads  $O(\frac{N}{B} \cdot \log N + \log N)$

also upper bound for cache-aware model

K-way Merge  $K$  runs → 1 run



#reads  $O(T/B + K)$  if  $M \geq (K+1)B + K + O(1) \dots$  so  $M \geq 2KB$  is sufficient

↑ scans

if runs are consecutive

we can set  $k := \frac{M}{2B}$

K-way Mergesort In every step, we merge  $k$ -tuples of runs

$\hookrightarrow$  #steps  $\leq \log_k N = \frac{\log N}{\log k}$

1 step: time  $\Theta(N \cdot \log k)$  all: time  $\Theta(N \cdot \log k \cdot \frac{\log N}{\log k})$

#reads  $O(N/B + 1)$  → steps: #reads  $O(\frac{N}{B} \cdot \frac{\log N}{\log k} + 1)$

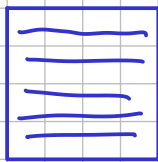
① this is known to be optimal in the I/O model (permutation bound) #reads is  $O(\frac{N}{B} \cdot \frac{\log N}{\log M/B} + 1)$

② also works in cache-aware model

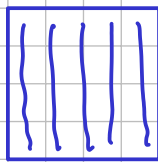
③ the same time + I/O complexity is reached by FunnelSort in the cache-oblivious model.

# Matrix Transposition of square matrix $N \times N$ .

How is a matrix stored



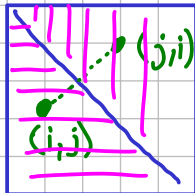
row-major order  
✓



column-major order  
Fortran & MATLAB

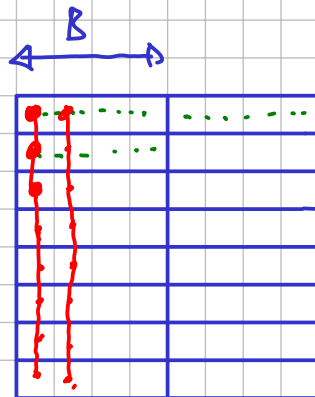
## 1) Trivial transpose

- ⊙  $(N^2)$  time
- ⊙  $(N^2)$  I/Os



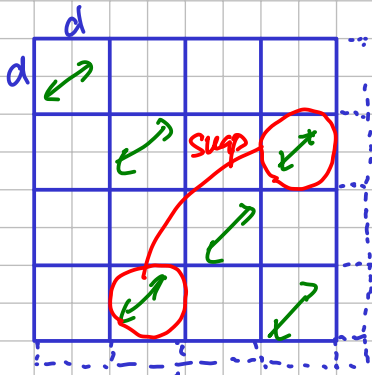
row scan  
↓  
consecutive in memory  
↓  
#reads  $\in O(N^2/B)$

Column scan: #reads  $\in \Theta(N^2)$   
unless  $M \geq N \cdot B$



row-major  
assume  $B \setminus N$

## 2) Use tiles of size $d \times d$

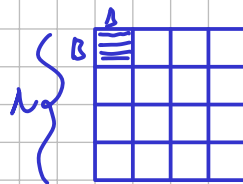


- transpose every tile
- swap tiles in symmetric pairs
- if 2 tiles fit in the cache, both tile transpose & tile swap done in the cache

in general: rectangular tiles at the border

we want:  $\frac{d^2}{B} \cdot \left(\frac{N}{d}\right)^2 = \frac{N^2}{B}$

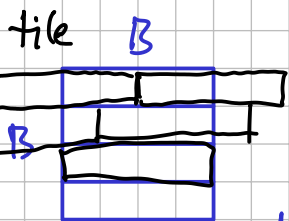
ⓐ if  $N$  is a multiple of  $B$ : we set  $d := B$



each row of a tile is a block  
↓  
tile spans  $B$  full blocks

#reads to load tile to cache =  $B$   
⊙  $(B)$  I/Os per tile } total I/O  
 $\left(\frac{N}{B}\right)^2$  tiles }  $O\left(\frac{N^2}{B}\right)$

## ⓑ general $N$ ... we still set $d := B$



each row spans max. 2 blocks  
 $\Rightarrow$  #reads to load a tile  $\leq 2B \in \Theta(B)$

#tiles =  $\lceil N/d \rceil^2 = \lceil N/B \rceil^2$   
 $\leq \left(\frac{N}{B} + 1\right)^2$   
 $\in O\left(\frac{N^2}{B^2} + 1\right)$

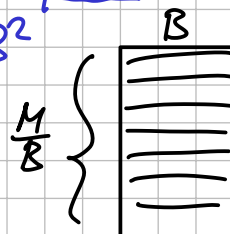
total time:  $\Theta(N^2)$

total I/Os:  $O\left(B \cdot \left(\frac{N^2}{B^2} + 1\right)\right) = O\left(\frac{N^2}{B} + 1\right)$

But we need  $M \geq 2B^2$

tall cache assumption

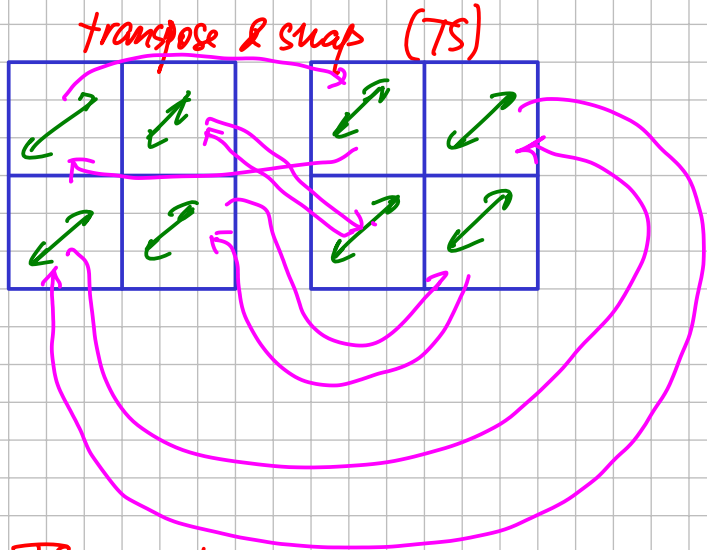
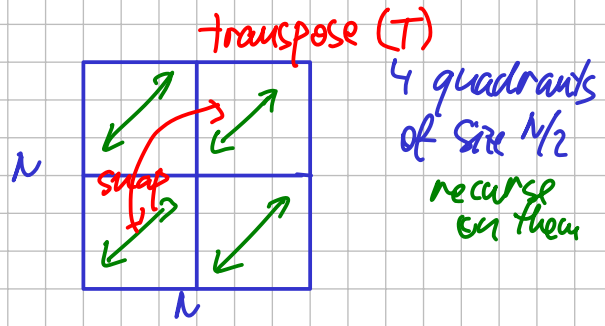
$M \geq c \cdot B^2$



$M \geq 4B^2$

optimal cache-aware algorithm

# 3 Cache-oblivious - Divide & Conquer alg.

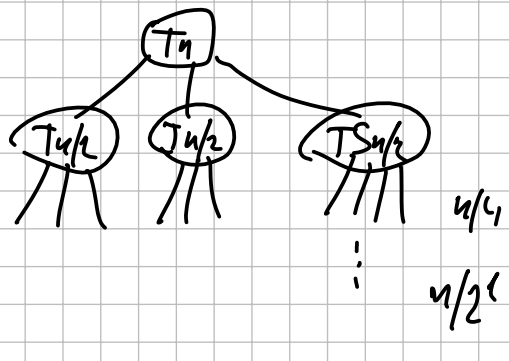


temporarily assume  $N=2^k$

$$T_n \rightarrow 2T_{n/2} + TS_{n/2}$$

$$TS_n \rightarrow 4TS_{n/2}$$

tree of recursion



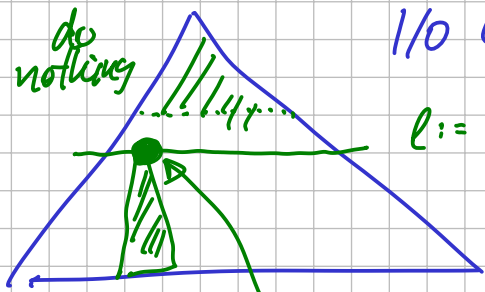
$\log N$  levels

at most  $4^l$  subproblems at level  $l$  of size  $N/2^l$

$\Rightarrow 4^{\log N}$  leaves,  $O(1)$  time per leaf  
 $(2^{\log N})^2 = N^2$

# int. nodes  $\leq$  # leaves  $\leq N^2$   
 $O(1)$  time per int. node

$\rightarrow O(N^2)$  time



I/O Complexity

$l :=$  topmost level at which problem size  $\leq B$

$$N/2^l \leq B \quad \text{but also} \quad N/2^{l-1} > B$$

$$N/2^l > B/2$$

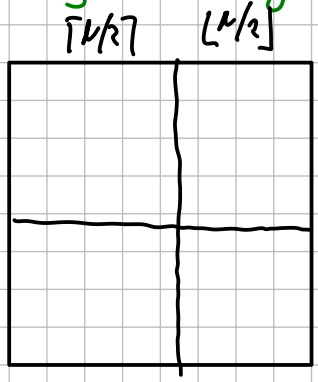
$$B/2 < N/2^l \leq B$$

$$N/2^l \in \Theta(B)$$

upper bound in the I/O model

but: the subproblems at level  $l$  form a tiling of the whole matrix

$\hookrightarrow$  by reasoning from (2) # I/Os  $\in O(N^2/B + 1)$



for general  $N$

prove that all subproblems are almost square: sides differ by at most 1.

proof: Exercise.