

APPROXIMATION ALGORITHMS

ON-LINE ALGORITHMS I

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TODAY

- COMPETITIVE RATIO
- REFRESHER: SCHEDULING JOBS ON PARALLEL MACHINES
- BIN PACKING
 - GREEDY 2-APPROXIMATION
 - COMPETITIVE RATIO $4/3$ LOWER BOUND
- ON-LINE STEINER TREE
 - LOWER BOUND
 - UPPER BOUND

COMPETITIVE RATIO

LET OPT DENOTE THE COST OF AN OPTIMAL SOLUTION

DEF.

AN ON-LINE ALGORITHM IS c -COMPETITIVE IF
IT ALWAYS FINDS A SOLUTION OF COST $\leq c \cdot \text{OPT}$.

IT IS ASYMPTOTICALLY c -COMPETITIVE IF IT ALWAYS
FINDS A SOLUTION OF COST $\leq c \cdot \text{OPT} + o(\text{OPT})$

BASICALLY SYNONYMOUS
WITH APPROXIMATION FACTOR

↑
NEGLECTIBLE
WHEN OPT
IS LARGE

SCHEDULING JOBS ON MULTIPLE MACHINES

INPUT: NUMBER m OF MACHINES

$p_1, p_2, \dots, p_n \geq 0$ PROCESSING TIMES,
BEING REVEALED ONE AT A TIME

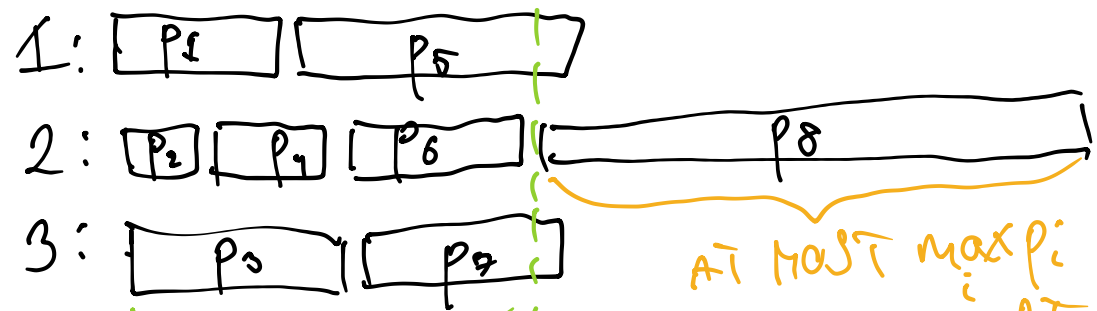
NEW COMPARED TO SETUP IN FIRST LECTURE

GRAMAN'S ALGORITHM:

ASSIGN EACH JOB TO
THE MACHINE THAT
CURRENTLY HAS THE
SMALLEST LOAD
(TIES BROKEN IN ANY WAY)

COMPETITIVE RATIO
IS ≤ 2

CONFIGURATION ($m=3$):



NO MACHINE
IS IDLE

START
OF LAST
JOB

$$\leq \sum_i p_i / m \leq OPT$$

TOTAL
COST
 $\leq 2 OPT$

TIGHT

ON-LINE

BIN-PACKING PROBLEM

INPUT: $a_1, a_2, \dots, a_n \in (0, 1)$, REVEALED ONE AT A TIME

OBJECTIVE: ASSIGN $\{1, \dots, n\}$ TO m BINS SUCH THAT ELEMENTS
IN EACH BIN B_j HAVE $\sum_{i \in B_j} a_i \leq 1$ AND m IS AS SMALL
AS POSSIBLE. ONCE ASSIGNED $i \in B_j$, THIS CANNOT
BE CHANGED.

"NEXT FIT"

GREEDY ALGORITHM:

WORK ON ONE BIN AT A TIME.
IF THERE IS ROOM, PUT a_i IN
BIN j , OTHERWISE MOVE ON
TO A NEW, EMPTY BIN

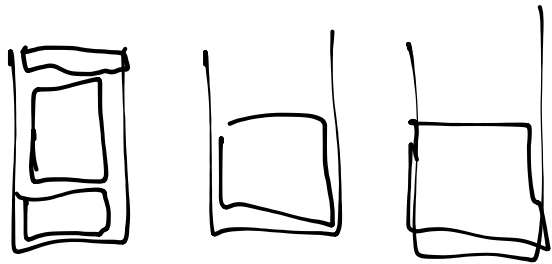
PAUSE AND THINK:

SHOW THAT GREEDY HAS
COMPETITIVE RATIO 2.

EXACTLY

FIRST FIT ALGORITHM

FOR ITEM i , PLACE a_i IN
THE FIRST EXISTING BIN
WHERE IT FITS, OR OPEN A
NEW BIN IF NONE EXISTS



ULLMAN (1971):

FIRST FIT USES
 $\leq 1.7 \text{OPT} + 3$ BINS

AND THE FACTOR 1.7
IS THE BEST ASYMPTOTIC
COMPETITIVE RATIO

LOWER BOUND FOR BIN PACKING'S COMPETITIVE RATIO

WANT TO SHOW LIMIT ON ANY ALGORITHM.

CONSIDER, FOR SOME SMALL $\epsilon > 0$, THE INPUT SEQUENCE

$$\underbrace{\frac{1}{2} - \epsilon, \frac{1}{2} - \epsilon, \frac{1}{2} - \epsilon, \dots, \frac{1}{2} - \epsilon}_{m \text{ TIMES}}, \underbrace{\frac{1}{2} + \epsilon, \frac{1}{2} + \epsilon, \dots, \frac{1}{2} + \epsilon}_{m \text{ TIMES}}$$

(2018)
BALOGH ET AL.:
COMP. RATIO
BETWEEN \sim
1.543 AND 1.578

AFTER FIRST m INPUTS, HAVE
 $\frac{m}{2} + t$ BINS, OF WHICH $2t$ HAVE
1 ELEMENT AND THE REST HAVE TWO

CAN MATCH $2t$ OF THESE TO
BINS WITH ONE ELEMENT, REMAINING
 $m - 2t$ NEED TO BE IN SEPARATE BINS

LOWER BOUND FOR ANY ALGORITHM

COMPETITIVE

$$\text{RATIO} \geq \frac{\frac{m}{2} + t}{\text{OPT}_m} = \frac{\frac{m}{2} + t}{m/2} = 1 + \frac{2t}{m}$$

AT TIME m

$$\boxed{\max\left(1 + \frac{2t}{m}, \frac{3-t}{m}\right) \geq \frac{4}{3} \text{ FOR ALL } t}$$

COMPETITIVE RATIO

$$\geq \frac{\frac{m}{2} + t + m - 2t}{m} = \frac{3}{2} - \frac{t}{m}$$

OPT_{2m}

ON-LINE STEINER TREE

FIXED AHEAD OF TIME

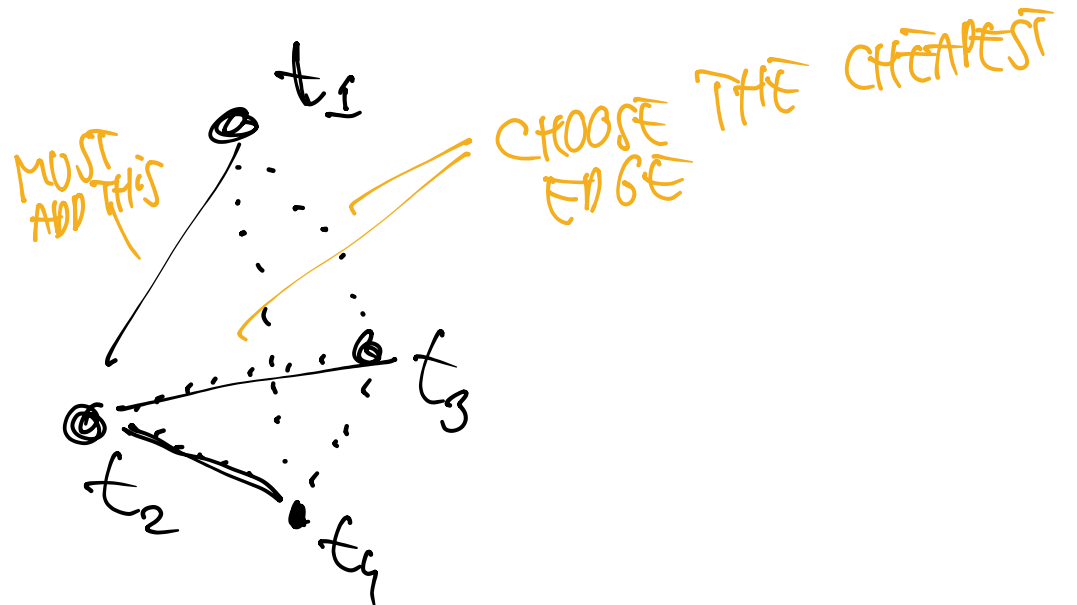
INPUT: DISTANCE METRIC GIVEN BY A WEIGHTED GRAPH

SEQUENCE t_1, \dots, t_k OF "TERMINAL NODES" IN GRAPH
GIVEN ON-LINE ONE AT A TIME

OBJECTIVE: MAINTAIN A STEINER TREE SPANNING THE
TERMINAL NODES t_1, \dots, t_i SEEN SO FAR.
CAN ONLY ADD EDGES, NOT REMOVE ANY

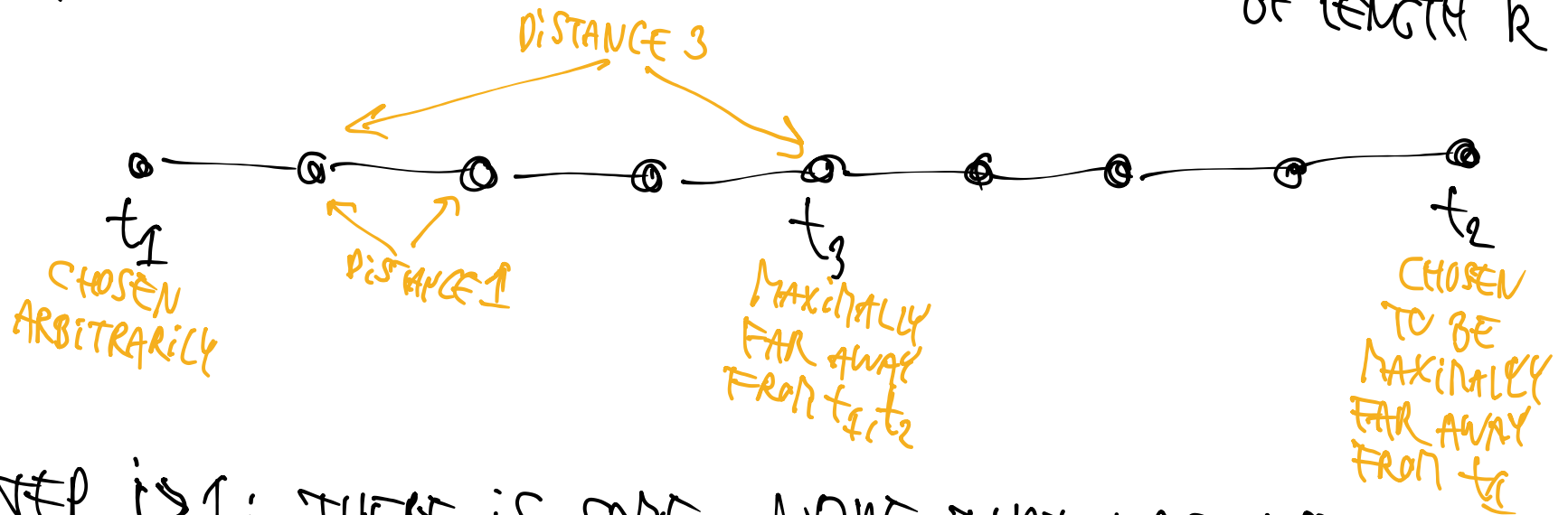
GREEDY ALGORITHM:

IN EACH STEP i
ADD THE CHEAPEST
EDGE $\{t_i, t_j\}$ WITH $j < i$



LOWER BOUND FOR GREEDY'S COMPETITIVE RATIO

METRIC: SHORTEST PATH ON GRAPH THAT IS A SIMPLE PATH OF LENGTH k



IN STEP $i \geq 1$: THERE IS SOME NODE THAT HAS DISTANCE

AT LEAST $\frac{k}{i+1} / 2$ TO PREVIOUS NODES (SUCH INTERVAL OF LENGTH $\frac{k}{i+1}$ IS EMPTY)

TOTAL COST IS: $\sum_{i=2}^k \frac{k/2}{i+1} = \Omega(kH_k) = \Omega(k \log k)$

OPT = $k-1$

COMPETITIVE RATIO IS $\Omega(\log k)$

ANALYSIS OF GREEDY

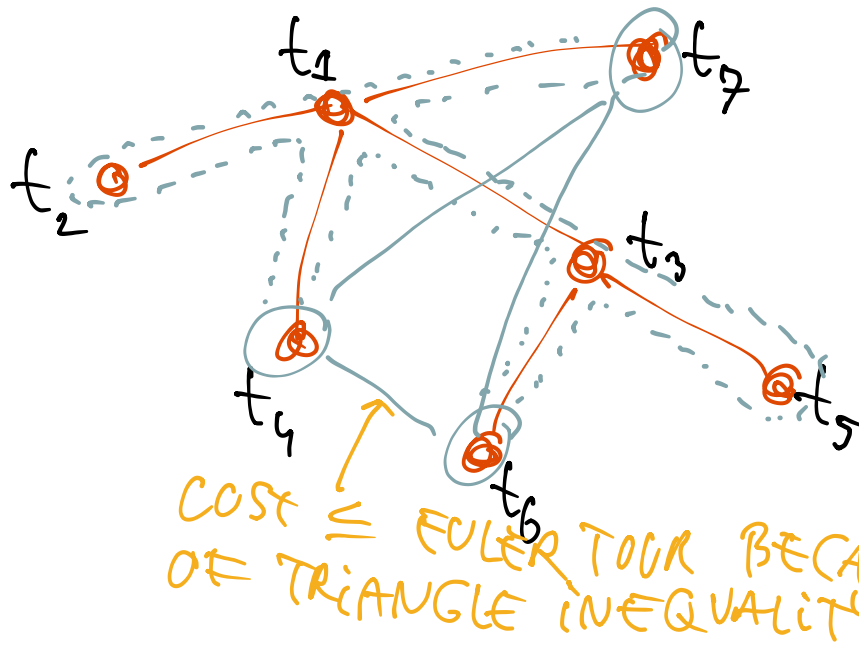
LEMMA FOR $i=1, \dots, k-1$, THE i TH MOST EXPENSIVE EDGE CHOSEN BY GREEDY HAS COST AT MOST $2 \text{OPT}/i$.

COROLLARY: TOTAL COST IS $\leq 2H_{k-1} \cdot \text{OPT}$

BOUND ON COMPETITIVE RATIO,
MATCHES LOWER BOUND UP TO CONSTANT FACTOR

PROOF OF LEMMA:

CONSIDER THE OPTIMAL STEINER TREE COST OPT



CLAIM
FOR ANY SET OF i TERMINALS, CAN CREATE A CYCLE VISITING THEM ALL OF WEIGHT $\leq 2 \text{OPT}$

\Rightarrow SOME EDGE HAS COST $\leq 2 \text{OPT}/i$

LEMMA FOR $i=1, \dots, k-1$, THE i TH MOST EXPENSIVE EDGE CHOSEN BY GREEDY HAS COST AT MOST $2OPT/i$.

CLAIM
FOR ANY SET OF i TERMINALS, CAN CREATE A CYCLE VISITING THEM ALL OF WEIGHT $\leq 2OPT$
 \Rightarrow SOME EDGE HAS COST $\leq 2OPT/i$

LAST PART OF PROOF

ORDER THE TERMINALS ACCORDING TO THE COST INCURRED BY GREEDY

$t_{(1)}, t_{(2)}, \dots, t_{(k)}$

\uparrow
MOST EXPENSIVE TO ADD

\uparrow
CHEAPEST TO ADD
 C_i : CYCLE CONTAINING THE i MOST EXPENSIVE TERMINALS

SOME TERMINAL
IN C_i COST $\leq 2OPT/i$
TO ADD

\Rightarrow THE CHEAPEST IN C_i COSTS AT MOST $2OPT/i$.