

Approximating the Throughput by Coolest First Scheduling

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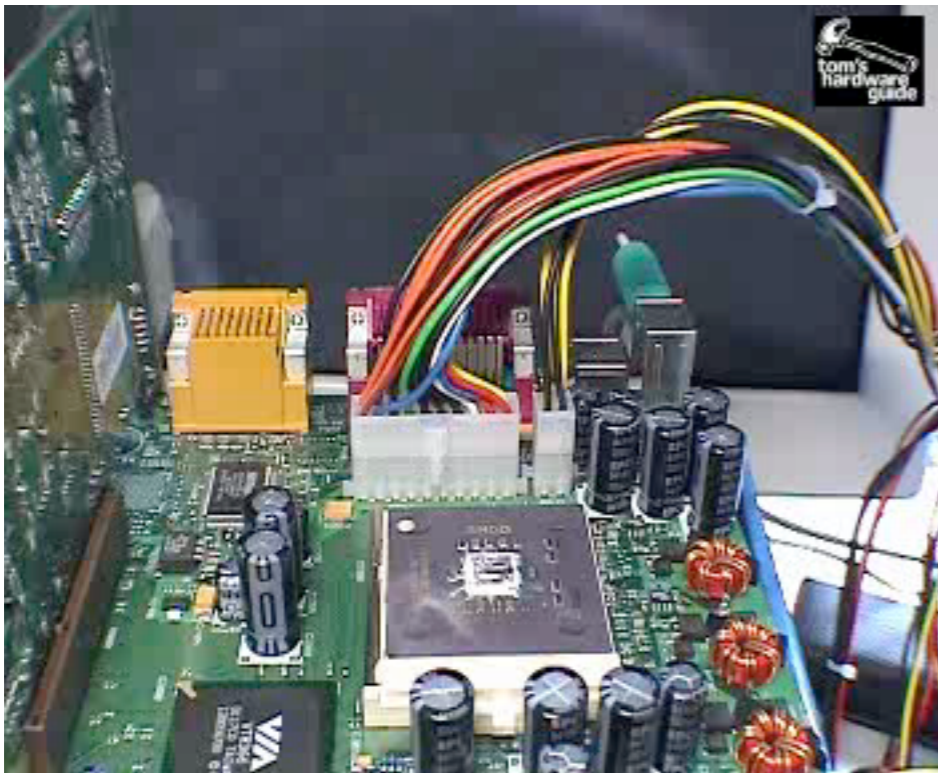
sep 2012 — WAOA







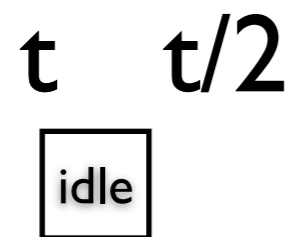
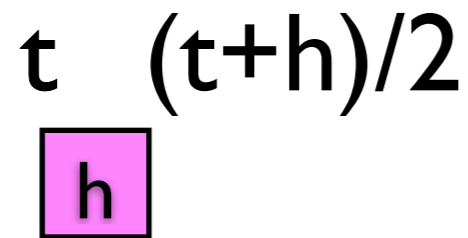
Motivation



When the CPU temperature exceeds some threshold

- some models freeze until CPU cooled down enough
- some models just start melting

The model



jobs have

- unit processing time
- distinct heat contribution in $[0,2]$

CPU temperature

- is initially 1
- should never exceed 1

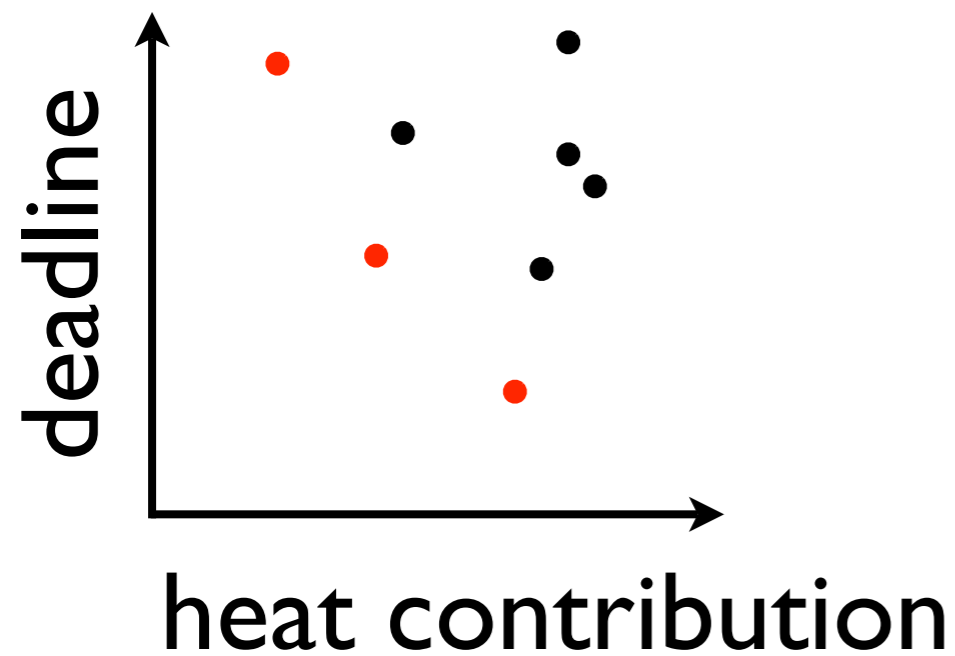
goal

- schedule a maximum number of jobs before (common) deadline D
- problem is NP-hard

temperature | 1 0.55 0.36 0.67 0.9 1 1/2 5/6



What was known



more general on-line setting

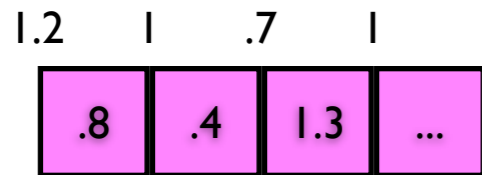
- jobs arrive online and have distinct deadlines, heat-contributions
- goal: maximize number of scheduled jobs respecting deadlines

[Chrobak,D,Hurand,Robert'08]

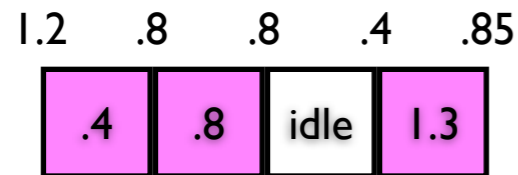
- scheduling any **non-dominated job** yields a 2-competitive on-line algorithm
- **how good are these algorithms in the offline setting?**

Minimizing makespan

HottestFirst



CoolestFirst



offline setting

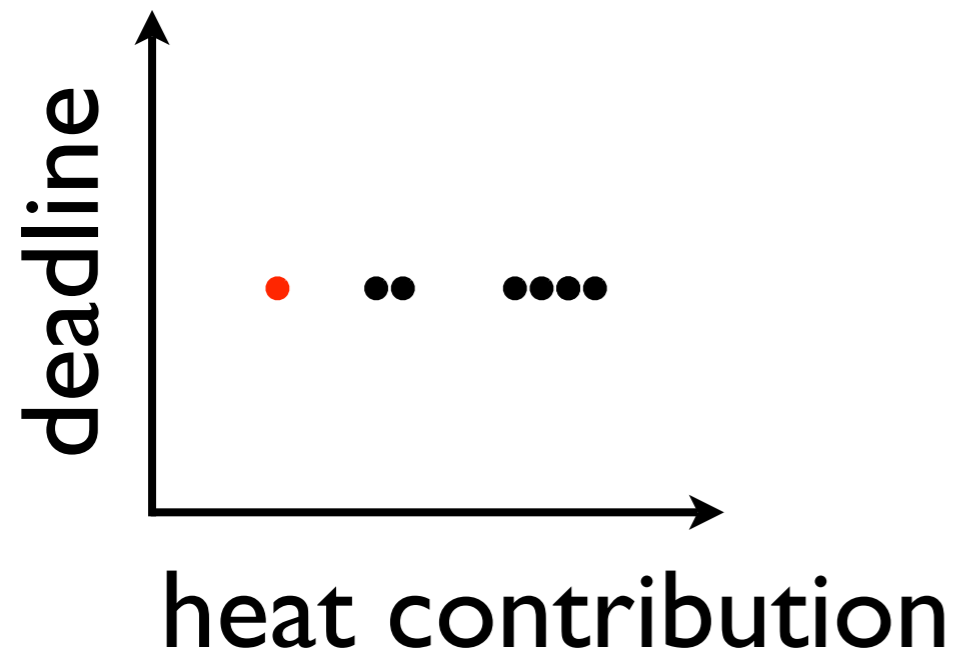
- all jobs are available at time 0 and have no deadline
- goal: produce a schedule respecting temperature threshold with smallest makespan

[Yang,Zhou,Chrobak,Zhang'08]

[Bampis,Letsios,Lucarelli,Markakis,Milis'12]

- *HottestFirst*: schedule at any moment the job with the largest heat contribution among jobs that would respect the temperature threshold
- seems to be a good heuristic to keep temperature low at later point and so avoid idle times

Maximizing throughput



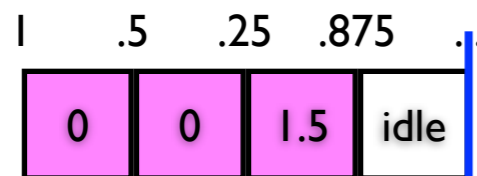
offline setting

- all jobs are available at time 0
- all jobs have the same deadline D
- goal: schedule as many jobs before deadline D

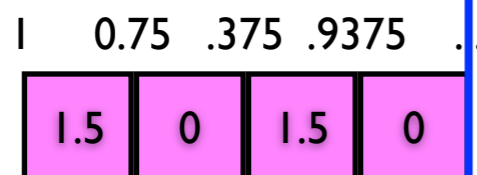
Only the coolest job is non-dominated

- *CoolestFirst*: schedule at any moment the job with the smallest heat contribution among allowed jobs
- It would be more clever to give priority to jobs with heat contribution $\in(1,2]$ since jobs from $[0,1]$ can be scheduled anytime. But then we don't know how to analyse.

CoolestFirst



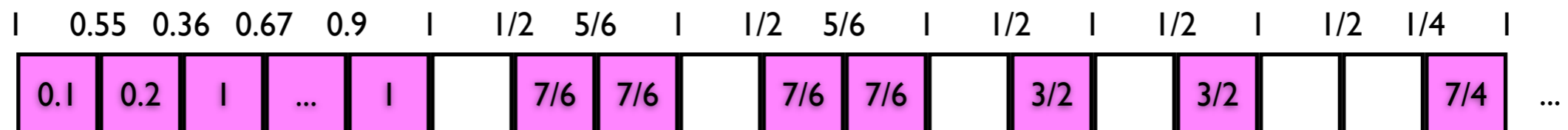
Better



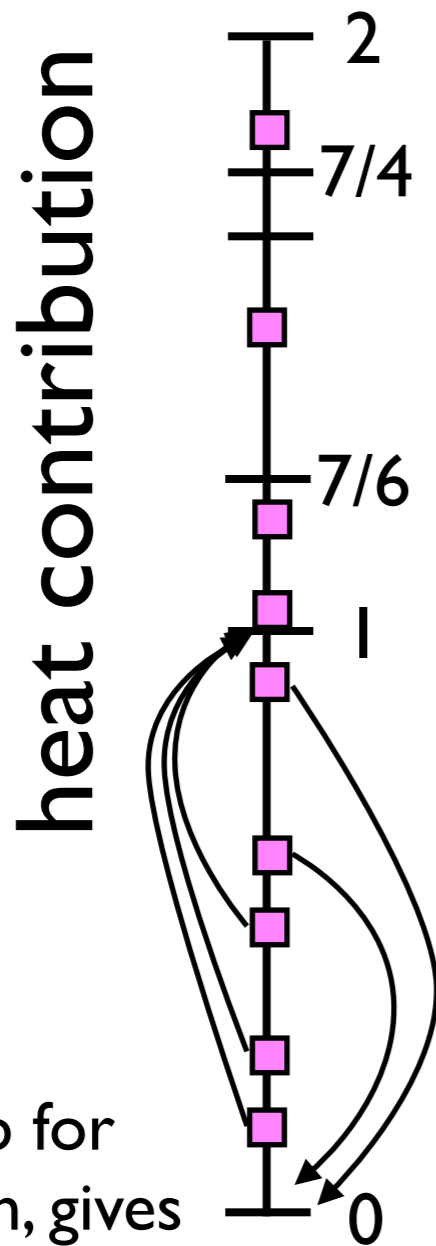
D

Analyze Coolest First

- **Input:** n jobs with different heat contributions $\in [0,2]$ and a common deadline D
- **CoolestFirst:** At any time schedule the one with smallest heat contribution among the jobs that would respect the temperature threshold
- **typical behavior:** schedule get's less and less dense



Method of analysis



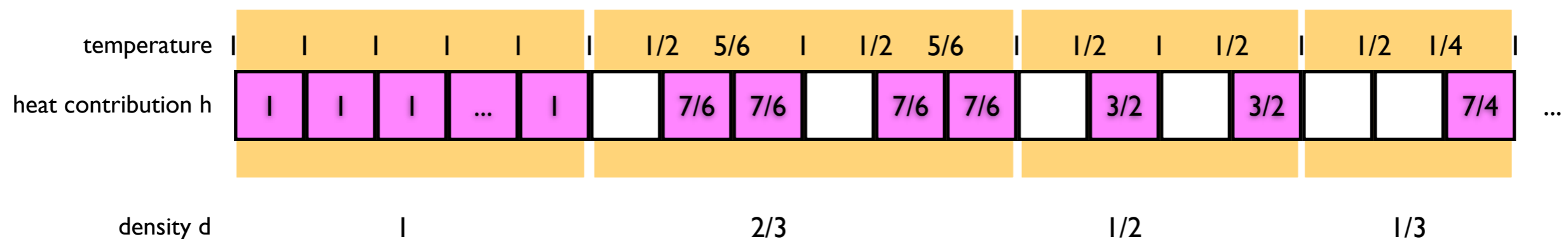
round up for
algorithm, gives
structure to upper
bound objective

round down for
optimum, gives
structure to lower
bound D

- Assume optimum schedules *all* jobs
- Let D be the optimal makespan
- Partition $[0,2]$ into job classes
- This pessimistic rounding permits to lower bound approximation ratio

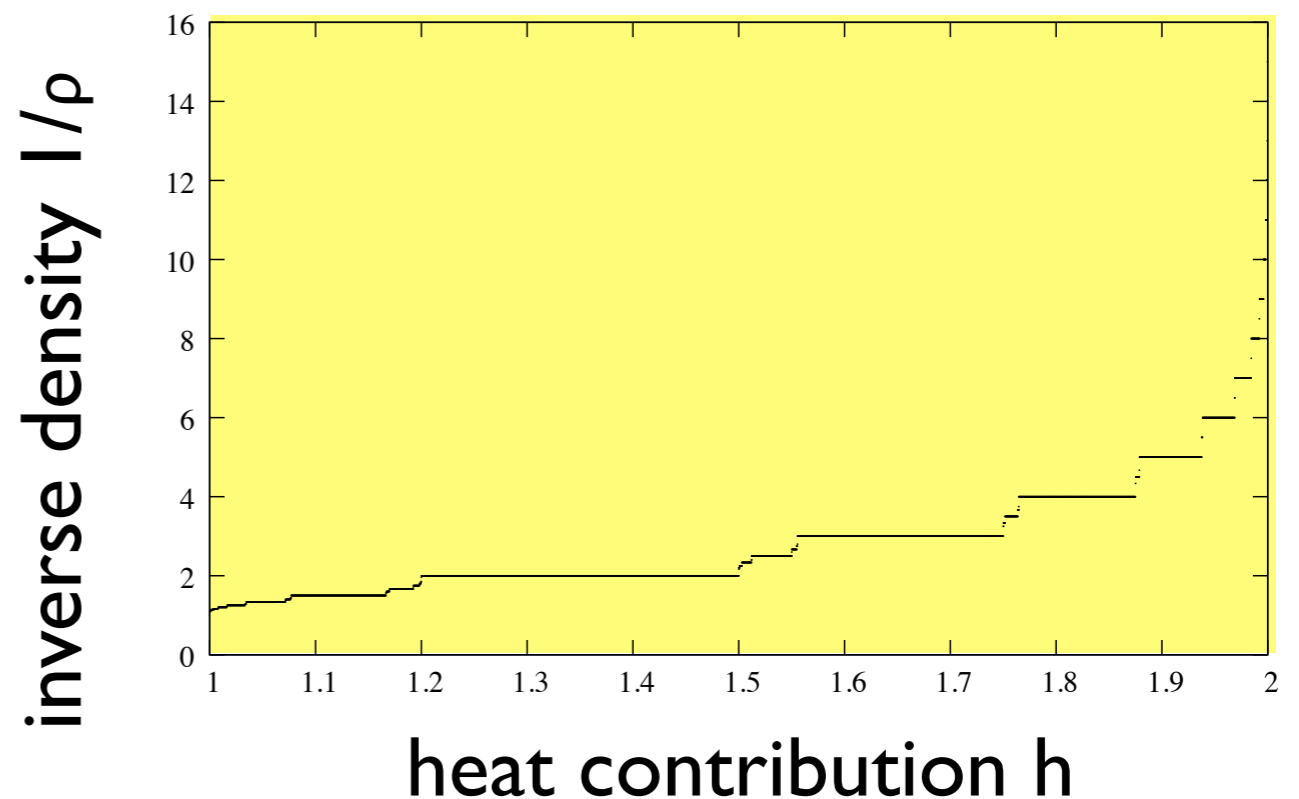
Density

- the output for the rounded instance, consist of **blocks** of jobs of same heat contribution **h**
- every block has some density $\rho := \text{average \#jobs per slot}$
- what is the relation between **h** and ρ ?



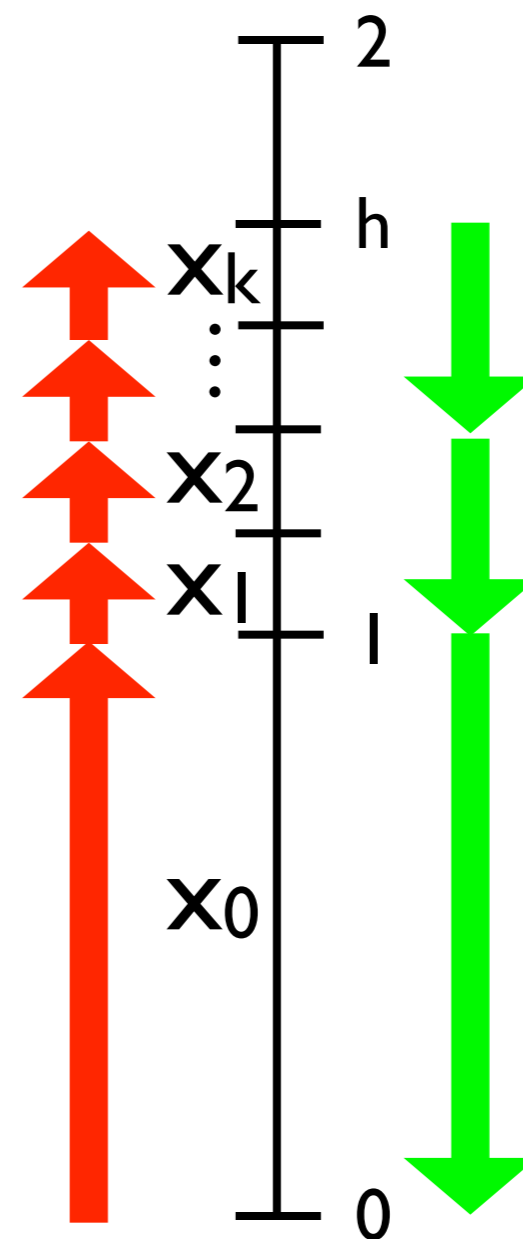
Relation between h and ρ

- experiments indicate it's monotone
(as one would expect)
- confirmed by a **proof**:
 \forall rational $\rho \exists h_\rho$:
 $G(h_\rho)$ has density ρ
and h_ρ is decreasing in ρ



Structure of the analysis

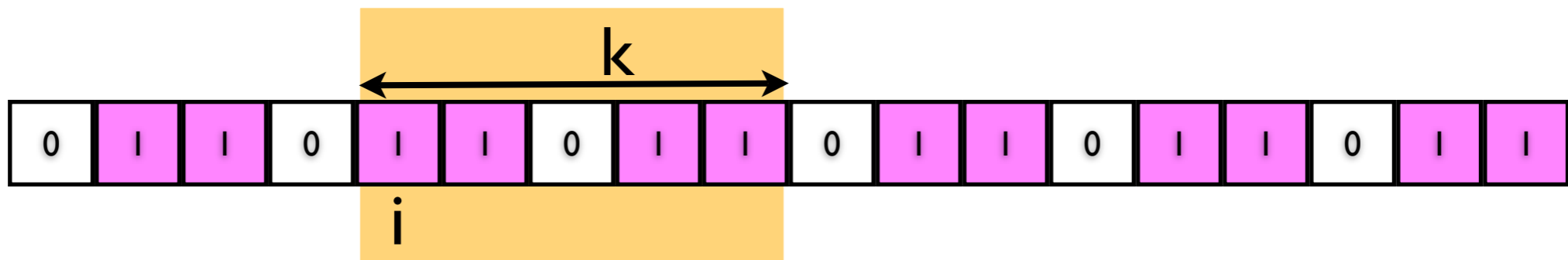
- Suppose last job scheduled by CoolestFirst has heat contribution h
- Partition $[0,2]$ into s classes
- Round heat contributions **up** for algorithm
- For every $q=1,\dots,k-1$ round jobs **down** for the optimum
- Find worst case instance described by number of jobs from each class x_1,\dots,x_k boils down in solving a linear program
- We provide a solution to the dual linear program, bounding the primal
- For the worst choice of h , this shows approximation ratio of CoolestFirst ≥ 0.72
- In contrast worst case example has ratio=0.75



Properties of sequence

- $G : h \mapsto$ infinite 01-sequence w describing output of CoolestFirst on infinite h -jobs

- exists ρ , such that for all i, k *sliding window property*
 $\text{floor}(\rho k) \leq \sum_{j=i}^{i+k-1} w_j \leq \text{ceil}(\rho k)$

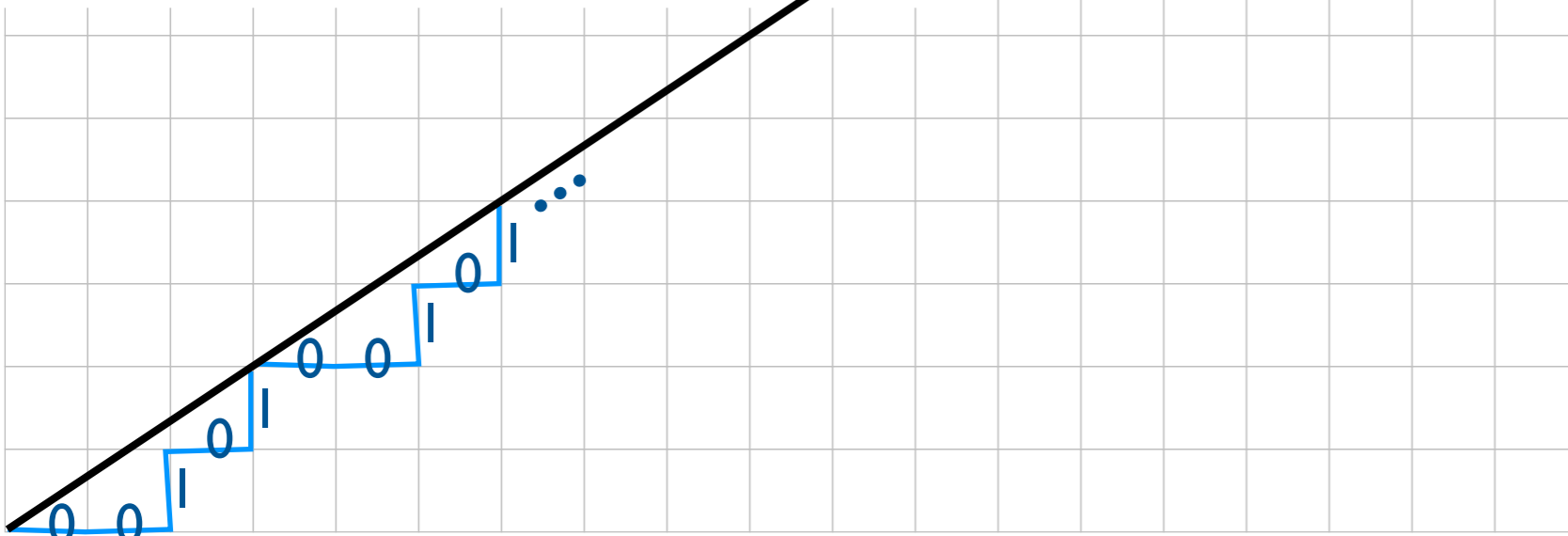


- is periodic (if h is rational)
- sounds familiar?

Discretization of line

discrete line (slope s , offset o)

- init $y=o$
- repeat:
 - if $y \geq l$, produce 1, update $y -= l$
 - if $y < l$, produce 0, update $y += s$



- s is irrational \Leftrightarrow
sequence *Sturmian*
- s is rational \Leftrightarrow
sequence is periodic
- *sliding window property*

Seem so different

discrete line (slope s , offset o)

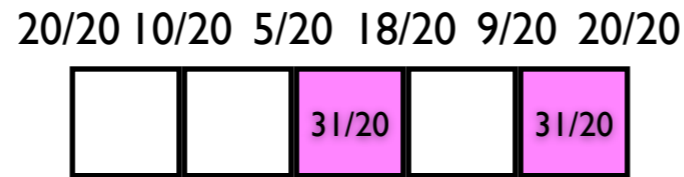
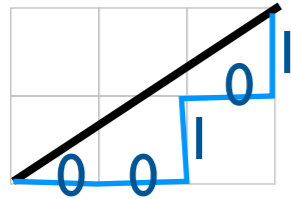
- init $y=o$
- repeat:
 - if $y \geq l$, produce 1, update $y -= l$
 - if $y < l$, produce 0, update $y += s$
- different slopes produce different sequences
- add

ok, but all we need $\forall \rho \exists h_\rho$
Greedy(l, h_ρ) produces density ρ ,
and $\rho < \rho'$ implies $h_\rho > h_{\rho'}$

Greedy (init temperature t , h)

- init t
- repeat:
 - if $t+h \leq 2$, produce 1, update $t = (t+h)/2$
 - if $t+h > 2$, produce 0, update $t /= 2$
- several h produce same sequence
- add and divide

$\forall p \in h_p$



- density p/q 2/5
- slope $p/(q-p)$ 2/3
- produces w^* (00101)^*
- $\underline{w} := \sum_{i=0..q-1} 2^i w_i$ 4+16=20
- $h=(2^q-1)/\underline{w}$ 31/20
- $\text{CircShift}(x_1x_2\dots x_k) := x_2\dots x_kx_1$
- $\text{Circ}(x) := \text{closure of } \{x\} \text{ under CircShift}$
- Properties $\forall u \in \text{Circ}(w)$

00101
01010

010101
100101
101001

- $u \leq w$ reverse lexicographically: $\underline{u} \leq \underline{w}$
- $u| \leq |w$ iff u starts with 1

procedure (w)

- init $u=w$
- repeat:
 - if u starts with 1, produce 1
 - else produce 0
 - update $u=\text{CircShift}(u)$

equivalences (let $t=\underline{u}/\underline{w}$)

$$\begin{aligned}
 t+h &\leq 2 \\
 \underline{u}+2^{q-1} &\leq 2\underline{w} \\
 \underline{u}| - 1 &\leq 0\underline{w} \\
 \underline{u}| &\leq | \underline{w} \\
 &u \text{ starts with } 1
 \end{aligned}$$

update

- if u starts with 0 then $\text{CircShift}(u)=\underline{u}/2$
- if u starts with 1 then $u=|v$ and $(\underline{u}+2^{q-1})/2=\underline{v}+2^{q-1}=\underline{v}| = \text{CircShift}(u)$

conclusion

- $\text{CoolestFirst}(h)$ produces same sequence as $\text{DiscreteLine}(p/q)$

Future directions

- Use this technique to analyse scheduling problems with different renewable resources
- Develop a new technique to analyse the Better Algorithm (priority to jobs $\in [0, 1]$)
- Come up with better bounds for the optimum schedule by rounding jobs $\in [0, 1]$ as well