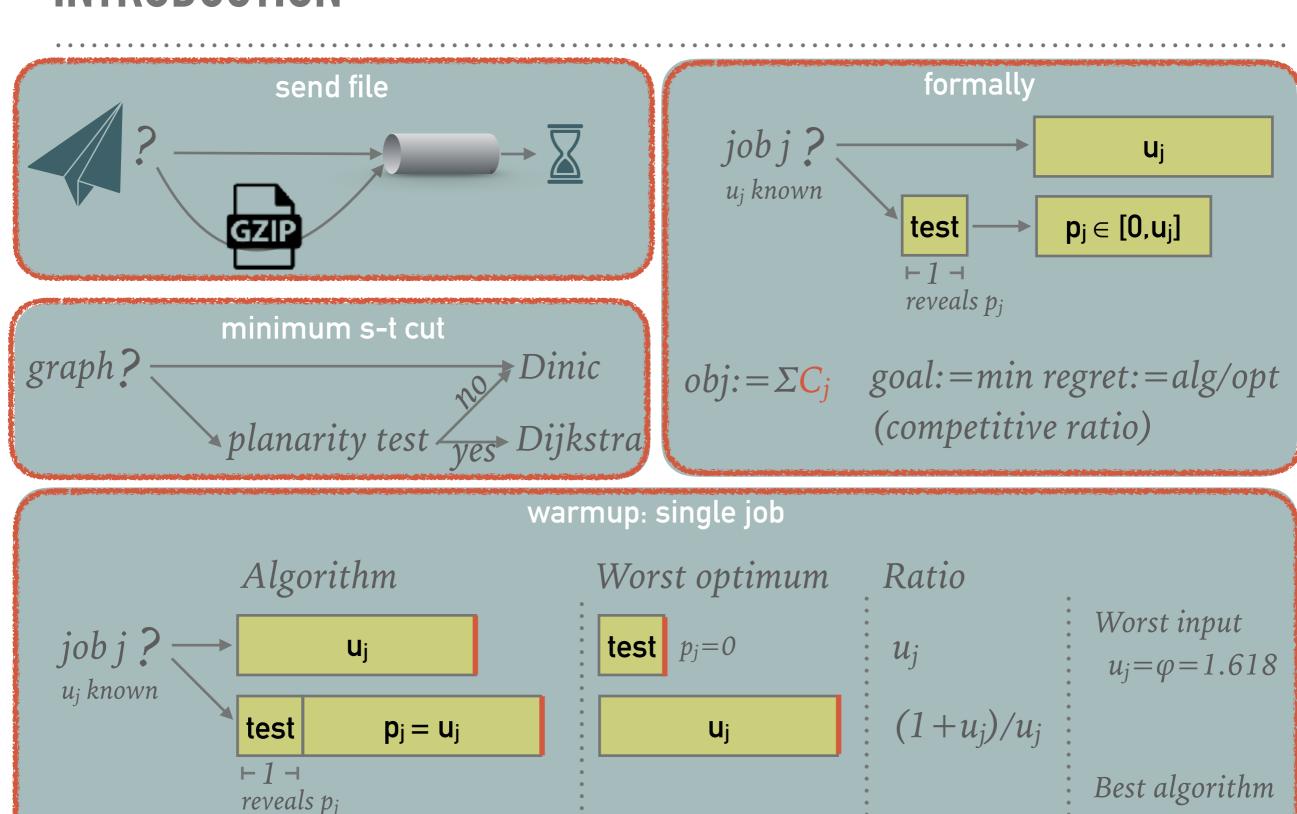
# SCHEDULING WITH EXPLORABLE UNCERTAINTY

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aussois scheduling workshop 2018

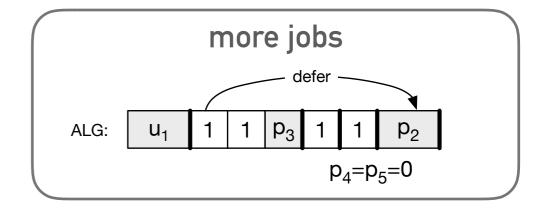
# INTRODUCTION



test iff  $u_i \ge \varphi$ 

# **RESULTS**

competitive ratio	lower bound	upper bound	algorithm
deterministic ratio	1.8546	2	THRESHOLD
randomized ratio	1.6257	1.7453 (asymptotic ratio)	RANDOM
det. ratio. when ∀j: u <sub>j</sub> =p	1.8546	1.9338	BEAT
det. ratio. when ∀j: u <sub>j</sub> =p, p <sub>j</sub> ∈{0,p}	1.8546	1.8668	UTE

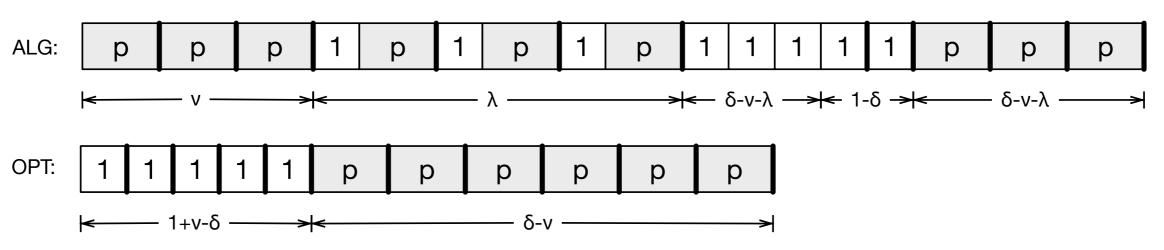


### DETERMINISTIC LOWER BOUND

competitive ratio	lower bound	upper bound	algorithm
deterministic ratio	1.8546	2	THRESHOLD
randomized ratio	1.6257	1.7453 (asymptotic ratio)	RANDOM
det. ratio. when ∀j: u <sub>j</sub> =p	1.8546	1.9338	BEAT
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- n uniform jobs with upper limit p
- Index jobs in order they are touched by algorithm (tested or executed untested)
- p<sub>j</sub>=0 if j≥δn or job j is executed untested by algo. p<sub>j</sub>=p otherwise
- Algorithm gets even to know δ
- Any decent algorithm produces a schedule with above structure for parameters v, λ with v+λ≤δ

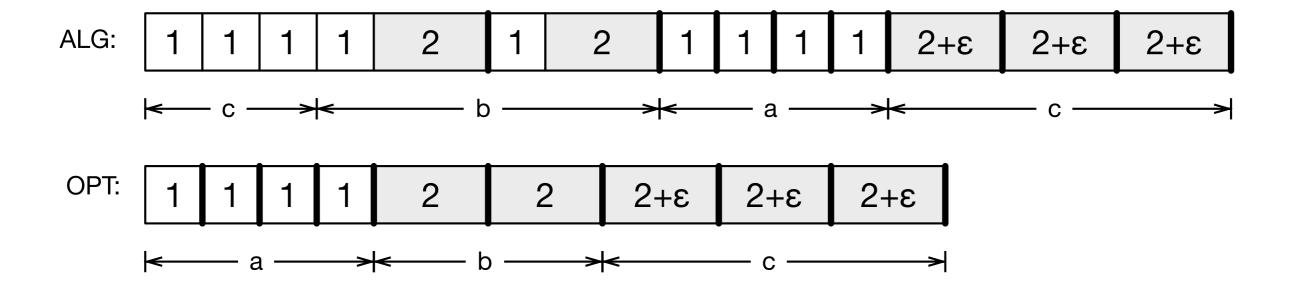
- The competitive ratio is ALG(δ,v, λ,n) / OPT(δ,v,n)
- Algorithm
   (minimizer) chooses
   v.λ
- Adversary
   (maximizer) chooses
   n,δ
- Analyzing local optima yields ratio 1.854628



## **ALGORITHM THRESHOLD**

competitive ratio	lower bound	upper bound	algorithm
deterministic ratio	1.8546	2	THRESHOLD
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det. ratio. when ∀j: u <sub>j</sub> =p	1.8546	1.9338	BEAT
det. ratio. when ∀j: u <sub>j</sub> =p, p <sub>j</sub> ∈{0,p}	1.8546	1.8668	UTE

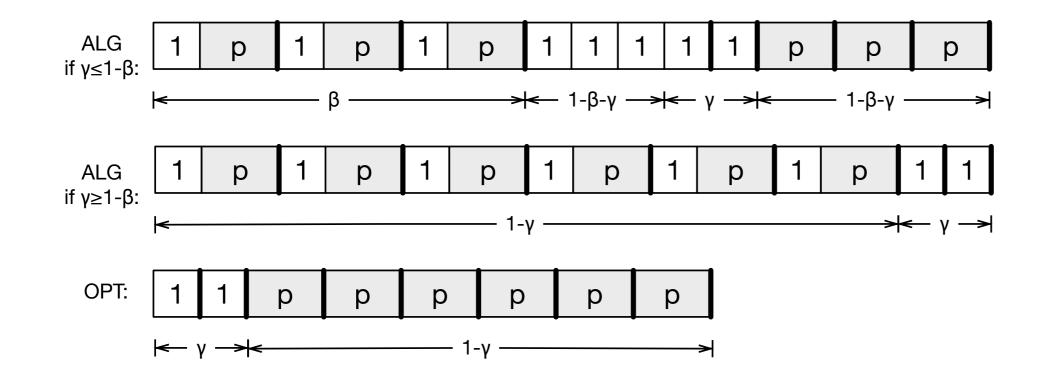
- Execute untested all jobs j with u<sub>j</sub>≤2 in order...
- Test all other
  jobs in arbitrary
  order. If p<sub>j</sub>≤2,
  execute,
  otherwise defer.
- Execute all deferred jobs in order...
- Worst case instance:
   a jobs u<sub>j</sub>=2,p<sub>j</sub>=0
   b jobs u<sub>j</sub>=p<sub>j</sub>=2
   c jobs u<sub>j</sub>=p<sub>j</sub>=2+ε
- Simple arithmetics: ALG(a,b,c)≤2· OPT(a,b,c)



### **ALGORITHM UTE**

competitive ratio	lower bound	upper bound	algorithm
deterministic ratio	1.8546	2	THRESHOLD
randomized ratio	1.6257	1.7453 (asymptotic ratio)	RANDOM
det. ratio. when ∀j: u <sub>j</sub> =p	1.8546	1.9338	BEAT
det. ratio. when ∀j: u <sub>j</sub> =p, p <sub>j</sub> ∈{0,p}	1.8546	1.8668	UTE

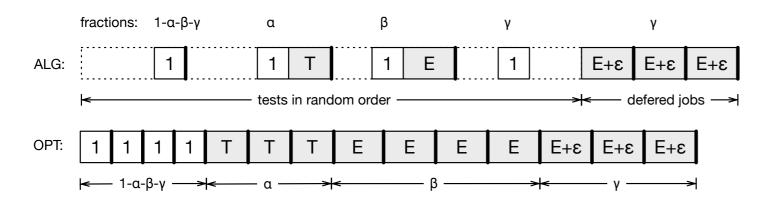
- $\begin{array}{l} \bullet \ \ \text{has ratio} \ \ \rho = \frac{1+\sqrt{3+2\sqrt{5}}}{2} \approx 1.8668. \\ \bullet \ \ \text{Parameter} \ \ \beta = \frac{1-\bar{p}+\bar{p}^2-\rho+2\bar{p}\rho-\bar{p}^2\rho}{1-\bar{p}+\bar{p}^2-\rho+\bar{p}\rho} \end{array}$
- Execute all jobs untested if p≤ρ
- Otherwise test all jobs. Execute right after their test the first max{0,β} fraction of jobs. Then only if p<sub>j</sub>=0. Finally execute deferred jobs.
- Worst case instance defined by length p fraction γ: the first γn tested jobs have p<sub>j</sub>=p and the remaining p<sub>j</sub>=0



• Second order analysis to optimize p, $\gamma$  and  $\beta$ 

### **ALGORITHM RANDOM**

competitive ratio	lower bound	upper bound	algorithm
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det. ratio. when ∀j: u <sub>j</sub> =p	1.8546	1.9338	BEAT
det. ratio. when ∀j: u <sub>j</sub> =p, p <sub>j</sub> ∈{0,p}	1.8546	1.8668	UTE



- has parameters T≥E
- Schedule untested all jobs with upper limit < T in increasing upper limit order</li>
   Test in random order all larger jobs j, if p<sub>j</sub>≤E execute immediately, else defer their execution
   Finally schedule deferred jobs in increasing processing time order
- Worst case instances:  $(1-\alpha-\beta-\gamma)$  fraction of jobs :  $u_j=T$ ,  $p_j=0$  an jobs have  $u_j=T$ ,  $p_j=T$   $\beta n$  jobs have  $u_j=E$ ,  $p_j=E$   $\gamma n$  jobs have  $u_j=E+\epsilon$ ,  $p_j=E+\epsilon$
- Ratio ≤ T iff
   G := OPT·T ALG ≥ 0
- Algorithm chooses T, E to max. G
   Adversary chooses α,β,γ to min. G

Every decision we make, is the wrong one.

-Murphy