



# **FINAL EXAM SCHEDULER**

**4005-735-01 Parallel Computing I**

**G2.Team Kyz**

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**<http://tinyurl.com/ritkyz>**

# AGENDA

- Problem Description
- Solutions
- Approaches
  - Brute-Force
    - Sequential/Parallel Design, Performance Metrics, Investigation
  - Simulated Annealing (SA)
    - Paper Summary, Sequential/Parallel Design, Performance Metrics
  - Genetic Algorithm (GA)
    - Paper Summary, Sequential/Parallel Design, Performance Metrics
- Future Work
- Q&A



# FINAL EXAM SCHEDULING PROBLEM

## Sections

0101-301-01	FINANCIAL ACCOUNTING	DEY,R	*Open	40	39	MW	1000N	1200N	12
0101-301-02	FINANCIAL ACCOUNTING	KEARNS,F	Open	39	38	TR	400P	550	
0101-301-03	FINANCIAL ACCOUNTING	KEARNS,F	Close	40	40	TR	1200N	150	
0101-301-71	FINANCIAL ACCOUNTING	EVANS,W	Open	40	38	T	600P	950P	12
0101-301-90	FINANCIAL ACCOUNTING	LEBOWITZ,P	Close	25	25	NA	ONLINE	COU	
0101-302-01	MANAGEMENT ACCOUNTING	OLIVER,B	Open	40	39	TR	200P	350	
0101-302-02	MANAGEMENT ACCOUNTING	DEY,R	*Open	40	38	MW	800A	950A	12
0101-345-71	ACCOUNTING INFO SYSTEMS	NEELY,M	*Open	28	17	W	600P	950P	12
0101-409-01	FINAN. REPT. & ANLYS. II	KEARNS,F	*Open	40	26	MW		120	
0101-494-71	COST ACCTG TECH ORG	MORSE,W	*Open	15	9	W	600P	950P	12
0101-523-90	ADVANCED TAXATION	KLEIN,R	Open	25	19	NA	ONLINE	COURSE	NA
0101-540-71	ADVANCED ACCOUNTING	OLIVER,B	*Open	20	12	M	600P	950	
0101-554-01	FORENSIC&FRAUD ACCOUNTNG	KLEIN,R	Open	12	0	W	400P	550	
0101-703-71	ACCTG FOR DECISION MAKER	MORSE,W	*Open	35	31	T	600P	920	
0101-703-90	ACCTG FOR DECISION MAKER	KLEIN,R	Open	25	23	NA	ONLINE	COU	
0101-704-71	CORP FINANCIAL REPT I	KARIM,K	Open	35	15	W	600P	920P	12
0101-706-71	COST MANAGEMENT	KARIM,K	Open	34	16	T	600P	920P	12
0101-707-71	ADVANCED ACCOUNTING	OLIVER,B	*Open	15	5	M	600P	950	

## Slots

- MTWRF 8:00-10:00 10:15-12:15p 12:30p-14:30p 14:45p-16:45p

## Students



# SOLUTIONS

- Three different experimental approaches
  - Brute-force
  - Simulated Annealing (SA)
  - Genetic Algorithm (GA)



## RANKING CRITERIA

- Variant of Exams distributed across exam slots
- Each student has a vote:
  - Exam Conflict: **POSITIVE\_INFINITY**
  - Three or more exam per day: **5.0**
  - Consecutive Exams: **2.0**
  - Friday Exams: **0.5**



## EXAMPLES

Schedule for Student 68997-3266 John Doe 1

	MON	TUE	WED	THU	FRI
8:00am	N/A	N/A	N/A	4003-233-70	4003-233-45
10:15am	N/A	N/A	N/A	4003-420-02	N/A
12:30pm	N/A	N/A	4003-232-01	N/A	4003-713-70
2:45pm	N/A	N/A	4003-334-40	N/A	N/A

Schedule for Student 54331-5905 John Doe 2

	MON	TUE	WED	THU	FRI
8:00am	4003-231-01	N/A	N/A	4003-334-02	N/A
10:15am	N/A	4003-232-55	N/A	N/A	N/A
12:30pm	N/A	N/A	4003-233-03	N/A	N/A
2:45pm	N/A	N/A	N/A	4003-410-01	N/A



## PACKAGE COMMON

### ○ Objects

- Section
- Student
- Schedule

Student
<ul style="list-style-type: none"><li>• getId()</li><li>• getName()</li></ul>

Section
<ul style="list-style-type: none"><li>• getId()</li><li>• getTitle()</li><li>• getProfessor()</li><li>• ...</li></ul>

Schedule
<ul style="list-style-type: none"><li>• Map&lt;SectionId, Slot&gt;</li><li>• getRank()</li></ul>

### ○ Utilities

- Resources
  - Provide data loading, global access to resources
- Random.generateSchedule()
  - Randomly generate a schedule
- Ranker.rank(Schedule)
  - Rank the given schedule
- GenerateData Program

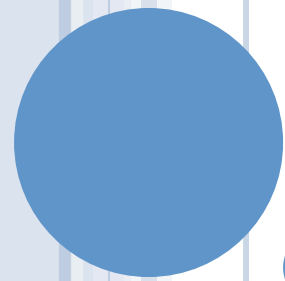


## TEST DATA

N	Courses	Students	Student Load
5	5	2,00	4
10	10	4,00	4
20	20	8,00	4
50	50	2,000	4
100	100	4,000	4
200	200	8,000	4

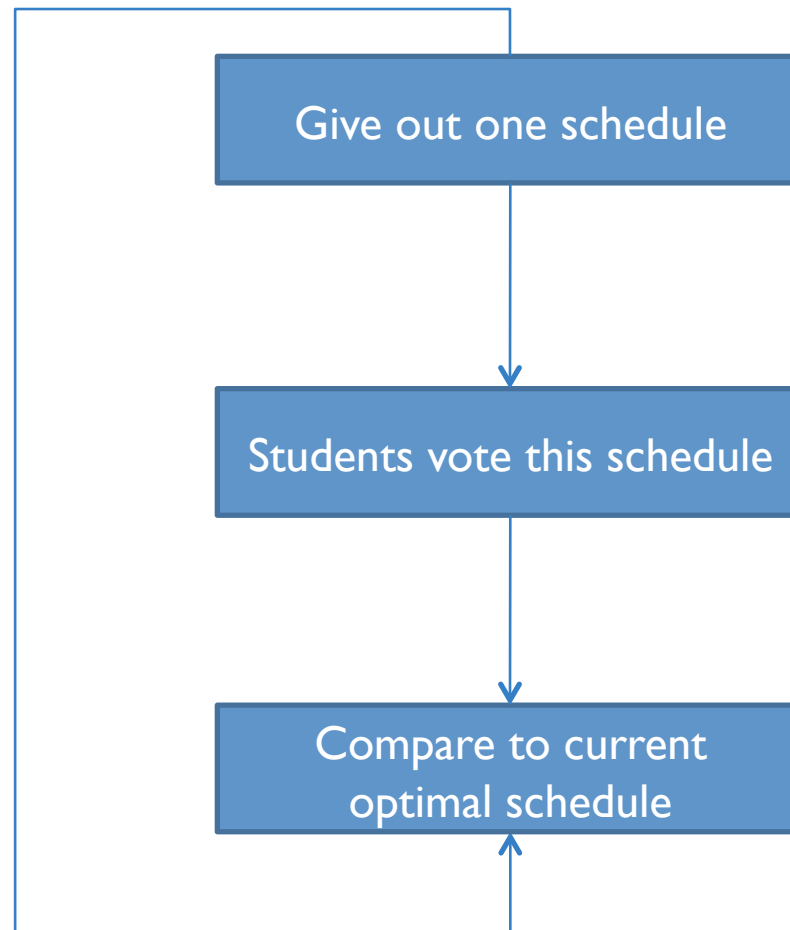




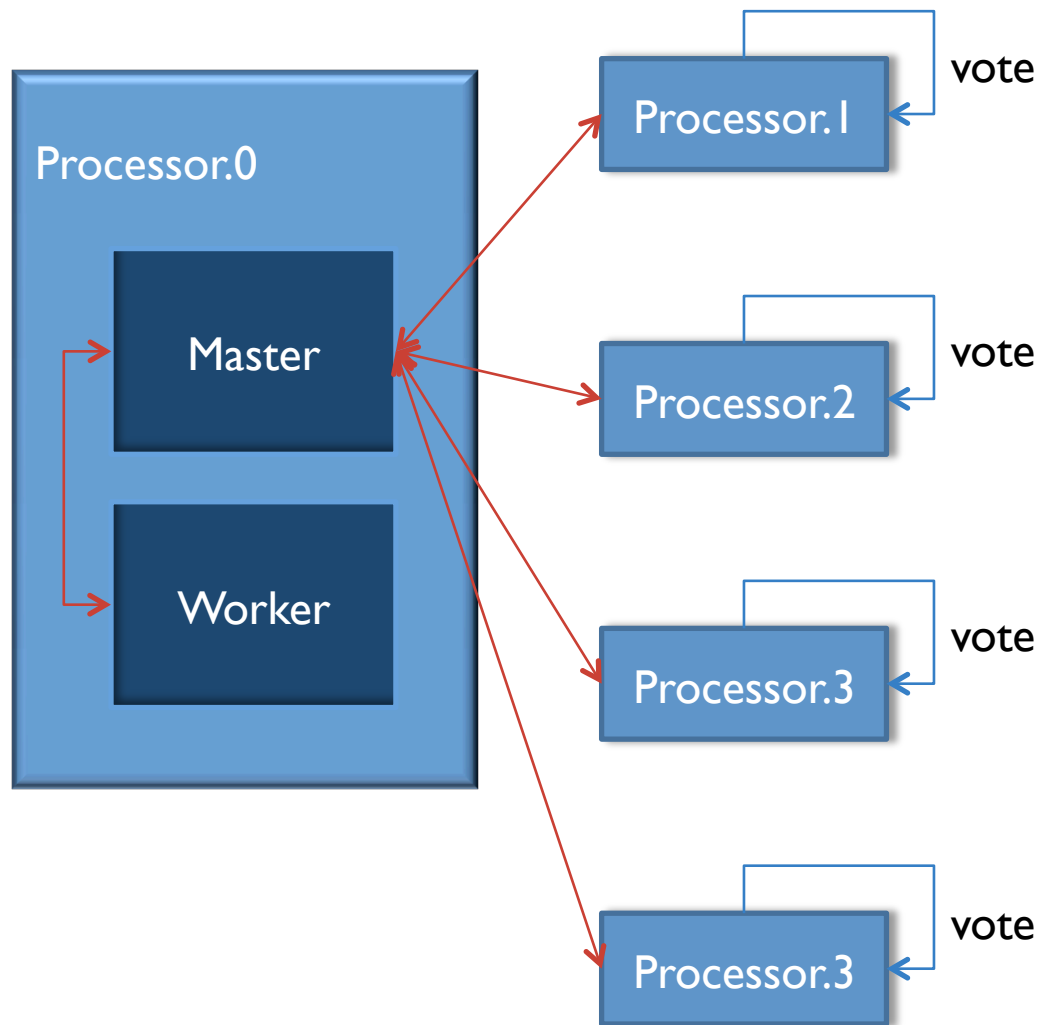


## **BRUTE-FORCE APPROACH**

## BRUTE-FORCE: SEQUENTIAL



# BRUTE-FORCE: FIRST CLUSTER PARALLEL DESIGN



## Master:

- Schedule []
- Schedule Generator
- All the information of courses
- `ObjectBuf< Schedule > buf = ObjectBuf.sliceBuffer(Schedule[], Range);`

## Worker:

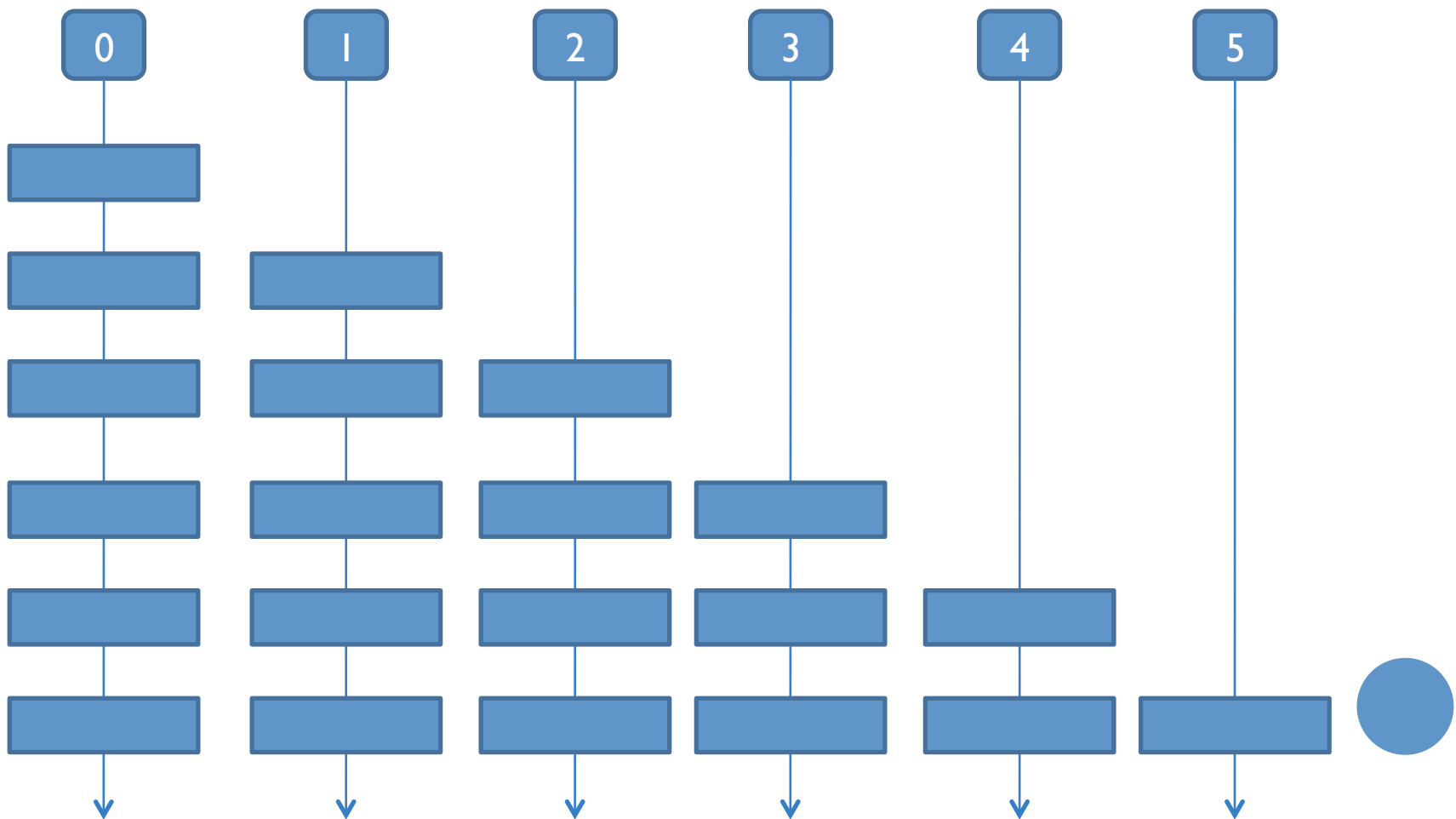
- Schedule[]
- Optimal Schedule
- All the information of students

## Communication

### Method:

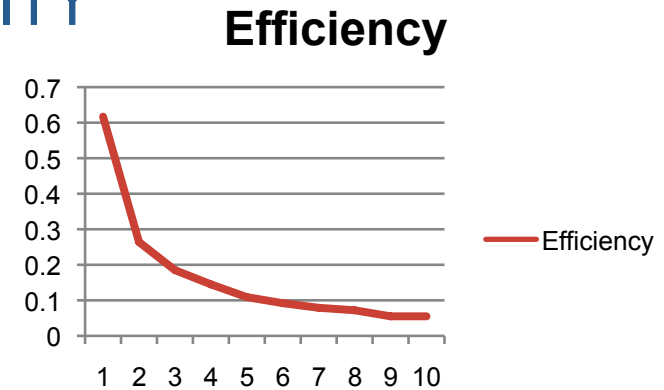
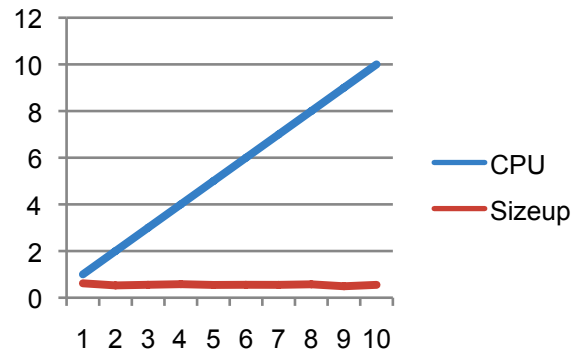
- `world.receive(pro, buf);`
- `world.send(pro, tag, buf);`
- CommRequest request;  
`world.receive(0, tag, buf, request);`

## BRUTE-FORCE: FIRST DESIGN EXPECTED SIZEUP

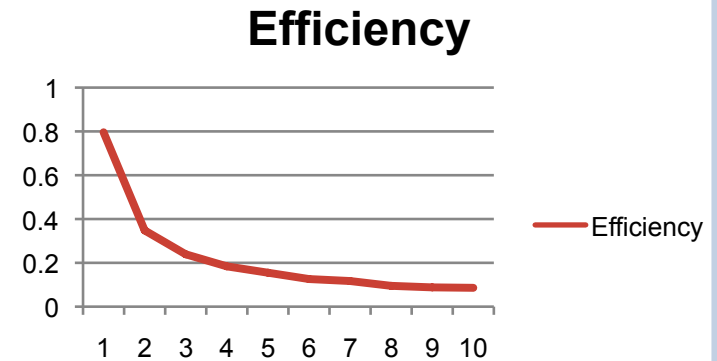
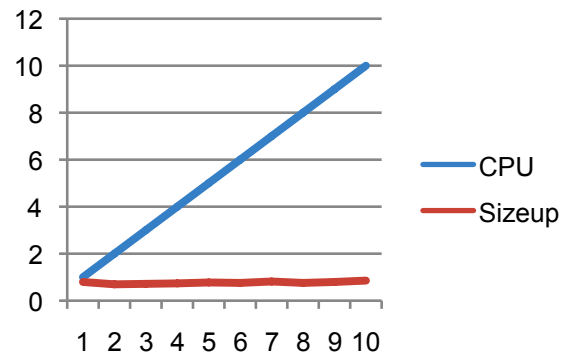


# BRUTE-FORCE: RELENTLESS REALITY

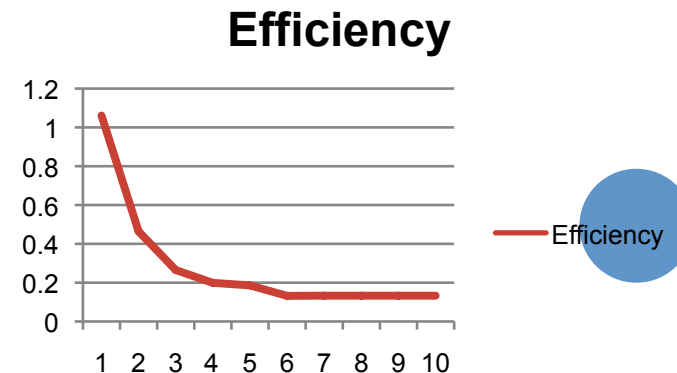
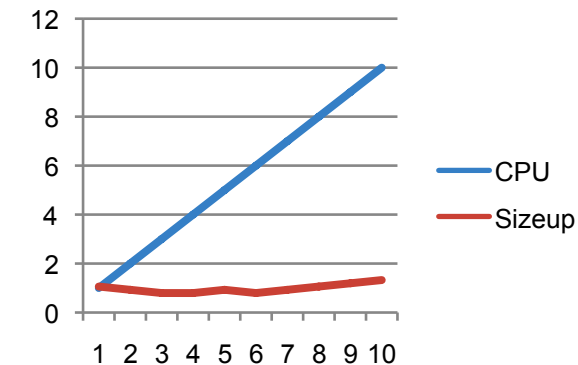
- (1): 10000 msc,  
pieces size 50



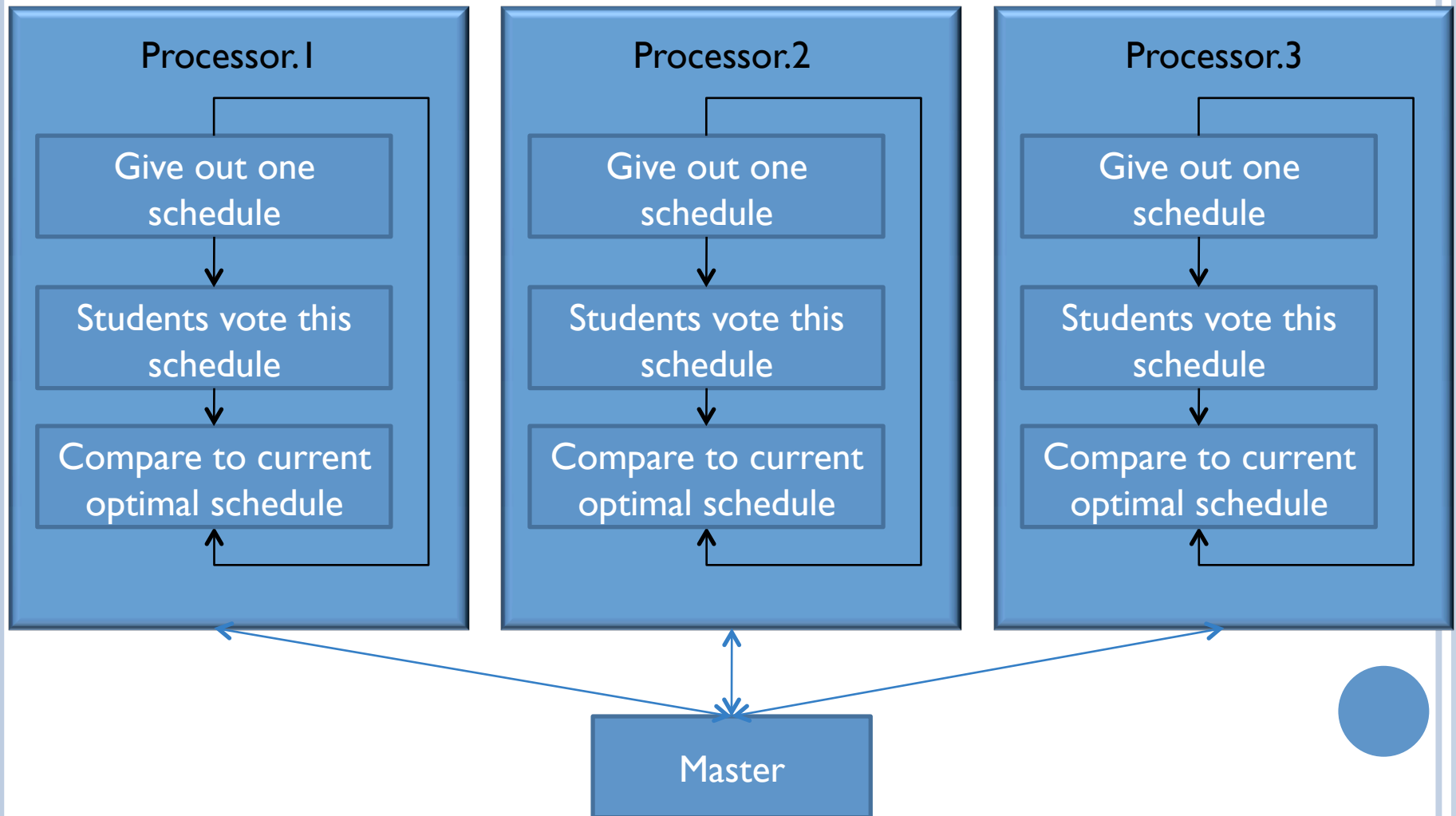
- (2): 10000 msc,  
Pieces size 150



- (3): 10000 msc  
Pieces size 1000

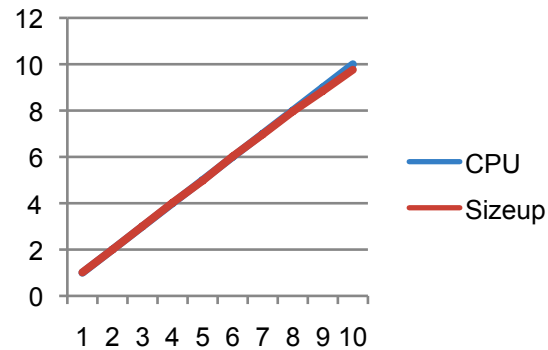


## BRUTE-FORCE: REDESIGN

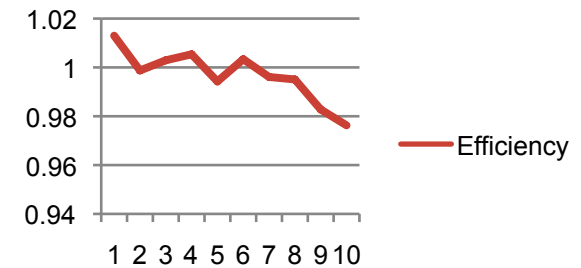


# BRUTE-FORCE: SECOND DESIGN RESULT

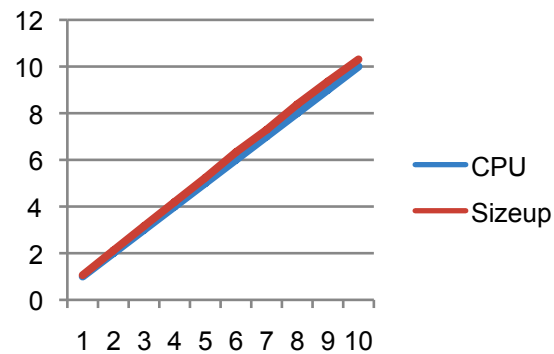
○ (1): 10000 msc



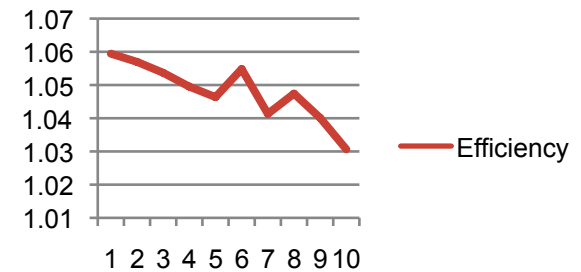
Efficiency



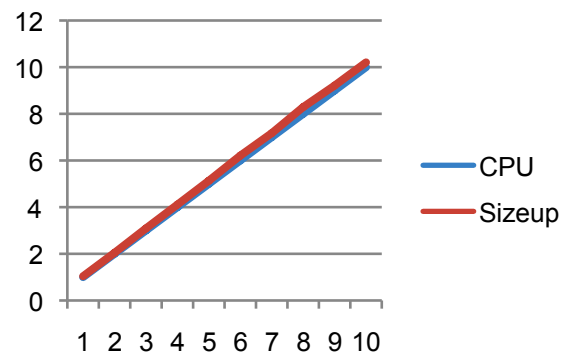
○ (2): 20000 msc



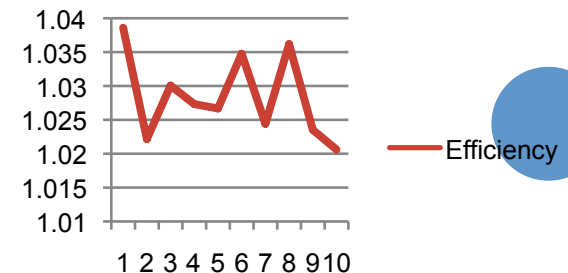
Efficiency

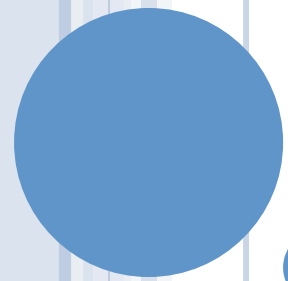


○ (3): 30000 msc



Efficiency





# **SIMULATED ANNEALING (SA)**



# PAPER #I: STOCHASTIC SEARCH ALGORITHMS FOR EXAM SCHEDULING

*By Mansour and Timany, published in International Journal of  
Computational Intelligence Research in 2007*

- Exam scheduling as a modified weighted graph coloring problem
- Objective Functions
- Simulated Annealing Algorithm (SA)
- Results Reference




## SA: SEQUENTIAL

```
Initial configuration = random;
Initial temperature T(0) = 0.93; //high initial acceptance
Freezing temperature Tf = 2^-30; //uphill moves impossible

while(T(i) > Tf and not converged) {
    repeat (# of slots) * (# of exams) times
        generate_function();
    save_best_so_far(); //smallest OF1
    T(i) = phi * T(i); //phi = 0.95
}

function generate_function() {
    perturb(); //randomly change one exam's slot to another slot
    if ( $\Delta OF1 \leq 0$ )
        accept();
    else if (randon() <  $e^{(-\Delta OF1/T(i))}$ )
        accept(); //accept with a probability
}
```



## SA: RESULT COMPARISON

### ○ Problem Size:

- Exams: 336
- Students 2456
- Enrolments: 9550
- Slots: 20

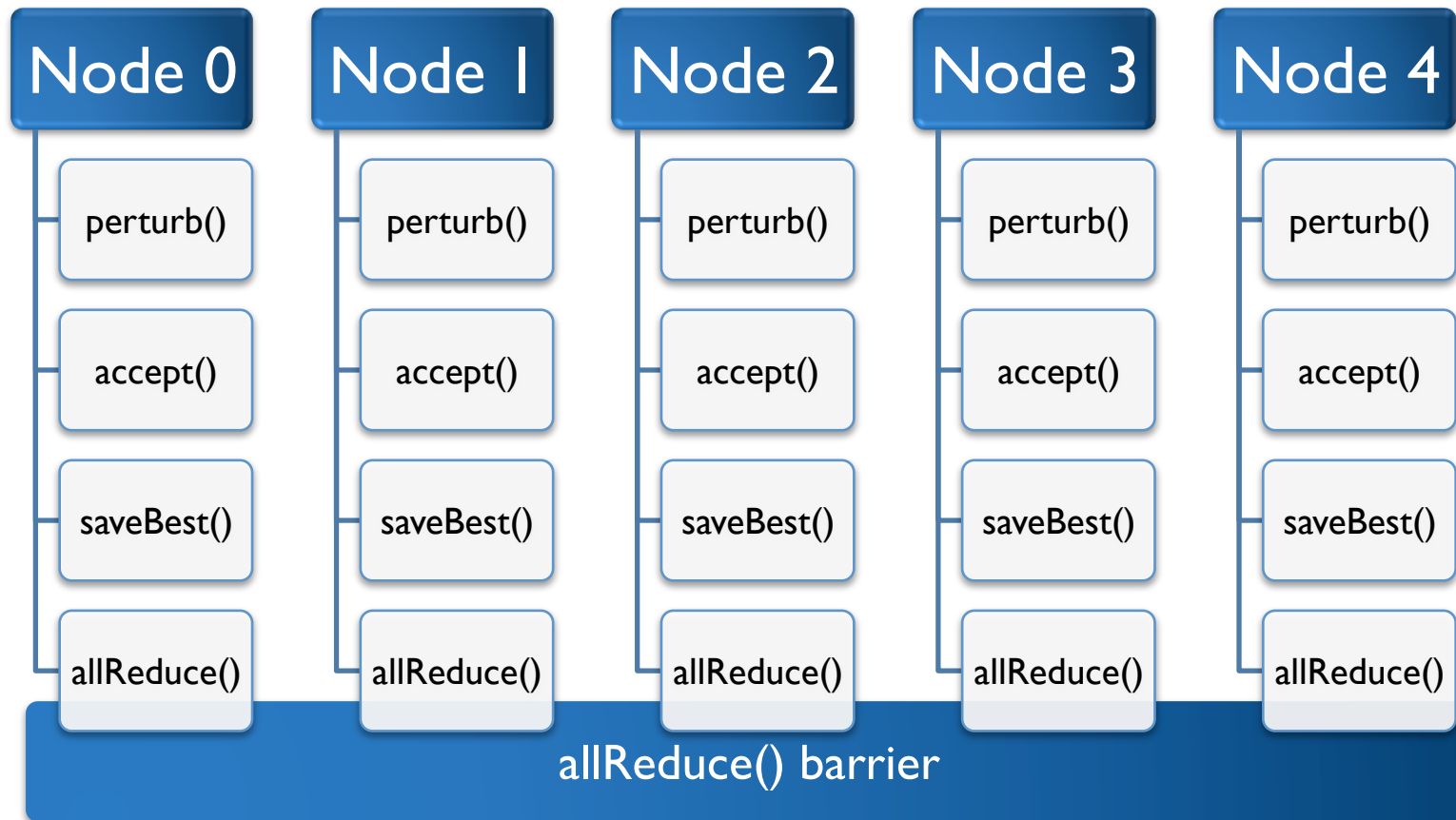
	SE	CE	ME	Rank
Our	0	24	351	2594.66
Their	3	336	572	N/A

### ○ Notations:

- SE: Simultaneous Exam (conflict)
- CE: Consecutive Exams
- ME: Multiple Exam (3 or more on the same day)



## SA: PARALLEL



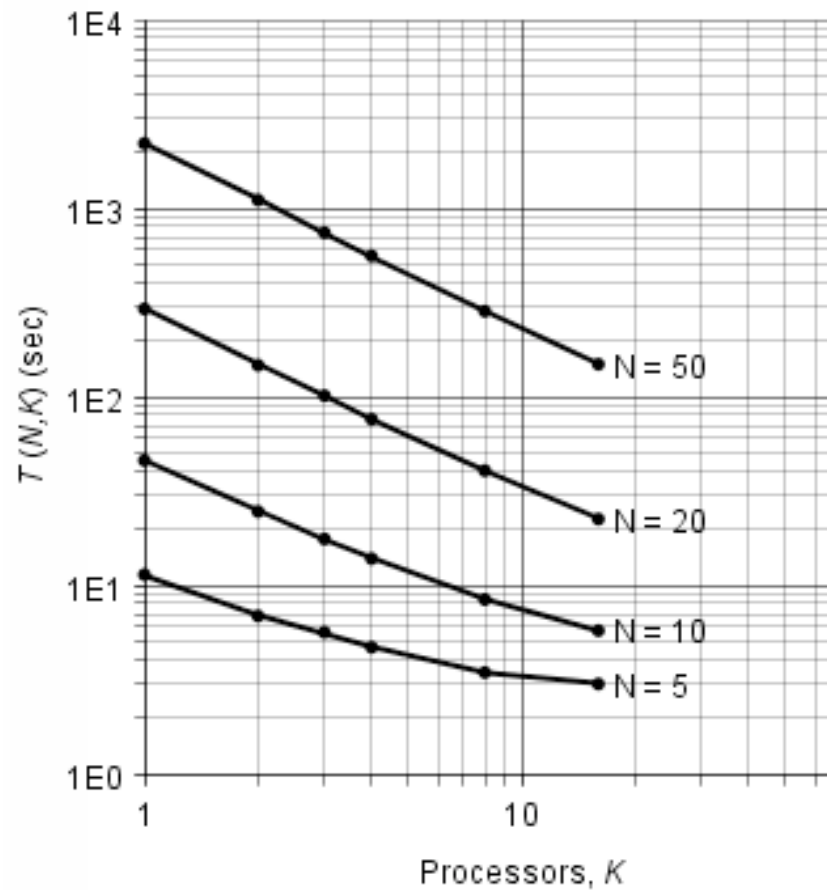
## SA: REDUCTION

```
final ObjectItemBuf<Schedule> buf =  
    ObjectItemBuf.buffer(sa.getBest());  
Comm.world().allReduce(0, buf, new ObjectOp<Schedule>() {  
    @Override  
    public Schedule op(final Schedule x, final Schedule y) {  
        if(x.getRank() < y.getRank())  
            return x;  
        return y;  
    }  
});  
sa.setBest(buf.item);
```

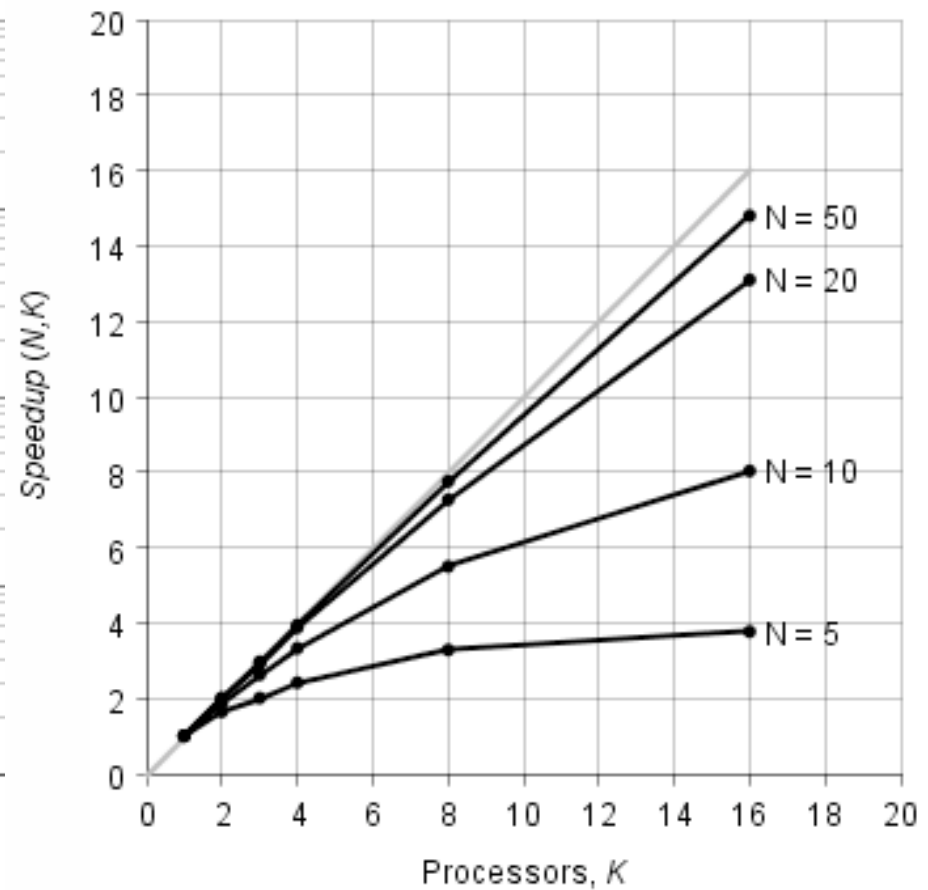


## SA: PERFORMANCE METRICS

Running Time vs. Processors

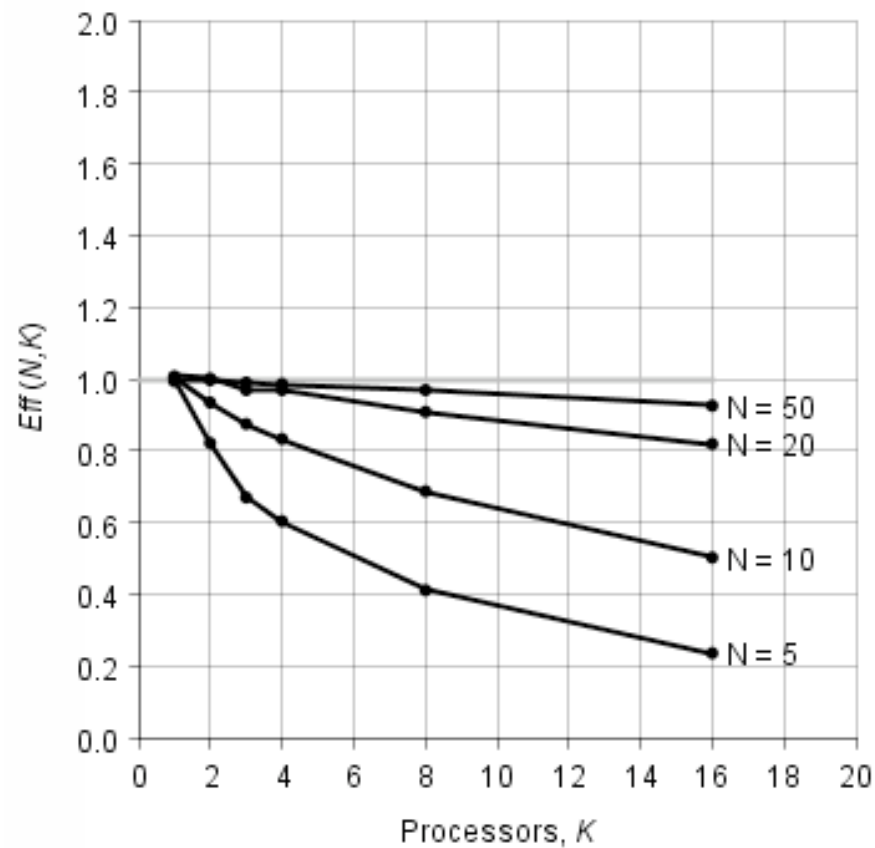


Speedup vs. Processors

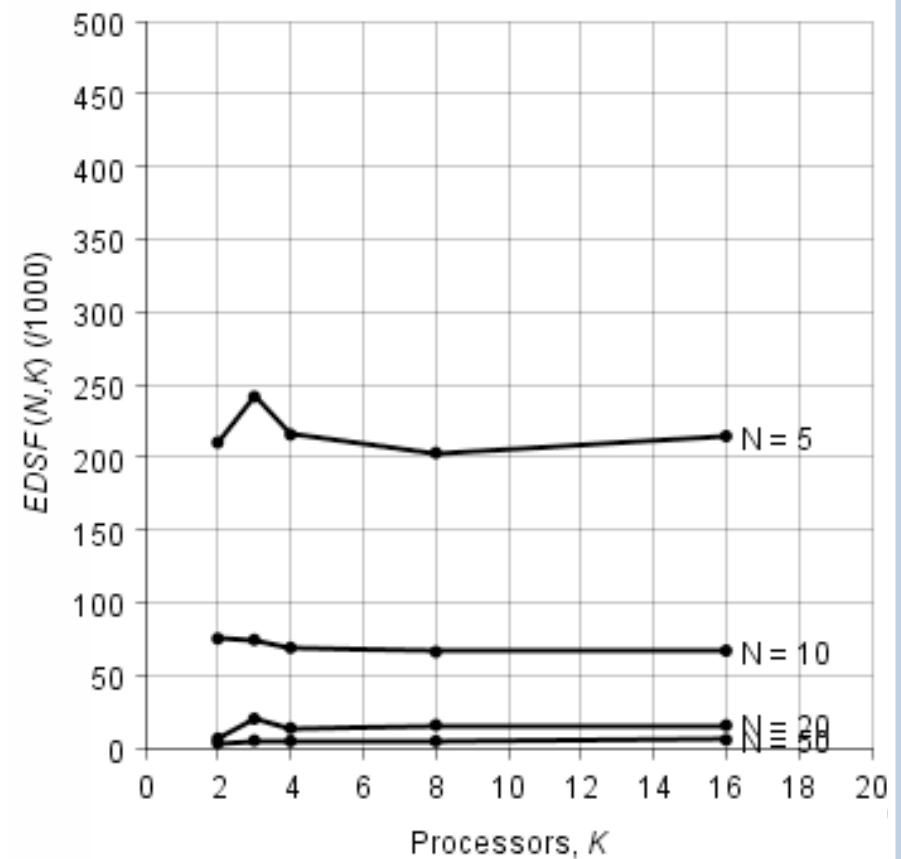


# SA: PERFORMANCE METRICS

Efficiency vs. Processors



EDSF vs. Processors



## SA: INVESTIGATION

### ○ Bottlenecks

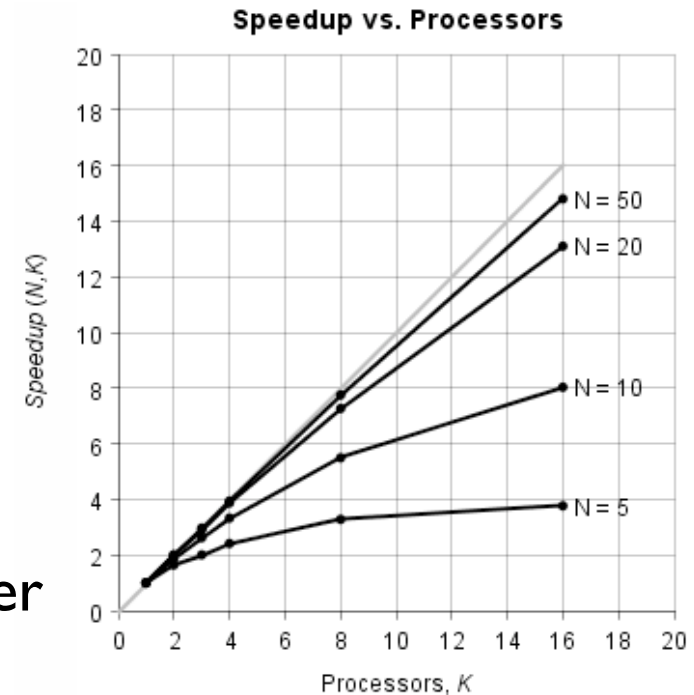
- Barrier makes it hard to load balance
- Communication overhead

### ○ Better efficiency as N becomes larger

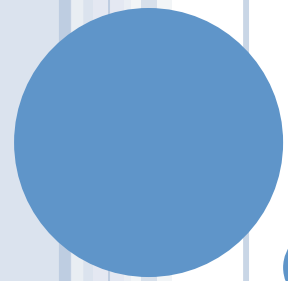
- # of temperature fixed
- Amount of communication fixed
- Perturb and ranking takes significantly longer,  $O(N^2)$

### ○ Limitation

- When  $N=100$ , sequential program takes more than an hour to run on a cluster node,  $K=16$  takes 613,783 ms
- When  $N=200$ ,  $K=16$ , it takes 2530,561 ms to finish







# **GENETIC ALGORITHM**

# GA: GENETIC ALGORITHM

```
Randomly generate initial population size POP;  
Evaluate fitness of individuals;
```

```
repeat {  
    rank individuals and allocate reproduction trials;  
  
    for i=1 to POP step 2 {  
        randomly select two parents from list;  
        apply crossover and mutation;  
    }  
  
    apply hill-climbing to offspring //hybridization  
  
    evaluate fitness of offspring;  
    save_best_so_far();  
  
} until converge
```



## GA: PAPERS

### ○ Used 3 Papers:

- Genetic Algorithm Taxonomy by Mariusz Nowostawski and Riccardo Poli
- Stochastic Search Algorithms for Exam Scheduling by Nashat Massour and Mazen Timany
- Parallel Genetic Algorithms for the Hybrid Flow shop Scheduling Problem by K. Belkadi, M. Gourgand, and M. Benyettou



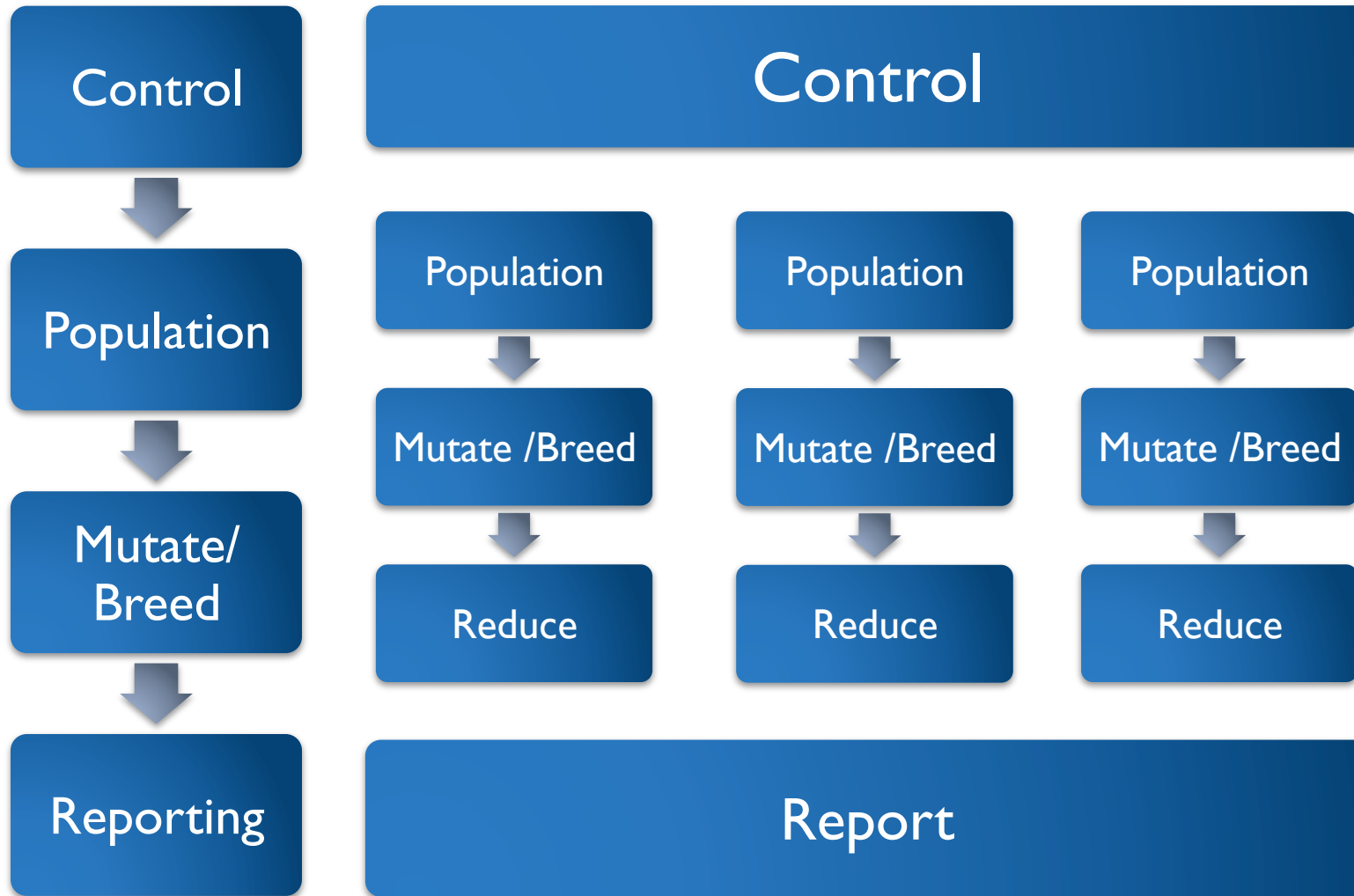
# GA: PAPER FINDINGS

## ○ Findings

- Cross-over rate
- Mutation rate
- Number of mutations
- Selection of individuals for reproduction
- Replacement strategies
- Convergence Detection
- Population size
- Migration Topologies



## GA: SEQUENTIAL AND PARALLEL DESIGN



## GA: RESULT COMPARISON

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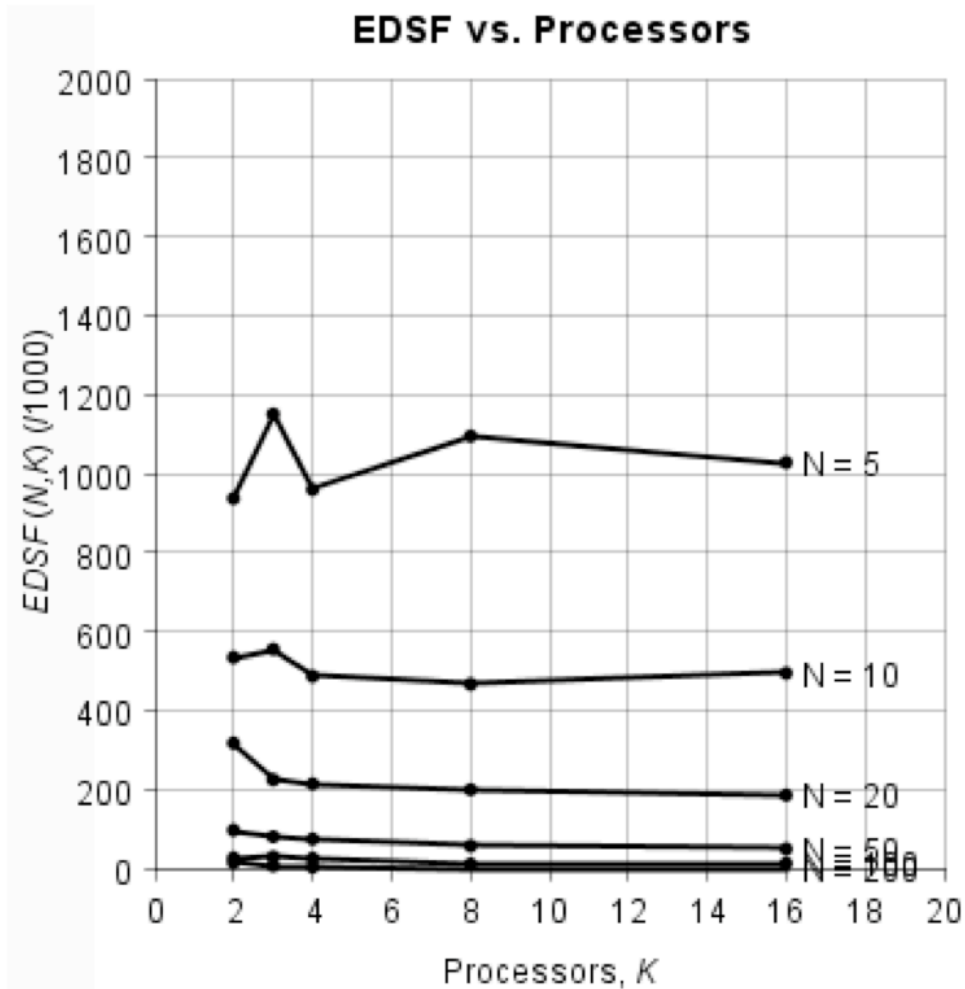
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### ○ Notations:

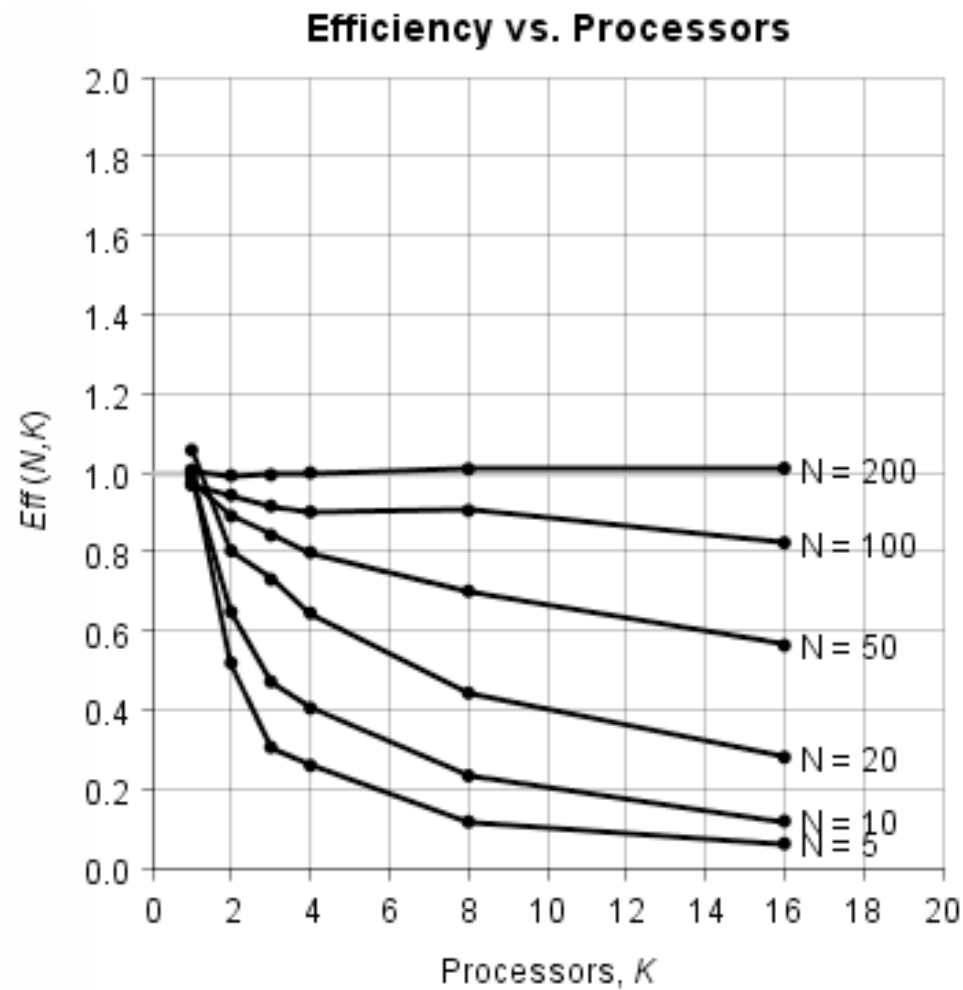
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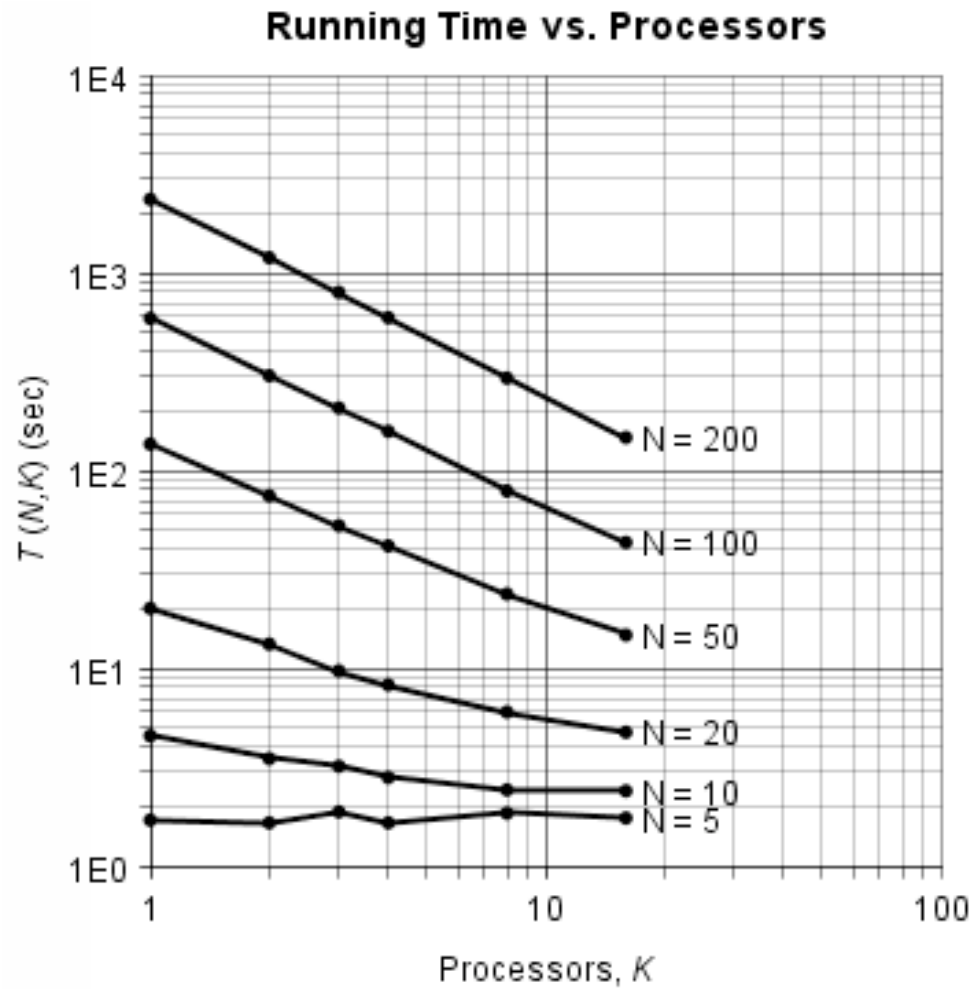


# GA: PERFORMANCE

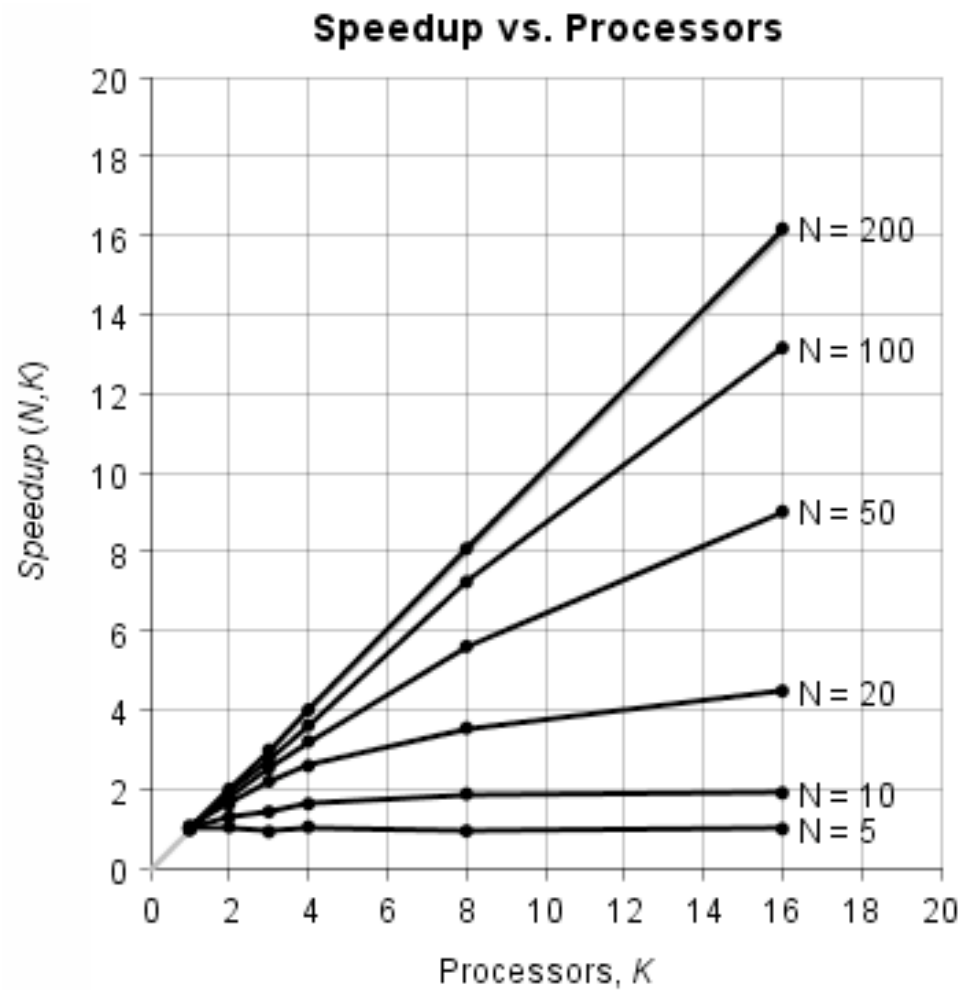




# GA: PERFORMANCE



# GA: PERFORMANCE



# GA: INVESTIGATION

- Investigation Results and Problems:
  - It works!
  - Convergence Problems
  - Parameter Issues



## FUTURE WORK

- Increased Problem Complexity
  - RIT: 2500 courses, 16,000 students
- More parameter for Ranker
- Minimize the schedule structure
  - Use only 32-bit integers instead of Section ID String
- Focus on Genetic Algorithm (GA)
  - True Migration
  - Better Convergence Detection
  - Solution Detection
  - Load Balancing with Convergence



# THANK YOU FOR LISTENING

- G2.Team Kyz
  - Kevin Cheek
  - Yandong Wang
  - Ziyang Zhou
- Visit us at: <http://tinyurl.com/ritkyz>

