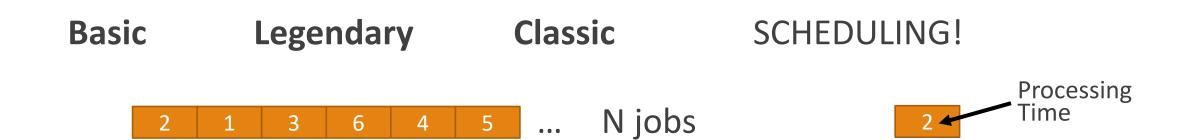
# Minimum Makespan Problem

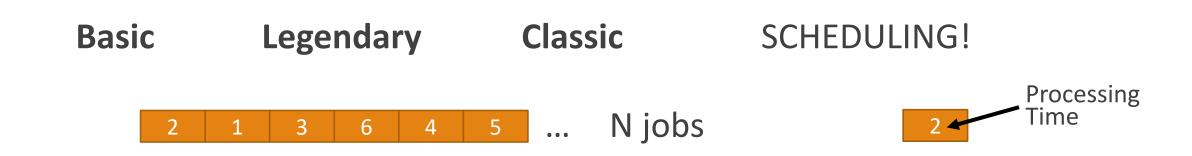
MURUN ENKHEE

#### Agenda

- 1. Makespan Problem Definition
- 2. Previous Work
  - **1. Online List** Scheduling Algorithm Greedy
  - 2. Online MR Algorithm Current Best Deterministic Algorithm
  - 3. Online Rand Algorithm Current Best Randomized Algorithm for general case
  - 4. Offline Algorithm NEAR Optimal
- 3. Input Sequence Generation
  - 1. Uniformly Distributed Randoms
  - 2. **Normally** Distributed Randoms
  - **3. Zipfian** Distributed Randoms
- 4. Report Table

Basic Legendary Classic SCHEDULING!





Call me MACHINE

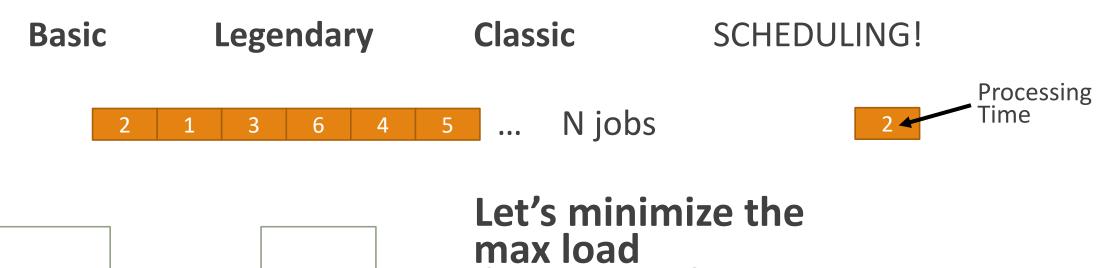
Call me MACHINE

M machines



Call me MACHINE

Call me MACHINE Let's minimize the max load /makespan/



Call me MACHINE

Call me MACHINE max load /makespan/ How Would You Schedule, tho? The Famous

Introduced by Graham in 1966

#### Online List Scheduling Algorithm

1 3 6 4 5 ... N jobs

Processing Time

Call me MACHINE

Call me MACHINE





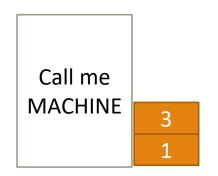
Call me MACHINE



6 4 5 ... N jobs

Processing Time

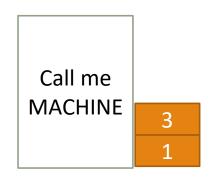
Call me MACHINE



4 5 ... N jobs



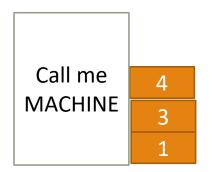




5 ... N jobs



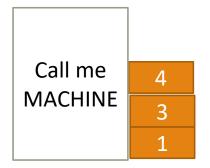




... N jobs



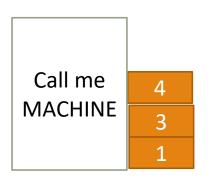




... N jobs







Makespan = 13.

However, OPT can do 11

#### Previous Work

#### **Upper Bound**

(2 – 1/m) – List by Graham 1966

1.986 – Bartal et al.

1.945 – Karger et al

1.923 – M2 by Susan et al.

**1.9201 – MR** by Fleischer & Wahl 2000

**Lower Bound** /current best/

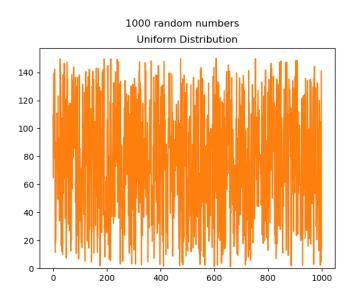
1.853 – Gormley et al.

Randomized Upper Bound /current best/

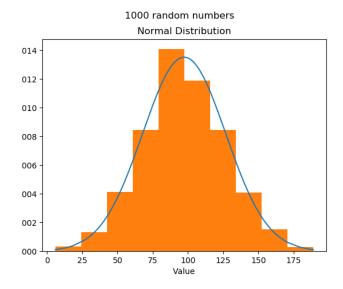
**1.916 – Rand** by Susan et al. 2002

#### Generating Input Sequence

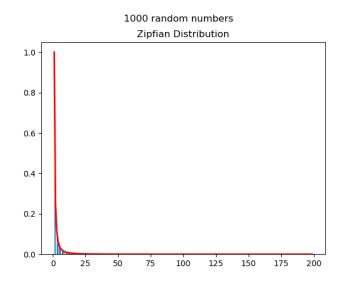
#### Uniform Distribution



#### Normal Distribution



#### **Zipfian Distribution**



# Report Table

|                      | Number of Jobs /n/ |  | # of Machines /m/ | Offline Approximation | Online Algorithm |                               |                                |
|----------------------|--------------------|--|-------------------|-----------------------|------------------|-------------------------------|--------------------------------|
| Input sequence       |                    |  |                   |                       | Greedy           | Current Best<br>Deterministic | Current Best Random /m>7/      |
|                      |                    |  |                   |                       | List Scheduling  | MR Algorithm                  | Rand Algorithm /avg of 10runs/ |
| Uniform Distribution |                    |  | 5                 | 15161.76              | 15191            | 15191                         | 19401.7                        |
|                      | 1000               | (1 <tp<150)< td=""><td>50</td><td>1518.65</td><td>1586.71</td><td>1586.71</td><td>1890.23</td></tp<150)<>          | 50                | 1518.65               | 1586.71          | 1586.71                       | 1890.23                        |
|                      |                    |  | 150               | 512.93                | 588.86           | 588.86                        | 682.64                         |
|                      |                    | (200 <tp<500)< td=""><td>5</td><td>697703.07</td><td>697835.85</td><td>697835.85</td><td>892607.39</td></tp<500)<> | 5                 | 697703.07             | 697835.85        | 697835.85                     | 892607.39                      |
|                      | 10000              |  | 50                | 69770.44              | 70036.74         | 70036.74                      | 83628.11                       |
|                      |                    |  | 150               | 23323.91              | 23538.27         | 23538.27                      | 27806.87                       |
| Normal Distribution  |                    | (1 <tp<170)< td=""><td>5</td><td>19997.99</td><td>20015.61</td><td>20015.61</td><td>25600.01</td></tp<170)<>       | 5                 | 19997.99              | 20015.61         | 20015.61                      | 25600.01                       |
|                      | 1000               |  | 50                | 2014                  | 2053.66          | 2291.78                       | 2434.17                        |
|                      |                    |  | 150               | 689.89                | 750.39           | 750.39                        | 868.49                         |
|                      |                    | (0 <tp<650)< td=""><td>5</td><td>600335.77</td><td>600366.77</td><td>600366.77</td><td>767888.58</td></tp<650)<>   | 5                 | 600335.77             | 600366.77        | 600366.77                     | 767888.58                      |
|                      | 10000              |  | 50                | 60044.81              | 60282.12         | 60282.12                      | 72080.16                       |
|                      |                    |  | 150               | 20036.75              | 20332.37         | 21457.02                      | 24019.45                       |
| Zipfian Distribution |                    | (0 <tp<1034)< td=""><td>5</td><td>1034</td><td>1211</td><td>1211</td><td>1175</td></tp<1034)<>                     | 5                 | 1034                  | 1211             | 1211                          | 1175                           |
|                      | 1000               |  | 50                | 1034                  | 1046             | 1046                          | 1043                           |
|                      |                    |  | 150               | 1034                  | 1036             | 1036                          | 1036                           |
|                      |                    |  | 5                 | 11361                 | 11529            | 11529                         | 14714                          |
|                      | 10                 | 0000   | 50                | 3974                  | 4068             | 4068                          | 4038                           |
|                      |                    |  | 150               | 3974                  | 3998             | 3998                          | 3991                           |

#### References

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