## Goal for Today

Several of you are doing research related to one of these models:

- 1. Redundancy Model ("min" model)
  - Same request sent to multiple servers.
  - Use <u>first</u> result to complete.
- 2. Limited Fork-Join Model ("max" model)
  - Break request into many pieces, each sent to different server.
  - Request done when <u>all</u> pieces are done.

Before we can study these, we need to cover MINs and MAXs.

## Understanding MINs: General Distribution

Let  $X_1, X_2, \ldots, X_n$  be i.i.d.  $\sim X$ . Assume we know X.

#### Want to understand:

$$W = \min(X_1, \dots, X_n)$$

Our Goal: Express  $f_W(t)$  in terms of  $f_X(t)$ 

Question: What is  $\overline{F}_W(t) = \mathbf{P}\{W > t\}$ ?

**Question:** What is  $F_W(t)$ ?

Question: What is  $f_W(t)$ ?

## Understanding MINs: Exponential Distribution

Let  $X_1, X_2, \ldots, X_n$  be i.i.d.  $\sim X$ . Assume we know  $X \sim \text{Exp}(\mu)$ .

Want to understand:  $W = \min(X_1, \dots, X_n)$ 

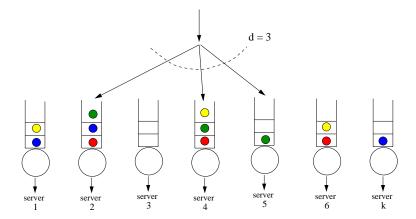
**Question:** What is  $\overline{F}_W(t)$ ? What is  $f_W(t)$ ?

**Question:** What does this tell us about the distribution of W?

Question: What is E[X]? What is E[W]?

**Question:** How would we get  $\mathbf{E}[W]$  if we didn't have  $X \sim \text{Exp}(\mu)$ ?

### Redundancy-d Model



- Each job creates d copies of itself.
- $\bullet$  The d copies go to different random servers.
- Job is complete as soon as any ONE copy is done. Remaining copies are cancelled.

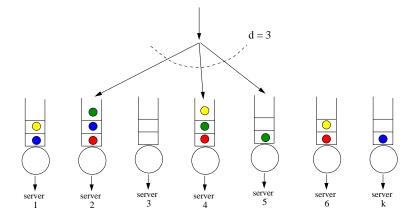
**Question:** Let  $T_i$  represent the response time at queue i. What is T, the overall response time?

Question: How do we compute this?

#### Relevant papers:

- Gardner et al. "Redundancy-d: The Power of d Choices for Redundancy" Operations Research, vol. 65, no. 4, 2017.
- Gardner et al. "Reducing Latency via Redundant Requests: Exact Analysis." SIGMET-RICS 2015.
- Gardner et al. "A Better Model for Job Redundancy: Decoupling Server Slowdown and Job Size." IEEE MASCOTS 2016.

## Redundancy-d Model



- $\bullet$  Each job creates d copies of itself.
- $\bullet$  The d copies go to different random servers.
- Job is complete as soon as any one copy is done. Remaining copies are cancelled.

$$T = \min(T_1, T_2, \dots, T_d) .$$

**Question:** What is the distribution of  $T_i$ ?

**Question:** If  $T_i$  is Exponentially-distributed with mean  $\mathbf{E}[T_i]$ , what does this say about  $\mathbf{E}[T]$ ?

# Understanding MAXs: General Distribution

Let  $X_1, X_2, \ldots, X_n$  be i.i.d.  $\sim X$ . Assume we know X.

#### Want to understand:

$$Z = \max(X_1, \dots, X_n)$$

Question: What is  $F_Z(t) = \mathbf{P} \{Z \leq t\}$ ?

**Question:** What is  $f_Z(t)$ ?

# Understanding MAXs: Exponential Distribution

Let  $X_1, X_2, \ldots, X_n$  be i.i.d.  $\sim X$ . Suppose  $X \sim \text{Exp}(\mu)$ .

Want to understand:

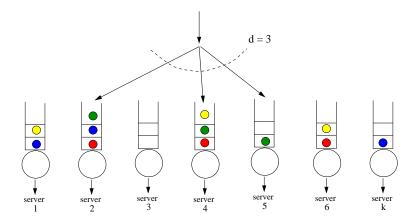
$$Z = \max(X_1, \dots, X_n)$$

Question: What is  $F_Z(t) = \mathbf{P} \{Z \leq t\}$ ?

**Question:** What is  $\mathbf{E}[Z]$ ?

#### Limited Fork-Join Model

Model is analyzed here: Wang et al. "Delay Asymptotics and Bounds for Multi-Task Parallel Jobs." Queueing Systems, vol. 91, no. 3-4, March 2019, pp. 207–239.



- Each job split into d parts.
- $\bullet$  The d parts go to different random servers.
- Job is complete only when ALL parts are done.

**Question:** Let  $T_i$  represent the reponse time at queue i. What is T, the overall response time?

Question: How do we compute this?

**Question:** Generally, we obtain the distribution of  $T_i$  through measurement. However, if job "parts" have Exponentially-distributed sizes, and thus  $T_i$  is Exponentially distributed with mean  $\mathbf{E}[T_i]$ , what can we say about  $\mathbf{E}[T]$ ?