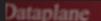




## **STORALEXRAS** TRIFACTA



### TRITONSORT (NSDI 2011) Sort Really Fast **THEMIS (SOCC 2012)** MapReduce Really Fast









































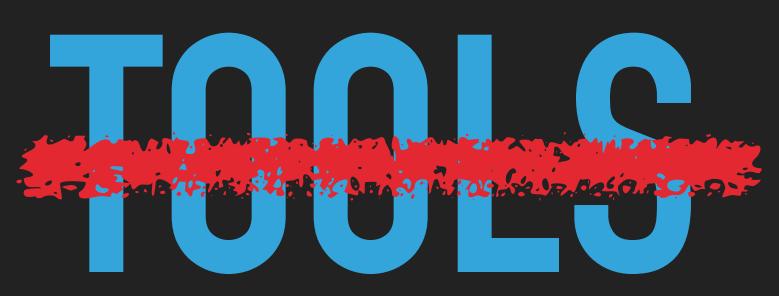






## 

## 





## **1. SOFTWARE-HARDWARE CO-DESIGN** 2. BUILDING FOR EXPERIMENTATION **3. CAREFULLY MANAGING MEMORY**



### **SORT IS AN EXCELLENT TEST** OF THE INPUT-OUTPUT ARCHITECTURE OF A COMPUTER AND ITS OPERATING SYSTEM.

"A measure of transaction processing power **Datamation 1985** 

### THE SORT BENCHMARK SORTING K/V PAIRS (RECORDS) MANY CATEGORIES, VARIANTS TODAY: GRAYSORT (100TB)

# **173 VINUTES** DN 3452 HADOOP NODES



## 578 GB PER MINUTE **966BPERSECOND** 3452 NODES2.79 MBPS PER NODE

### THE GAP IN THEORETICAL PER NODE PERFORMANCE AND WHAT IS ACTUALLY ACHEVED HAS BECOME GLARINGLY LARGE



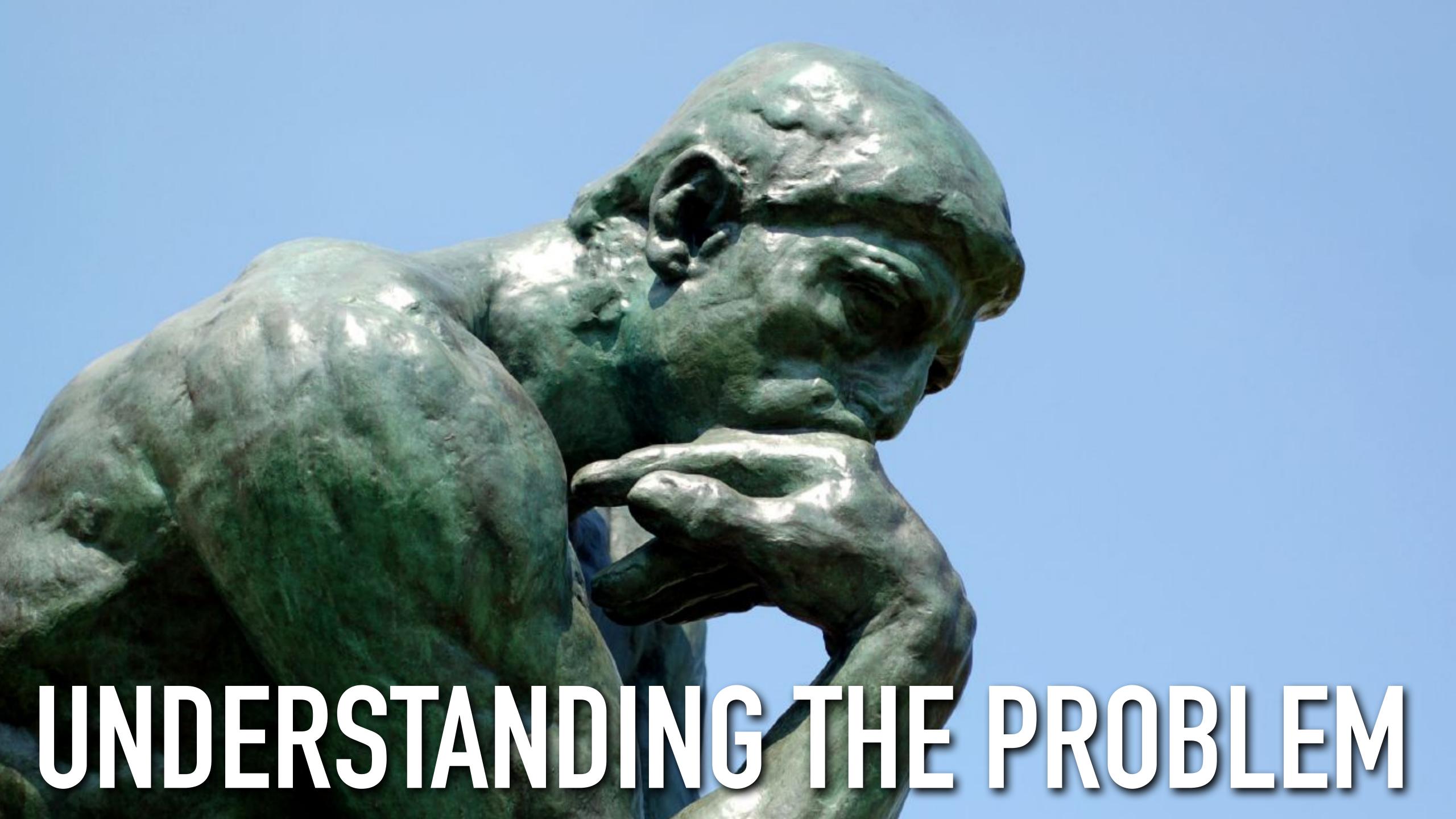
### Anderson and Tucek "Efficiency Matters!" SIGOPS OSR 2010





# HARDWARE & SOFTWARE CO-DESGNED FOR WORKLOAD















# EIWORK 10Gbps





### 8 CORES 24 GB RAM ► 16 DISKS ► 10 GBPS NIC



# OPERATIONS?

# WHAT ARE THE

## EXPENSIVE

## ROTATION

# SEEKING





## KEPOFFTHEDISK

## TWO READS -TWO WRIES PER RECORD

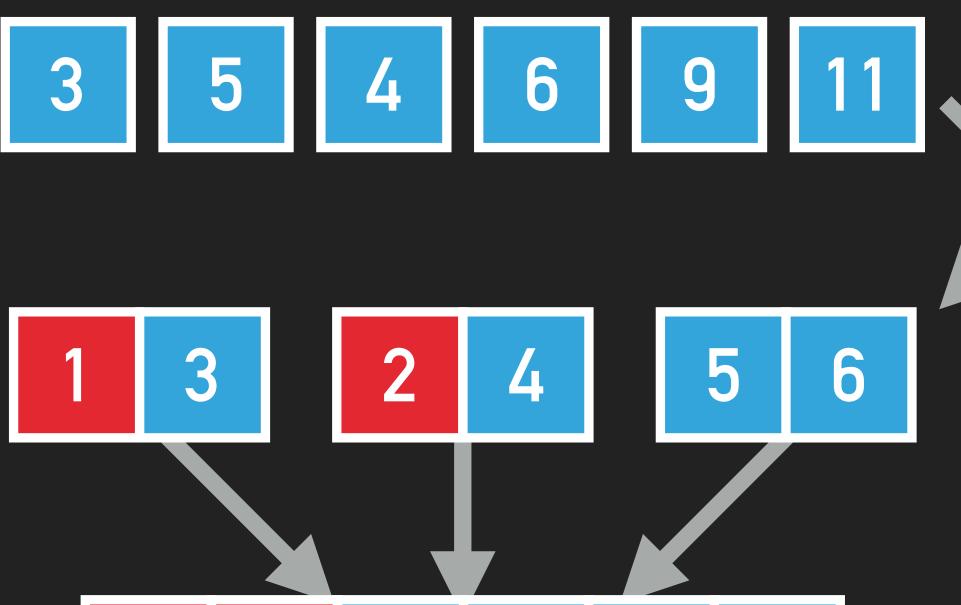
## SEEK INFREQUENTLY

## BGWRTES

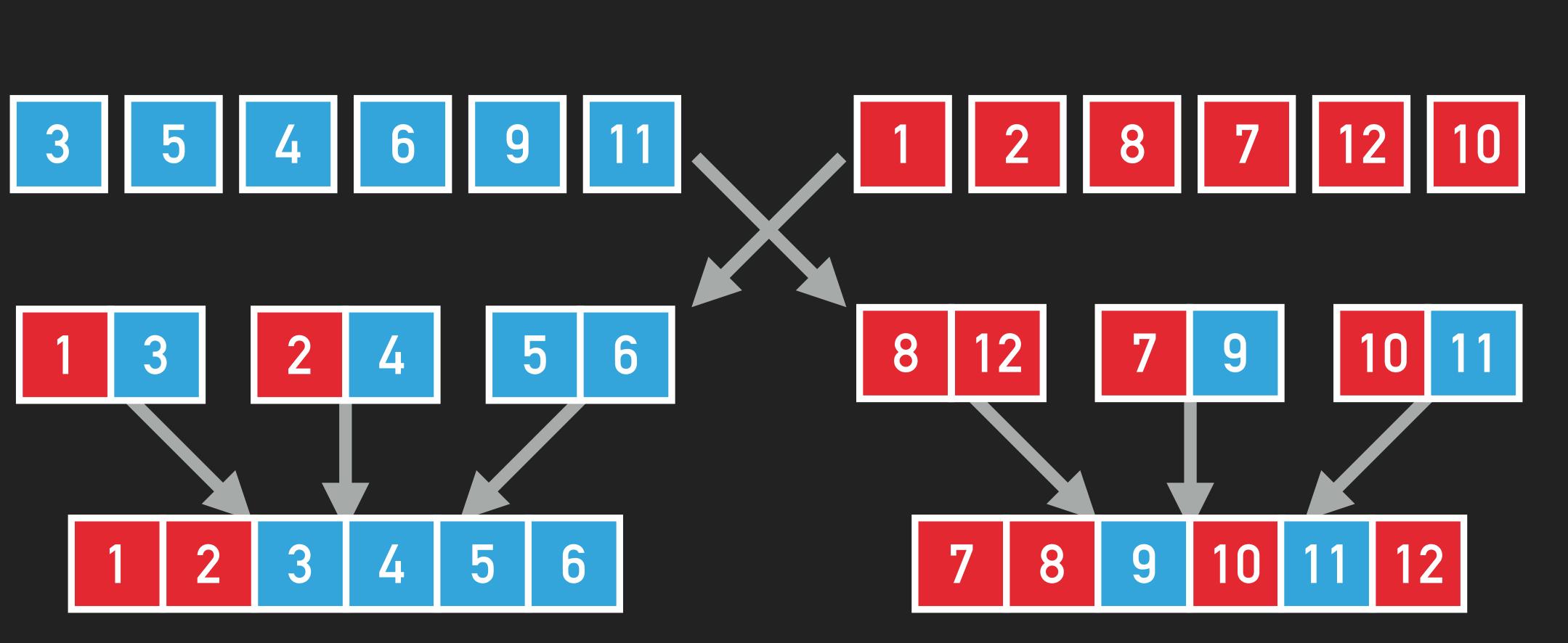
## BIG READS

# WHICH DISTRIBUTED Sorting Algorithm?

## 



2 3 4 5 6



# THE TROUBLE WITH MERGESORT AT SCALE, MANY SORTED CHUNKS

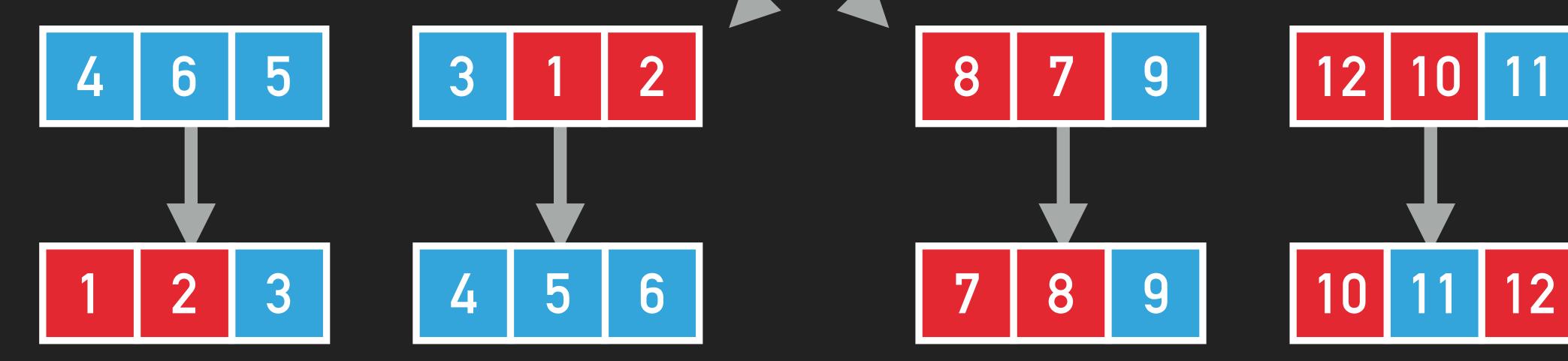


### FETCHING RANDOMLY CAUSES SEEKS

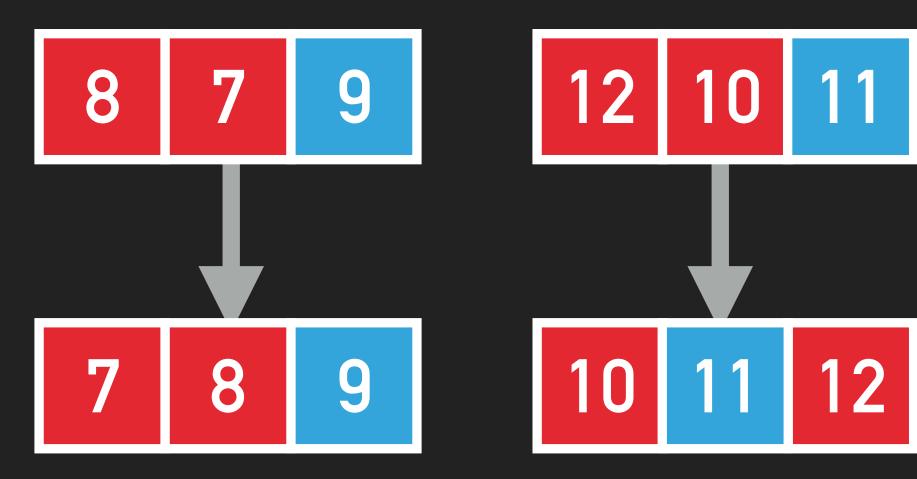


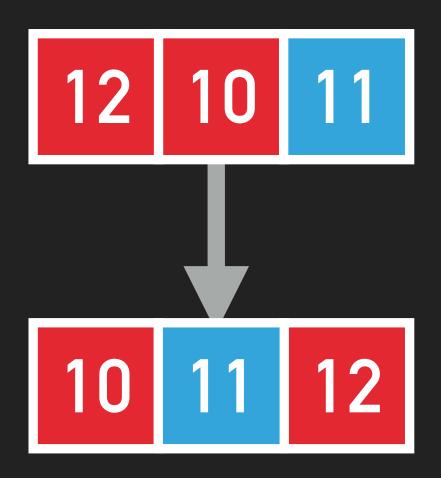
## DSTRBUTION SORT











## **DISTRIBUTION SORT**

# BIG WRITES IN FIRST PASS SEQUENTIAL I/O IN SECOND PASS





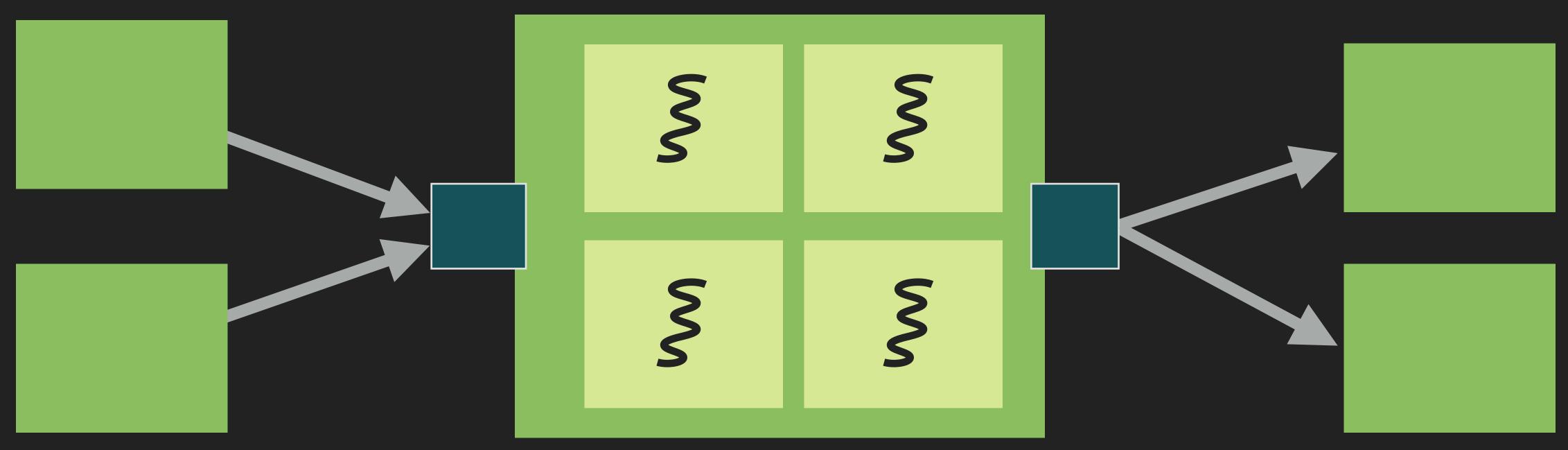




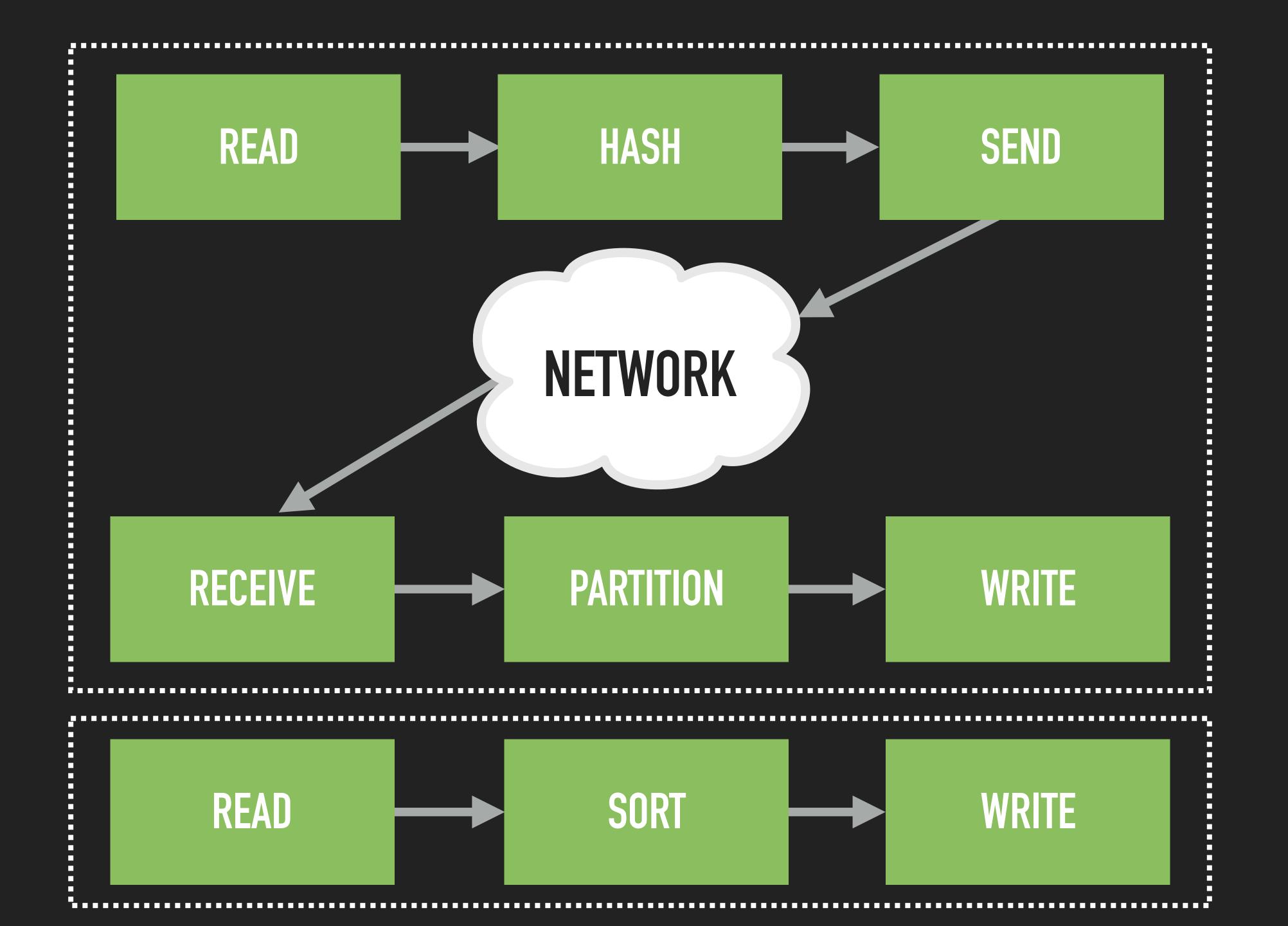




# GRAPHS







### **REALLY FAST DISKS?** HASH **SYNTHETIC** SEND **NETWORK**

### RECEIVE

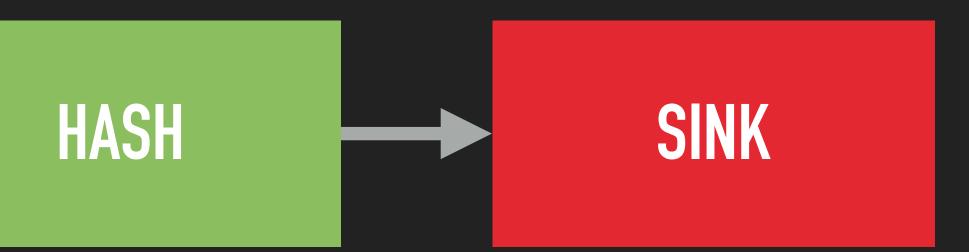
PARTITION

SINK

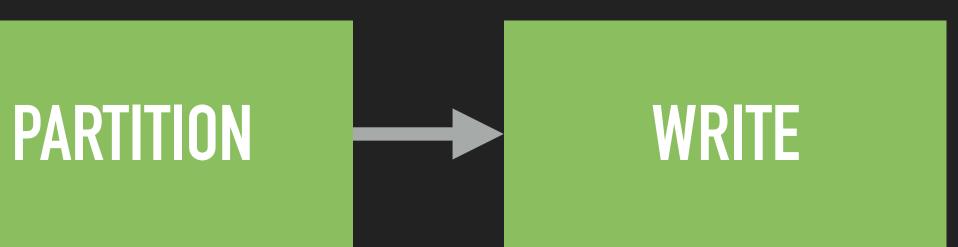
### **REALLY FAST NETWORK?**

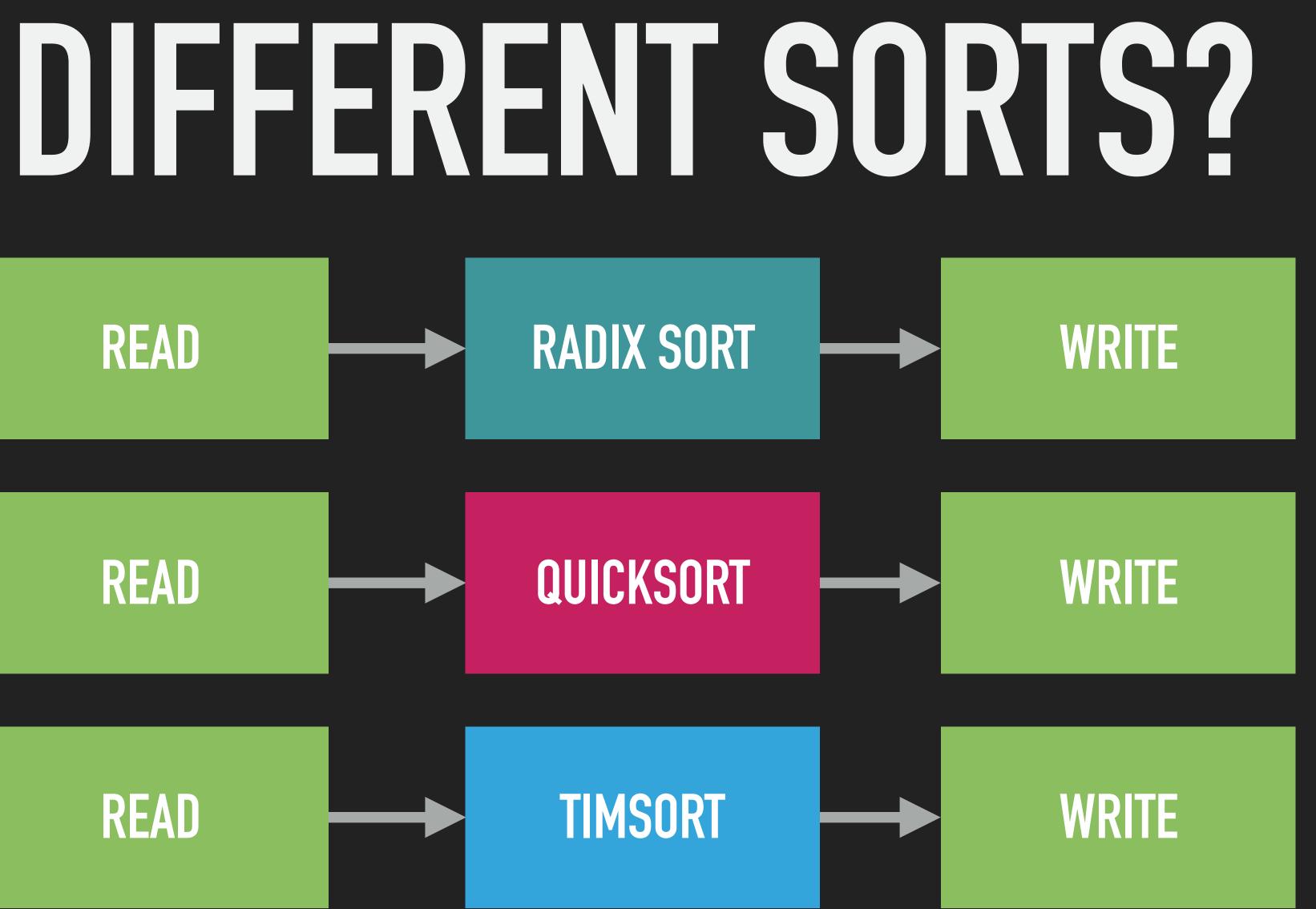


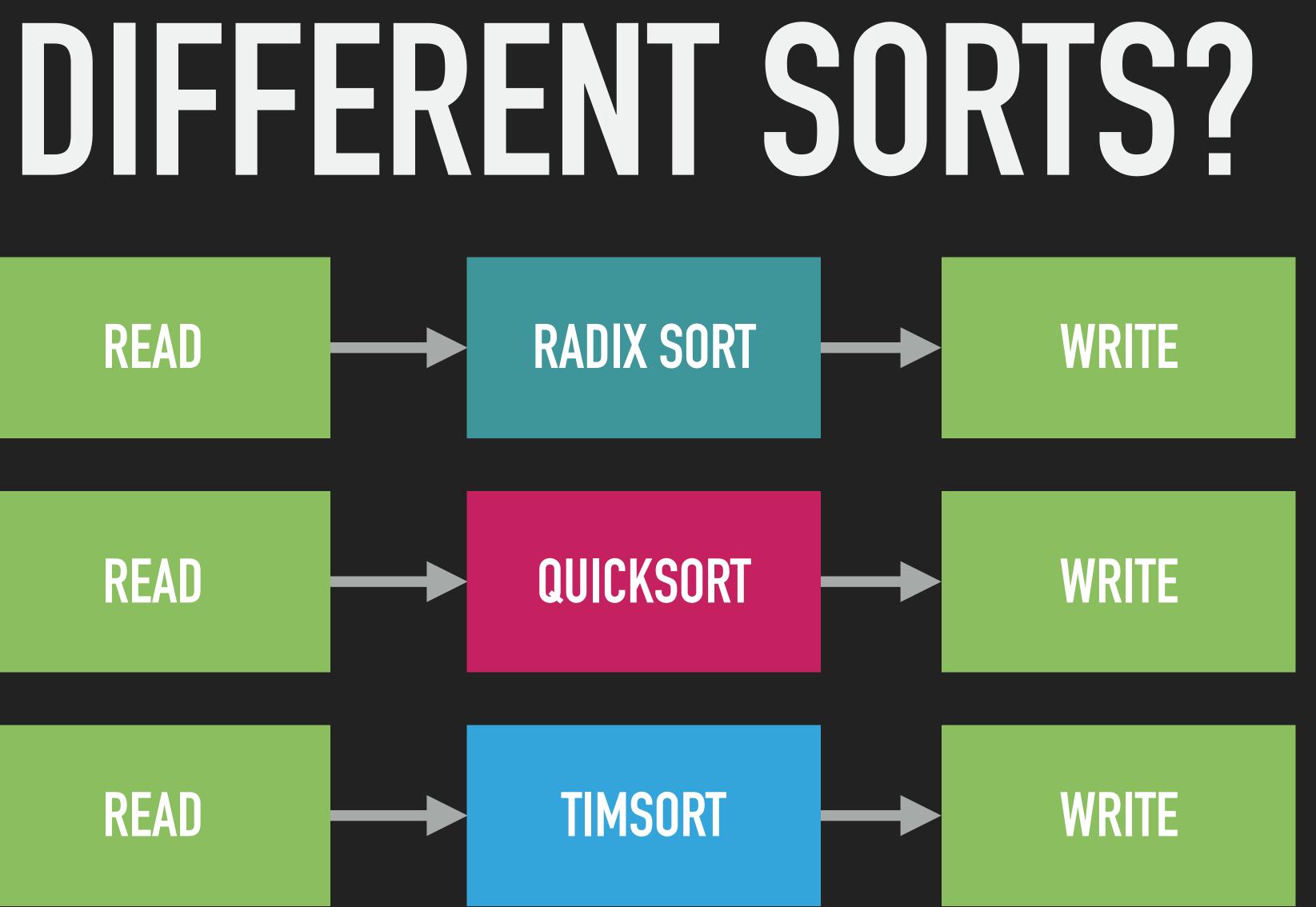


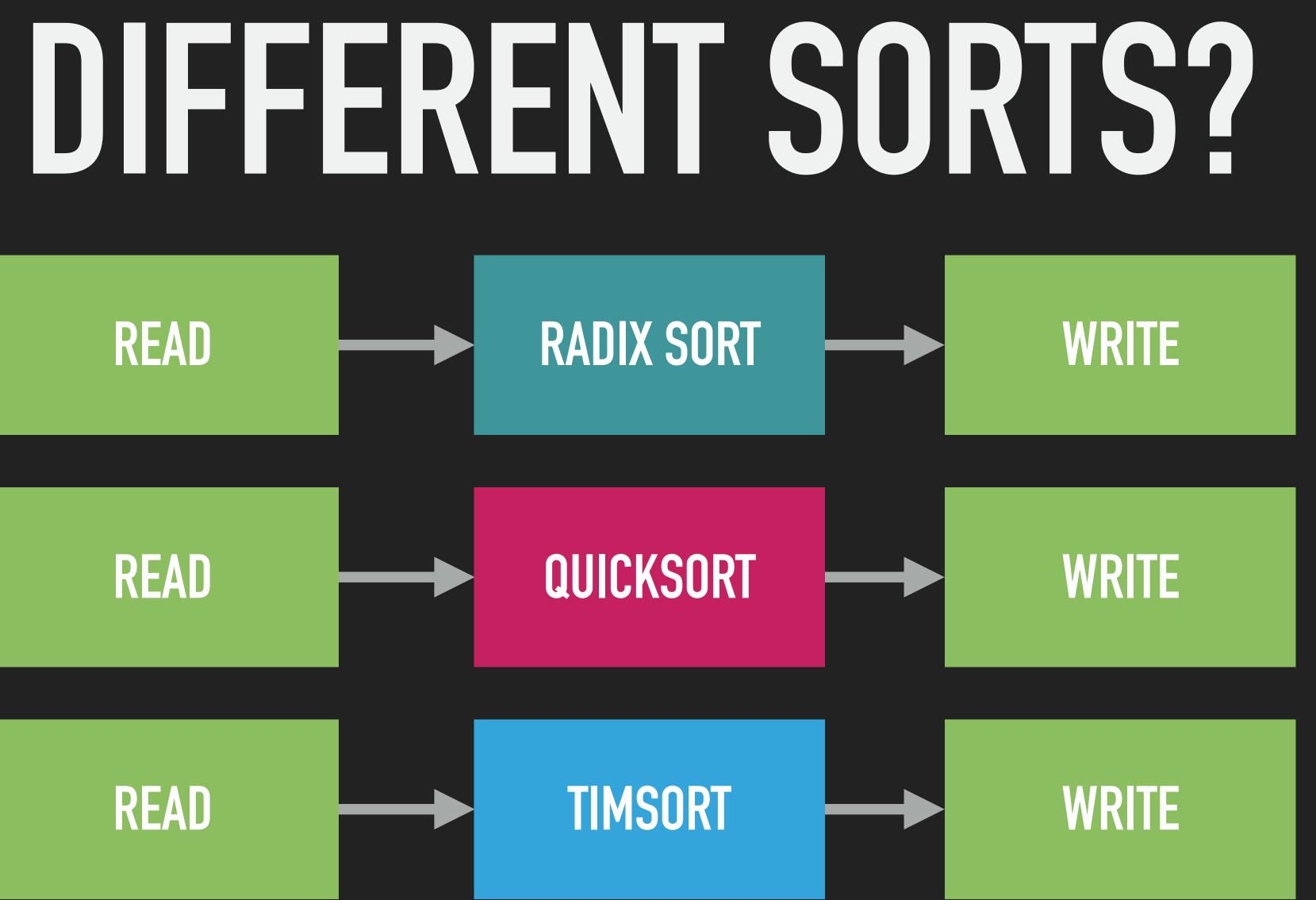


### NETWORK

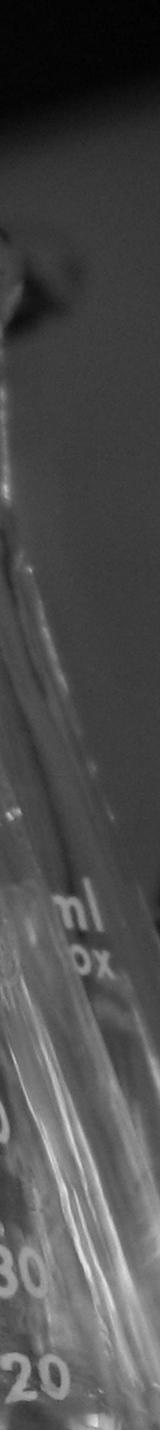








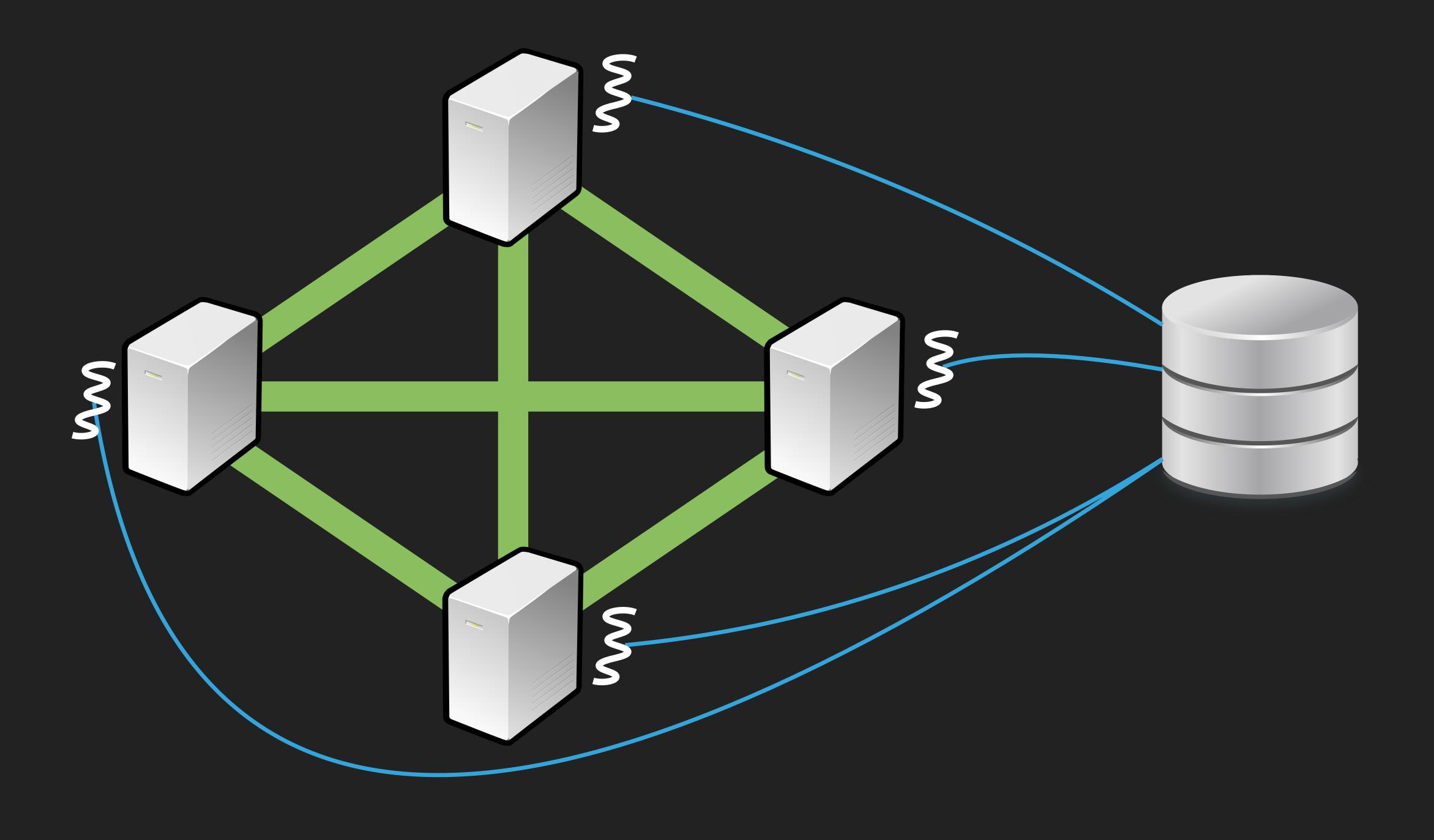




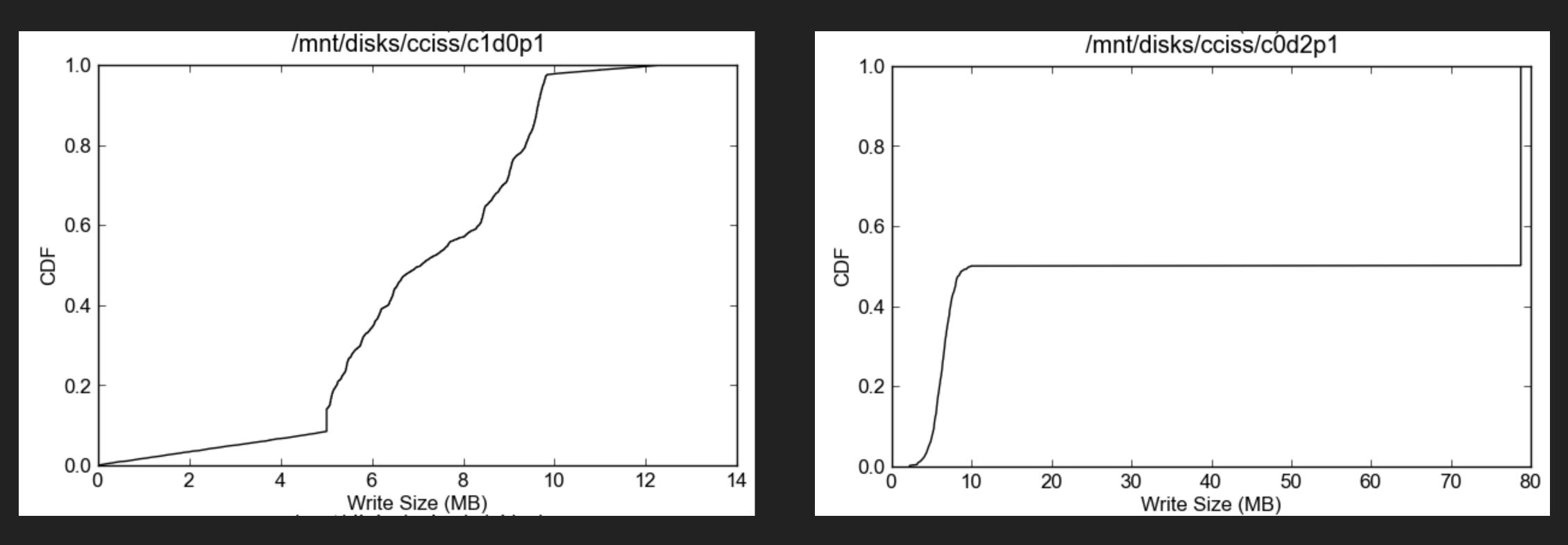
# HOW LARGE ARE WRITES? WHERE STHE BOTTLENECK? ARE STAGES BLOCKED? DLE?





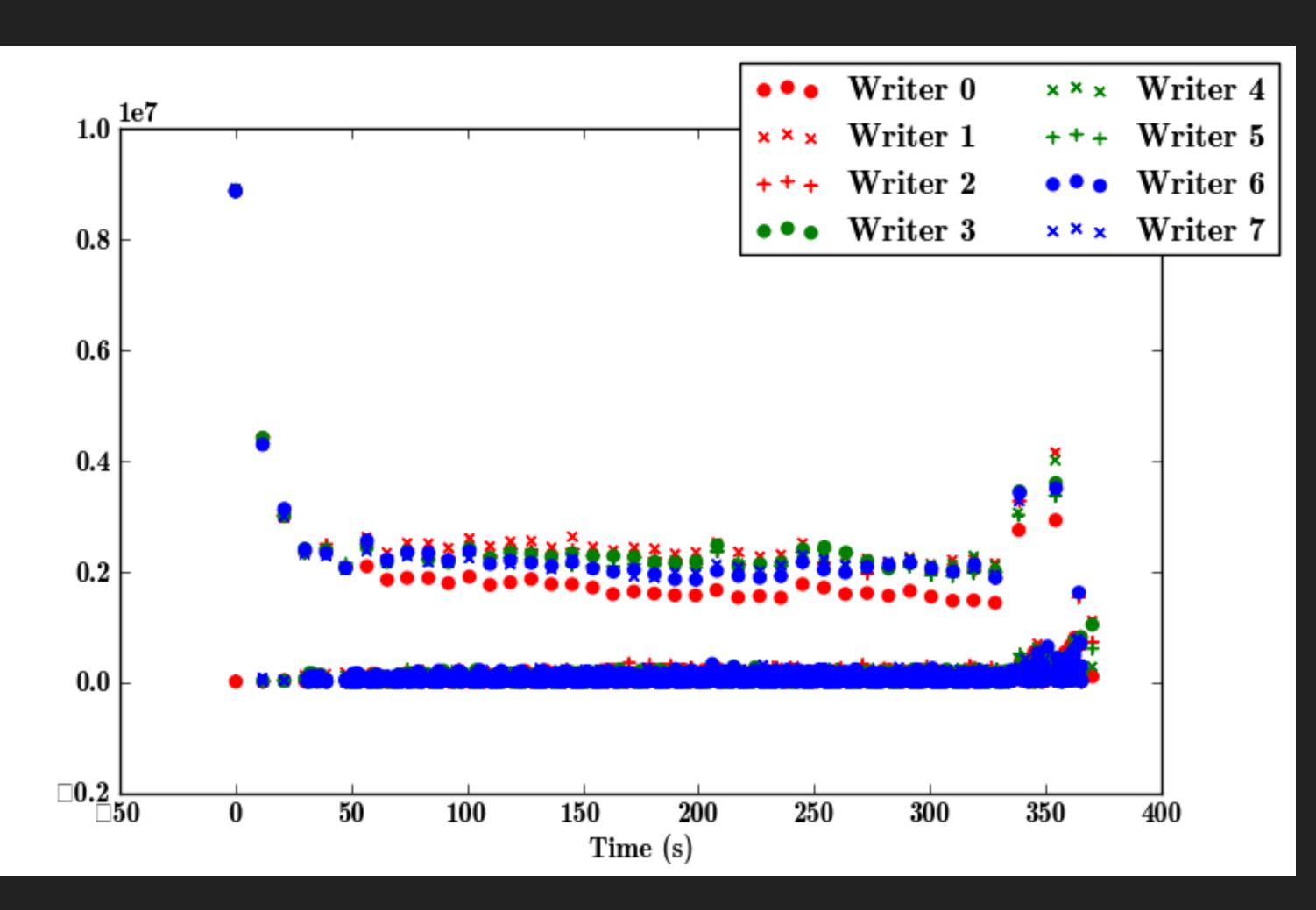


### 





### 





### RUNTIME INFO

### writer

Key	Worker ID								Total
	0	1	2	3	4	5	6	7	Total
bytes_consumed	7.88 GiB	7.89 GiB	7.89 GiB	7.90 GiB	7.87 GiB	7.88 GiB	7.89 GiB	7.89 GiB	63.09 GiB
bytes_produced	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B
bytes_written	7.88 GiB	7.89 GiB	7.89 GiB	7.90 GiB	7.87 GiB	7.88 GiB	7.89 GiB	7.89 GiB	63.09 GiB
bytes_written_after_direct_io_disabled	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B
queue_size	0	0	0	0	0	0	0	0	0
work_units_consumed	1873	1873	1874	1877	1870	1873	1873	1874	14987
work_units_produced	0	0	0	0	0	0	0	0	0

### reader:local

Кеу	Worker ID								
	0	1	2	3	4	5	6	7	Total
bytes_consumed	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B
bytes_produced	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B
bytes_read	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B	0 B
work_units_consumed	0	0	0	0	0	0	0	0	0
work_units_produced	0	0	0	0	0	0	0	0	0

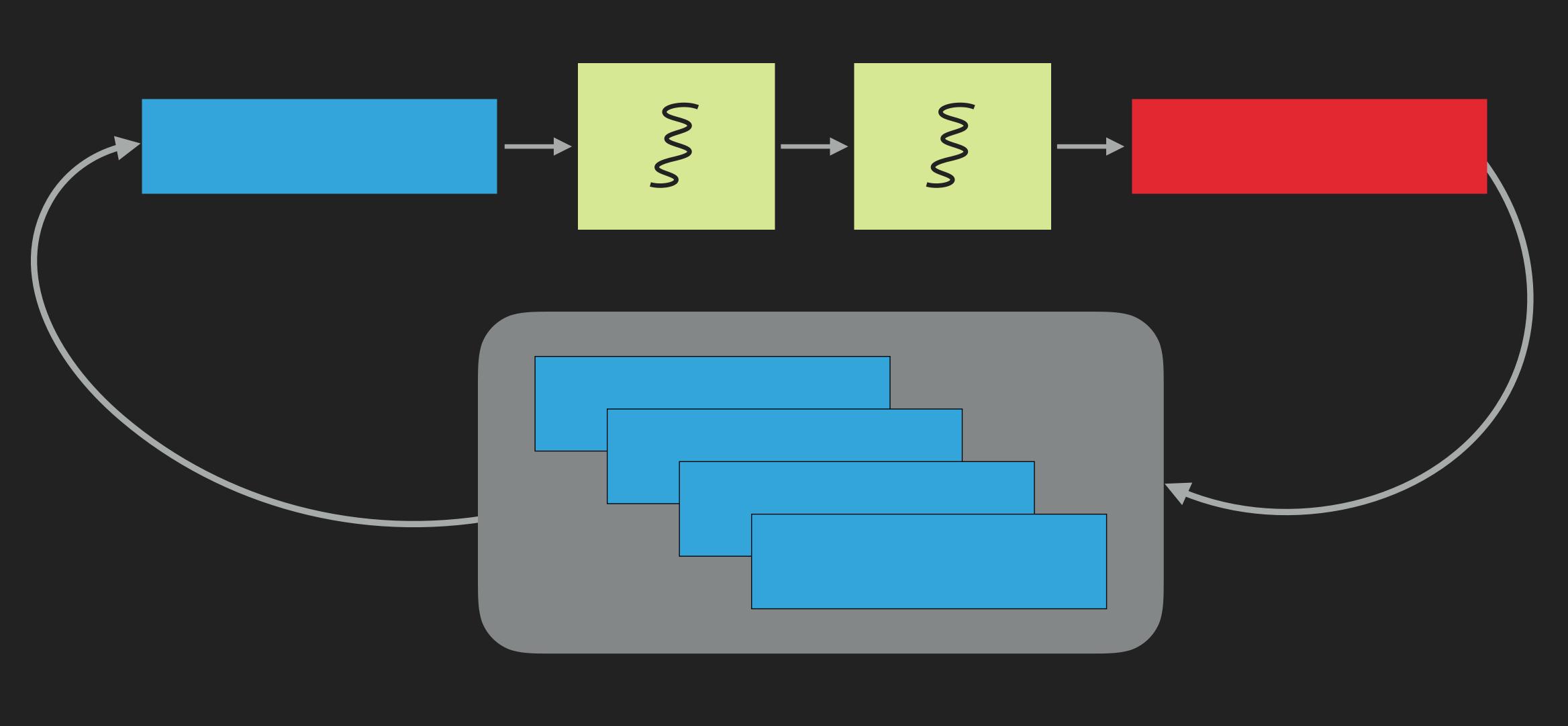


### ORGANIZING LOGS /2016/06/14/frob\_widgets\_1.tar.bz2

### ORGANIZING LOGS /2016/06/14/frob\_widgets\_1.tar.bz2 /cluster\_nodes.txt /node.conf

### ORGANIZING LOGS /2016/06/14/frob\_widgets\_1.tar.bz2 /cluster\_nodes.txt /node.conf /notes.md



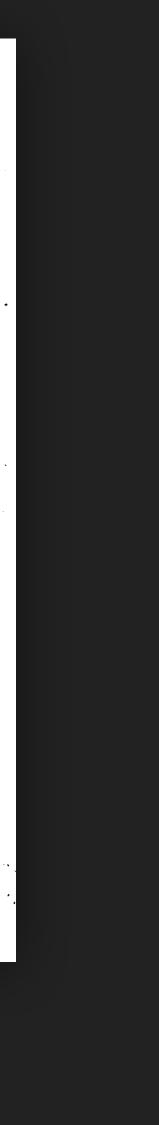


# BUFFER POOLS ARE FAST AND SIMPLE AND INFLEXIBLE

# SIMPLE AND FLEXIBLE AND DANGEROUS

By default, Linux follows an optimistic memory allocation strategy. This means that when malloc() returns non-NULL there is no guarantee that the memory really is available. In case it turns out that the system is out of memory, one or more processes will be killed by the OOM killer.

Apparently: P: has to be symmetric 9/22/11  $\frac{1}{2} \stackrel{\text{T}}{\chi} \stackrel{\text{T}}{P} \stackrel{\text{T}}{\chi} = + \stackrel{\text{T}}{q} \stackrel{\text{T}}{\chi} = C - \stackrel{\text{T}}{\Sigma} \stackrel{\text{T}}{q} \stackrel{\text{T}}{i} \stackrel{\text{T}}{\chi} = \frac{1}{2} \stackrel{\text{T}}{q} \stackrel{\text{T}}{\chi} = \frac{1}{2} \stackrel{\text{T$ # C+E+D ZAVE+D C ZA D≥B Very simple example:  $\vec{x} = \begin{bmatrix} q & 7 \\ s & 7 \end{bmatrix}$ F= 28+E FZC+E+D J= H+G JZ G+重H GZF = [q. s. c][Pii J=H+6 LZJ K≥G+I 1-2167 CZA 133 (u'dcswitch117.dcswitch.sysnet.ucsd.edu', u'reader L Q + 12 50 + 13 C, 12 TO (u'deswitch)17.deswitch.sysnet.uesd.edu', u'key extr =B ୭ J=K L=M u'dcswitch117.dcswitch.sysnet.ucsd.edu', u'sort XP x Pi cswitch117.dcswitch.sysnet.ucsd.edu', u'coordinator\_receiver c XPr (u'deswitch117.deswitch.sysnet.uesd.edu', u'boundary calcul = \_ \_ \_ th118.dcswitch.sysnet.ucsd.edu'. u'broadcast.co bottleneck= Downstocan consumption rabe (u'dcswitch118.dcswitch.sysnet.ucsd.edu', u'broadcast\_rece  $q_{0}(q_{0}l_{11} + s_{0}l_{12} + cl_{13}) + s_{0}(q_{0}l_{12} + s_{0}l_{22} + cl_{13})$ ' <u>Z'</u> (a,y) *e* E  $+C(q_0 l_{13} + S_0 l_{23} + C l_{33}) = c^2 - q_0 S_0 - q_1 S_1$ (u'dcswitch118.dcswitch.sysnet.ucsd.edu', u'boundary\_holder SZL+M  $R_{a}M_{a} \geq M_{a}\Sigma' P_{xa}R_{x}M_{x}$ ->L+N 600 GOO (3) (1) I=M=N=9  $P_{11} = \frac{1}{10} + 2P_{12} = \frac{1}{10} + \frac{1}{1$  $(D_1, -)$   $(H_1, -)$   $(H_2, -)$ TZL  $Z_{x_y}^{+} R_y R_y = R_y M_y = Z_{x_z}^{+} R_x M_x$  $(x_y) \in E$ JZG+H = c<sup>-</sup>-9, 5, L 2J : lost 1/2 somewheres) by 2) M<sub>B</sub>=4 Always holds . lun inc. edges  $2P_{12} = -1$  $R_{A}^{2}R_{B}^{2}R_{c}$ こ C≥ 0448 A+ 1017 B D≥0.5C = - 🍂 All else p . 5. 7 R<sub>B</sub>≥R<sub>A</sub> 鲁  $P_{cD} = 1$   $P_{cD} \neq 0.5$  D = 0.5 CRCZRB A -ar  $\lfloor c \rfloor$ EZOSC C Downstrem TAZO.5C WBZO.5C MBZO.5C MCZD MeZE . C 2 0.5 P C 2 9.5E AZC CZA REC CZB 20.0 5 B .





# ARE WE SOLVING **CERERGENPROBLEM?**

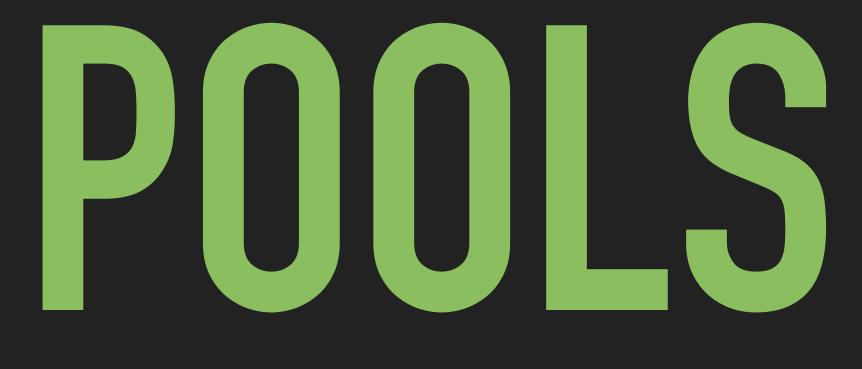


### WHAT IF MALLOC WATED? WAITING PROVIDES BACKPRESSURE CALLERS CAN BE SCHEDULED **INTERFACE STAYS SIMPLE** DECISIONS CAN BE GLOBAL











# CONSTRAINTS



### **938 GB PER MINUTE** 15.6 GB PER SECOND 52 NODES **300 MBPS PER NODE**

### 6757 GB PER MINUTE 1126GBPERSECOND 178N0DES632 MBPS PER NODE









# ARCHITECTURE

## **STRUCTURE SOFTWARE** FOR EXPERIMENTATION AND MEASUREMENT

# SAVE YOUR LOGS SAVE YOUR CONFIG

# SAVE YOUR NOTES



# SOMETIMES YOU NEED MORE CONTROL THAN THE OS WILL GIVE YOU





