

Blue Waters Failure Analysis: Final Presentation

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Project Overview

Objective: To analyze 30,000 Blue Waters Data Points and observe:

- 1) Failure Type Probabilities
- 2) Conditional Probabilities, Failure Densities and Hazard Rates
- 3) Joint Distribution: Cores Used, Duration
- 4) Inter Arrival Distribution and CDF

Data Sample

	A	B	C	D	E	F	G	H	I	J	K
1	inter-arrival	duration	NodesNumbers	TasksPerNode	nodeType	coresNumber	exitStatus	failureType	JobScriptStart	coreHours	SuccessOrFailure
2		1602	25700	16	compute	411200	1	JOB_SCRIPT	SUCCESS	1829840	FAILURE
3	4393	2883	22629	32	compute	724128	0	JOB_EXEC_OK	SUCCESS	5799058.4	SUCCESS
4	522442	9024	4800	32	compute	153600	-10	EXCEED_CLOCK_	FAIL	3850240	FAILURE
5	72643	88	22629	32	compute	724128	1	JOB_SCRIPT	SUCCESS	177009.067	FAILURE
6	13663	2690	22629	32	compute	724128	0	JOB_EXEC_OK	SUCCESS	5410845.33	SUCCESS
7	171814	2	24576	16	compute	393216	1	JOB_SCRIPT	SUCCESS	2184.53333	FAILURE
8	93	3	12288	32	compute	393216	1	JOB_SCRIPT	SUCCESS	3276.8	FAILURE
9	15272	9821	22528	32	compute	720896	0	JOB_EXEC_OK	SUCCESS	19666443.4	SUCCESS
10	113	1019	8192	32	compute	262144	143	TERM_SIGNAL	SUCCESS	742013.156	FAILURE
11	69680	531	8256	32	compute	264192	0	JOB_EXEC_OK	SUCCESS	389683.2	SUCCESS
12	17378	3	4608	32	compute	147456	0	JOB_EXEC_OK	SUCCESS	1228.8	SUCCESS
13	47563	35	8192	32	compute	262144	137	FATAL_ERROR	SUCCESS	25486.2222	FAILURE
14	679	3620	4096	32	compute	131072	-10	EXCEED_CLOCK_	FAIL	1318001.78	FAILURE
15	13263	36	3000	32	compute	96000	1	JOB_SCRIPT	SUCCESS	9600	FAILURE
16	13227	39	5000	32	compute	160000	1	JOB_SCRIPT	SUCCESS	17333.3333	FAILURE
17	8449	8984	8192	32	compute	262144	0	JOB_EXEC_OK	SUCCESS	6541949.16	SUCCESS
18	4682	119	32	32	compute	1024	0	JOB_EXEC_OK	SUCCESS	338.488889	SUCCESS
19	621	225	864	2	compute	1728	0	JOB_EXEC_OK	SUCCESS	1080	SUCCESS
20	1315	6630	1350	16	compute	21600	-10	EXCEED_CLOCK_	FAIL	397800	FAILURE
21	9335	257	1375	4	compute	5500	0	JOB_EXEC_OK	SUCCESS	3926.38889	SUCCESS
22	782	827	22600	1	compute	22600	0	JOB_EXEC_OK	SUCCESS	51917.2222	SUCCESS
23	664	1258	22600	1	compute	22600	0	JOB_EXEC_OK	SUCCESS	78974.4444	SUCCESS

*Received from Catello Di Martino, Ph-D

Data Analysis Approach and Concepts used from Class

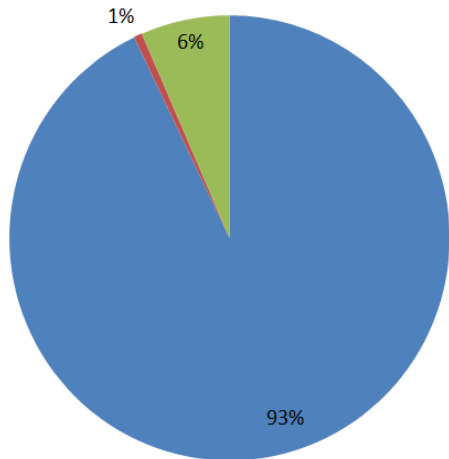
- Analyzed Data Using R because it is better for statistical analysis than Matlab
 - Correlation, Variance, Table functions
- Conditional Probability of Failure
 - Took the number of failures in an interval and divided by the total number of tasks within an interval
- Failure Density and Hazard Rate
 - Used methods that we learned in class to create tables like the ones in lecture

Data Analysis Approach and Concepts Used From the Class

- Failure Probabilities and Exit Code Polarity
 - Looked at the polarity of exit codes to determine Job Script Success and Failure
- Joint Distribution: Cores Used, Duration
 - Each variable was divided into intervals, a table was made with likelihoods and variables on respective x and y axes to determine the joint distribution.

Job Script Failure: Failure Type Distribution

■ EXCEED_CLOCK_TIME ■ JOB_EXEC_FAIL1 ■ JOB_EXEC_FAIL2



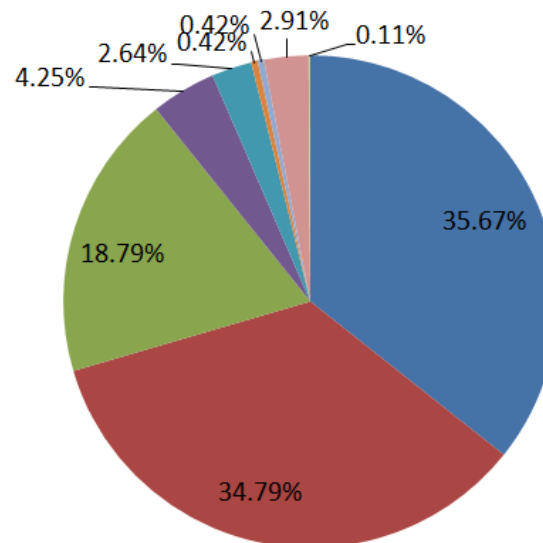
P(Failure Type | Job Script Fail)

Failure Probabilities

```
> summary(Job_Script_Fail$failureType)
      CANNOT_EXEC  COMMAND_NOT_FOUND  EXCEED_CLOCK_TIME  FATAL_ERROR  ILLEGAL_INSTRUCT
              0                0              1364              0              0
      JOB_EXEC_FAIL1  JOB_EXEC_FAIL2  JOB_EXEC_OK  JOB_SCRIPT  LIMIT_EXCEED
              9              96              0              0              0
      MISC_ERROR      SEG_FAULT      TERM_SIGNAL
              0              0              0
> nrow(Job_Script_Fail)
[1] 1469
```

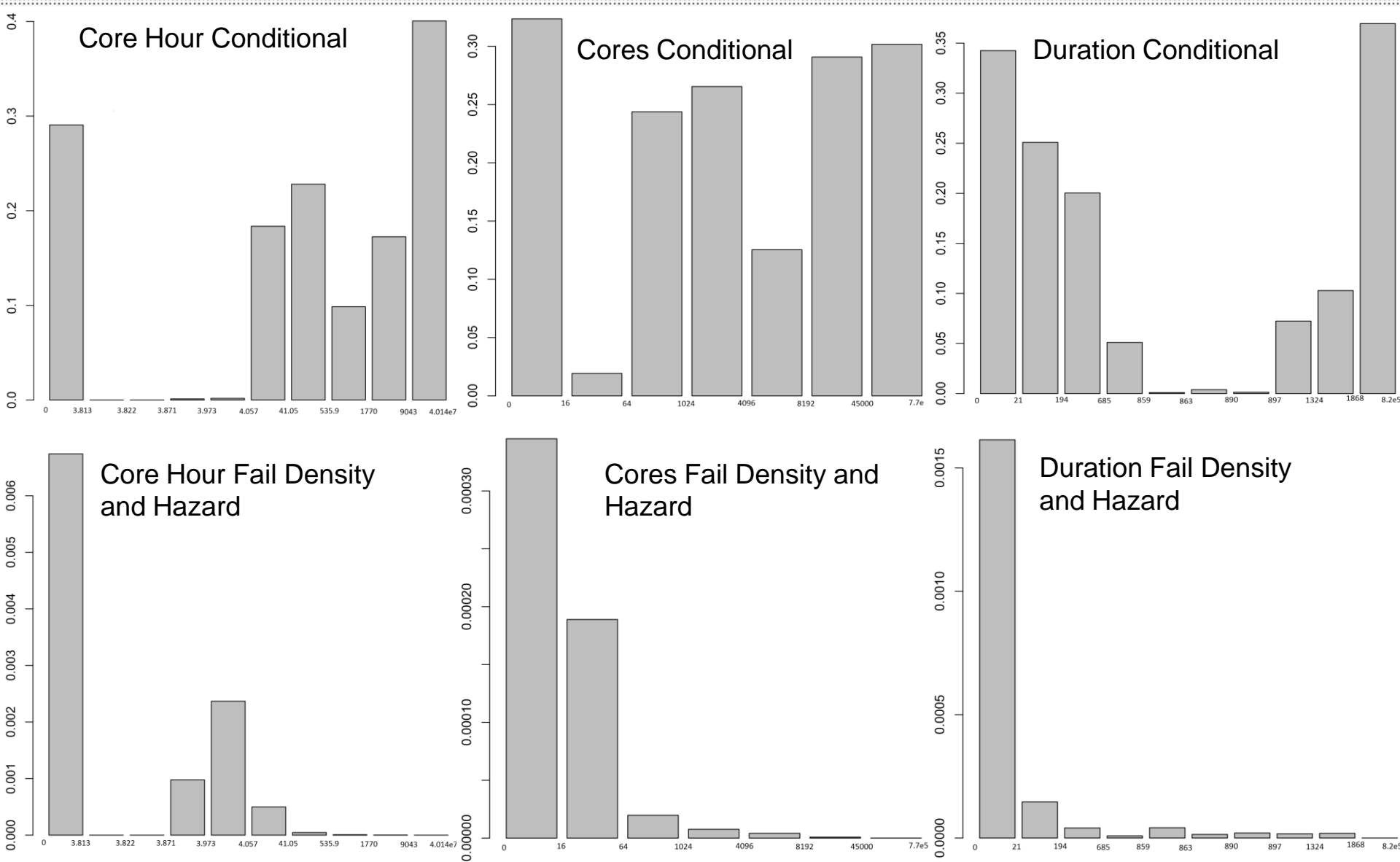
Job Script Success/Job Exec Fail: Failure Type Distribution

■ LIMIT_EXCEED ■ FATAL_ERROR ■ JOB_SCRIPT
 ■ COMMAND_NOT_FOUND ■ TERM_SIGNAL ■ SEG_FAULT
 ■ ILLEGAL_INSTRUCT ■ MISC_ERROR ■ CANNOT_EXEC



P(Failure Type | Job Script Success/Job Execute Fail)

Conditional Failure Probability, Failure Density, Hazard Rate



Duration, Cores and Core Hour Data

```
> cor(bluewaters$coresNumber, bluewaters$duration)
[1] 0.03065871
```

```
> givenDuration
```

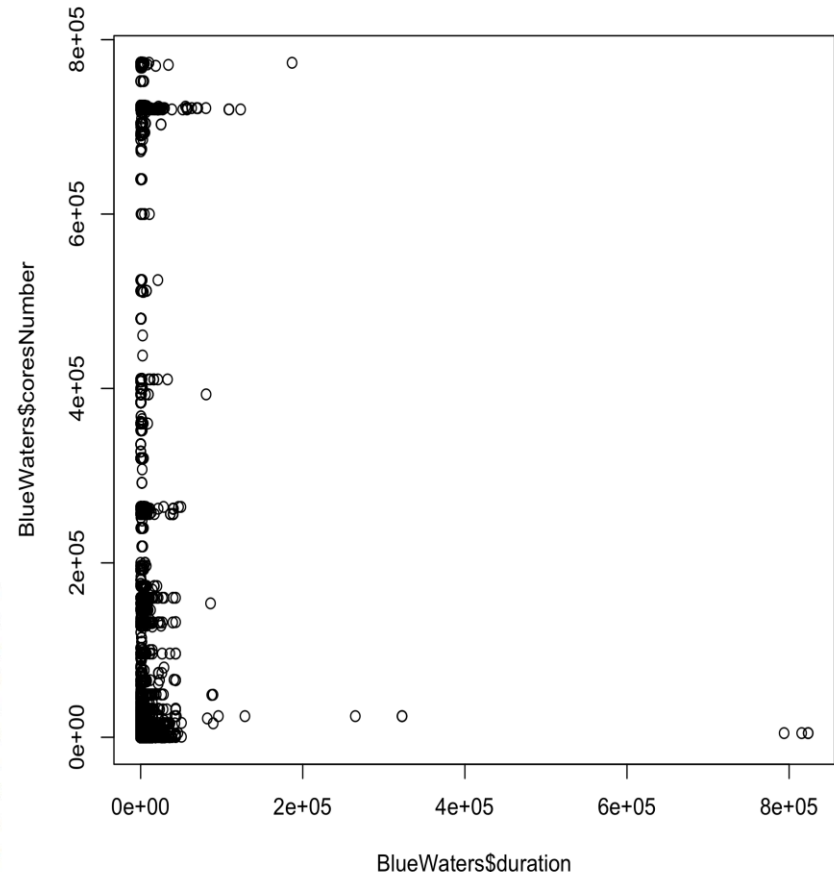
	t1	t2	Failure	Success	Total	P(F t1 < t < t2)	failDensity	hazard
1	0.0	21.0	1017	1952	2969	0.3425395756	1.614286e-03	1.614286e-03
2	21.0	194.0	759	2266	3025	0.2509090909	1.462428e-04	1.513744e-04
3	194.0	685.0	602	2402	3004	0.2003994674	4.086897e-05	4.344066e-05
4	685.0	859.0	45	836	881	0.0510783201	8.620690e-06	9.362852e-06
5	859.0	863.0	5	5055	5060	0.0009881423	4.166667e-05	4.532763e-05
6	863.0	890.4	12	3049	3061	0.0039202875	1.459854e-05	1.588409e-05
7	890.4	897.0	4	2954	2958	0.0013522650	2.020202e-05	2.199059e-05
8	897.0	1324.0	220	2818	3038	0.0724160632	1.717408e-05	1.869729e-05
9	1324.0	1868.0	309	2694	3003	0.1028971029	1.893382e-05	2.077900e-05
10	1868.0	823535.0	1109	1892	3001	0.3695434855	4.498984e-08	4.993877e-08

```
> givenCores
```

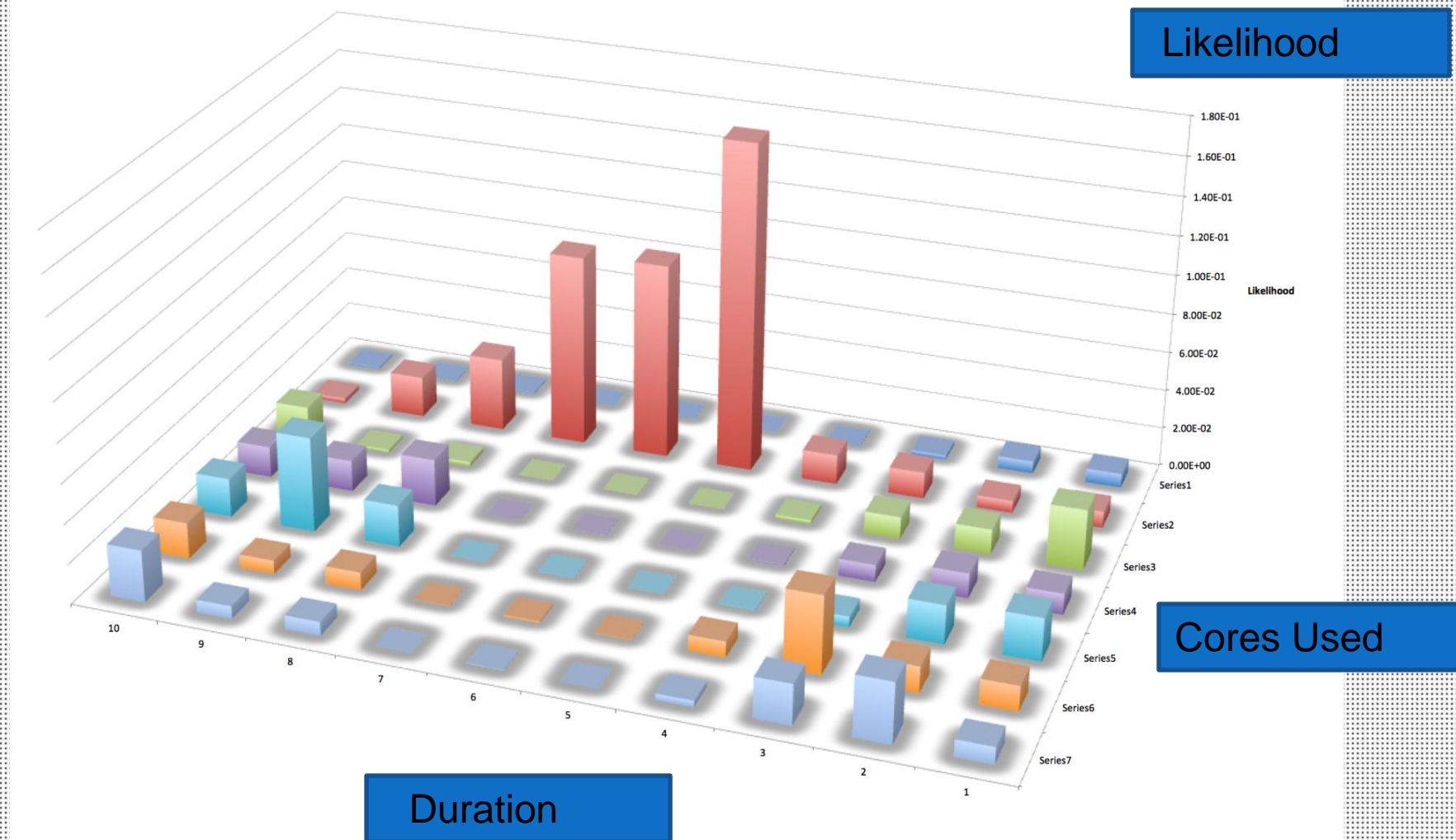
	t1	t2	Failure	Success	Total	P(F t1 < t < t2)	failDensity	hazard
1	-1	16	176	368	544	0.32352941	3.450980e-04	3.450980e-04
5	16	64	272	13872	14144	0.01923077	1.888889e-04	1.900036e-04
6	64	1024	568	1762	2330	0.24377682	1.972222e-05	2.002121e-05
7	1024	4096	703	1945	2648	0.26548338	7.628038e-06	7.895430e-06
8	4096	8192	512	3570	4082	0.12542871	4.166667e-06	4.419929e-06
9	8192	45120	936	2283	3219	0.29077353	8.448873e-07	9.127668e-07
10	45120	773568	915	2118	3033	0.30168150	4.186984e-08	4.681158e-08

```
> givenCoreTime
```

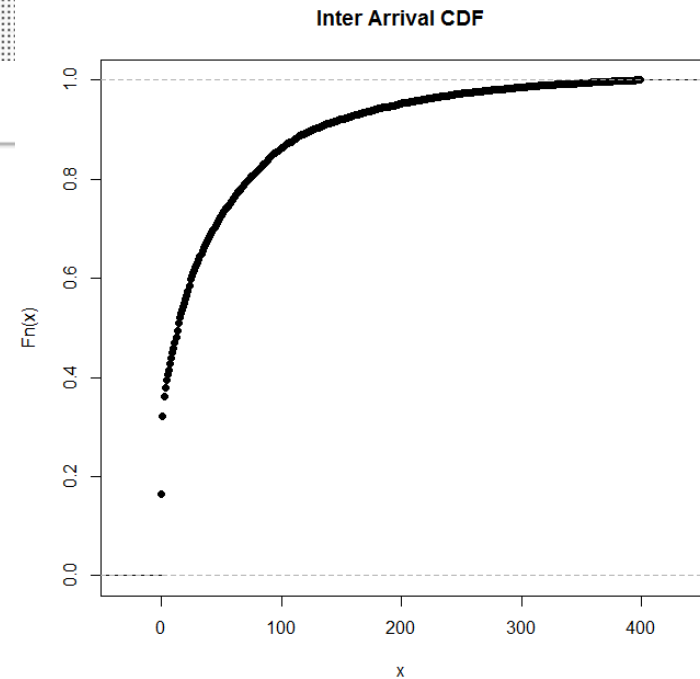
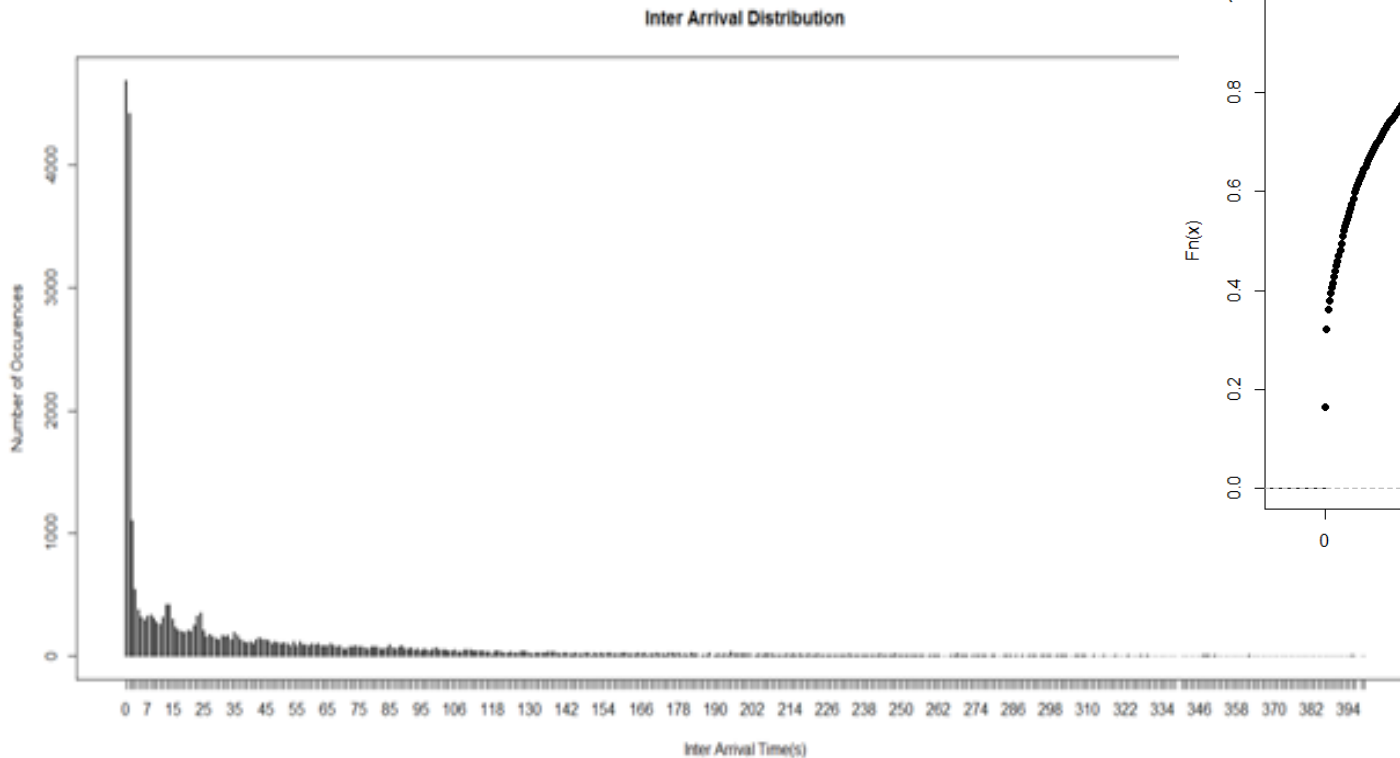
	t1	t2	Failure	Success	Total	P(F t1 < t < t2)	failDensity	hazard
1	-0.2413889	3.813333e+00	820	2001	2821	0.290677065	6.741111e-03	6.741111e-03
2	3.8133333	3.822222e+00	0	4940	4940	0.000000000	0.000000e+00	0.000000e+00
3	3.8222222	3.871111e+00	0	1265	1265	0.000000000	0.000000e+00	0.000000e+00
4	3.8711111	3.973333e+00	3	2497	2500	0.001200000	9.782609e-04	1.005751e-03
5	3.9733333	4.057778e+00	6	3451	3457	0.001735609	2.368421e-03	2.435227e-03
6	4.0577778	4.104533e+01	554	2463	3017	0.183626119	4.992670e-04	5.134555e-04
7	41.0453333	5.358933e+02	684	2315	2999	0.228076025	4.607475e-05	4.830145e-05
8	535.8933333	1.770382e+03	296	2707	3003	0.098568099	7.992512e-06	8.583945e-06
9	1770.3822222	9.042800e+03	517	2480	2997	0.172505839	2.369684e-06	2.572295e-06
10	9042.8000000	4.013611e+07	1202	1799	3001	0.400533156	9.984947e-10	1.104530e-09



Joint Distribution: Number of Cores Used vs. Duration



Interarrival Distribution and Problems with Data



```
> cor(completebluewaters$susedVmem_kb, completebluewaters$susedMem_kb)
[1] 0.9841249
```

```
> cor(completebluewaters$coreHours, completebluewaters$susedVmem_kb)
[1] 0.004801629
> cor(completebluewaters$coreHours, completebluewaters$susedMem_kb)
[1] 0.00679183
```

Conclusions

- Two types of failures: Job Script Success Failures and Job Script Fail Failures
- The conditional probabilities show that as any of the variables increases, so does the probability of failure. The failure densities and hazard rates show that as the variables increase, the density and hazard decrease.
- Joint Distribution Graph shows the most likely combination of Cores (16-64 cores) and Duration (859-863 seconds)

Feelings about the Class

- More in class projects or discussion
- Class expected students to have previous knowledge of R language

Likes:

- Insight on Reliability Systems
- Hearing about the relation to what we did in class to real world examples



Questions?