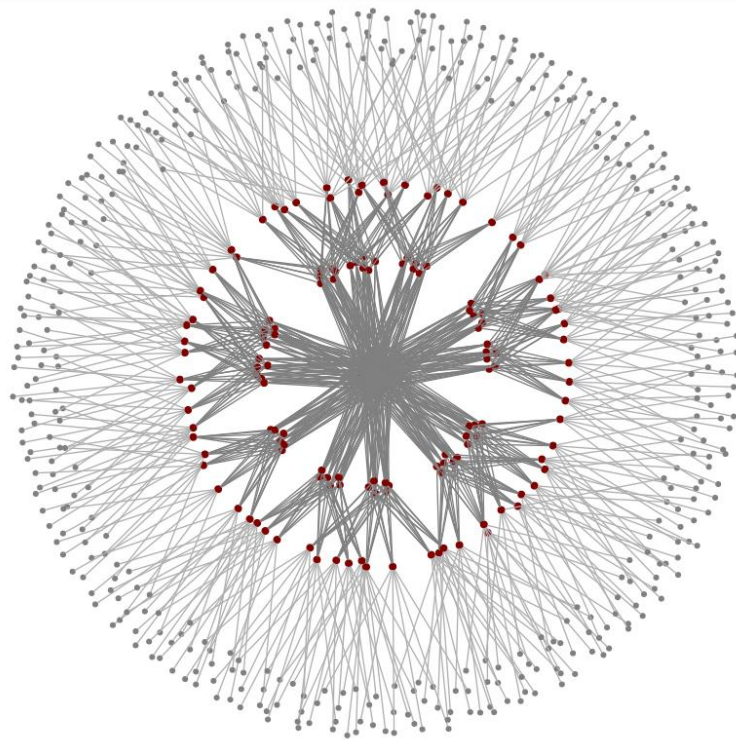


HAWKEYE

PERFORMANCE MONITORING FOR DATA CENTERS

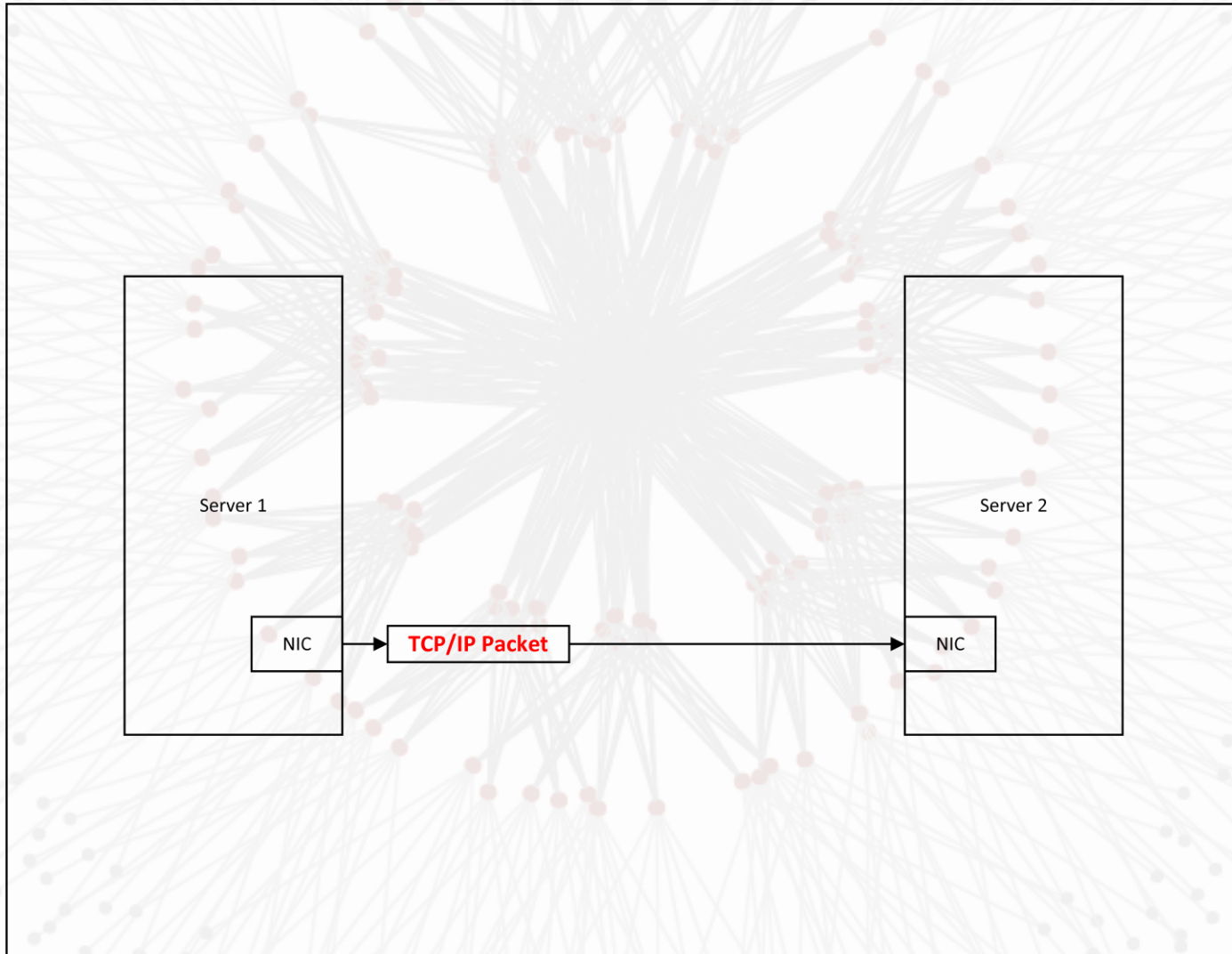


SHABBIR SUTERWALA
INSIGHT DE FELLOW

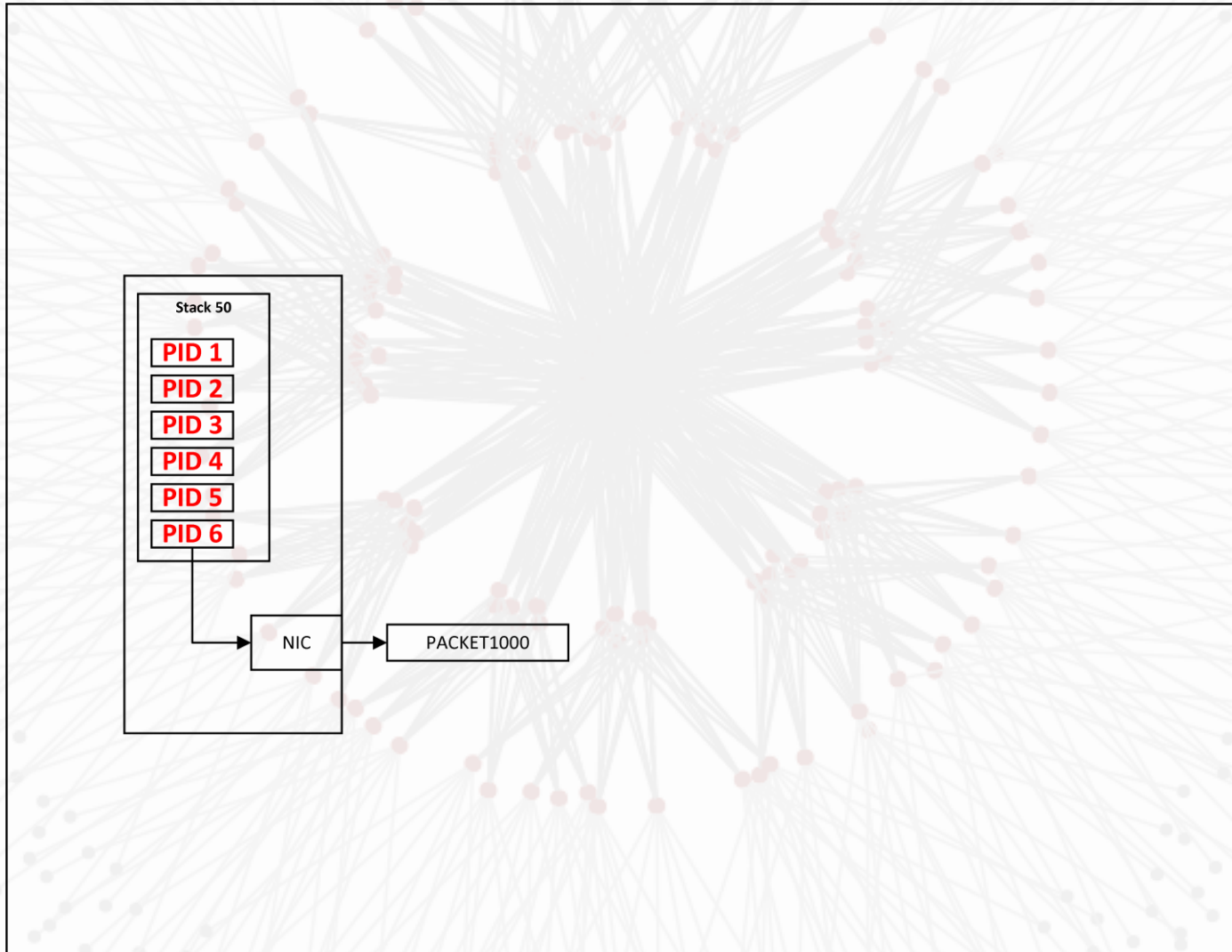
HAWKEYE – USE CASES

- Analyze over or under performance
- Preemptively reorganize cluster
 - Load balance
 - Capacity planning
 - MTBF stats
 - Power consumption
 - Scheduled batch jobs
- At second's time window

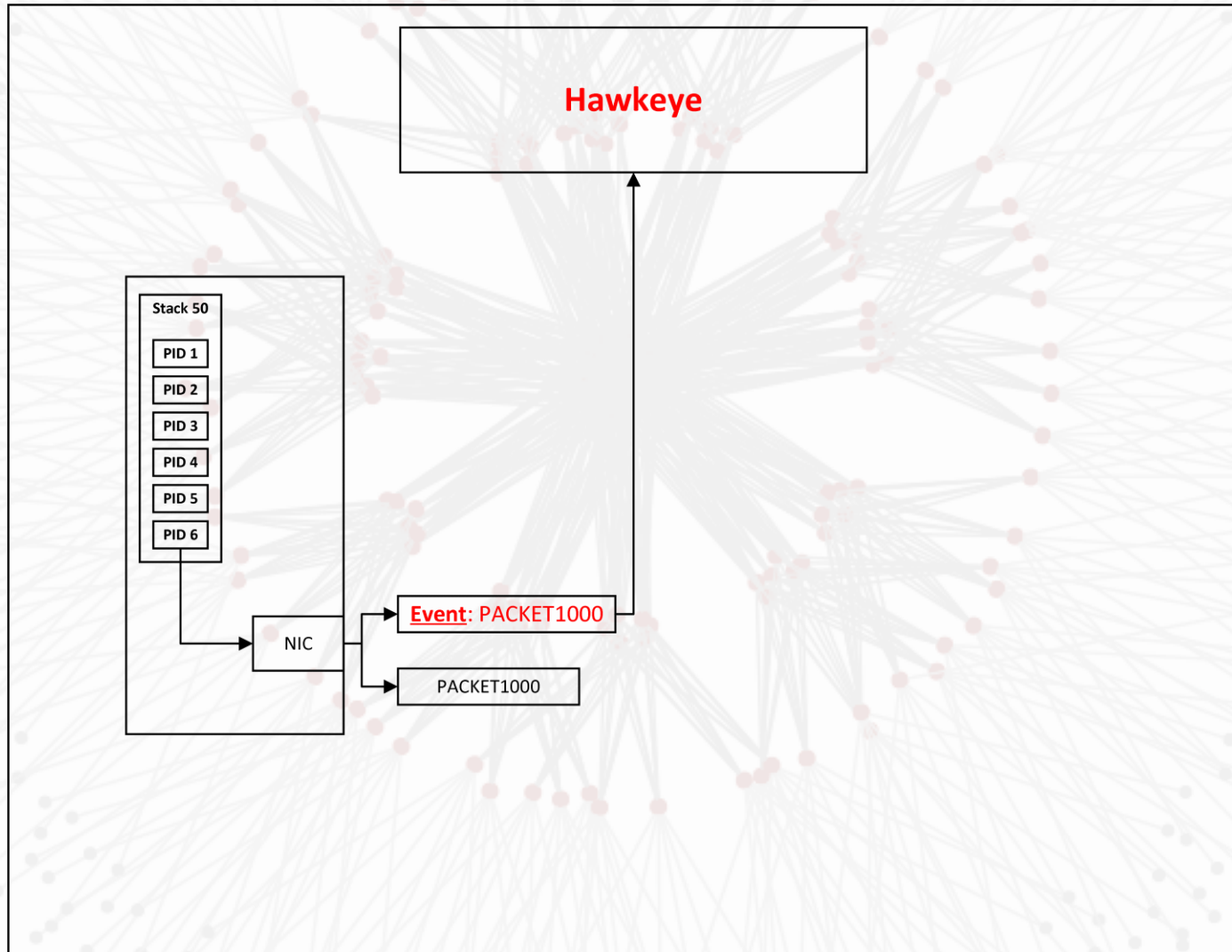
HAWKEYE - APPROACH



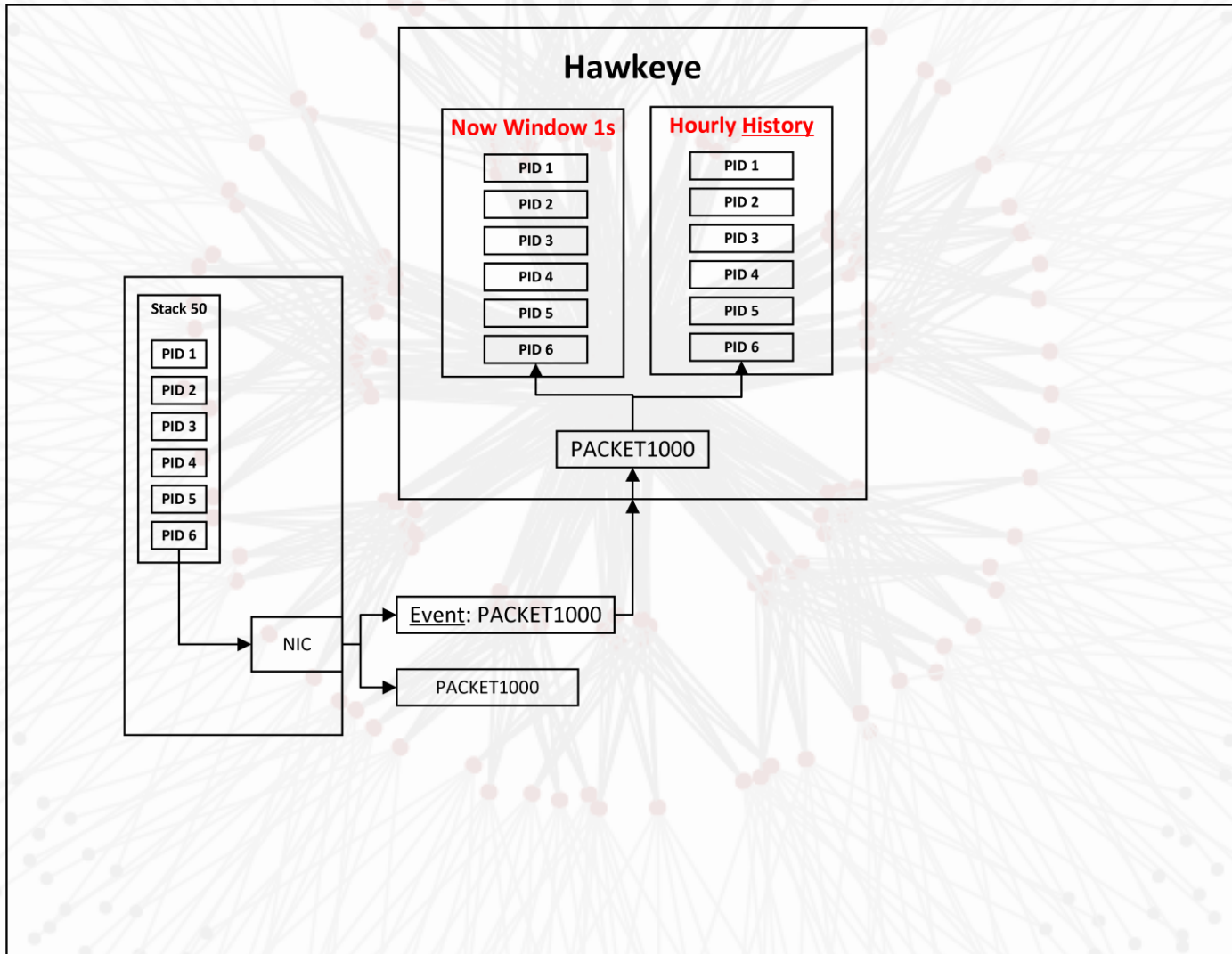
HAWKEYE - APPROACH



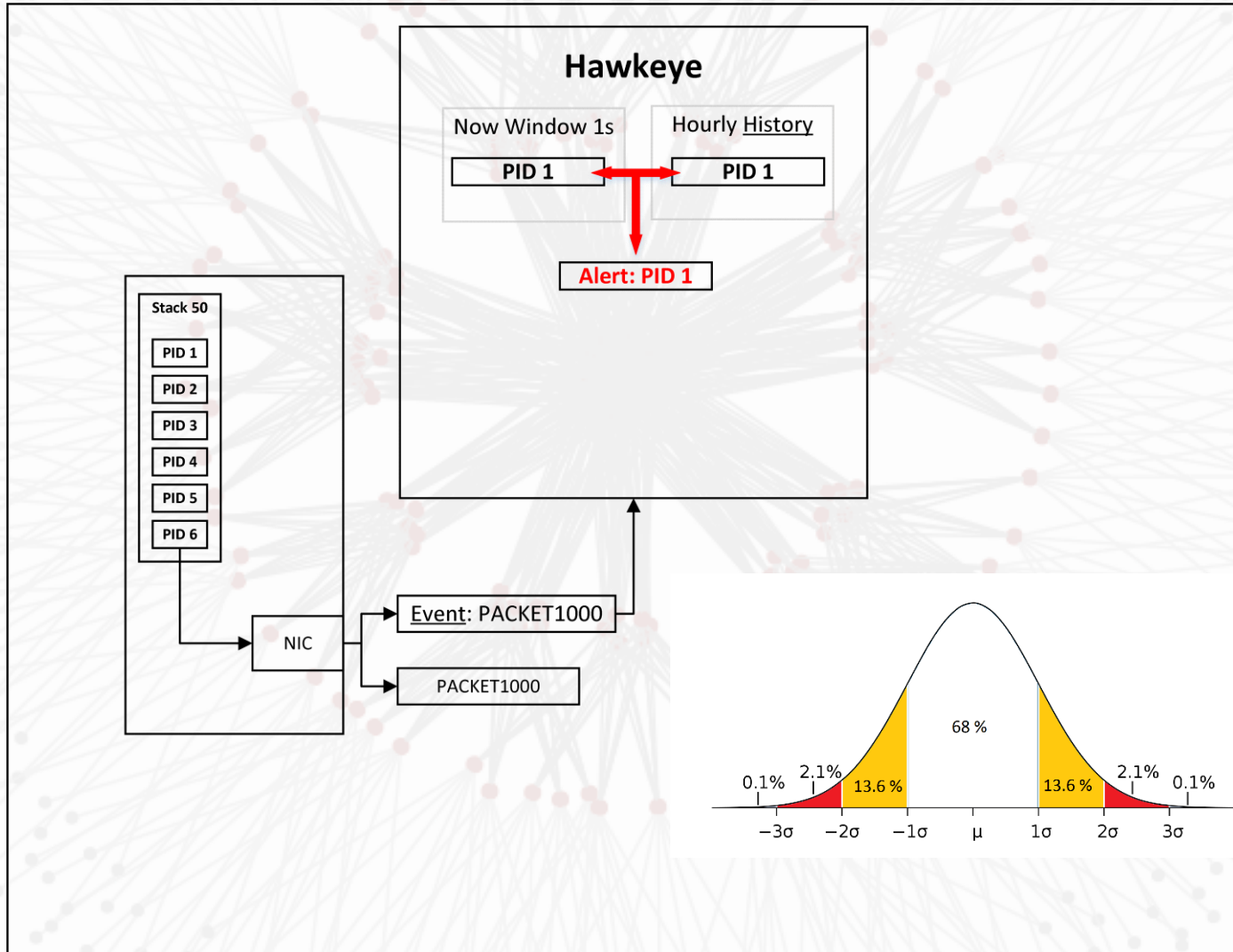
HAWKEYE - APPROACH



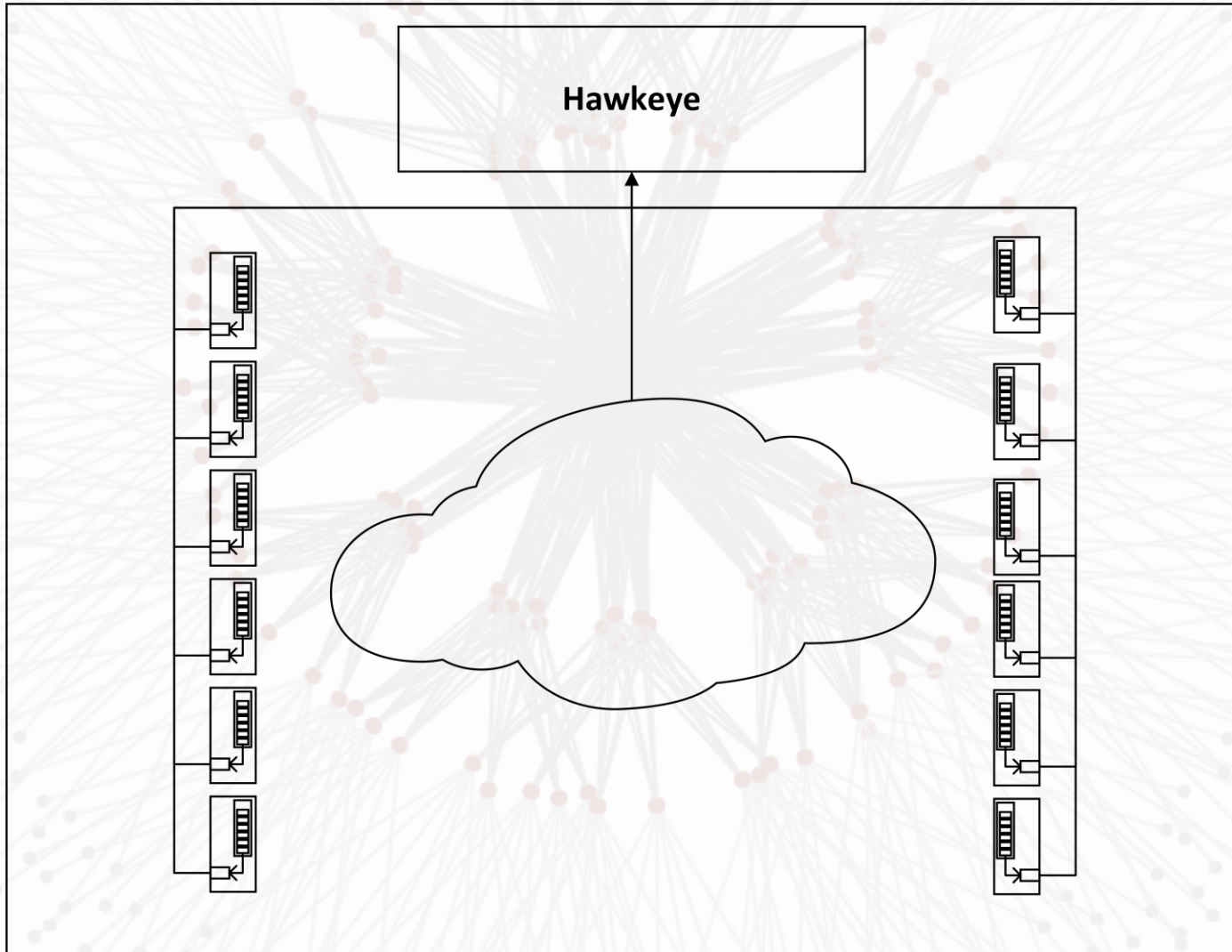
HAWKEYE - APPROACH



HAWKEYE - APPROACH



HAWKEYE - APPROACH



Hawkeye

Home

Monitors

Documentation

Start

Stop

Show 10 entries

Search:

Monitor	Throughput	Min	0%-5% (-2σ+)	5%-16% (-σ+)	84%-95% (σ+)	95%-100% (2σ+)	Max
hawkeye	49831	49842	49942	49971	50029	50058	50076
kafka	58660	47732	49453	49719	50252	50518	50509
mysql	50185	49018	45943	48251	52867	55176	59898
SWID0	51554	49809	49178	49623	50514	50959	53366
SWID20	59800	NaN	NaN	NaN	NaN	NaN	NaN
TASKID100	59382	48825	48140	49121	51082	52063	51200
TASKID20	52121	45721	46267	48166	51966	53865	55837
TASKTYPE100	66414	46820	48792	49400	50614	51222	52595
TASKTYPE20	41742	49765	49201	50096	51885	52780	52238
Monitor	Throughput	Min	0%-5% (-2σ+)	5%-16% (-σ+)	84%-95% (σ+)	95%-100% (2σ+)	Max

Showing 1 to 9 of 9 entries

Previous

1

Next

Start

Stop

Show alerts in last 10 seconds

Show 10 entries

Search:

Alert	Sev	Time	Throughput	Min	0%-5% (-2σ+)	5%-16% (-σ+)	84%-95% (σ+)	95%-100% (2σ+)	Max
SWID0	red	Fri, 12 Feb 2016 23:14:33 GMT	42802	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:14:20 GMT	40684	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:14:12 GMT	46616	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:12:53 GMT	45195	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:09:48 GMT	57062	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:09:38 GMT	52507	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:09:37 GMT	51056	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:06:11 GMT	46921	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 23:00:44 GMT	41329	49809	49178	49623	50514	50959	53366
SWID0	red	Fri, 12 Feb 2016 22:59:54 GMT	58190	49809	49178	49623	50514	50959	53366
Alert	Sev	Time	Throughput	Min	0%-5% (-2σ+)	5%-16% (-σ+)	84%-95% (σ+)	95%-100% (2σ+)	Max

Showing 1 to 10 of 24 entries

Previous

1

2

3

Next

DATA – 5TB / DAY

HawkeyeEvent: {

tsIn: 1453407175613828, tsOut: 1453407175614662,

packetID: "PACKET19083",

monitorGroup: [

{type: "T", subgroup: "AppType", id: "App", power: 6},

{type: "I", subgroup: "AppID", id: "Hawkeye", power: 5},

{type: "T", subgroup: "SwType", id: "SWTYPE42", power: 4},

{type: "I", subgroup: "SwID", id: "SWID20", power: 3},

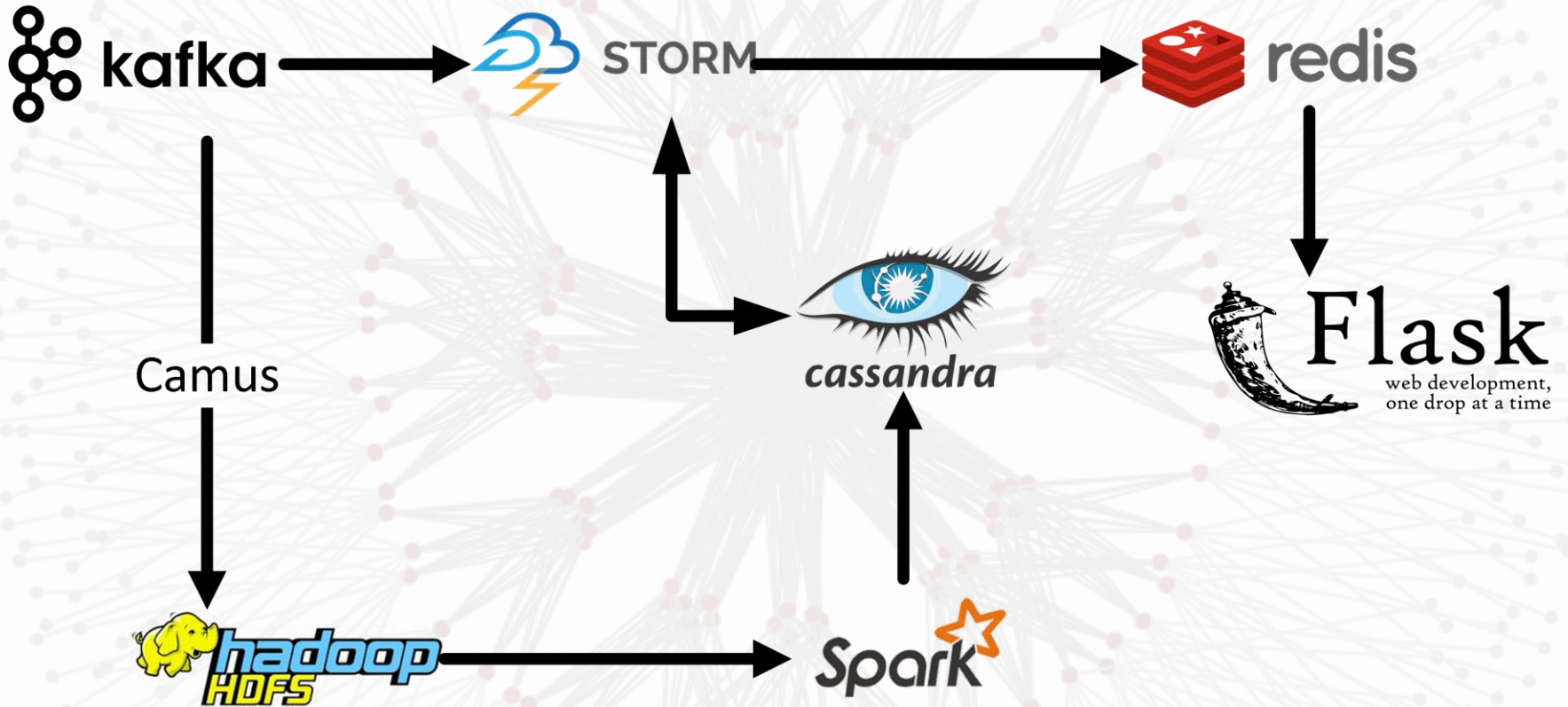
{type: "T", subgroup: "TaskType", id: "TASKTYPE21", power: 2},

{type: "I", subgroup: "TaskID", id: "TASKID154", power: 1}

]

}

PIPELINE



SCHEMA - SUBSET

```
(10 rows)  
cqlsh:hawkeye4> select monitor,alert_time_year,alert_time_ms,alert_sev,alert_through from monitor_alerts limit 10;
```

monitor	alert_time_year	alert_time_ms	alert_sev	alert_through
TASKTYPE906	2016	2016-02-09 07:42:52+0000	red	56294.5102
TASKTYPE906	2016	2016-02-09 07:41:07+0000	yellow	50991.99029
TASKTYPE906	2016	2016-02-09 07:40:22+0000	red	53721.05583
TASKTYPE906	2016	2016-02-09 07:39:11+0000	red	31199
TASKTYPE906	2016	2016-02-09 07:39:10+0000	red	39959.44444
TASKTYPE906	2016	2016-02-09 07:39:09+0000	red	39253.16667
TASKTYPE906	2016	2016-02-09 07:37:34+0000	red	45606.15385
TASKTYPE906	2016	2016-02-09 07:36:15+0000	red	47540.79369
TASKTYPE906	2016	2016-02-09 07:34:38+0000	yellow	48636.09091
TASKTYPE906	2016	2016-02-09 07:32:20+0000	red	48223.12379

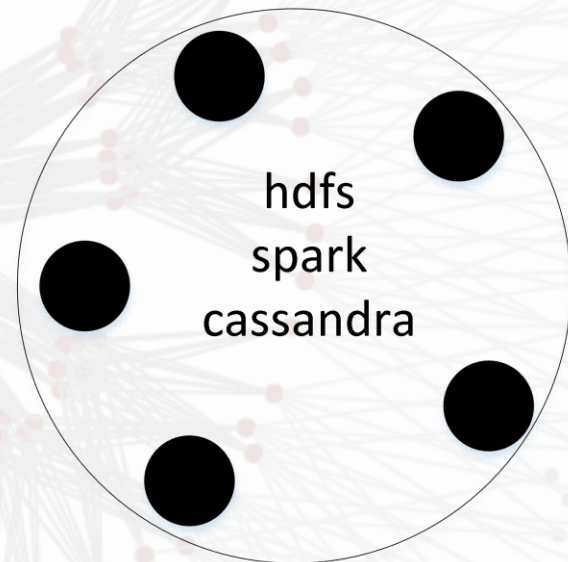
```
(10 rows)  
cqlsh:hawkeye4> select * from monitor_history limit 10;
```

monitor	record_time_year	record_time_ms	nevents	tdeltaagg	time_window_size_ms
TASKTYPE305	2016	2016-02-08 11:15:44+0000	400	20181033	600000
TASKTYPE305	2016	2016-02-08 11:05:44+0000	1237	61621326	600000
TASKTYPE305	2016	2016-02-08 10:55:44+0000	2813	139698082	600000
TASKTYPE305	2016	2016-02-08 10:45:44+0000	1130	57024590	600000
TASKTYPE305	2016	2016-02-08 10:35:43+0000	1868	91425185	600000
TASKTYPE305	2016	2016-02-08 10:25:43+0000	213	10622745	600000
TASKTYPE906	2016	2016-02-09 07:39:42+0000	2240	110067754	600000
TASKTYPE906	2016	2016-02-09 07:29:42+0000	3046	153359384	600000
TASKTYPE906	2016	2016-02-09 07:19:42+0000	1823	89980295	600000
TASKTYPE906	2016	2016-02-09 07:09:42+0000	2586	128722574	600000

CLUSTER



10 m4.xlarge
1TB



Instances : \$57.36 / 24 hours
Storage : \$70 / month

LESSONS LEARNED



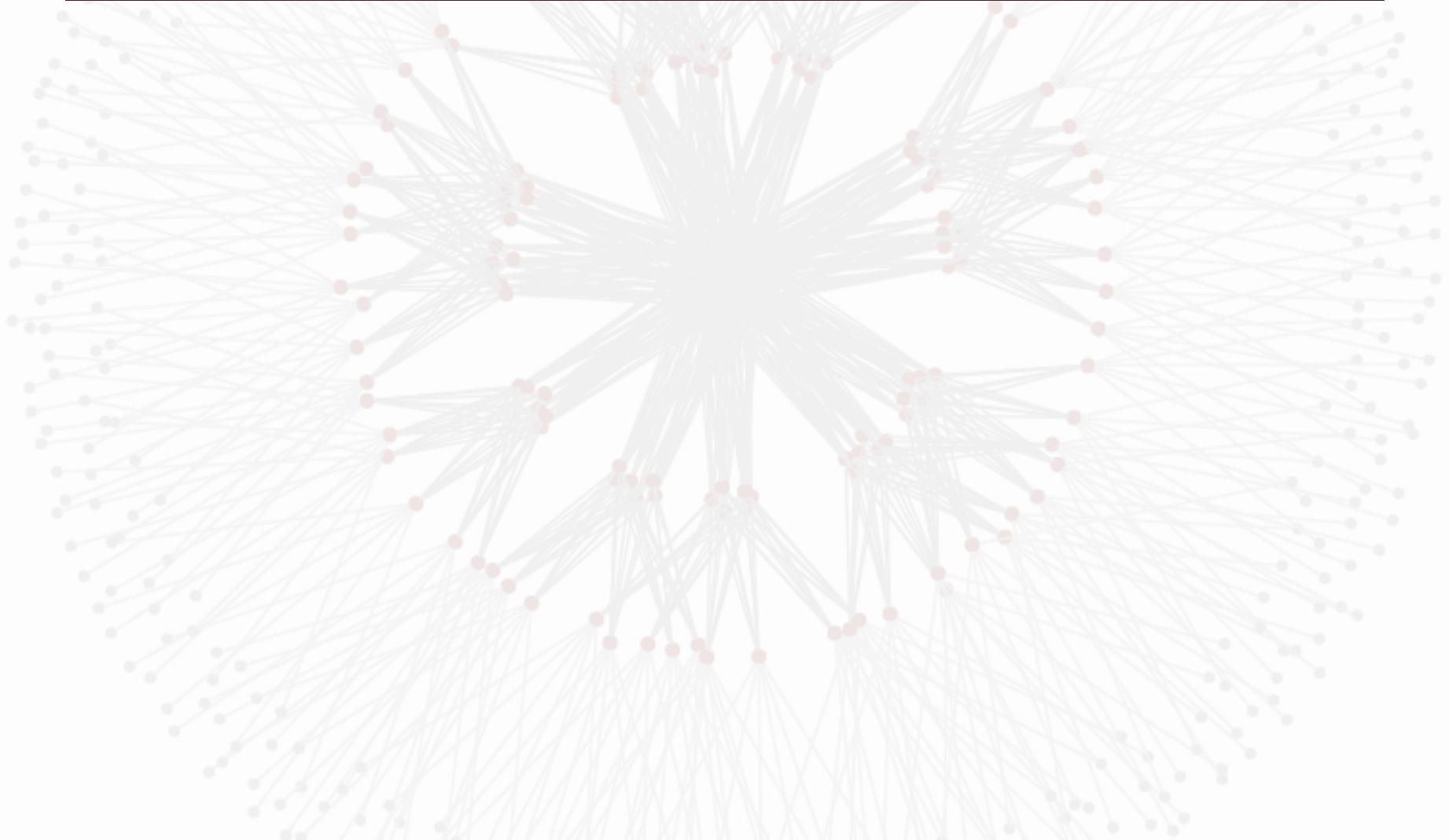
- Start with Query
- Invest in a scheduler
- Make the cluster secure from day 0

SHABBIR SUTERWALA

- Team Lead, Architecture / Principal Architect @ Infor
 - Cloverleaf → Ingestion & processing engine for healthcare market
- Previously worked at Cisco, AMD and Storage Startup
 - Built OS, Virtual Machines, File Systems



BACKUP SLIDES



SCHEMA - FULL

```
cqlsh:hawkeye4> select * from monitor_alerts limit 10;
```

monitor	alert_time_year	alert_time_ms	alert_sev	alert_through	max_through	min_through	sigma1neg_through	sigma1pos_through	sigma2neg_through	sigma2pos_through
TASKTYPE906	2016	2016-02-08 17:09:32+0000	red	50332.85922	49526.7681	49337.22816	49297.97315	49566.02311	49163.94816	49700.0481
TASKTYPE906	2016	2016-02-08 16:54:46+0000	red	47908.37136	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:54:21+0000	red	55228.96	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:54:01+0000	red	50332.85922	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:53:18+0000	red	49474.7233	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:53:01+0000	red	44555.64286	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:52:25+0000	red	49039.2	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:50:32+0000	red	53526.275	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKTYPE906	2016	2016-02-08 16:48:21+0000	red	49882.4733	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816	49337.22816
TASKID402	2016	2016-02-08 17:09:26+0000	yellow	52517.13821	49344.80952	43740.5122	42579.82421	50505.4975	38616.98757	54468.33415

(10 rows)

```
cqlsh:hawkeye4> select * from monitor_history limit 10;
```

monitor	record_time_year	record_time_ms	nevents	tdeltaagg	time_window_size_ms
TASKTYPE305	2016	2016-02-08 11:15:44+0000	400	20181033	600000
TASKTYPE305	2016	2016-02-08 11:05:44+0000	1237	61621326	600000
TASKTYPE305	2016	2016-02-08 10:55:44+0000	2813	139698082	600000
TASKTYPE305	2016	2016-02-08 10:45:44+0000	1130	57024590	600000
TASKTYPE305	2016	2016-02-08 10:35:43+0000	1868	91425185	600000
TASKTYPE305	2016	2016-02-08 10:25:43+0000	213	10622745	600000
TASKTYPE906	2016	2016-02-08 16:55:06+0000	2596	128571490	600000
TASKTYPE906	2016	2016-02-08 16:45:06+0000	2060	101634690	600000
TASKTYPE906	2016	2016-02-08 16:31:17+0000	1648	81307752	600000
TASKTYPE906	2016	2016-02-08 16:21:17+0000	2060	101634690	600000

(10 rows)

HAWKEYE – HOW?

- Chatty App → Low Performance
- Measure by counting TCP/IP Packets
 - $\text{Throughput} = \text{Total Packets} / \text{Time}$
- Include Network Latency
 - $\text{Throughput} = (\text{Total Latency} / \text{Total Packets}) / \text{Time}$

HAWKEYE – WHEN?

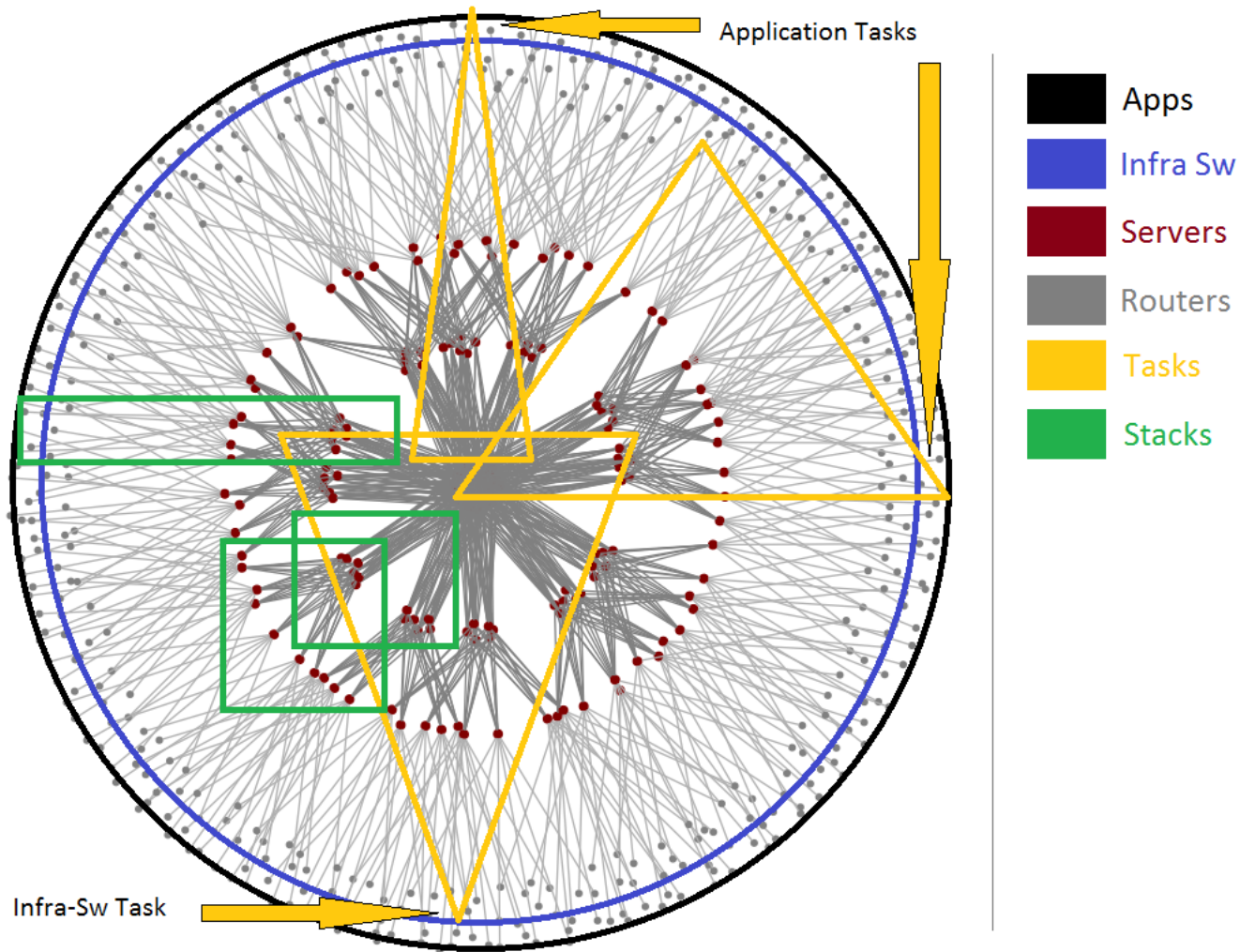
- Alerts – per monitor
 - Throughput now vs. historical data
 - Upper bound and lower bound
- Game – per stack
 - Rank user's stack's performance in real time

DATA

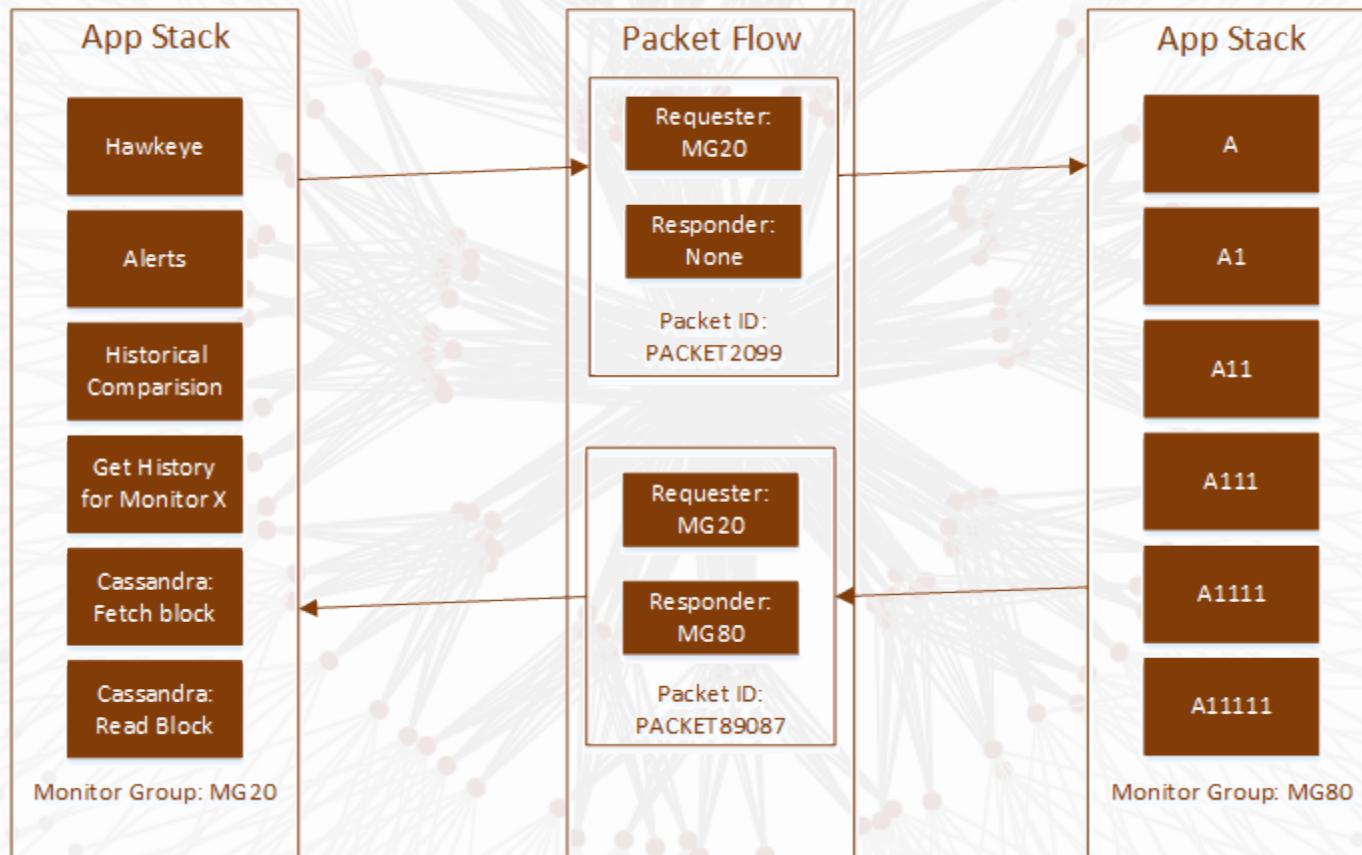


- Event:
 - TCP/IP packet timestamp In / Out
 - List of Monitors
- Engineered Data for Insight Project
- Real World
 - Hook into kernel: network stack, scheduler
 - Hi priority demon using *top*
 - Hypervisor

HAWKEYE MONITORS

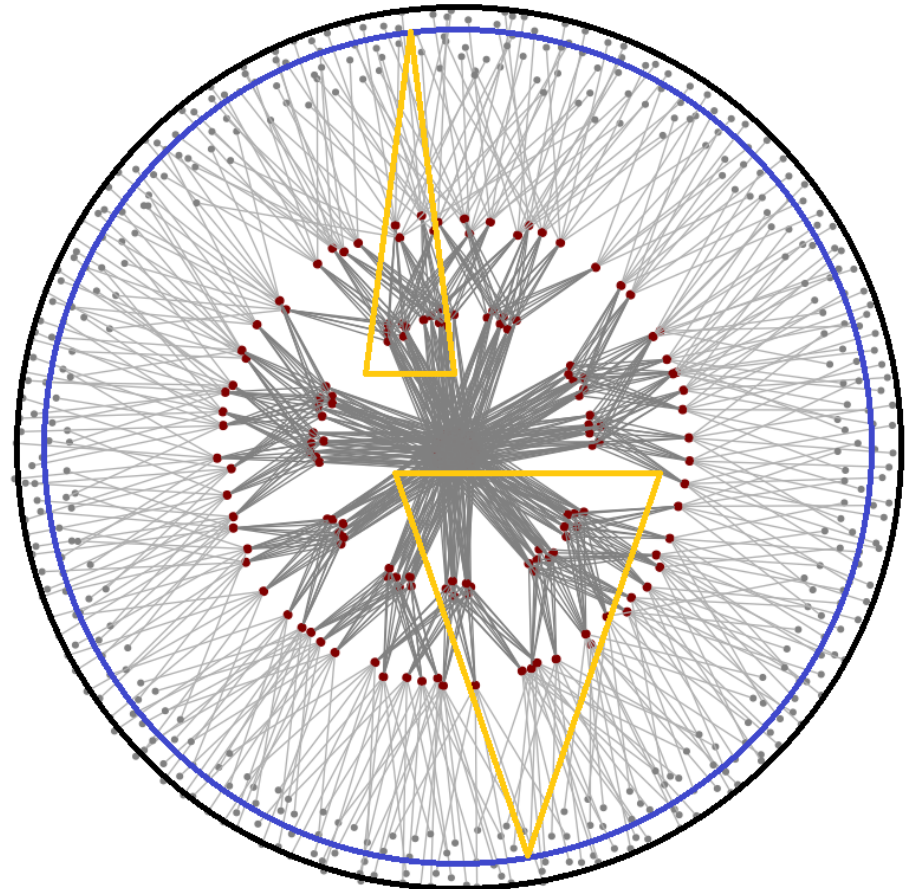


HAWKEYE – EXECUTION



HAWKEYE - APPROACH

- Sniff each TCP/IP packet
- Packet (P) \rightarrow Source Stack (S)
- At P's arrival:
 - For each source in SS
 - Add P's latency to source
- Now Window (Is):
 - For each source in Hawkeye
 - Alert of throughput's pvalue < 0 .



■ App ■ Infra-Sw ■ Servers ■ Routers ■ Tasks