



SmartCat

DATA → KNOWLEDGE → POWER

Challenges of Monitoring Distributed Systems

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Agenda

- Monitoring 101
- Metric data stream and tools
- Log data stream and tools
- Combine metrics and logs for full control
- Alerting



Monitoring 101

- Monitoring domain consists of:

Metrics data stream

Log data stream

Alerting





Metrics Data Stream

Metric data stream

- Metrics are indicators that everything is working within expected boundaries
- Easily forgotten and pushed aside when chasing deadlines
- Good dashboard has enough information (not too much, not too little)

Distributed system -> many graphs to watch -> information overload trap



Metric data stream - decision

- SaaS solutions vs self-managed solutions
- Paying solutions vs free solutions
- Decision based on:

technical team skillset

level of control

security of data



Metric data stream - stack

- Riemann as sink that handles events and sends them to Riemann server
- InfluxDB as NoSQL store which is build for measurements
- Grafana as visualization tool (flexible configurable graphs from many data sources)





Cassandra host: All

Cluster health

⌚ Last 15 minutes

Nodes up: 12 / 12

Request rate UPDATE

⌚ Last 3 seconds

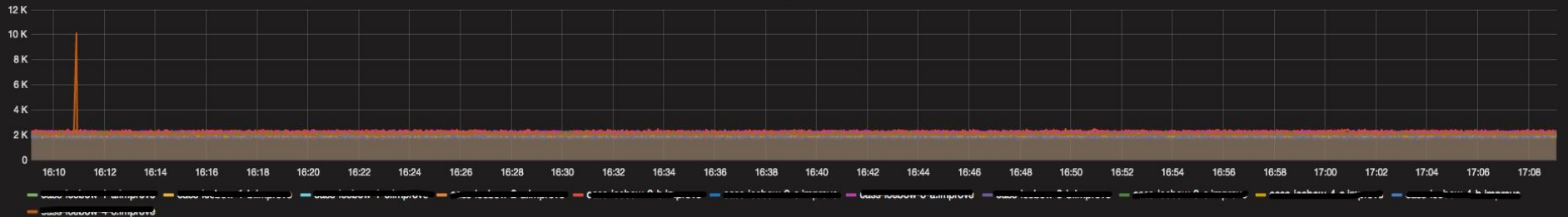


Request rate SELECT

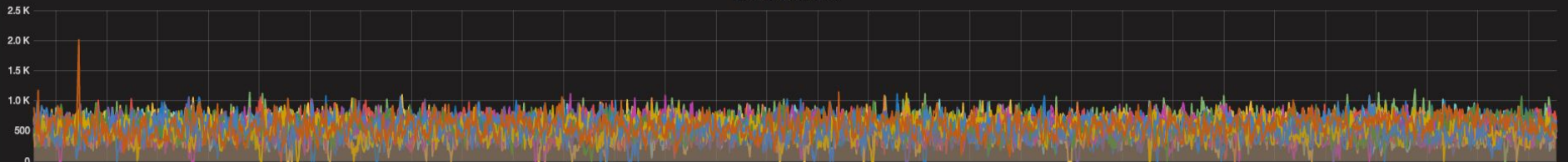
⌚ Last 3 seconds



Write request rate



Read request rate



Log Data Stream

Log data stream

- Metrics are indicator that something happened and logs provide context (what happened)
- Log monitoring on single machine requires skill and knowledge
- Same challenges as with metrics (not too much, not too little)

Distributed system -> many terminals open -> information overload trap



```
INFO [Service Thread] 2016-10-05 14:43:33,120 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:33,120 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:33,121 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:33,121 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
mapping-bb48b7a1f71f11e5b9f619193cfdec00/rts-external_m
apping-ka-674950-Data.db'), SSTableReader(path='/mnt/ca
ssandra/data/rts/external_mapping-bb48b7a1f71f11e5b9f61
9193cfdec00/rts-external_mapping-ka-674951-Data.db'), S
STableReader(path='/mnt/cassandra/data/rts/external_map
ping-bb48b7a1f71f11e5b9f619193cfdec00/rts-external_map
ping-ka-674949-Data.db'), SSTableReader(path='/mnt/cassa
ndra/data/rts/external_mapping-bb48b7a1f71f11e5b9f61919
3cfdec00/rts-external_mapping-ka-674947-Data.db'), SSTa
bleReader(path='/mnt/cassandra/data/rts/external_mapin
g-bb48b7a1f71f11e5b9f619193cfdec00/rts-external_mapin
g-ka-674948-Data.db')] established
[]
```

```
INFO [Service Thread] 2016-10-05 14:43:38,349 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:38,349 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:38,349 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:38,349 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
FamilyStore.java:905 - Enqueuing flush of external_mapp
ing: 309360573 (14%) on-heap, 0 (0%) off-heap
INFO [MemtableFlushWriter:7136] 2016-10-05 14:43:44,60
5 Memtable.java:347 - Writing Memtable-external_mapin
g@173146819(41.318MiB serialized bytes, 1687652 ops, 14
%0% of on/off-heap limit)
INFO [MemtableFlushWriter:7136] 2016-10-05 14:43:47,65
3 Memtable.java:382 - Completed flushing /mnt/cassandr
a/data/rts/external_mapping-bb48b7a1f71f11e5b9f619193cf
dec00/rts-external_mapping-tmp-ka-703853-Data.db (62.45
5MiB) for commitlog position ReplayPosition(segmentId=1
475245326623, position=22311095)
```

```
INFO [Service Thread] 2016-10-05 14:43:29,215 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:29,215 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:29,215 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:29,215 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
INFO [Service Thread] 2016-10-05 14:43:45,723 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:45,723 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:45,723 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:45,724 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
INFO [Service Thread] 2016-10-05 14:43:40,542 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:40,542 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:40,542 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:40,542 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
INFO [Service Thread] 2016-10-05 14:43:37,953 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:37,953 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:37,953 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:37,953 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
INFO [Service Thread] 2016-10-05 14:43:38,682 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:38,682 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:38,682 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:38,683 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
INFO [Service Thread] 2016-10-05 14:43:41,583 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:41,583 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:41,583 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:41,583 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

```
ssandra/data/rts/external_mapping-bb48b7a1f71f11e5b9f61
9193cfdec00/rts-external_mapping-ka-703504-Data.db'), S
STableReader(path='/mnt/cassandra/data/rts/external_map
ping-bb48b7a1f71f11e5b9f619193cfdec00/rts-external_map
ping-ka-703506-Data.db'), SSTableReader(path='/mnt/cassa
ndra/data/rts/external_mapping-bb48b7a1f71f11e5b9f61919
3cfdec00/rts-external_mapping-ka-703507-Data.db'), SSTa
bleReader(path='/mnt/cassandra/data/rts/external_mapin
g-bb48b7a1f71f11e5b9f619193cfdec00/rts-external_mapin
g-ka-703501-Data.db'), SSTableReader(path='/mnt/cassandr
a/data/rts/external_mapping-bb48b7a1f71f11e5b9f619193cf
dec00/rts-external_mapping-ka-703499-Data.db')]
```

```
INFO [Service Thread] 2016-10-05 14:43:39,902 StatusL
ogger.java:115 - OpsCenter.settings
0,0
INFO [Service Thread] 2016-10-05 14:43:39,903 StatusL
ogger.java:115 - system_traces.sessions
0,0
INFO [Service Thread] 2016-10-05 14:43:39,903 StatusL
ogger.java:115 - system_traces.events
0,0
INFO [Service Thread] 2016-10-05 14:43:39,903 StatusL
ogger.java:115 - rts_stress.external_mapping
0,0
```

Log data stream - decision

- SaaS solutions vs self-managed solutions
- Paying solutions and free solutions
- Decision based on:

technical team skillset

level of control

security of your data



Log data stream - ELK stack

- ELK - ElasticSearch, LogStash, Kibana
- Filebeat is sending log messages from instances
- Logstash can filter, manipulate and transform messages
- ElasticSearch indexes log messages for easier searching
- Kibana is visualization tool with filtering capabilities



← Search field to query elasticsearch

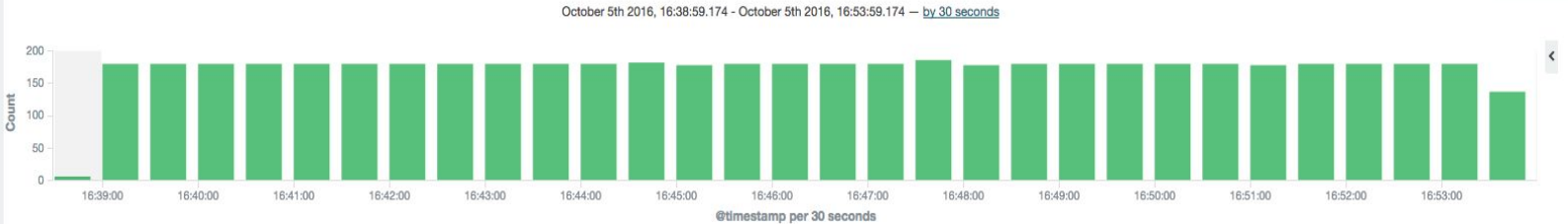
filebeat*

Selected Fields

- ? _source

Available Fields

- @timestamp
- _id
- _index
- #_score
- _type
- beat.hostname
- beat.name
- # count
- ? fields
- input_type
- message
- # offset
- source
- type



Time	_source
October 5th 2016, 16:53:53.106	<pre>@timestamp: October 5th 2016, 16:53:53.106 beat.hostname: ip-172-31-23-27 beat.name: ip-172-31-23-27 count: 1 fields: - input_type: log message: INFO [request-rate-module] 2016-10-05 14:53:52,163 LogReporter.java:35 - Measurement REQUESTRATE_UPDATE [time=1475679232163, value=0.0, tags={}, fields={}] offset: 1,944,813 source: /var/log/cassandra/system.log type: log _id: AVeWViUY05gEzeSC86Ld _type: log _index: filebeat-2016.10.05 _score:</pre>
October 5th 2016, 16:53:53.029	<pre>@timestamp: October 5th 2016, 16:53:53.029 beat.hostname: ip-172-31-23-25 beat.name: ip-172-31-23-25 count: 1 fields: - input_type: log message: INFO [request-rate-module] 2016-10-05 14:53:53,011 LogReporter.java:35 - Measurement REQUESTRATE_UPDATE [time=1475679233011, value=0.0, tags={}, fields={}] offset: 1,949,781 source: /var/log/cassandra/system.log type: log _id: AVeWiWS05gEzeSC86Lt _type: log _index: filebeat-2016.10.05 _score:</pre>
October 5th 2016, 16:53:52.105	<pre>@timestamp: October 5th 2016, 16:53:52.105 beat.hostname: ip-172-31-23-27 beat.name: ip-172-31-23-27 count: 1 fields: - input_type: log message: INFO [request-rate-module] 2016-10-05 14:53:51,163 LogReporter.java:35 - Measurement REQUESTRATE_UPDATE [time=1475679231163, value=0.0, tags={}, fields={}] offset: 1,944,499 source: /var/log/cassandra/system.log type: log _id: AVeWViUY05gEzeSC86Lb _type: log _index: filebeat-2016.10.05 _score:</pre>
October 5th 2016, 16:53:52.105	<pre>@timestamp: October 5th 2016, 16:53:52.105 beat.hostname: ip-172-31-23-27 beat.name: ip-172-31-23-27 count: 1 fields: - input_type: log message: INFO [request-rate-module] 2016-10-05 14:53:51,164 LogReporter.java:35 - Measurement REQUESTRATE_SELECT [time=1475679231163, value=0.0, tags={}, fields={}] offset: 1,944,656 source: /var/log/cassandra/system.log type: log _id: AVeWViUY05gEzeSC86Lc _type: log _index: filebeat-2016.10.05 _score:</pre>
October 5th 2016, 16:53:52.028	<pre>@timestamp: October 5th 2016, 16:53:52.028 beat.hostname: ip-172-31-23-25 beat.name: ip-172-31-23-25 count: 1 fields: - input_type: log message: INFO [request-rate-module] 2016-10-05 14:53:52,012 LogReporter.java:35 - Measurement REQUESTRATE_SELECT [time=1475679232011, value=0.0, tags={}, fields={}] offset: 1,949,624 source: /var/log/cassandra/system.log type: log _id: AVeWiWS05gEzeSC86Ls _type: log _index: filebeat-2016.10.05 _score:</pre>
October 5th 2016, 16:53:52.028	<pre>@timestamp: October 5th 2016, 16:53:52.028 beat.hostname: ip-172-31-23-25 beat.name: ip-172-31-23-25 count: 1 fields: - input_type: log message: INFO [request-rate-module] 2016-10-05 14:53:52,011 LogReporter.java:35 - Measurement REQUESTRATE_UPDATE [time=1475679232011, value=0.0, tags={}, fields={}] offset: 1,949,467 source: /var/log/cassandra/system.log type: log _id: AVeWiWS05gEzeSC86Lr _type: log _index: filebeat-2016.10.05 _score:</pre>

Messages from all hosts

Filtering messages based on indexed fields

This visualization is linked to a saved search: **Application Errors (staging)**



filebeat*

Data Options ▶ ✕

metrics

Y-Axis ▶ Count

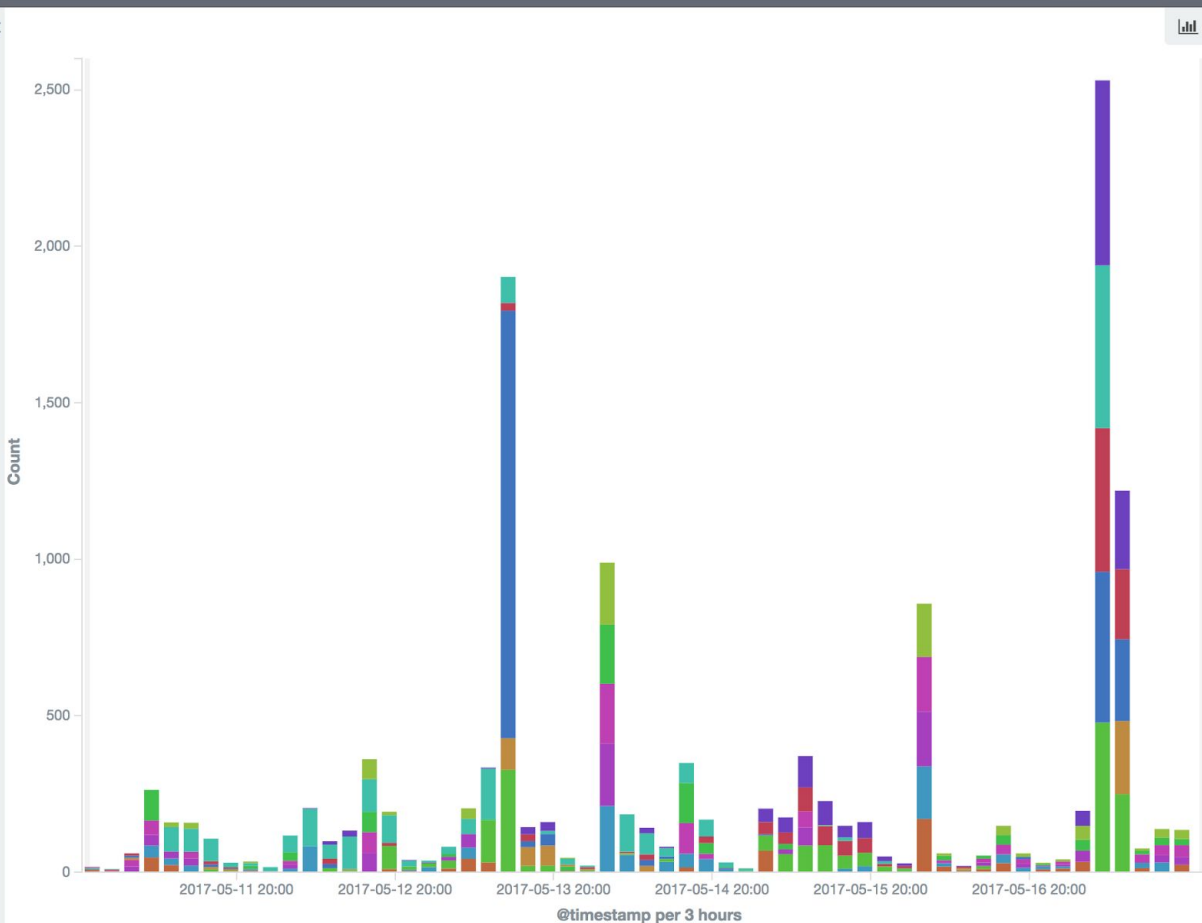
+ Add metrics

buckets

X-Axis @timestamp per 3 hours ▲ ▼ ✕

Split Bars beat.name: Descending ▲ ▼ ✕

⌵ Add sub-buckets



Application Errors (staging)

- staging-match-a-1.au...
- staging-match-a-2.au...
- staging-match-a-1.au...
- staging-match-a-1.au...
- staging-match-b-2.au...
- staging-match-b-1.au...
- staging-match-a-2.au...
- staging-match-a-3.au...
- staging-match-b-1.au...
- staging-match-b-2.au...
- staging-match-a-2.au...
- staging-match-b-3.au...

Combine logs and
metrics

Real world example

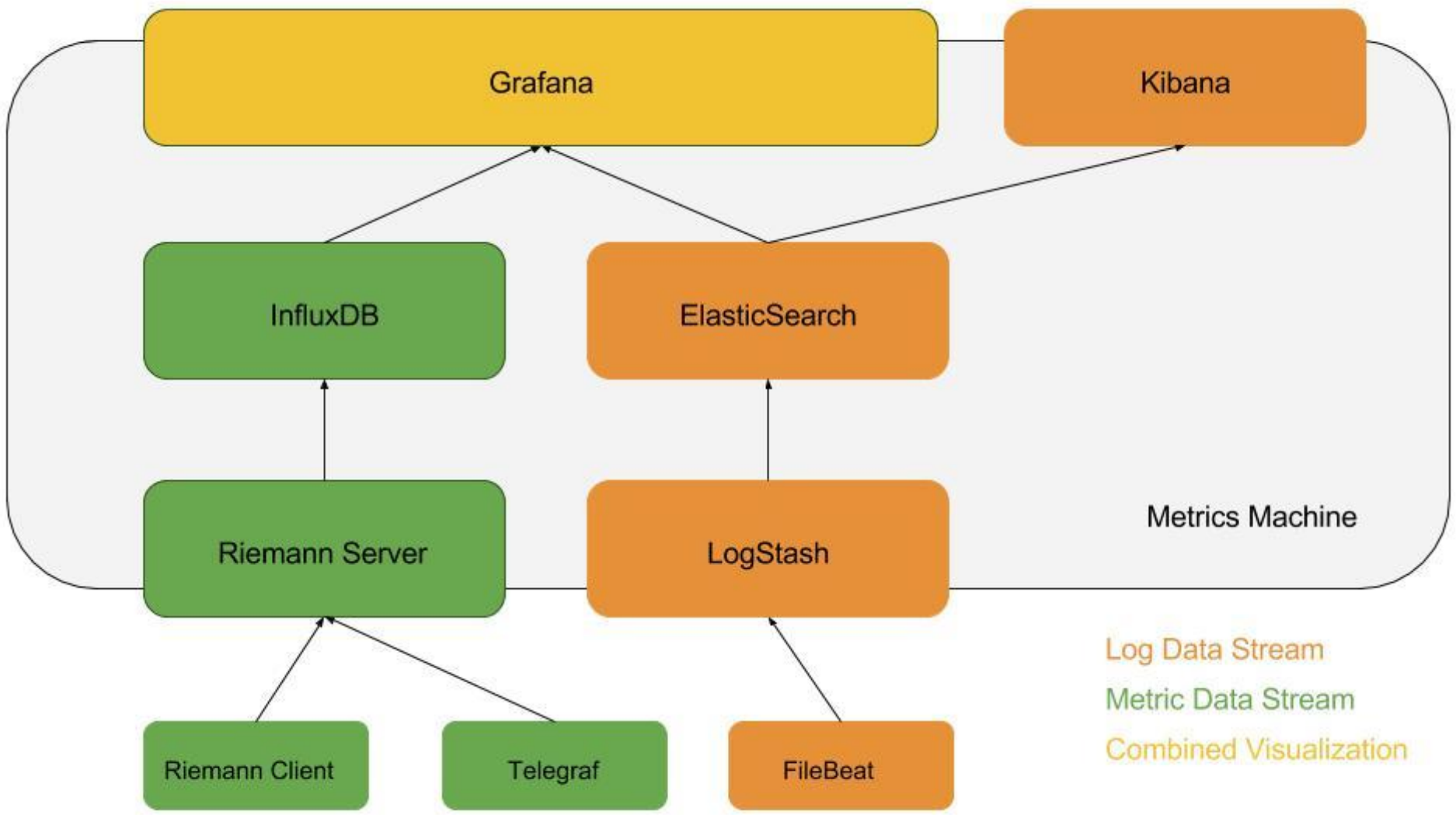
- Provide reliable latency guarantee for 99.999% request
- Whole infrastructure deployed on AWS
- Lot of metrics transferred to metrics machine
- We needed fine grained diagnostics for queries to database both on cluster and application level among other things



Combine logs and metrics

- It is much easier to look at graphs than logs
- Good metric coverage can pinpoint exact cause of problems
- Usually we need log messages to bring the context
- Grafana can combine InfluxDB (measurement data store) and ElasticSearch (log index)

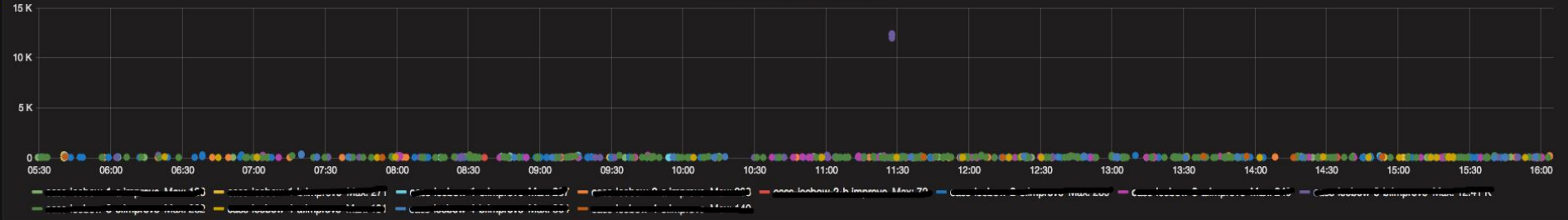






apptime: All cassandrahost: All

Slow queries (external_mapping)



Dropped message count



Dropped messages

beat.hostname	message
cassandrahost-3	INFO [ScheduledTasks:1] 2016-10-04 09:28:00,091 MessagingService.java:929 - REQUEST_RESPONSE messages were dropped in last 5000 ms: 8 for internal timeout and 0 for cross node timeout
cassandrahost-3	INFO [ScheduledTasks:1] 2016-10-04 09:28:00,091 MessagingService.java:929 - MUTATION messages were dropped in last 5000 ms: 27347 for internal timeout and 0 for cross node timeout
cassandrahost-3	WARN [SharedPool-Worker-129] 2016-10-04 09:27:58,581 AbstractEventProcessor.java:76 - Event queue overflow. Until relaxed, further events will be dropped.
cassandrahost-3	WARN [SharedPool-Worker-54] 2016-10-04 09:27:58,546 AbstractEventProcessor.java:76 - Event queue overflow. Until relaxed, further events will be dropped.
cassandrahost-3	INFO [ScheduledTasks:1] 2016-10-04 09:28:00,091 MessagingService.java:929 - READ messages were dropped in last 5000 ms: 1374 for internal timeout and 0 for cross node timeout

Retry count



Alerting



Alerting

- Alerting is giving you freedom not to look at graphs
- Someone else placed domain knowledge about alerts
- Alerting must not be frequent since you will end up ignoring alerts

Distributed system -> many alerts -> information overload trap



Grafana
The ~~Boy~~ Who
Cried Wolf

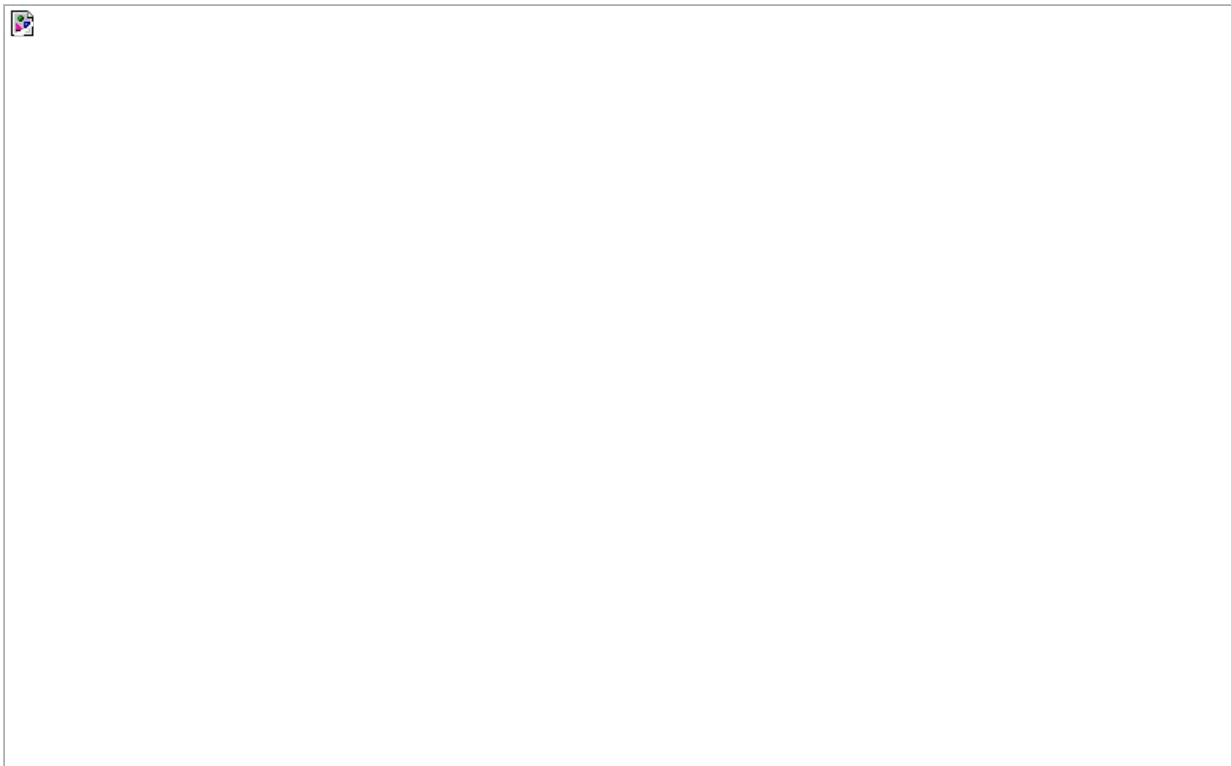


Sentinel - SMART Alerting

- Alerts are build by humans, we make false assumptions
- Correlation between features in most alerting system is not supported
- Why not let the machine find anomalies
- Have snapshot of the system at moment something happened
- Have diagnostic messages with cause of error



Sentinel - SMART Alerting



Sentinel - SMART Alerting

ALERT - Anomaly detected Inbox x



11:37 AM (2 minutes ago) ☆



Time: 2016-10-21 11:07:00

Snapshot of the system:

```
avg(mem_used_percent) -> 11.481133733107036
avg(diskio_writes) -> 90474.97142857143
avg(cpu_usage_user) -> 19.8143671812
avg(diskio_read_time) -> 95.44593425605537
time_slot -> 1477040820
avg(diskio_read_bytes) -> 0.6123595505617978
avg(diskio_write_bytes) -> 10965.333333333334
avg(queryReport_value) -> 84200.27777777778
avg(diskio_write_time) -> 3.842264177777778E8
avg(requestRate_select_value) -> 22.01406040986498
avg(cpu_usage_system) -> 12041.555555555555
avg(requestRate_update_value) -> 54.957909850772374
avg(cpu_usage_idle) -> 3862055.6470588236
avg(diskio_reads) -> 0.17503878265256603
avg(disk_used_percent) -> 8.538556188444445E9
avg(cpu_usage_steal) -> 62.93553057481667
avg(diskio_io_time) -> 212.26966292134833
avg(cpu_usage_iowait) -> 6.056117222060926
```

Further Investigation:

Disk I/O write time value was high, please check [Cluster Disk Stats](#).



Conclusion

Takeaways

- Have right amount of information, not too much, not too little
- Having good selection of metrics and logs is iterative process
- Do not end up fixing monitoring machine instead of fixing application code
- Be proactive, not reactive
- Tailor metrics by your needs, build tools if there are not any that suite your use case



Links

- [Monitoring stack for distributed systems](#) - SmartCat blog post
- [Distributed logging](#) - SmartCat blog post
- [Metrics collection stack for distributed systems](#) - SmartCat blog post
- [Monitoring machine ansible project \(Riemann, Influx, Grafana, ELK\)](#) -
SmartCat github project

Q&A

SmartCat.io

Thank you

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