



Metric Indexes

Architecture and Usage

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Agenda

- ▶ Why are metrics special?
- ▶ Metric data model
- ▶ Using metrics
 - Ingest
 - Manage
 - Query
- ▶ Counters
- ▶ Performance

Why Metric Indexes?

Metrics Data Fundamentally **Different** From Log Data

- High Volume
 - Low Latency
 - Structured
 - Data Emitted At Consistent Interval
- Constrained Query Interface
 - Higher Tolerance for Loss/Approximations

The Splunk Metric Store presents a **constrained query** interface and leverages the **structured** nature of metrics data to meet **higher volume** and **lower latency** demands

Metrics As Logs

```
09-27-2018 10:55:32.618 INFO Metrics - group=pipeline, name=parsing, processor=utf8,
cpu_seconds=0.012845, executes=66, cumulative_hits=301958
```

► Metrics often found in log form

- Splunk event indexes could handle these naturally (e.g. metrics.log in index=_internal)
- Could even render metrics as logs to store in Splunk

► Weakness in Approach

- Analytics over textual events relatively slow (~50K events/node/sec)
- Leveraging indexed fields & tstats is significantly better, but not optimal
 - Storing metric **values** in keyword lexicon is inefficient and unnecessary
 - Values for a single metric series should be co-located whenever possible

130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=GIFTS&SESSIONID=5D1SLAFF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-SW-01" "Opera/9.80 (Win
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&SESSIONID=5D5SL7FF6ADFF9 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product_id=K9-CW-01" "Comodo11.1.1 (Win
ows NT 5.1; SV1; .NET CLR 1.1.4322)" "GET /product.screen?product_id=FL-DSH-01&SESSIONID=5D5SL7FF6ADFF9 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product_id=AV-CB-01&SESSIONID=5D18SL8FF2ADFF9" "Opera/9.80 (Win
itemId=EST-16&product_id=RP-LI-02)" 468 125.17 14.189 "GET /cart.do?action=remove&itemId=EST-6&product_id=FI-SW-01" "Opera/9.80 (Win
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Metrics Data Model

Metric Data Point

- The atomic event representing a **single** measurement in time

Dimensions (key=value<string>)

- Key/Value pairs associated with a particular metric data point
- Aside from metric_name, these are **Optional**
- Examples: app=Solitaire, host=linux-1, datacenter=west

Metric Name (metric_name=<string>)

- Required** dimension for all metric data points.
- Examples: cpu.idle, io.util, temp, page_hits

Measurement (_value=<number>)

- Required** numerical field for all metric data points, stored as 64 bit float

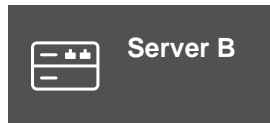
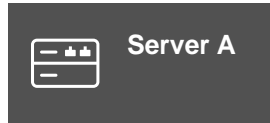
Timestamp (_time=<number>)

- Required** time field for all metric data points, stored as 32 bit integer

Metric Time Series

- A series of metric data points over time with the same metric_name and exact same dimension key/value pairs

Metric Time Series Examples

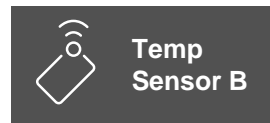
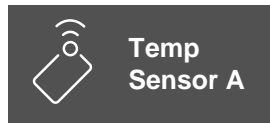


Dimensions				
metric_name	host	app	_time	_value
cpu.idle	A	foo	1	4.2
mem.free	B	bar	2	7.3
cpu.idle	A	foo	3	8.4
mem.free	A	baz	4	32

Different Colors Represent Distinct **Metric Time Series**. Each Row is a Single **Metric Data Point**, made up of a timestamp, measurement and a set of required and optional dimensions

Both of these data points belong to the same **Metric Time Series** because they share the exact same set of required and optional dimension key/value pairs:

metric_name=cpu.idle
host=A
app=foo



Dimensions				
metric_name	host	room	_time	_value
temperature	A	Tupac	1	4.2
temperature	B	Biggy	2	7.3
temperature	A	Joplin	3	8.4
temperature	B	Tupac	4	32

Note that different Metric Time Series may have a completely separate set of **Optional Dimensions**. For example, the time series from temperature sensors have a “room” dimension. The ones from servers above have a “app” dimension.

Numerous Ways of getting Metrics Into System

Logs to Metrics at Search Time

`mcollect` & `meventcollect`

- ▶ Re-ingest already indexed log events into metrics index (Splunk 7.1+)
 - Similar to summary indexing using `collect`
 - No additional license cost
- ▶ Best practice: using `meventcollect` for simple events search, use `mcollect` turning report output to metrics (e.g. stats, timechart)

<code>mcollect</code>	<code>meventcollect</code>
Use in any search	Only after distributable commands (e.g. search, where, eval)
Runs on Search Head	Runs on indexers
Store on SH or forward to indexers	Store on indexers

Logs to Metrics at Search Time (Cont.)

```
mcollect/meventcollect index=<string> [split=<bool>] [prefix_field=<string>]
[<field-list>]
```

► Single metric per event/row (split=false)

- Requires `metric_name` and `_value` fields. Other fields treated as dimensions (or explicitly specified in `<field-list>`)
- `sourcetype=foo | stats count as _value by user city | eval metric_name="foo.count" | mcollect index=my_metrics split=false user city`

► Multiple metrics per event/row (split=true)

- Must specify list of dimension fields. All other numerical fields treated as **metric values** (a metric data point is emitted for each one)
- `index=_internal source=*/metrics.log | eval prefix = group + "." | meventcollect index=my_metrics split=true prefix_field=prefix name processor`

```
09-27-2018 10:55:32.618 INFO Metrics - group=pipeline, name=parsing,
processor=utf8, cpu_seconds=0.012845, executes=66, cumulative_hits=301958
```

Metrics Data Management

Metrics Indexes

- ▶ Metric indexes very similar to event indexes
 - Data written to hot buckets. Buckets rolled to warm, cold, frozen, etc.
 - Internal storage format similar to event indexes (.tsidx)
- ▶ Most data management features for log indexes are supported for metrics
 - Replication, retention policy, access controls, remote storage, etc.
 - Exception: metrics does not support deleting individual data points.

New Index X

General Settings

Index Name

Set index name (e.g., INDEX_NAME). Search using index=INDEX_NAME.

Index Data Type

Events

Metrics

The type of data to store (event-based or metrics).



indexes.conf

[metrics_index]

this is a metrics index

datatype = metric

paths/other index params ...

The mstats command

- ```
| mstats <projections over _value>
 WHERE metric_name=<string> [<dimension filter predicates>|<index specification>]
 BY [<group-by dimensions>] []
```

**WHERE** index=metrics metric\_name=cpu.idle host=splunk-\*.com

Ex: `mstats sum( value)`

**WHERE** index=metrics metric name=cpu.idle host=splunk-\*.com **span**=1h

# Querying Metrics

## The mstats command – enhanced syntax

- Specifying multiple metrics awkward in original syntax

```
|mstats avg(_value) max(_value) WHERE index=metrics metric_name=cpu.idle OR
metric_name=mem.usage BY datacenter metric_name
```

- Format of output is also awkward and likely needs further eval/where/stats commands to format properly.

- Enhanced mstats syntax (7.1+)

- Allow for easier specification of multiple metrics.

```
|mstats <projections over metric_name>
 WHERE [<dimension filter predicates>|<index specification>]
 BY [<group-by dimensions>] []
```

Ex: |mstats avg(cpu.idle) max(mem.usage)

```
 WHERE index=metrics
```

```
 BY datacenter
```

- Use metric\_name instead of \_value.
- No metric\_name allowed in the WHERE expression

- Original syntax better when you need to treat different metric\_names as a single metric

- | mstats avg(\_value) WHERE metric\_name="cpu.util" OR metric\_name="cpu.utilization" ...

| datacenter | metric_name | avg(_value) | max(_value) |
|------------|-------------|-------------|-------------|
| east       | cpu.idle    | 70          |             |
| east       | mem.usage   |             | 25          |
| west       | cpu.idle    | 90          |             |
| west       | mem.usage   |             | 40          |



| datacenter | avg(cpu.idle) | max(mem.usage) |
|------------|---------------|----------------|
| east       | 70            | 25             |
| west       | 90            | 40             |

130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category\_id=GIFTS&SESSIONID=5D1SLAFF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-SW-03" "Opera/9.20 (Win  
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# Querying Metrics Catalog

## The mcatalog command

- ▶ Constrained query language similar to tstats
  - Can ONLY list metrics catalog information, e.g. metric names, dimensions
  - convenient internal field: `_dims`
  - Cannot project, filter or group by `_value` field, only dimensions

| **mcatalog** values(metric\_name|\_dims|\_catalog|<dimension>)

**WHERE** [metric\_name=<string>] [<dimension filter predicates>|<index specification>]

**BY** [<group-by dimensions>]

Ex: | **mcatalog** values(\_dims) **WHERE** index=metrics **BY** metric\_name

Ex: | **mcatalog** values(metric\_name) **WHERE** index=metrics

Ex: | **mcatalog** values(region) **WHERE** index=metrics **BY** metric\_name

130.60.4 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&SESSIONID=5D1SLAFF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-SW-01" "Opera/9.80 (Win  
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itemId=EST-16&product\_id=RP-LI-02" 468 125.17 14.189 [07/Jun 18:10:57:123] "GET /category.screen?category\_id=GIFTS&SESSIONID=5D1SLAFF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-SW-01" "Opera/9.80 (Win  
://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product\_id=K9-CW-01" "Compaq i486 Win  
pping.com/purchase&itemId=EST-26&product\_id=K9-CW-01" "Compaq i486 Win

## The metrics catalog endpoint

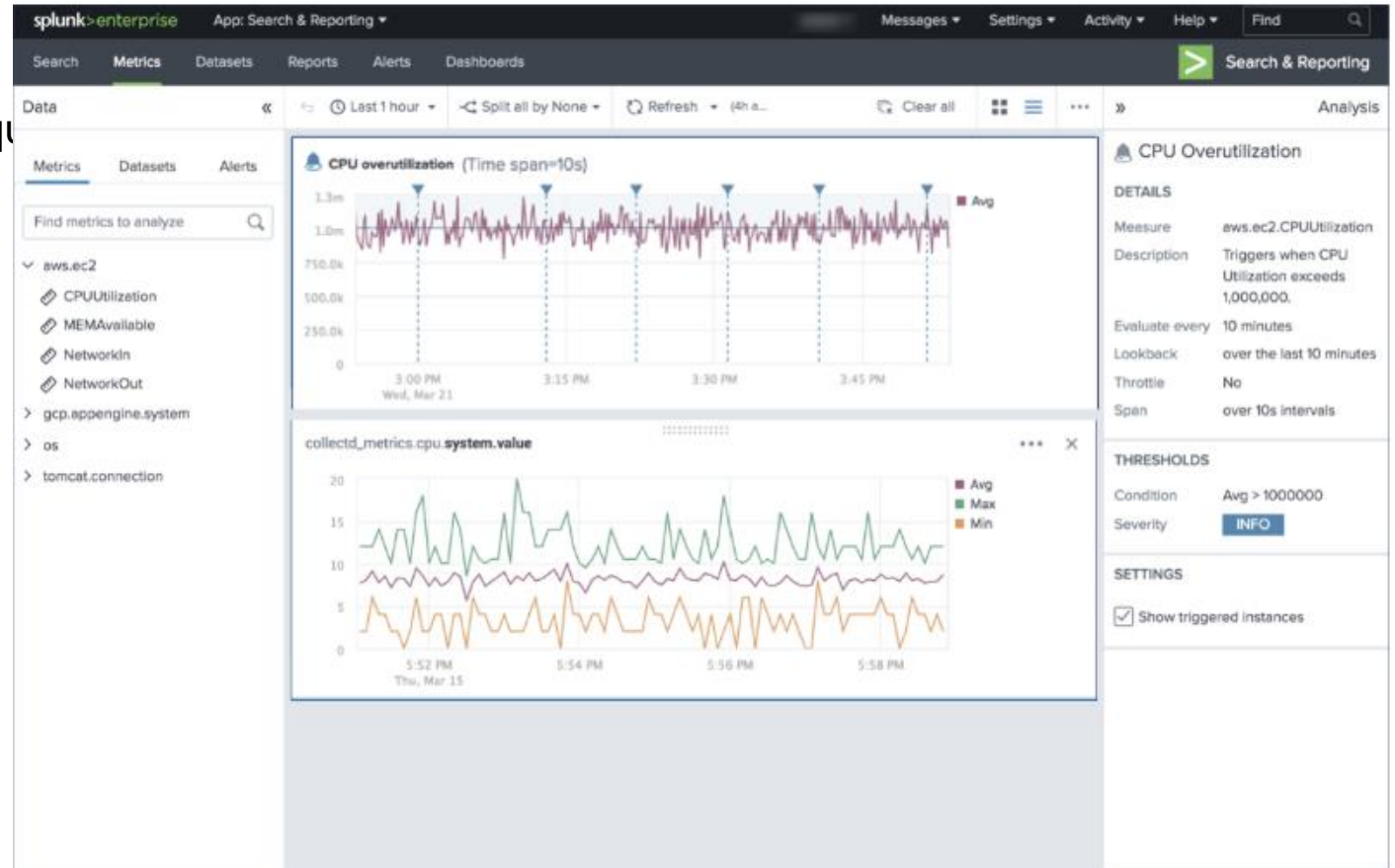
- List metric names: </services/catalog/metricstore/metrics>
- List dimension names: </services/catalog/metricstore/dimensions>
- List dimension values: </services/catalog/metricstore/dimensions/{dimension-name}/values>
- Filter results by index, dimension and dimension values (including wildcard):
  - </services/catalog/metricstore/metrics?filter=index=metrics&filter=dc>
  - </services/catalog/metricstore/metrics?filter=index=metrics&filter=dc=east>
  - </services/catalog/metricstore/dimensions?filter=index=metrics>
  - [/services/catalog/metricstore/dimensions?filter=index=metrics&filter=dc\\*](/services/catalog/metricstore/dimensions?filter=index=metrics&filter=dc*)

# Querying Metrics and Catalog

## The Analysis Workspace

### ► Try the Analysis Workspace!

- Full featured GUI. No SPL knowledge required
- Allows for
  - drilldown
  - open in search
  - create dashboard
  - Others: alters, export etc.
- <https://splunkbase.splunk.com/app/3976/>

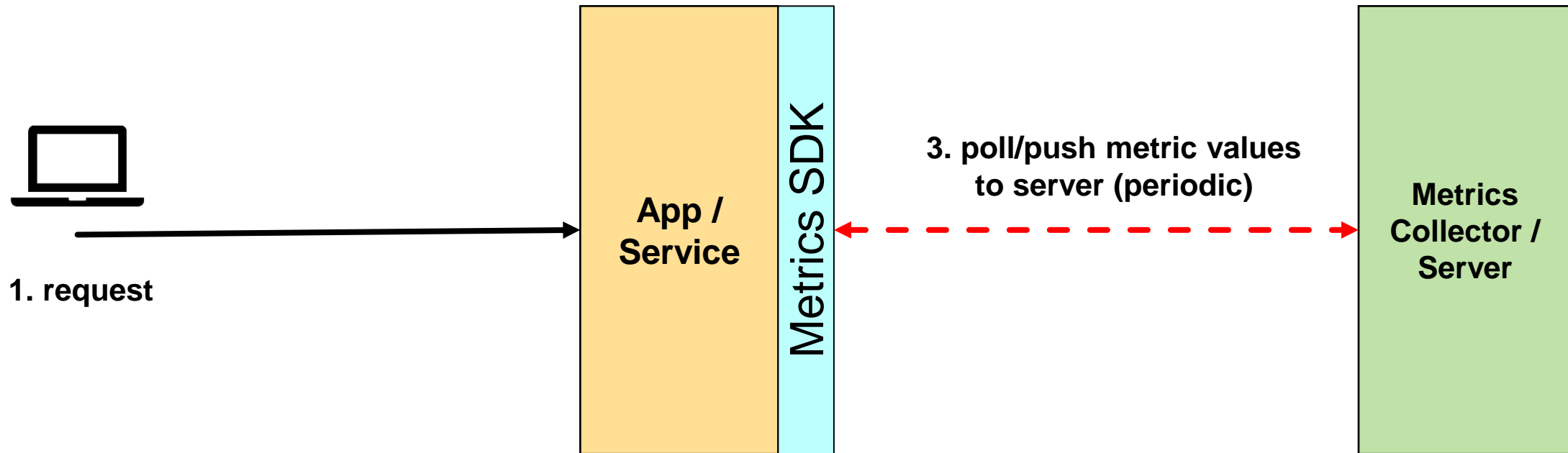


# Compare and Contrast stats Family Commands

|                       | Historical Search | Realtime Search | Metric Index | Event Index | Aggregate on Dimensions / Index-time Fields | Aggregate on Search-time Fields | Aggregate on metric values (_value) |
|-----------------------|-------------------|-----------------|--------------|-------------|---------------------------------------------|---------------------------------|-------------------------------------|
| <b>mstats</b>         | X                 | X               | X            |             |                                             |                                 | X                                   |
| <b>mcatalog</b>       | X                 |                 | X            |             | X                                           |                                 |                                     |
| <b>tstats</b>         | X                 |                 |              | X           | X                                           |                                 |                                     |
| <b>search + stats</b> | X                 | X               |              | X           | X                                           | X                               |                                     |

- mstats aggregate on metric values, mcatalog search for metadata
- real-time mstats much more efficient than real-time event search + stats
- tstats on index time fields only. search+stats on index time fields still slow due to reading raw data.

# Counters



**2. Invoke client api, e.g.**  
increment(<counter name>)



# Counters

To reset or not to reset?

| Periodic Counters                                                           | Accumulating Counters                                                           |
|-----------------------------------------------------------------------------|---------------------------------------------------------------------------------|
| Counter value resets to 0 every time it is reported to server               | Counter value resets only when service is reset                                 |
| Counter value represents increments since last report                       | Needs at least 2 measurements to compare because only deltas are meaningful     |
| statsd, collectd <b>ABSOLUTE</b> , collectd <b>DERIVE</b> (storerates=true) | Prometheus, collectd <b>COUNTER</b> , collectd <b>DERIVE</b> (storerates=false) |



**Consistency is key! (between client/server/query)**

# Counters

## How to query

- ▶ Gauge values (e.g. current temperature)
  - `min()`, `max()`, `avg()`, `perc()`
- ▶ Periodic counters
  - `sum()`
- ▶ Accumulating counters
  - `rate()` **new** for Splunk 7.2: similar to `rate()` in Prometheus, `derivative()` in Influxdb
  - Use `latest()` and `streamstats` before 7.2 or to customize treatment of resets, rollovers, or missing data

# Performance Characteristics

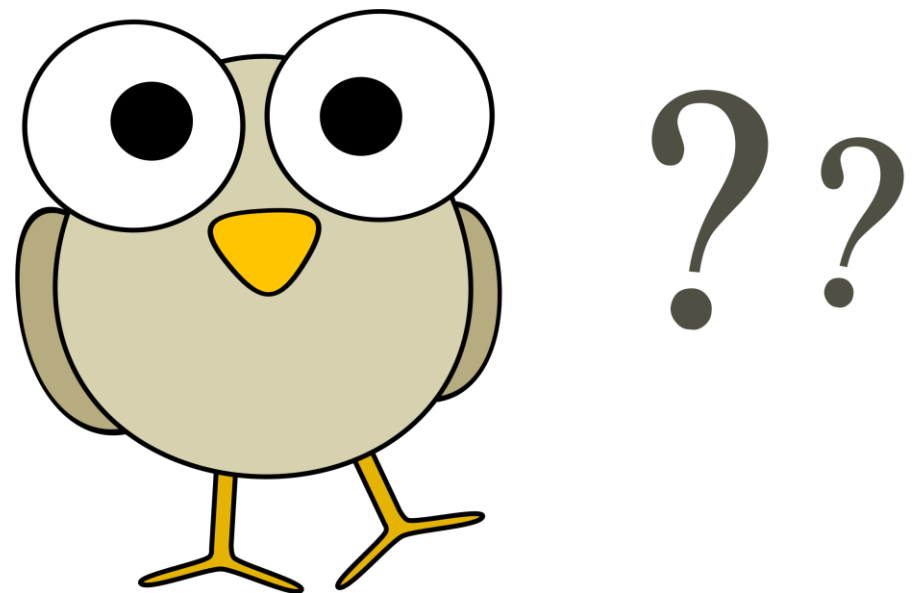
- ▶ Search Performance **significantly better** in 7.1+ (~5-6x for typical searches)
  - Better co-location of data points for a metric series.
- ▶ Indexing performance fairly **consistent** across workload characteristics
  - 100K EPS/node for average hardware (2x12 Xeon 2.3Ghz, 64GB RAM, 15K disks)
- ▶ Search performance highly **sensitive** to cardinality of metric series
  - Each metric series **shares** the metric\_name and exact set of dimension values
  - **Magic ratio** = # metric data points / # metric series (for each bucket)
  - Performance tends to **quickly degrade** when ratio is < 100 due to per metric series overhead.
- ▶ Tuning Parameters
  - Bucket size (larger is better for search)
  - Hashing on metric\_name (touch fewer buckets during searches over specific metrics. Tricky tradeoffs; not usually recommended.)

# Future Work

- ▶ Improve (accumulating) counter computation
  - rate() to account for rollover and resets
- ▶ Metric Rollups
  - Rollup metrics to longer time intervals (e.g. 1 hour, 1 day) for longer retention
  - Similar to summary indexing
- ▶ Add support for linked metrics
  - Optimize storage and querying for multiple metric values with the same set of dimension values



# Questions?



130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D1SLAFF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-SW-01"  
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317 27.160.0.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D5SL9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product\_id=FI-SW-01"  
item\_id=EST-16&product\_id=RP-LI-02" 468 125.17 14.11.189] "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D5SL8FF1ADFF6 HTTP 1.1" 200 2423 "http://buttercup-shopping.com/category.screen?category\_id=FLOWERS"  
do?action=purchase&itemId=EST-16&product\_id=RP-LI-02" 468 125.17 14.11.189] "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D5SL8FF1ADFF6 HTTP 1.1" 200 2423 "http://buttercup-shopping.com/category.screen?category\_id=FLOWERS"  
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# Thank You

Don't forget to **rate this session**  
in the **.conf18** mobile app

**.conf18**

**splunk>**