

# Detecting Numerical Outliers

## Advances

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Tuesday, September 26, 2017 | Washington, DC



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# \$ ./splunk whoami

---

Introductions



# Meet the Splunkers

Hi my name is...



@iman



Imakaremi\_splunk



imakaremi



@mattymo

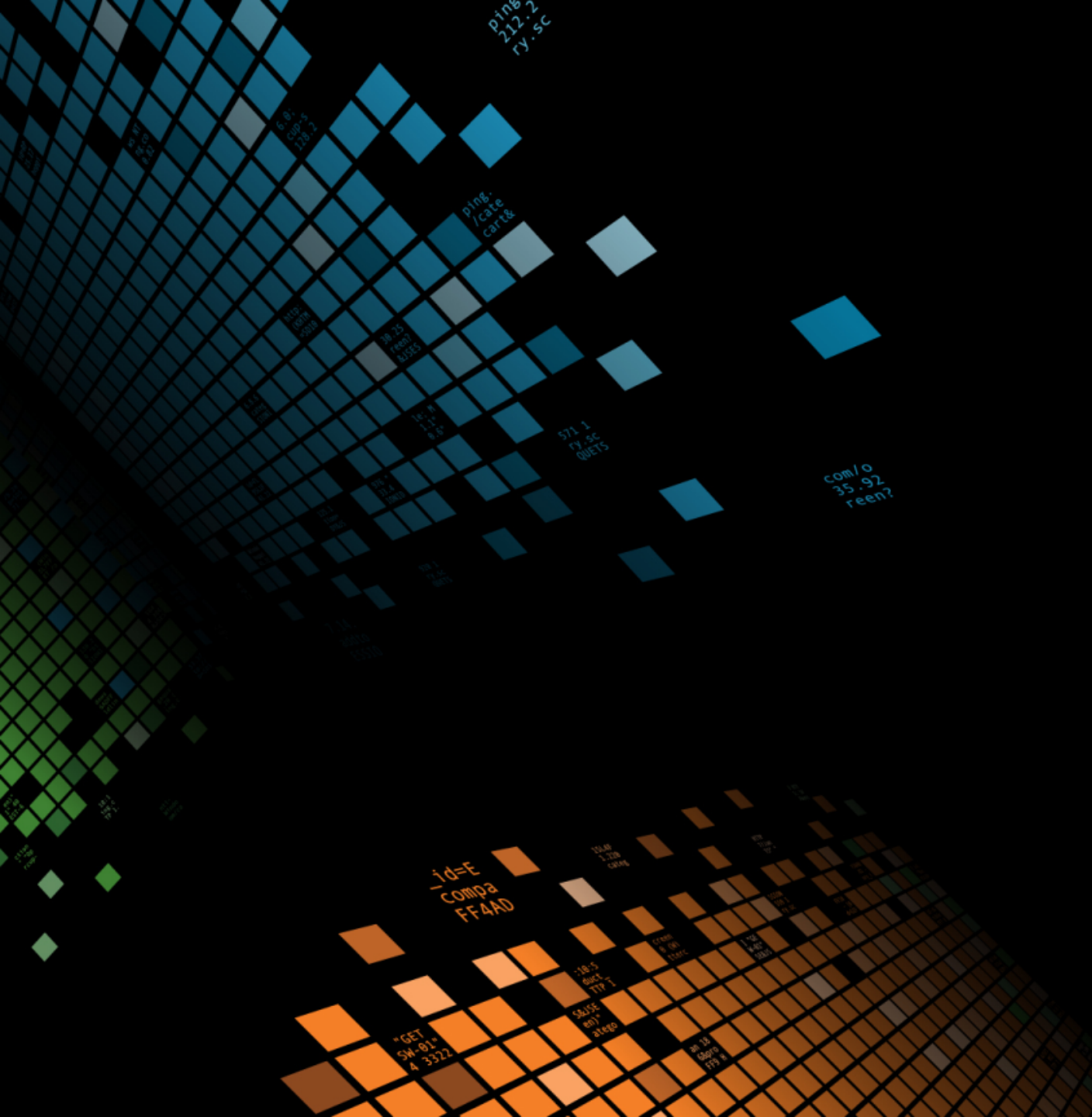


mmodestino\_splunk



matthewmodestino

130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15L9FF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=F1-SW-01"  
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product\_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 404 322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-268product\_id=K0-CW-01"  
317.27.160.0.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product\_id=AV-CB-01&JSESSIONID=5D15L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product\_id=K0-CW-01"  
10.0.0.1 - - [07/Jan 18:10:56:189] "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product\_id=K0-CW-01"  
10.0.0.1 - - [07/Jan 18:10:55:187] "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product\_id=K0-CW-01"  
10.0.0.1 - - [07/Jan 18:10:55:198] "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-18&product\_id=AV-CB-01"



# \$ ./splunk history

---

Year in review



# This time last year...

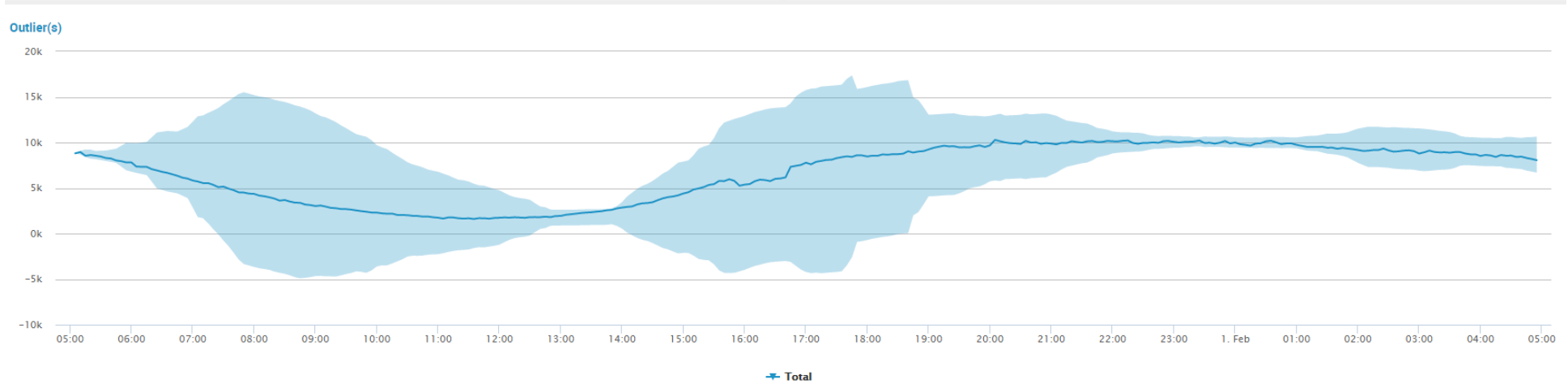
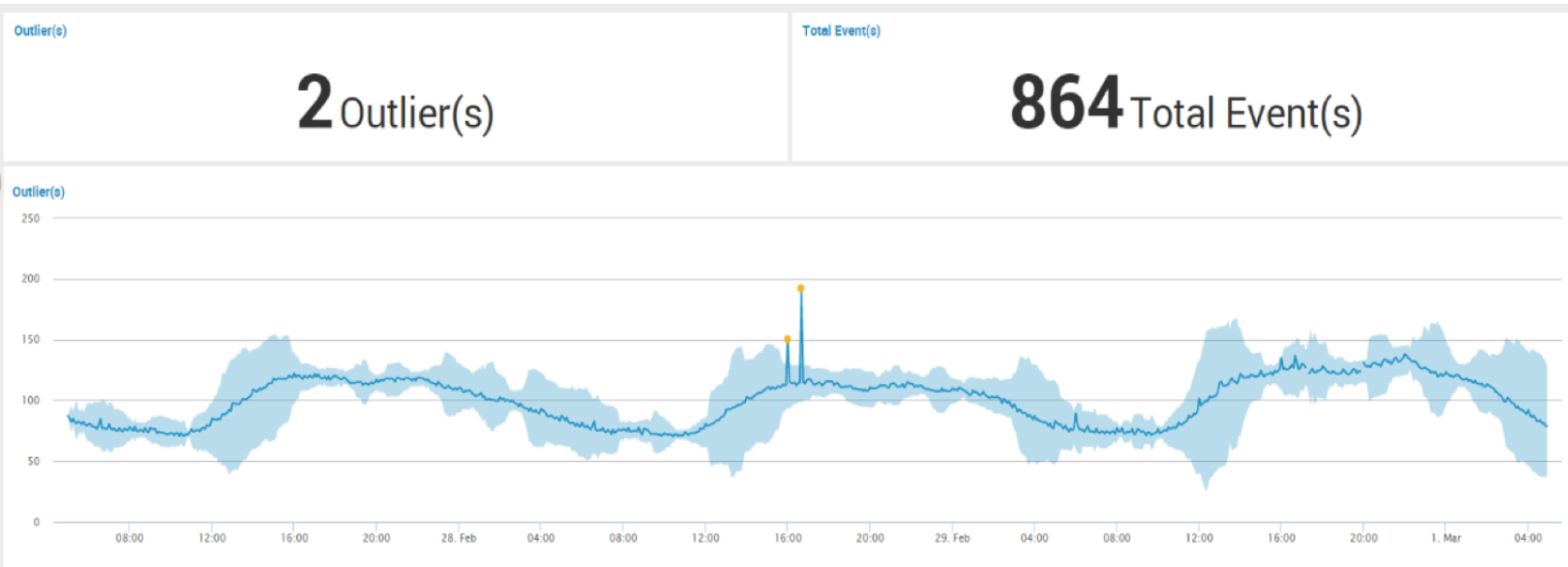
Sharing our experience using the MLTK to build smarter alarms!



Modelling Complex System's Behaviour  
Right Algorithm  
Custom Visualization  
Quick Validation  
Generating SPL





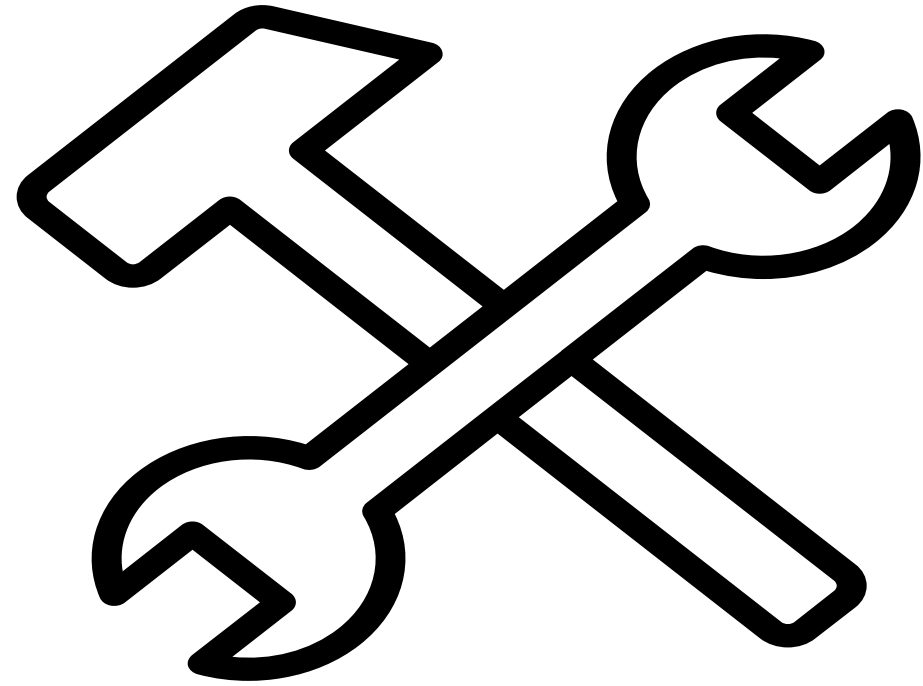


130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-SW-03"  
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product\_id=FL-DSH-01&JSESSIONID=5D55L7FF6ADF0 HTTP 1.1" 404 322 "http://shopping.com/cart.do?action=purchase&itemId=EST-268product\_id=KQ-CB-01"  
317.27.160.0.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D55L9FF1ADF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product\_id=AV-CB-01&JSESSIONID=5D55L7FF6ADF0 HTTP 1.1" 200 385 "http://shopping.com/cart.do?action=purchase&itemId=EST-268product\_id=KQ-CB-01"  
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# Share the Recipe!

How can I detect outliers in my data?



130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15L9FF1ADFF3 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-01"  
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product\_id=FL-DSH-01&JSESSIONID=5D55L7FF6ADFF0 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-268product\_id=KQ-CW-01"  
ows NT 27.160.0.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product\_id=AV-CB-01&JSESSIONID=5D55L7FF6ADFF0 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-18&product\_id=AV-CB-01"  
item\_id=EST-16&product\_id=RP-LI-02" 468 125.17 14.1.1.1 "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L7FF6ADFF0 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-18&product\_id=AV-CB-01"  
action=purchase&itemId=EST-26&product\_id=KQ-CW-01" 468 125.17 14.1.1.1 "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L7FF6ADFF0 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-18&product\_id=AV-CB-01"







# \$ ./splunk show dependencies

---

What do we need to get started?





# \$ ./splunk firstTimeRun

---

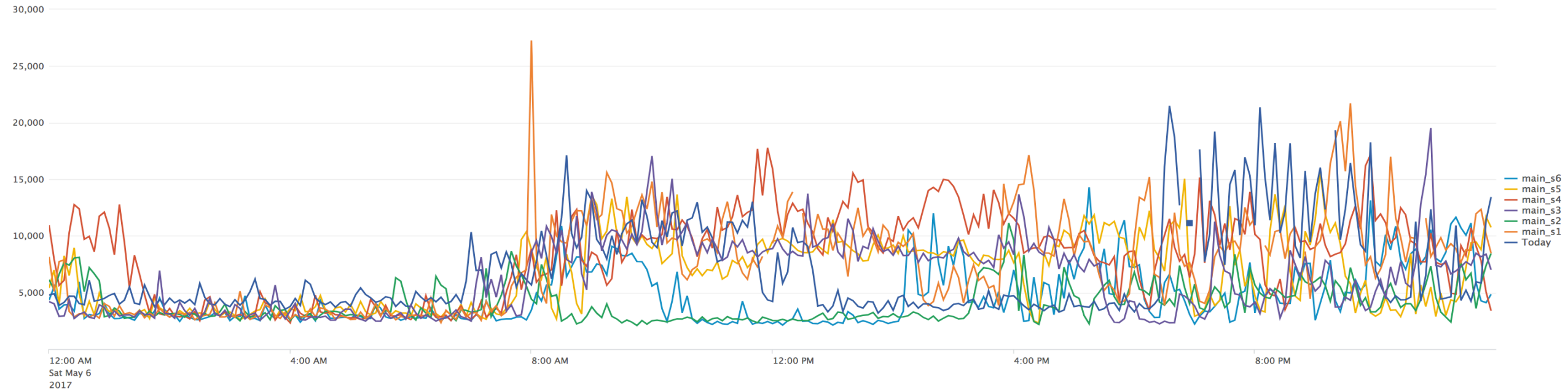
Timewrap and Median Absolute Deviation





# Timewrap

## Bending stats and time



```

| tstats prestats=t count WHERE index=main by _time span=300s
| timechart span=300s partial=f count
| timewrap d series=short
| rename s0 AS Today

```

```

130.60.4 - - [07/Jun 18:10:57:153] "GET /category.screen?category_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-SW-03"
128.241.220.82 - - [07/Jun 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product_id=KQ-CW-01"
317.27.160.0 - - [07/Jun 18:10:56:156] "GET /oldlink?item_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product_id=AV-CB-01&JSESSIONID=5D15LAF10ADFF10"
10.55.187.1 - - [07/Jun 18:10:55:187] "GET /category.screen?category_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"

```

# Deltas

Is today like the other days?

_time	s7	s6	s5	s4	s3	s2	s1	Today	d1	d2	d3	d4	d5	d6	d7
2017-09-24 13:05:00	2984	1040	432	401	1110	1916	873	653	-220	-1263	-457	252	221	-387	-2331
2017-09-24 13:10:00	3405	982	500	385	1304	1423	826	580	-246	-843	-724	195	80	-402	-2825
2017-09-24 13:15:00	1223	981	527	467	1195	1691	651	1273	622	-418	78	806	746	292	50
2017-09-24 13:20:00	1400	913	455	407	2382	2241	882	657	-225	-1584	-1725	250	202	-256	-743
2017-09-24 13:25:00	1528	890	400	400	3297	1489	1167	650	-517	-839	-2647	250	250	-240	-878
2017-09-24 13:30:00	1383	959	449	462	1501	11630	998	641	-357	-10989	-860	179	192	-318	-742
2017-09-24 13:35:00	1177	1381	424	446	1339	21142	706	786	80	-20356	-553	340	362	-595	-391
2017-09-24 13:40:00	1126	1136	494	441	1569	20692	521	1789	1268	-18903	220	1348	1295	653	663
2017-09-24 13:45:00	1073	1071	413	493	1434	20429	1249	971	-278	-19458	-463	478	558	-100	-102
2017-09-24 13:50:00	1016	1006	436	416	1363	19919	687	1144	457	-18775	-219	728	708	138	128
2017-09-24 13:55:00	1023	1053	474	397	1070	18442	749	1665	916	-16777	595	1268	1191	612	642
2017-09-24 14:00:00	1149	1165	420	459	1202	20347	739	2247	1508	-18100	1045	1788	1827	1082	1098
2017-09-24 14:05:00	974	1914	431	408	880	19217	746	2050	1304	-17167	1170	1642	1619	136	1076
2017-09-24 14:10:00	942	1723	486	480	571	20350	1116	1131	15	-19219	560	651	645	-592	189
2017-09-24 14:15:00	676	1661	466	465	700	20000	600	676	610	10650	100	605	600	1101	600

```

| tstats prestats=t count WHERE index=main by _time span=300s
| timechart span=300s partial=f count
| timewrap d series=short
| rename s0 AS Today
| foreach s*
  [ eval d<<MATCHSTR>> = Today - <<FIELD>>]

```

# Median Absolute Deviation

Calculate median and median absolute deviation

d1	d2	d3	d4	d5	d6	d7	isOutlier	medianAbsDev1	medianAbsDev2	medianAbsDev3	medianAbsDev4	medianAbsDev5	medianAbsDev6	medianAbsDev7	median_1	median_2	median_3	median_4	median_5	median_6	median_7
-153	-799	-661	631	642	105	-1551	0	0	0	0	0	0	0	0	-153	-799	-661	631	642	105	-1551
-220	-1263	-457	252	221	-387	-2331	0	17	116	51	95	106	123	195	-186	-1031	-559	442	432	-141	-1941
-246	-843	-724	195	80	-402	-2825	0	26	0	63	57	141	15	390	-220	-843	-661	252	221	-387	-2331
622	-418	78	806	746	292	50	0	30	116	82	124	176	130	442	-186	-821	-559	442	432	-141	-1941
-225	-1584	-1725	250	202	-256	-743	0	26	232	102	57	141	15	494	-220	-843	-661	252	221	-256	-1551
-517	-839	-2647	250	250	-240	-878	0	30	117	370	30	80	12	442	-222	-841	-692	251	236	-248	-1214
-357	-10989	-860	179	192	-318	-742	0	34	232	136	57	29	15	390	-225	-843	-724	250	221	-256	-878
80	-20356	-553	340	362	-595	-391	0	83	318	138	64	78	38	404	-222	-1053	-692	251	236	-287	-810
1268	-18903	220	1348	1295	653	663	0	132	403	139	71	126	62	419	-220	-1263	-661	252	250	-256	-743
-278	-19458	-463	478	558	-100	-102	0	94	572	142	80	134	105	456	-222	-1424	-607	296	306	-248	-742
457	-18775	-219	728	708	138	128	0	132	741	144	89	141	148	494	-220	-1584	-553	340	362	-240	-742
916	-16777	595	1268	1191	612	642	0	214	5444	239	136	176	197	567	-186	-6286	-508	409	460	-170	-566
1508	-18100	1045	1788	1827	1082	1098	0	298	7182	486	186	232	277	724	-70	-13883	-460	409	460	-170	-246
1304	-17167	1170	1642	1619	136	1076	0	490	7182	759	273	283	228	839	268	-16972	-341	603	633	18	-26
15	-19219	560	651	645	-592	189	0	490	7182	759	273	283	343	839	268	-17634	-70	690	676	18	89
-213	-19658	-120	205	208	-1191	-303	0	298	7182	756	270	299	343	724	48	-18438	-170	564	602	-170	13
-537	-19310	74	354	289	-296	-287	0	444	7182	482	284	330	343	530	48	-18839	-23	564	602	-170	13
-267	-18583	-651	533	552	-133	-22	0	450	7182	481	284	330	343	530	48	-18839	-23	592	602	-116	53
-874	-14512	-993	118	111	-410	-427	0	631	4272	629	374	370	343	560	48	-18839	-23	592	602	-116	53
900	18700	900	700	507	50	100	0	631	9001	620	374	370	343	560	150	18704	20	676	601	25	100

```

| streamstats window=12 median(d*) as median_*
| foreach median_*
  [ eval absDev<<MATCHSTR>> = abs(d<<MATCHSTR>> - <<FIELD>>)]
| streamstats window=12 median(absDev*) as medianAbsDev*
| eval isOutlier = 0

```



# Put it all together

Timechart, Timewrap, Foreach, Streamstats, Eval

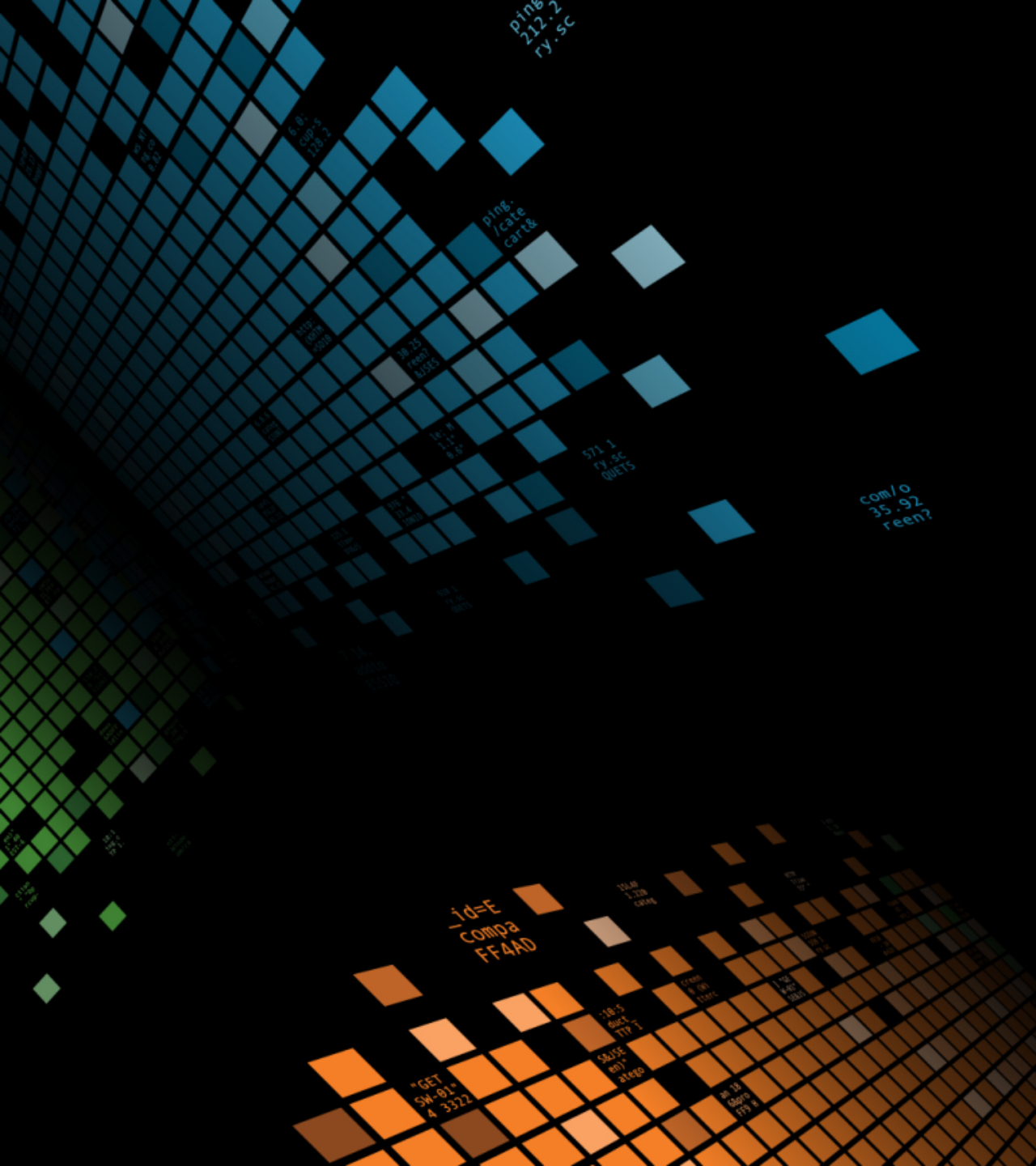
```

1 | tstats prestats=t count WHERE index=main by _time span=300s
2 | timechart span=300s partial=f count
3 | timewrap d series=short
4 | rename s0 AS Today
5 | foreach s*
6 |   [ eval d<<MATCHSTR>> = Today - <<FIELD>>]
7 | streamstats window=12 median(d*) as median_*
8 | foreach median_*
9 |   [ eval absDev<<MATCHSTR>> = abs(d<<MATCHSTR>> - <<FIELD>>)]
10 | streamstats window=12 median(absDev*) as medianAbsDev*
11 | eval isOutlier = 0
12 | foreach median_*
13 |   [ eval
14 |     lowerBound<<MATCHSTR>> = <<FIELD>> - medianAbsDev<<MATCHSTR>>*exact(5),
15 |     upperBound<<MATCHSTR>> = <<FIELD>> + medianAbsDev<<MATCHSTR>>*exact(5),
16 |     isOutlier<<MATCHSTR>> = if(d<<MATCHSTR>> < lowerBound<<MATCHSTR>> OR d<<MATCHSTR>> > upperBound<<MATCHSTR>>, 1, 0),
17 |     isOutlier = isOutlier + isOutlier<<MATCHSTR>>]
18 | eval isOutlier=if(isOutlier>3.5, 1, 0)
19 | fields _time Today isOutlier

```







# \$ ./splunk outliers redux

---

Streamstats all the way down!



# Streamstats

Streamstats-y way to do Timewrap, with the ability to split by!

_time	orig_sourcetype	totalEvents	d1	d2	d3	d4	d5	d6	d7
2017-09-26 00:45:00	stream:arp	20	30	32	30	30	32	32	32
2017-09-26 00:45:00	stream:dns	116	128	119	176	189	193	132	132
2017-09-26 00:45:00	stream:ip	173	174	162	287	323	243	190	190
2017-09-26 00:45:00	stream:tcp	53	51	47	142	163	65	47	47
2017-09-26 00:45:00	stream:udp	91	95	89	112	129	147	110	110
2017-09-26 00:40:00	stream:arp	22	30	30	32	30	30	30	30
2017-09-26 00:40:00	stream:dns	109	133	146	199	277	181	144	144
2017-09-26 00:40:00	stream:ip	172	189	181	322	454	200	197	197
2017-09-26 00:40:00	stream:tcp	52	55	49	175	218	53	55	55
2017-09-26 00:40:00	stream:udp	88	98	104	115	190	110	100	100
2017-09-26 00:35:00	stream:arp	30	32	30	30	32	30	30	30
2017-09-26 00:35:00	stream:dns	163	140	112	200	216	114	132	132
2017-09-26 00:35:00	stream:icmp	8	8	8	15	3	1	1	1
2017-09-26 00:35:00	stream:ip	177	199	164	336	418	170	196	196
2017-09-26 00:35:00	stream:tcp	42	71	43	174	227	55	59	59
2017-09-26 00:35:00	stream:udp	105	99	93	119	141	87	102	102
2017-09-26 00:30:00	stream:arp	30	30	30	30	30	30	30	30
2017-09-26 00:30:00	stream:dns	121	158	156	341	341	145	118	118
2017-09-26 00:30:00	stream:ip	168	175	181	648	446	175	174	174
2017-09-26 00:30:00	stream:tcp	41	57	54	431	276	32	54	54

```
index='meta_woot_read_summary' sourcetype=meta_woot orig_sourcetype!=stash orig_sourcetype=* orig_host=* orig_index=main
| stats sum(count) as totalEvents by _time orig_sourcetype
| streamstats time_window=1d first(totalEvents) as d1 by orig_sourcetype
| streamstats time_window=2d first(totalEvents) as d2 by orig_sourcetype
| streamstats time_window=3d first(totalEvents) as d3 by orig_sourcetype
| streamstats time_window=4d first(totalEvents) as d4 by orig_sourcetype
| streamstats time_window=5d first(totalEvents) as d5 by orig_sourcetype
| streamstats time_window=6d first(totalEvents) as d6 by orig_sourcetype
| streamstats time_window=7d first(totalEvents) as d7 by orig_sourcetype
```

# Deltas

e = deltas

_time	orig_sourcetype	totalEvents	d1	d2	d3	d4	d5	d6	d7	e1	e2	e3	e4	e5	e6	e7	median_1	median_2	median_3	median_4	median_5	median_6	median_7	
2017-09-26 00:50:00	stream:arp	20	30	30	30	30	30	30	30	-10	-10	-10	-10	-10	-10	-10	-10	-10	-10	-10	-10	-10	-10	-10
2017-09-26 00:50:00	stream:dns	131	146	117	375	241	121	156	156	-15	14	-244	-110	10	-25	-25	-15	-3	-90	-110	-72	-25	-25	
2017-09-26 00:50:00	stream:ip	164	199	159	517	355	163	191	191	-35	5	-353	-191	1	-27	-27	-17	5	-150	-191	-28	-25	-25	
2017-09-26 00:50:00	stream:tcp	38	62	36	267	174	45	45	45	-24	2	-229	-136	-7	-7	-7	-3	3	-123	-136	-7	-3	-3	
2017-09-26 00:50:00	stream:udp	94	106	92	207	139	90	109	109	-12	2	-113	-45	4	-15	-15	-10	2	-27	-45	-22	-15	-15	
2017-09-26 00:45:00	stream:arp	20	30	32	30	30	32	32	32	-10	-12	-10	-10	-12	-12	-12	-8	-8	-10	-8	-8	-8	-8	
2017-09-26 00:45:00	stream:dns	116	128	119	176	189	193	132	132	-12	-3	-60	-73	-77	-16	-16	-12	-3	-60	-73	-72	-16	-16	
2017-09-26 00:45:00	stream:ip	173	174	162	287	323	243	190	190	-1	11	-114	-150	-70	-17	-17	-17	11	-150	-241	-28	-19	-19	
2017-09-26 00:45:00	stream:tcp	53	51	47	142	163	65	47	47	2	6	-89	-110	-12	6	6	-3	3	-123	-166	-12	-3	-3	
2017-09-26 00:45:00	stream:udp	91	95	89	112	129	147	110	110	-4	2	-21	-38	-56	-19	-19	-4	2	-21	-38	-22	-12	-12	
2017-09-26 00:40:00	stream:arp	22	30	30	32	30	30	30	30	-8	-8	-10	-8	-8	-8	-8	-2	0	0	-2	0	0	0	
2017-09-26 00:40:00	stream:dns	109	133	146	199	277	181	144	144	-24	-37	-90	-168	-72	-35	-35	-24	-35	-90	-168	-24	3	3	
2017-09-26 00:40:00	stream:ip	172	189	181	322	454	200	197	197	-17	-9	-150	-282	-28	-25	-25	-17	-9	-159	-278	-7	-19	-19	
2017-09-26 00:40:00	stream:tcp	52	55	49	175	218	53	55	55	-3	3	-123	-166	-1	-3	-3	-16	-1	-132	-185	-1	-13	-13	
2017-09-26 00:40:00	stream:udp	88	98	104	115	190	110	100	100	-10	-16	-27	-102	-22	-12	-12	-3	-5	-27	-68	-10	3	3	

```
| foreach d*
| [ eval e<<MATCHSTR>> = totalEvents - <<FIELD>>]
| streamstats window=12 median(e*) as median_* by orig_sourcetype
```

130.60.4 - - [07/Jun 18:10:57:123] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15L9FF1ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-SW-01" "Mozilla/5.0 (Windows NT 6.0; WOW64; rv:51.0) Gecko/20100801 Firefox/51.0"

128.241.220.82 - - [07/Jun 18:10:57:123] "GET /product.screen?product\_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product\_id=AV-CB-01&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14"

317.27.160.0 - - [07/Jun 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 189 "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14"

10.0.0.0 - - [07/Jun 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 189 "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14"

10.0.0.0 - - [07/Jun 18:10:56:156] "GET /oldlink?item\_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 189 "GET /category.screen?category\_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14"

# Math

## Median Absolute Deviation

_time	orig_sourcetype	totalEvents	absDev1	absDev2	absDev3	d1	d2	d3	e1	e2	e3	isOutlier	medianAbsDev1	medianAbsDev2	medianAbsDev3	median_1	median_2	median_3
2017-08-28 15:15:00	stream:arp	2	2	8	0	4	12	2	-2	-10	0	0	2	5	3	0	-2	0
2017-08-28 15:15:00	stream:dns	312	124	107	135	265	285	518	47	27	-206	0	79	104	129	-77	-80	-71
2017-08-28 15:15:00	stream:http	625	563	624	574	65	7	54	560	618	571	0	61	32	5	-3	-6	-3
2017-08-28 15:15:00	stream:icmp	1	82	7	32	85	14	40	-84	-13	-39	0	5	6	8	-2	-6	-7
2017-08-28 15:15:00	stream:ip	1167	812	790	441	508	553	852	659	614	315	0	159	387	228	-153	-176	-126
2017-08-28 15:15:00	stream:tcp	942	708	784	622	271	196	337	671	746	605	0	52	219	154	-37	-38	-17
2017-08-28 15:15:00	stream:udp	177	110	36	100	153	228	359	24	-51	-182	0	78	69	60	-86	-87	-82
2017-08-28 15:10:00	stream:dns	181	254	35	1	512	226	252	-331	-45	-71	0	68	82	122	-77	-80	-70
2017-08-28 15:10:00	stream:http	12	356	11	11	371	7	4	-359	5	8	0	47	15	5	-3	-6	-3
2017-08-28 15:10:00	stream:icmp	2	1	2	7	5	6	2	-3	-4	0	0	4	5	8	-2	-6	-7
2017-08-28 15:10:00	stream:ip	358	129	93	67	640	443	553	-282	-85	-195	0	148	254	228	-153	-178	-128
2017-08-28 15:10:00	stream:tcp	173	166	79	18	376	132	208	-203	41	-35	0	46	129	154	-37	-38	-17
2017-08-28 15:10:00	stream:udp	122	36	1	2	244	211	206	-122	-89	-84	0	74	69	60	-86	-88	-82
2017-08-28 15:05:00	stream:dns	158	380	21	39	614	217	266	-456	-59	-108	0	68	82	122	-76	-80	-69
2017-08-28 15:05:00	stream:ip	326	277	129	48	755	375	502	-429	-49	-176	0	162	254	258	-152	-178	-128
2017-08-28 15:05:00	stream:tcp	138	170	42	37	344	134	192	-206	4	-54	0	46	129	173	-36	-38	-17
2017-08-28 15:05:00	stream:udp	125	40	34	2	251	178	205	-126	-53	-80	0	78	69	60	-86	-87	-82
2017-08-28 15:00:00	stream:arp	2	0	12	8	2	16	10	0	-14	-8	0	2	2	5	0	-2	0
2017-08-28 15:00:00	stream:dns	274	61	65	130	289	289	213	-15	-15	61	0	64	82	127	-76	-80	-69
2017-08-28 15:00:00	stream:http	50	47	37	48	5	19	6	45	31	44	0	47	32	5	-2	-6	-4

```

| foreach median_*
  [ eval absDev<<MATCHSTR>> = abs(e<<MATCHSTR>> - <<FIELD>>)]
| streamstats window=12 median(absDev*) as medianAbsDev* by orig_sourcetype
| eval isOutlier = 0

```



# Vote

Which one of these things, is not like the others?

_time	orig_sourcetype	totalEvents	isOutlier
2017-09-26 00:55:00	stream:arp	22	0
2017-09-26 00:55:00	stream:dns	119	1
2017-09-26 00:55:00	stream:ip	194	0
2017-09-26 00:55:00	stream:tcp	63	0
2017-09-26 00:55:00	stream:udp	93	0
2017-09-26 00:50:00	stream:arp	20	0
2017-09-26 00:50:00	stream:dns	131	0
2017-09-26 00:50:00	stream:ip	164	0
2017-09-26 00:50:00	stream:tcp	38	0
2017-09-26 00:50:00	stream:udp	94	0
2017-09-26 00:45:00	stream:arp	20	0
2017-09-26 00:45:00	stream:dns	116	0
2017-09-26 00:45:00	stream:ip	173	0
2017-09-26 00:45:00	stream:tcp	53	0
2017-09-26 00:45:00	stream:udp	91	0
2017-09-26 00:40:00	stream:arp	22	1
2017-09-26 00:40:00	stream:dns	109	0

```

| foreach median_*
  [ eval
    lowerBound<<MATCHSTR>> = <<FIELD>> - medianAbsDev<<MATCHSTR>>*exact(5),
    upperBound<<MATCHSTR>> = <<FIELD>> + medianAbsDev<<MATCHSTR>>*exact(5),
    isOutlier<<MATCHSTR>> = if(e<<MATCHSTR>> < lowerBound<<MATCHSTR>> OR e<<MATCHSTR>> > upperBound<<MATCHSTR>>, 1, 0),
    isOutlier = isOutlier + isOutlier<<MATCHSTR>>]
| eval isOutlier=if(isOutlier>3.5, 1, 0)
| fields _time orig_sourcetype totalEvents isOutlier
| sort - _time

```



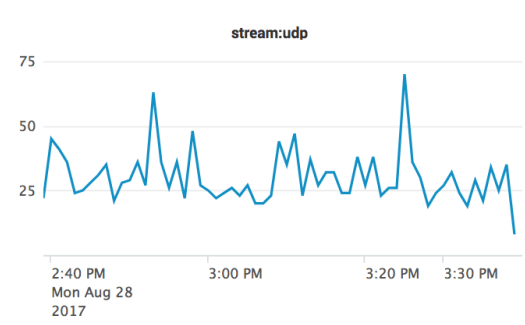
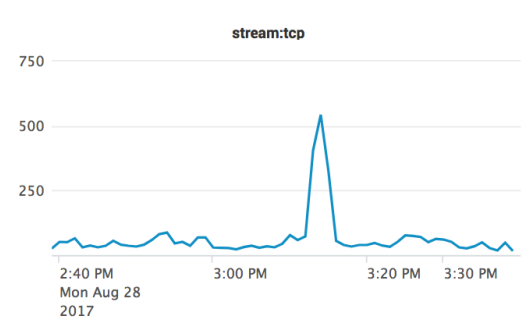
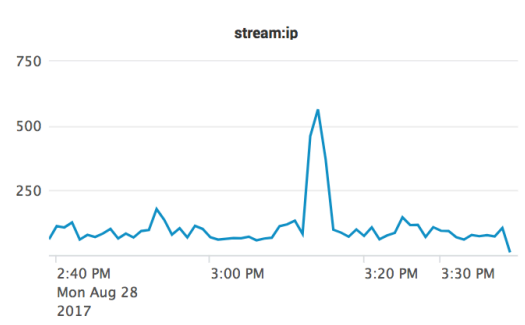
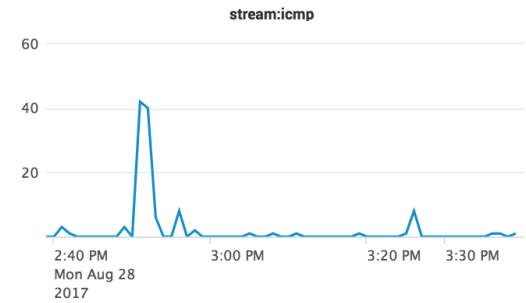
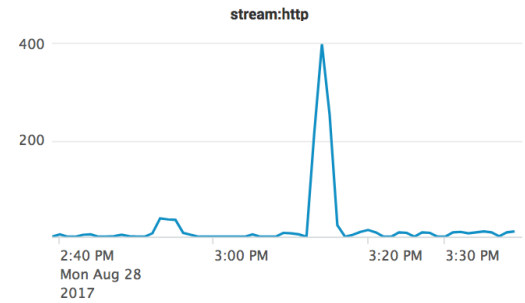
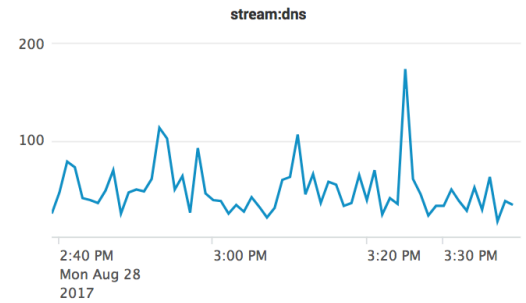
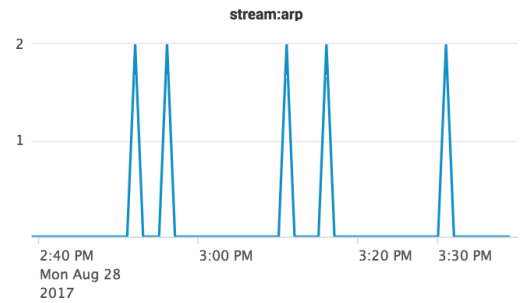
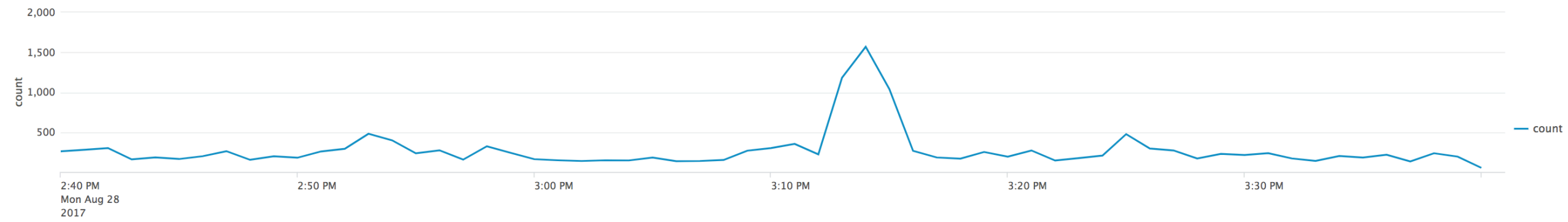
# \$ su splunkadmin

---

Watching the watcher

# Monitoring Critical Data Feeds

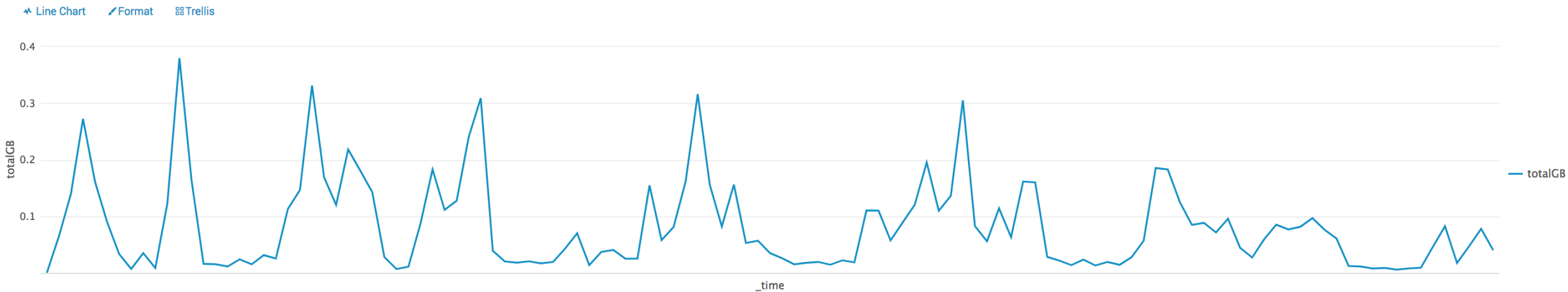
## dogfood



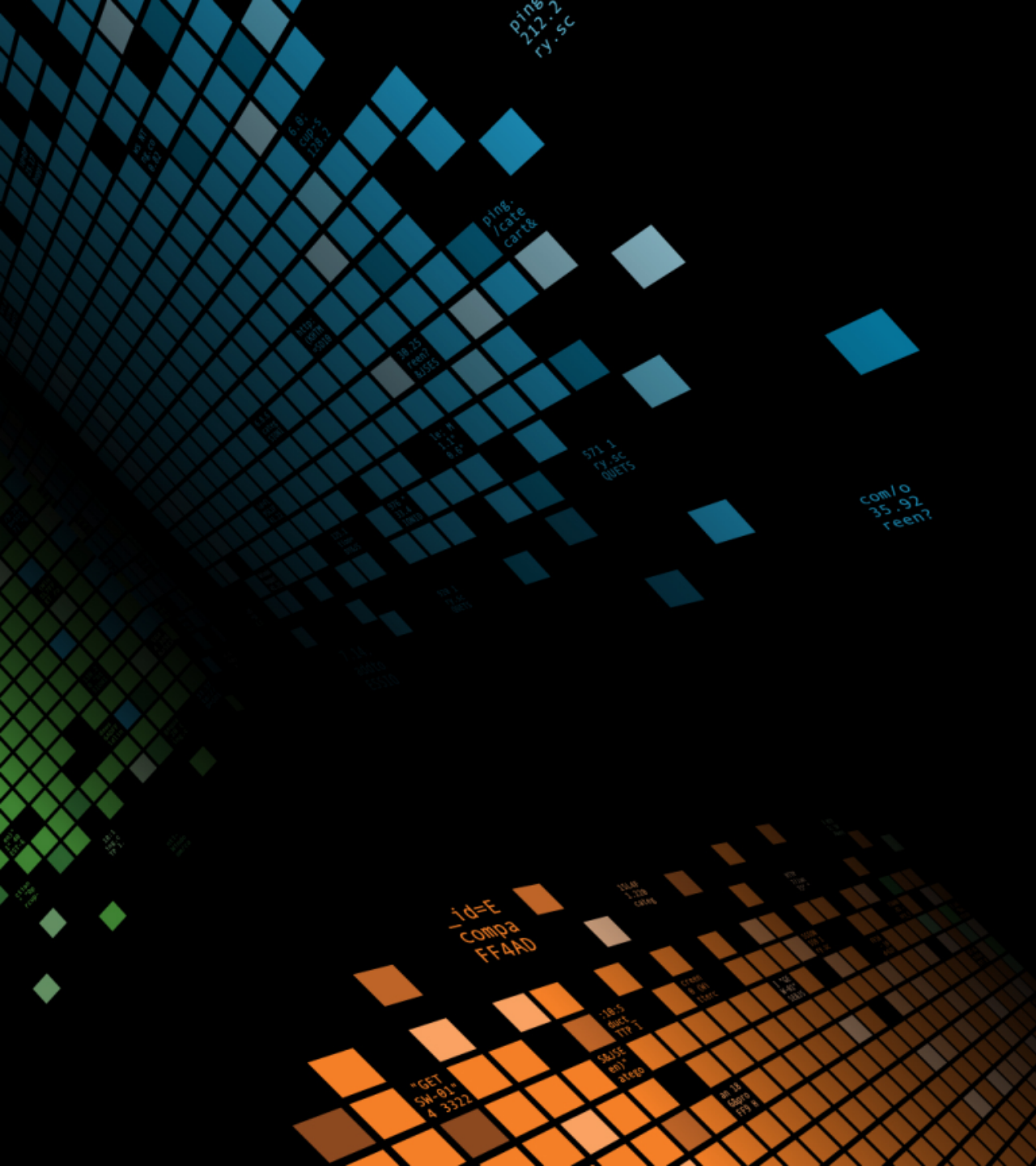
130.60.4 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
128.241.220.82 - - [07/Jun 18:10:57:123] "GET /product.screen?product\_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-268product\_id=KQ-CU-01"  
317.27.160.0 - - [07/Jun 18:10:56:156] "GET /product.screen?product\_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-268product\_id=KQ-CU-01"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"  
10.0.0.1 - - [07/Jun 18:10:57:153] "GET /category.screen?category\_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product\_id=FI-5W-03"

# License Analytics

## Monitor your indexing rate!



```
130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=GIFTS&JSESSIONID=5D15LAF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-SW-03" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6; rv:53.0) Gecko/20100801 Firefox/53.0"
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product_id=KQ-CW-01" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6; rv:53.0) Gecko/20100801 Firefox/53.0"
317.27.160.0.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product_id=AV-CB-01&JSESSIONID=5D55L9FF1ADFF3" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6; rv:53.0) Gecko/20100801 Firefox/53.0"
125.17.14.1 - - [07/Jan 18:10:55:187] "GET /category.screen?category_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-18&product_id=KQ-CW-01" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6; rv:53.0) Gecko/20100801 Firefox/53.0"
125.17.14.1 - - [07/Jan 18:10:55:189] "GET /category.screen?category_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-18&product_id=KQ-CW-01" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6; rv:53.0) Gecko/20100801 Firefox/53.0"
```



# \$ su netops

---

Outlier on the wire







# In Summary

## What did we learn?



Select meaningful metrics or KPI to analyze



Engage Decision Makers, Domain Experts & Splunk Ninjas



Analyze your data over time & use MLTK to get to know your data!



Use timewrap or streamstats method to baseline & identify outliers



Validate, alarm, iterate!





**Making machine data  
accessible, usable and  
valuable to everyone.**

# Q&A

---



# Thank You

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