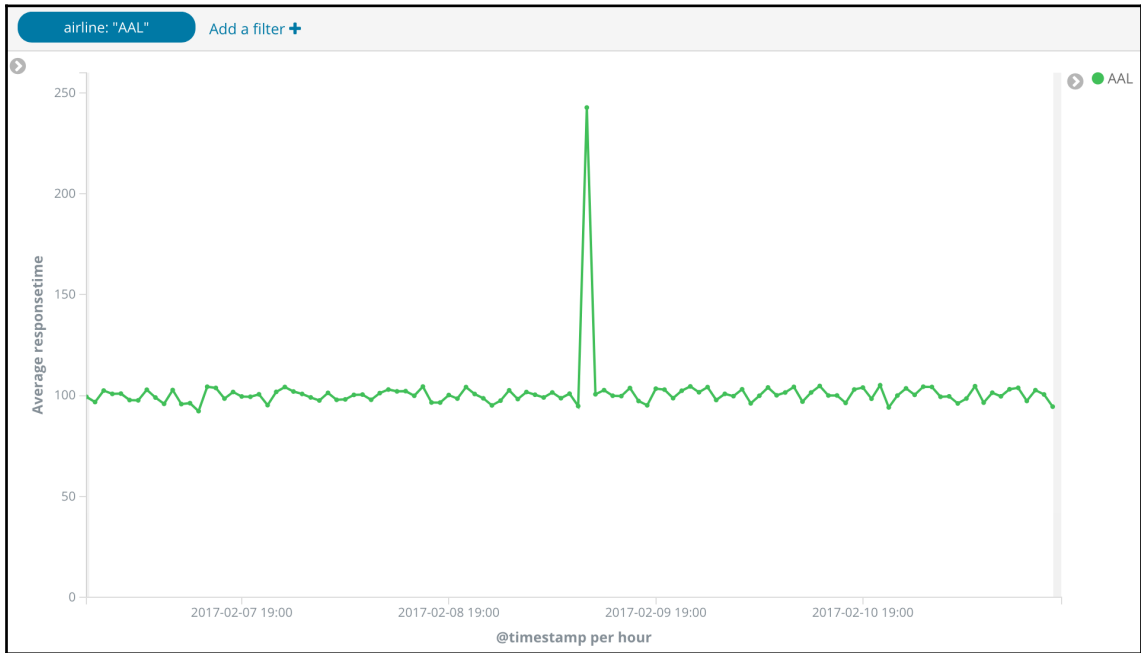
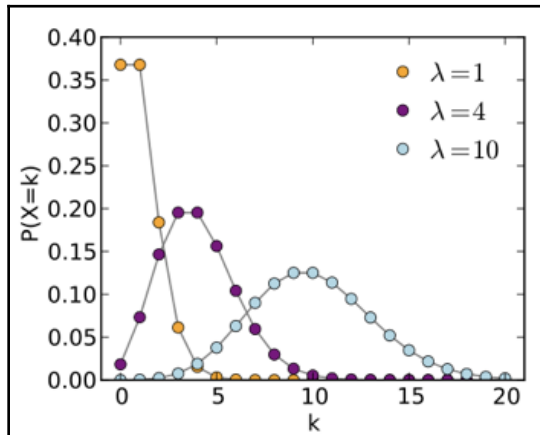
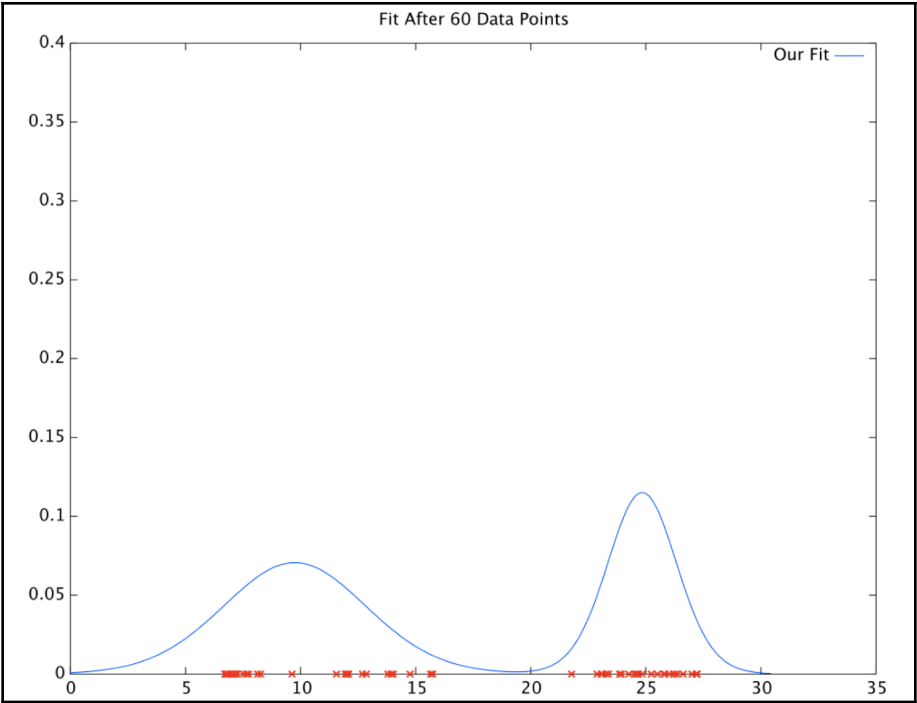
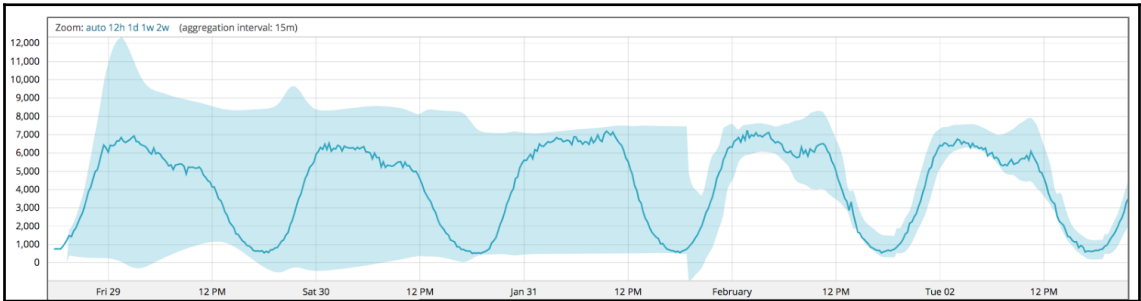
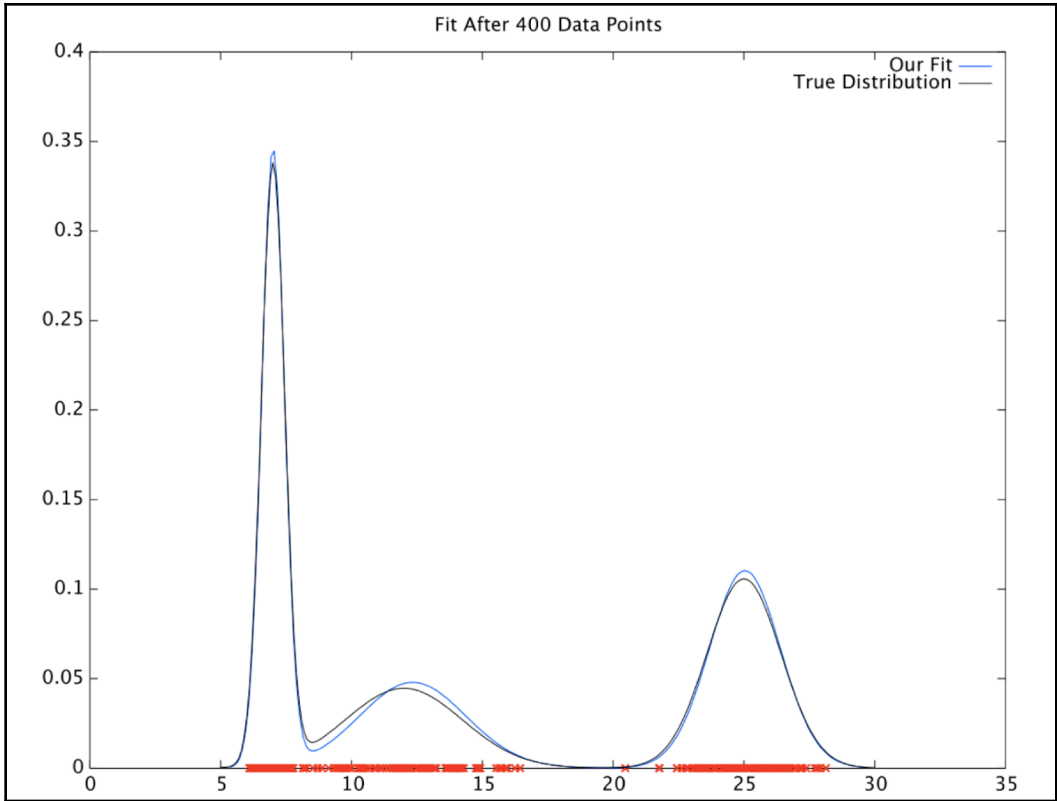


Chapter 1: Machine Learning for IT





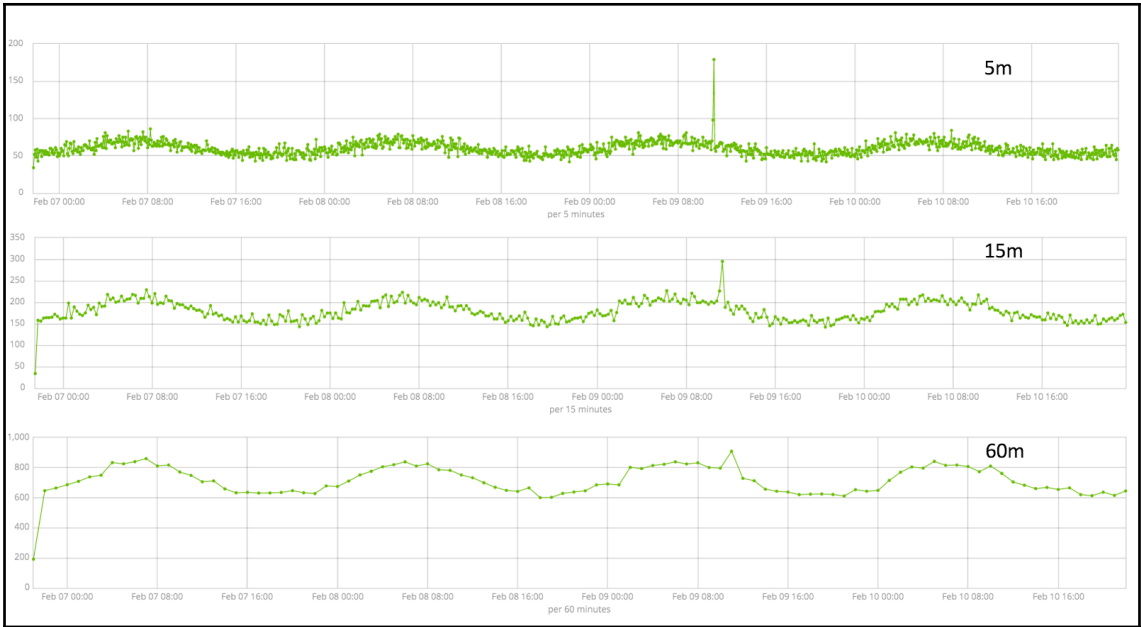






```
top - 11:56:59 up 26 min, 1 user, load average: 0.06, 0.18, 0.48
Tasks: 91 total, 1 running, 90 sleeping, 0 stopped, 0 zombie
Cpu0 : 0.0%us, 0.0%sy, 0.0%ni,100.0%id, 0.0%wa, 0.0%hi, 0.0%si, 0.0%st
Cpu1 : 0.3%us, 0.0%sy, 0.0%ni, 99.7%id, 0.0%wa, 0.0%hi, 0.0%si, 0.0%st
Cpu2 : 0.7%us, 0.0%sy, 0.0%ni, 99.3%id, 0.0%wa, 0.0%hi, 0.0%si, 0.0%st
Cpu3 : 0.3%us, 0.0%sy, 0.0%ni, 99.7%id, 0.0%wa, 0.0%hi, 0.0%si, 0.0%st
Mem: 15405348k total, 10182940k used, 5222408k free, 59148k buffers
Swap: 0k total, 0k used, 0k free, 813512k cached
```

PID	USER	PR	NI	VIRT	RES	SHR	S	%CPU	%MEM	TIME+	COMMAND
1835	ec2-user	20	0	15.1g	8.8g	214m	S	1.0	59.9	6:39.09	/usr/lib/jvm/java/bin/java -Xms8g -Xmx8g -XX:+UseConcMarkSweepGC -XX:CMSInitiatingOcc
1863	ec2-user	20	0	1276m	145m	20m	S	1.0	1.0	0:25.73	/opt/elastic/ml/kibana/bin/./node/bin/node --no-warnings /opt/elastic/ml/kibana/bin/
1958	ec2-user	20	0	138m	8224	7536	S	0.0	0.1	0:06.72	/opt/elastic/ml/elasticsearch/plugins/x-pack/platform/linux-x86_64/bin/controller
2016	ec2-user	20	0	115m	3936	2840	S	0.0	0.0	0:00.06	sshd: ec2-user@pts/0
2017	ec2-user	20	0	112m	3356	2876	S	0.0	0.0	0:00.01	-bash
2060	ec2-user	20	0	15308	2132	1820	R	0.0	0.0	0:01.68	top
2349	ec2-user	20	0	90388	26m	16m	S	0.0	0.2	0:00.08	./autodetect --jobid=weblogs --licenseValidation=846052866894315 --bucketspan=900 --l

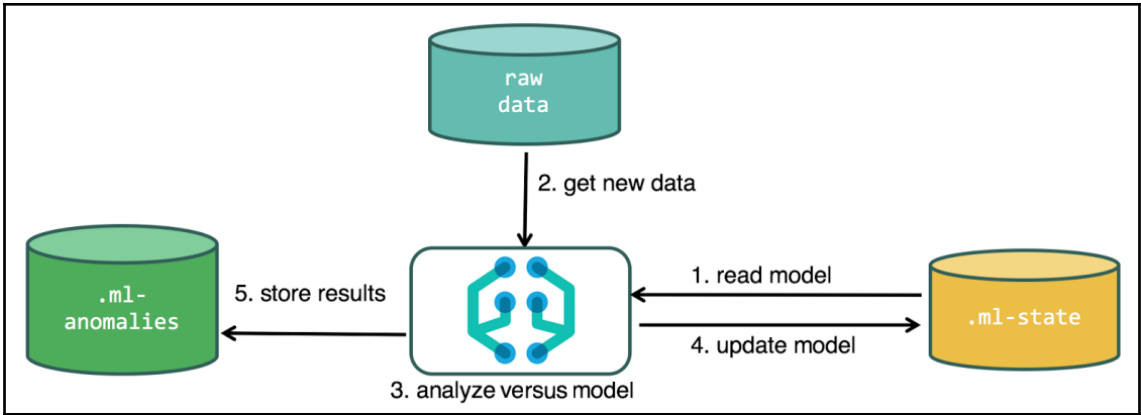


httpd_errors 38,709 ok closed stopped

Job settings Job config Datafeed Counts JSON Job messages Datafeed preview

Refresh

Time	Node	Message
2017-08-10 20:15:18	Lrj_1pU	Job created
2017-08-10 20:15:18	Lrj_1pU	Opening job on node [{"Lrj_1pU"}{"Lrj_1pUJTbmC7u_PqVP-ug"}{"jw40tjGSZ6kRzjXc7wA"}{"127.0.0.1"}{"127.0.0.1:9300"}{"ml.enabled=true"}]
2017-08-10 20:15:18	Lrj_1pU	Loading model snapshot [N/A], job latest_record_timestamp [N/A]
2017-08-10 20:15:21	Lrj_1pU	Starting datafeed [datafeed-httpd_errors] on node [{"Lrj_1pU"}{"Lrj_1pUJTbmC7u_PqVP-ug"}{"jw40tjGSZ6kRzjXc7wA"}{"127.0.0.1"}{"127.0.0.1:9300"}{"ml.enabled=true"}]
2017-08-10 20:15:21	Lrj_1pU	Datafeed started (from: 1970-01-01T00:00:00Z to: 2017-08-11T00:15:19.001Z)
2017-08-10 20:15:32	Lrj_1pU	Datafeed lookback completed
2017-08-10 20:15:32	Lrj_1pU	Datafeed stopped
2017-08-10 20:15:32	Lrj_1pU	Job is closing



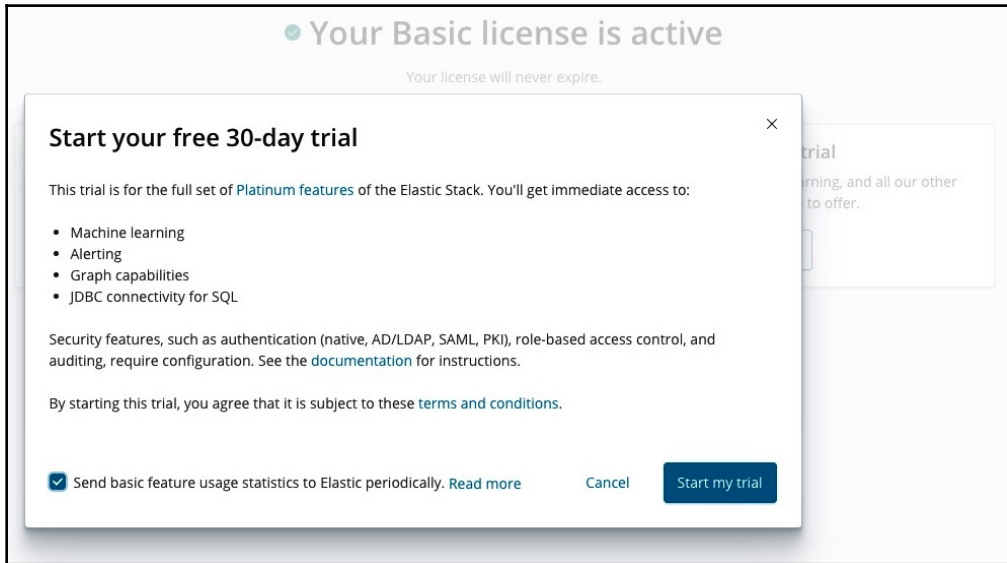
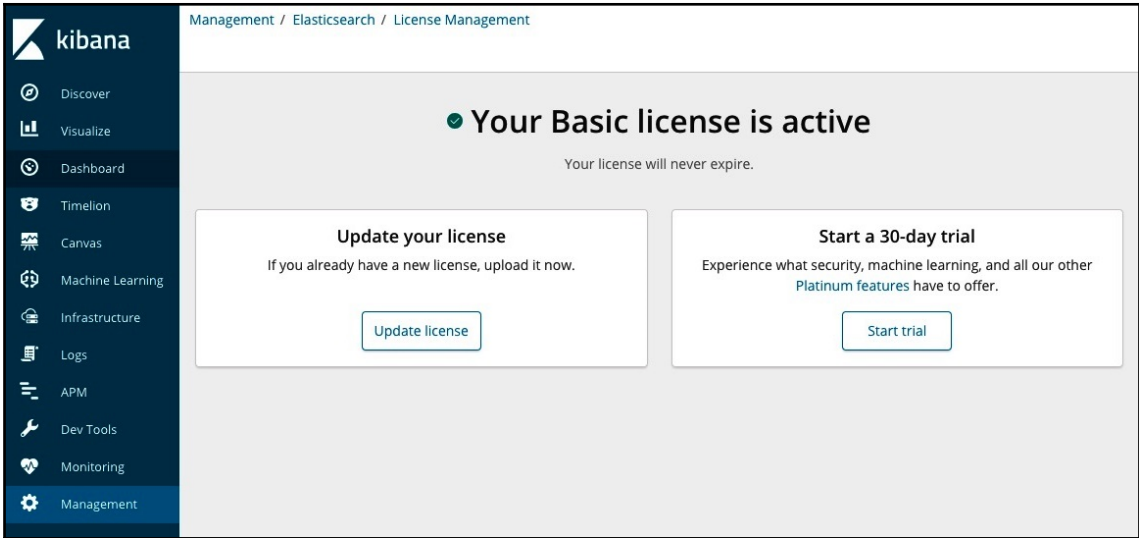
Chapter 2: Installing the Elastic Stack with Machine Learning

Kibana status is Green

1.40 GB Heap total	164.23 MB Heap used	2.93, 4.90, 4.25 Load
119.31 ms Response time avg	1278.00 ms Response time max	3.80 Requests per second

Plugin status BUILD **18763** COMMIT **2ba5ab17**

ID	Status
● plugin:kibana@6.5.1	Ready
● plugin:elasticsearch@6.5.1	Ready
● plugin:xpack_main@6.5.1	Ready
● plugin:searchprofiler@6.5.1	Ready
● plugin:ml@6.5.1	Ready
● plugin:tilemap@6.5.1	Ready



Management / Elasticsearch / License Management

✔ Your Trial license is active
 Your license will expire on **December 25, 2018 10:12 AM EST**

Update your license

If you already have a new license, upload it now.

[Update license](#)

Extend your trial

If you'd like to continue using security, machine learning, and our other awesome Platinum features, request an extension now.

[Extend trial](#)

Revert to Basic license

You'll revert to our free features and lose access to security, machine learning and other Platinum features.

[Revert to Basic](#)

Management / Kibana

Index Patterns Saved Objects Spaces Reporting Advanced Settings

[Create index pattern](#)

Create index pattern

Kibana uses index patterns to retrieve data from Elasticsearch indices for things like visualizations. Include system indices

Step 1 of 2: Define index pattern

Index pattern

You can use a * as a wildcard in your index pattern. You can't use spaces or the characters \, /, ?, *, <, >, |.

[Next step](#)

No Elasticsearch indices match your pattern.

Rows per page: 10 ▾

Create index pattern

Kibana uses index patterns to retrieve data from Elasticsearch indices for things like visualizations.

Include system indices

Step 1 of 2: Define index pattern

Index pattern

You can use a * as a wildcard in your index pattern.
You can't use spaces or the characters \, /, ?, ", <, >, |.

> Next step

✓ **Success!** Your index pattern matches **1 index**.

metricbeat-6.5.1-2018.11.25

Rows per page: 10 ▾

Create index pattern

Kibana uses index patterns to retrieve data from Elasticsearch indices for things like visualizations.

Include system indices

Step 2 of 2: Configure settings

You've defined **metricbeat-*** as your index pattern. Now you can specify some settings before we create it.

Time Filter field name

Refresh

The Time Filter will use this field to filter your data by time.
You can choose not to have a time field, but you will not be able to narrow down your data by a time range.

> Show advanced options

< Back

Create index pattern

Management / Kibana

Index Patterns Saved Objects Spaces Reporting Advanced Settings

Create Index pattern

★ metricbeat-*

★ metricbeat-*

⌚ Time Filter field name: @timestamp

This page lists every field in the **metricbeat-*** index and the field's associated core type as recorded by Elasticsearch. To change a field type, use the Elasticsearch [Mapping API](#).

Fields (1838) Scripted fields (0) Source filters (0)

Q Filter All field types ▾

Name	Type	Format	Searchable	Aggregatable	Excluded
@timestamp ⌚	date		●	●	
_id	string		●	●	
_index	string		●	●	
_score	number				
_source	_source				
_type	string		●	●	
aerospike.namespace.client.delete.error	number		●	●	

kibana

Machine Learning / Job Management 30 seconds

Job Management Anomaly Explorer Single Metric Viewer Data Visualizer Settings

Active ML Nodes: 0 Total jobs: 0 Open jobs: 0 Closed jobs: 0 Active datafeeds: 0

Refresh + Create new job

Q Search... Opened Closed Failed Started Stopped Group ▾

ID ↑	Description	Processed records	Memory status	Job state	Datafeed state	Latest timestamp	Actions
No items found							

Rows per page: 10 ▾

From a New Search, Select Index

Q Filter... 1 of 1

Name ▲

metricbeat-*

Or, From a Saved Search

Q Saved Searches Filter... 0-0 of 0

Name ▲

No matching saved searches found.

Create a job from the index pattern metricbeat-*

Use a wizard

Use one of the wizards to create a machine learning job to find anomalies in your data.



Single metric

Detect anomalies in a single time series.



Multi metric

Detect anomalies in multiple metrics by splitting a time series by a categorical field.



Population

Detect activity that is unusual compared to the behavior of the population.



Advanced

Use the full range of options to create a job for more advanced use cases.

Learn more about your data

If you're not sure what type of job to create, first explore the fields and metrics in your data.



Data Visualizer

Learn more about the characteristics of your data and identify the fields for analysis with machine learning.

metricbeat-*

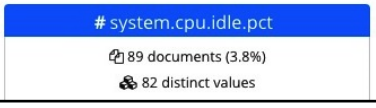
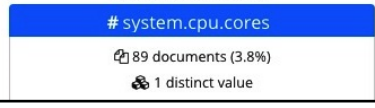
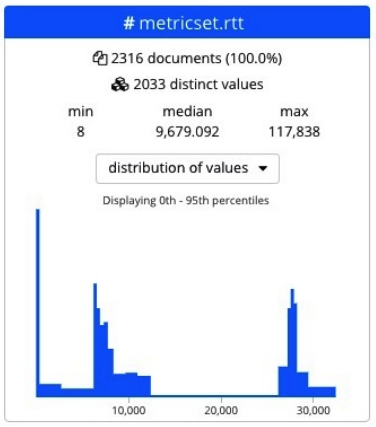
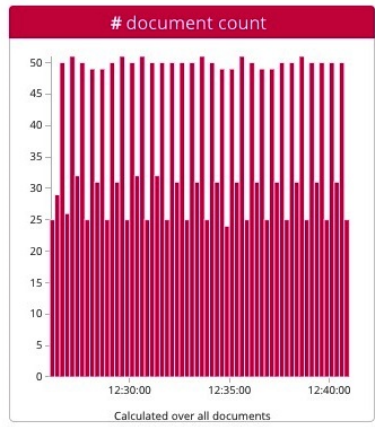
Use full metricbeat-* data

Search... (e.g. status:200 AND extension:PHP)

Sample documents per shard from a total of **2316** documents

Metrics

69 fields exist in documents (1483 in total) show empty fields



Create Job

Use the Advanced job wizard to create a job to find anomalies in this data:

Advanced
Use the full range of options to create a job for more advanced use cases

Single metric
Detect anomalies in a single time series.

Machine Learning / Job Management / Create New Job / Single Metric Job ◀ Last 15 minutes ▶

New job from index pattern metricbeat-*

[Use full metricbeat-* data](#)

Aggregation ?
Field ?
Bucket span ? [Estimate bucket span](#) ▶

Machine Learning / Job Management / Create New Job / Single Metric Job ◀ November 25th 2018, 11:12:21.534 to November 25th 2018, 13:35:31.742 ▶

New job from index pattern metricbeat-*

Chart interval: 1m [Use full metricbeat-* data](#)

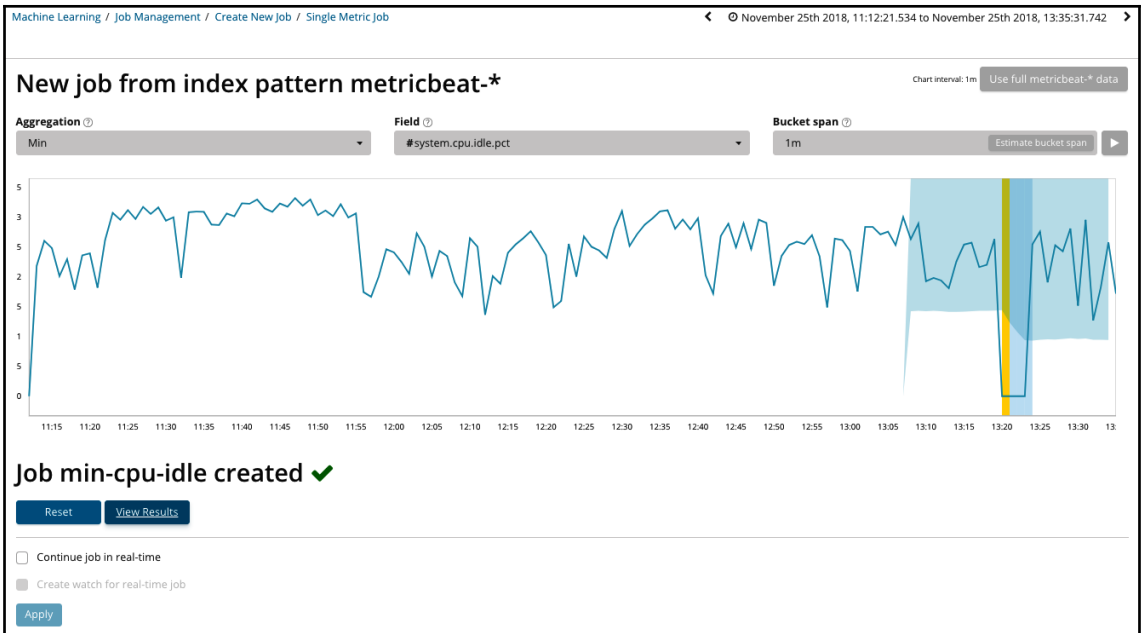
Aggregation ?
Field ?
Bucket span ? [Estimate bucket span](#) ▶

Name ?

Description ?

Job Groups ?

Advanced ?
 Move to advanced job configuration



Job min-cpu-idle created ✓

[Reset](#) [View Results](#)

Continue job in real-time

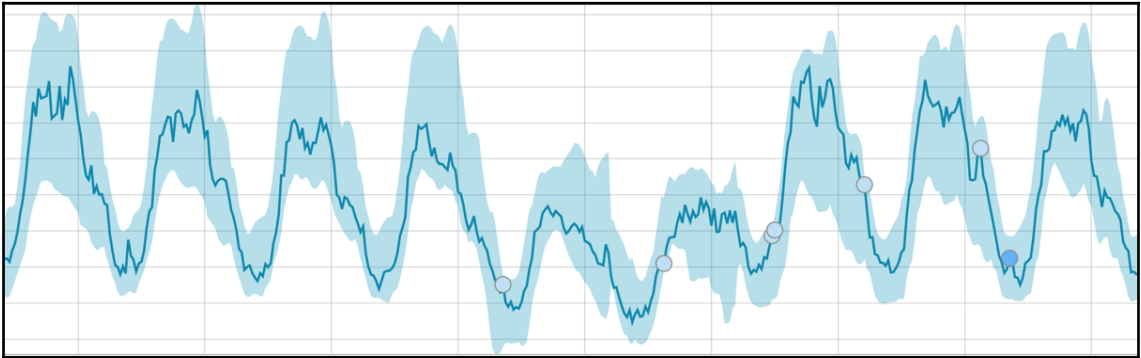
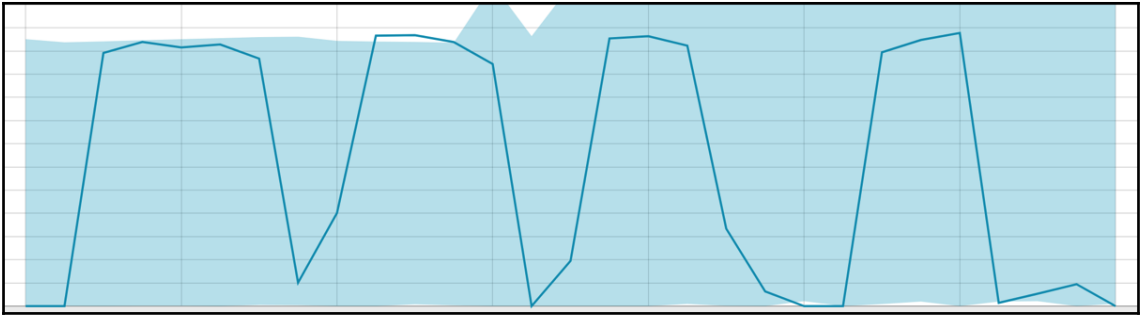
Create watch for real-time job

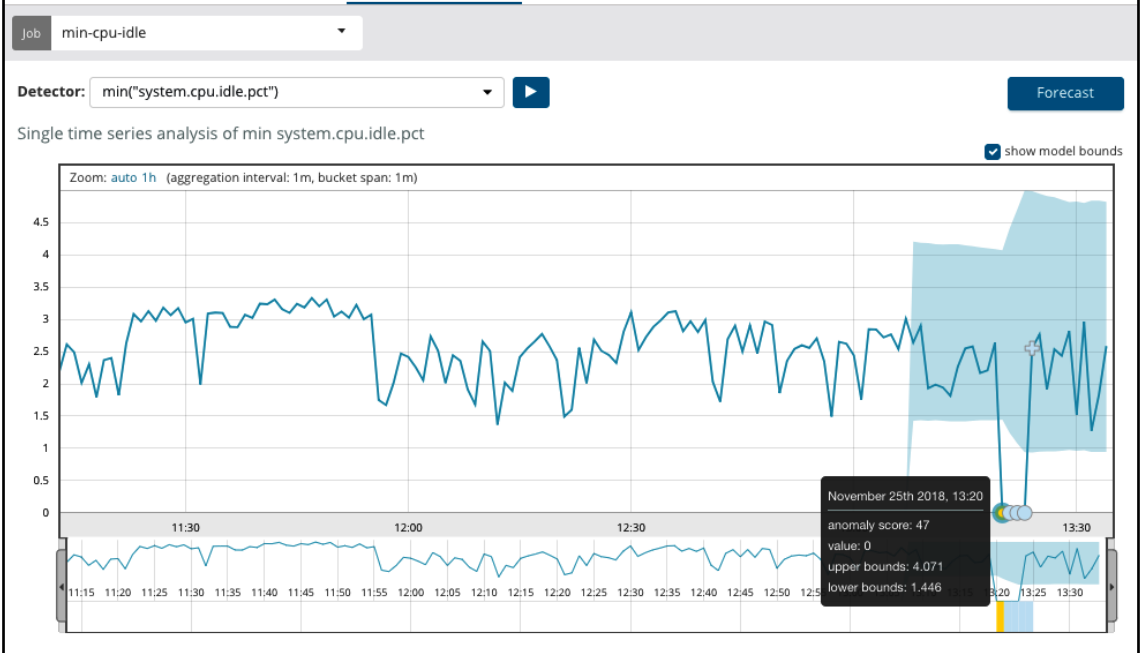
Time range **Severity threshold**

Now -

Send email

[Apply](#)





Anomalies

Severity threshold: warning Interval: Auto

time	max severity ↓	detector	actual	typical	description	job ID	actions
November 25th 2018, 13:00	47	min("system.cpu.idle.pct")	0	2.529	Unexpected zero value	min-cpu-idle	

Description
 minor anomaly in min("system.cpu.idle.pct")

Details on highest severity anomaly

time	November 25th 2018, 13:20:00 to November 25th 2018, 13:21:00
function	min
fieldName	system.cpu.idle.pct
actual	0
typical	2.53
job ID	min-cpu-idle
probability	0.0012353052581190274

Rows per page: 25

New job from index pattern metricbeat-*

Chart interval: 1m [Use full metricbeat-* data](#)

Job settings

Fields

- system.process.cgroup.memory.stats
- system.process.cpu.system.ticks
- system.process.cpu.total.norm.pct
- system.process.cpu.total.pct
- system.process.cpu.total.ticks
- system.process.cpu.total.value

Split Data [Remove split](#)

system.process.name

Key Fields (Influencers)

system.process.name

Bucket span

1m [Estimate bucket span](#)

Results

Document count

Data split by system.process.name

system.process.name

Google Drive Fi

Google Chrome H

Mean system.process.cpu.total.pct

Job Management
[Anomaly Explorer](#)
[Single Metric Viewer](#)
[Data Visualizer](#)
[Settings](#)

Job: cpu-per-process

Top Influencers

system.process.name

- java 65 110
- Google Drive Fi 21 21
- Google Chrome H 5 5

Anomaly timeline

Overall

View by: system.process.name Limit: 10 (Sorted by max anomaly score)

java

Google Drive Fi

Google Chrome H

Anomalies

Severity threshold: warning

Interval: Auto

time	max sever...	detector	found for	influenced by	actual	typical	description	job ID	actions
> November 25th 2018, 13:00	65	mean(system.pr ocess.cpu.total. pct)	java	system.process. name: java	0.103	0.019	↑ 5x higher	cpu-per-process	
> November 25th 2018, 13:00	21	mean(system.pr ocess.cpu.total. pct)	Google Drive Fi	system.process. name: Google Drive Fi	0.061	0.084	↓ 1.4x lower	cpu-per-process	
> November 25th 2018, 13:00	5	mean(system.pr ocess.cpu.total. pct)	Google Chrome H	system.process. name: Google Chrome H	0.223	0.044	↑ 5x higher	cpu-per-process	

Rows per page: 25



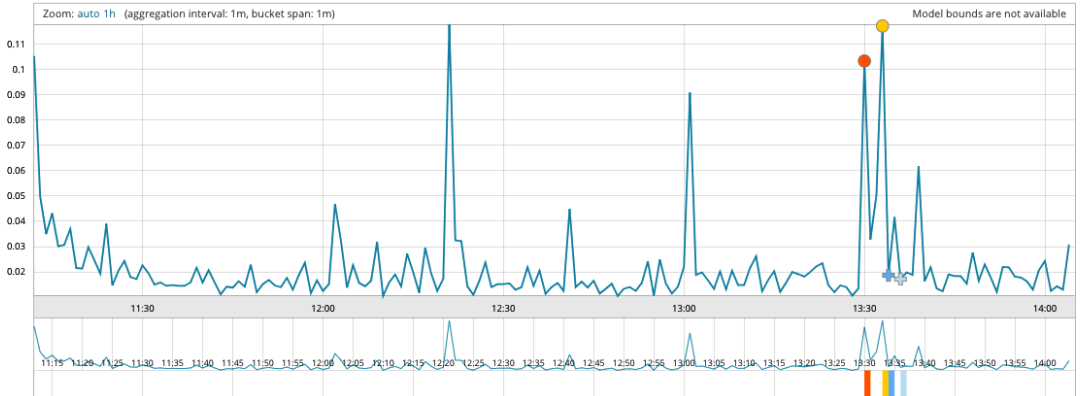
time	max sever...	detector	found for	influenced by	actual	typical	description	job ID	actions
> November 25th 2018, 13:00	65	mean(system.pr ocess.cpu.total. pct)	java	system.process. name: java	0.103	0.019	↑ 5x higher	cpu-per-process	View series Configure rules

Rows per page: 25

Job:

Detector: system.process.name:

Single time series analysis of avg system.process.cpu.total.pct (system.process.name: java)



Anomalies

New job from index pattern metricbeat-*

Chart interval: 1m [Use full metricbeat-* data](#)

Job settings

Population

tsystem.process.name

Fields

Add field

system.process.cpu.total.... High mean

Key Fields (Influencers)

tsystem.process.name tbeat.hostname

Bucket span

1m [Estimate bucket span](#)

Job Details

Name

outlier-processes

Description

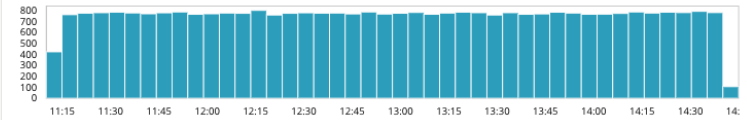
Processes that use more CPU than others

Job Groups

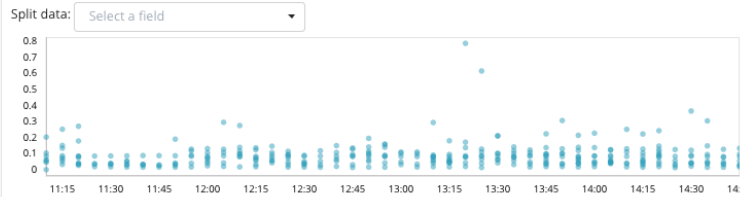
Job Group

Results

Document count



High mean system.process.cpu.total.pct over system.process.name



Job outlier-processes

Top Influencers

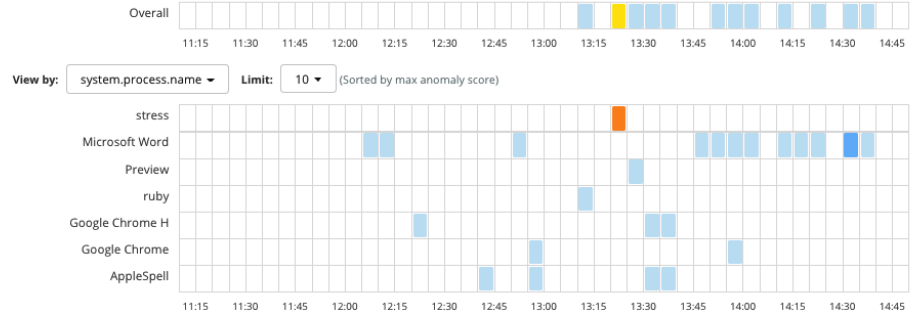
system.process.name

- stress 69 134
- Microsoft Word 3 18
- Preview 1 1
- ruby 1 2
- Google Chrome H 1 3
- Google Chrome < 1 < 1
- AppleSpell < 1 < 1

beat.hostname

- poipu 48 54

Anomaly timeline



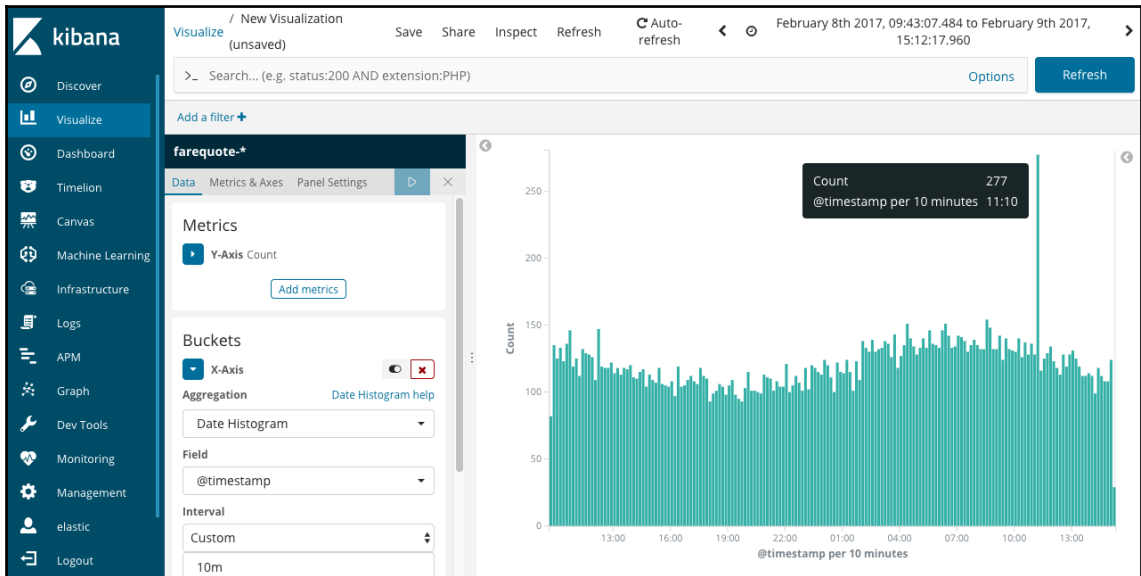
Anomalies


Severity threshold: warning Interval: Auto

time	max seve...	detector	found for	influenced by	actual	typical	description	job ID	actions
> November 25th 2018, 13:00	69	high_mean(system.process.cpu.total.pct) over system.process.name	stress	beat.hostname: poipu system.process.name: stress	0.824	0.076	↑ 11x higher	outlier-processes	⚙️
> November 25th 2018, 14:00	3	high_mean(system.process.cpu.total.pct) over system.process.name	Microsoft Word	beat.hostname: poipu system.process.name: Microsoft Word	0.406	0.084	↑ 5x higher	outlier-processes	⚙️



Chapter 3: Event Change Detection





- Discover
- Visualize
- Dashboard
- Timelion
- Canvas
- Machine Learning
- Infrastructure
- Logs
- APM
- Graph
- Dev Tools
- Monitoring
- Management

February 6th 2017, 19:00:00.000 to February 11th 2017, 18:59:54.000

New job from index pattern farequote-*

Chart interval: 10m Use full farequote-* data

Aggregation ?

Count

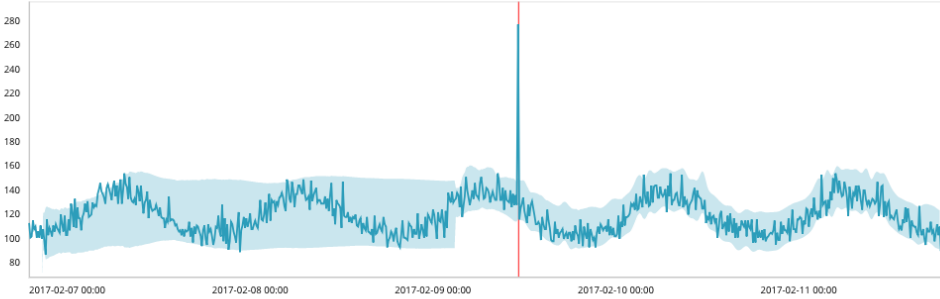
Field ?

Select a field

Bucket span ?

10m Estimate bucket span ▶

Sparse data ?





Job farequote created ✓


Reset
View Results

Continue job in real-time

Create watch for real-time job

Apply

 elastic
  Logout
 0 Default



- Discover
- Visualize
- Dashboard
- Timeline
- Canvas
- Machine Learning
- Infrastructure
- Logs
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- Graph
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- Monitoring
- Management

Machine Learning / Single Metric Viewer Auto-refresh ◀ February 6th 2017, 19:00:00.000 to February 11th 2017, 18:59:54.000 ▶

Job Management Anomaly Explorer Single Metric Viewer Data Visualizer Settings

Job: farequote

Detector: count Forecast


Single time series analysis of count show model bounds

Zoom: auto 12h 1d (aggregation interval: 10m, bucket span: 10m)



Anomalies

Severity threshold: warning Interval: Auto

time	max severity ↓	detector	actual	typical	description	job ID	actions
> February 9th 2017, 11:00	● 90	count	277	127.9	↑ 2x higher	farequote	

Rows per page: 25 ▼

kibana Machine Learning / Single Metric Viewer Auto-refresh February 6th 2017, 19:00:00.000 to February 11th 2017, 18:59:54.000

Job Management Anomaly Explorer **Single Metric Viewer** Data Visualizer Settings

job: farequote_1h

Detector: count ▶ Forecast

Single time series analysis of count show model bounds

Zoom: auto 12h 1d (aggregation interval: 1h, bucket span: 1h)

Anomalies
Severity threshold: warning Interval: Auto

No matching anomalies found

Create a new job

Job Details

Analysis Configuration

Datafeed

Edit JSON

Data Preview

bucket_span ?

15m

summary_count_field_name ?

events_per_min

categorization_field_name ?

Select...

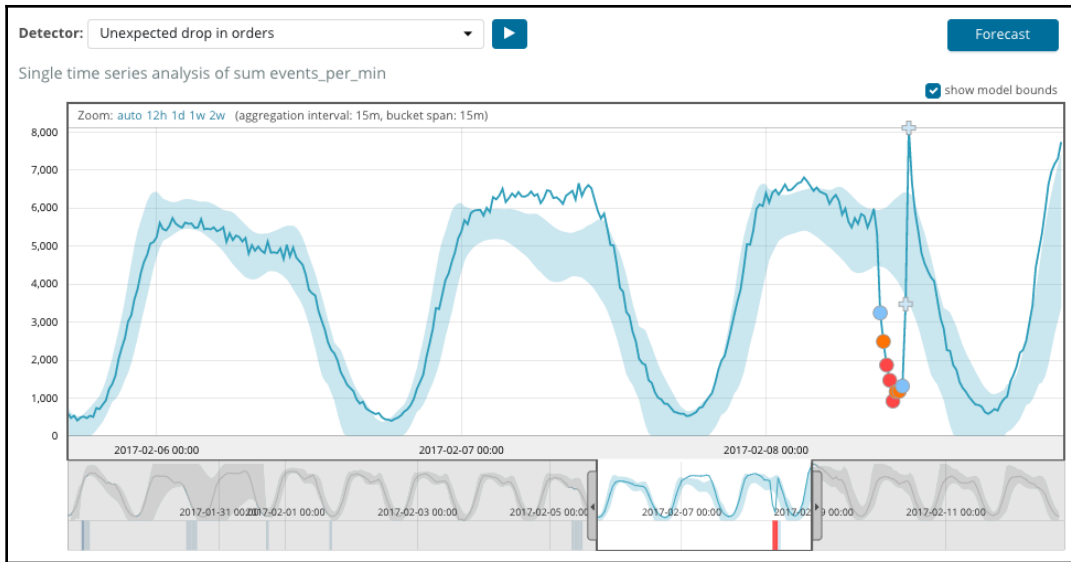
Detectors ?

+ Add Detector

The screenshot shows the Kibana interface with a sidebar on the left containing navigation items: Discover, Visualize, Dashboard, Timelion, Canvas, Machine Learning (highlighted), Infrastructure, Logs, APM, Graph, Dev Tools, and Monitoring. The main content area is titled 'Machine Learning / Job Management / Create New Job / Advanced Job Configuration'. A modal dialog titled 'Add new detector' is open, containing the following fields:

- Description** ? : Unexpected drop in orders
- function** ? : low_count (with a multiplier 'x')
- field_name** ? : Select...
- by_field_name** ? : Select...
- over_field_name** ? : Select...
- partition_field_name** ? : Select...
- exclude_frequent** ? : Select...

Below the fields is a link: [Help for analytical functions](#). At the bottom of the dialog are 'Add' and 'Cancel' buttons. Below the dialog, the 'Detectors' section is visible with a '+ Add Detector' button.



- Discover
- Visualize
- Dashboard
- Timeline
- Canvas
- Machine Learning
- Infrastructure
- Logs
- APM
- Graph
- Dev Tools
- Monitoring
- Management

Machine Learning / Job Management / Create New Job / Multi Metric Job ◀ February 6th 2017, 19:00:00.000 to February 11th 2017, 18:59:54.000 ▶

New job from index pattern farequote-*

Chart interval: 15m Use full farequote-* data

Job settings

Fields

- event rate Count
- responsetime Mean
- airline Distinct count

Sparse data

Split Data Remove split

tairline

Key Fields (Influencers)

tairline

Bucket span

10m Estimate bucket span

Job Details

Name

job ID

Description

job description

Results

Document count

Data split by airline

Count event rate

Machine Learning / Anomaly Explorer Auto-refresh ◀ February 6th 2017, 19:00:00.000 to February 11th 2017, 18:59:54.000 ▶

Job Management **Anomaly Explorer** Single Metric Viewer Data Visualizer Settings

Job: count_per_airline

Top Influencers

airline

AAL 98 100

Anomaly timeline

Overall

View by: airline Limit: 10 (Sorted by max anomaly score)

Anomalies

Severity threshold: warning Interval: Auto Show charts

count - airline AAL View [↗](#)

time	max se...	detector	found for	influenced...	actual	typical	description	job ID	actions
▶ February 9th 2017, 11:00	● 98	count	AAL	airline: AAL	170	11.8	↑ 14x higher	count_per_airline	

New job from index pattern gallery-*

Chart interval: 1d [Use full gallery-* data](#)

Job settings

Population

clientip

Fields

Add field

event rate

Count

Key Fields (Influencers)

tstatus x clientip x turi x

Bucket span

15m [Estimate bucket span](#)

Job Details

Name

population_analysis

Description

Job description

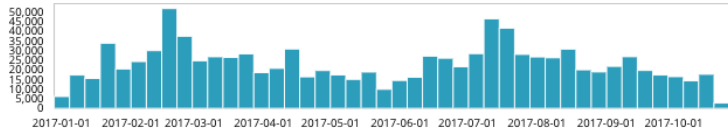
Job Groups

Job Group

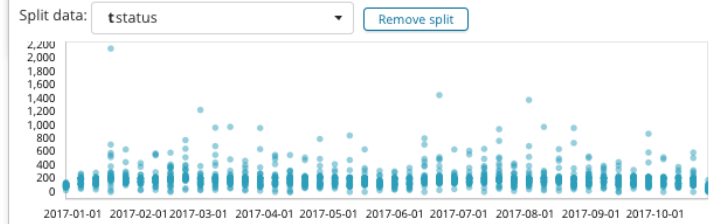
[Advanced](#)

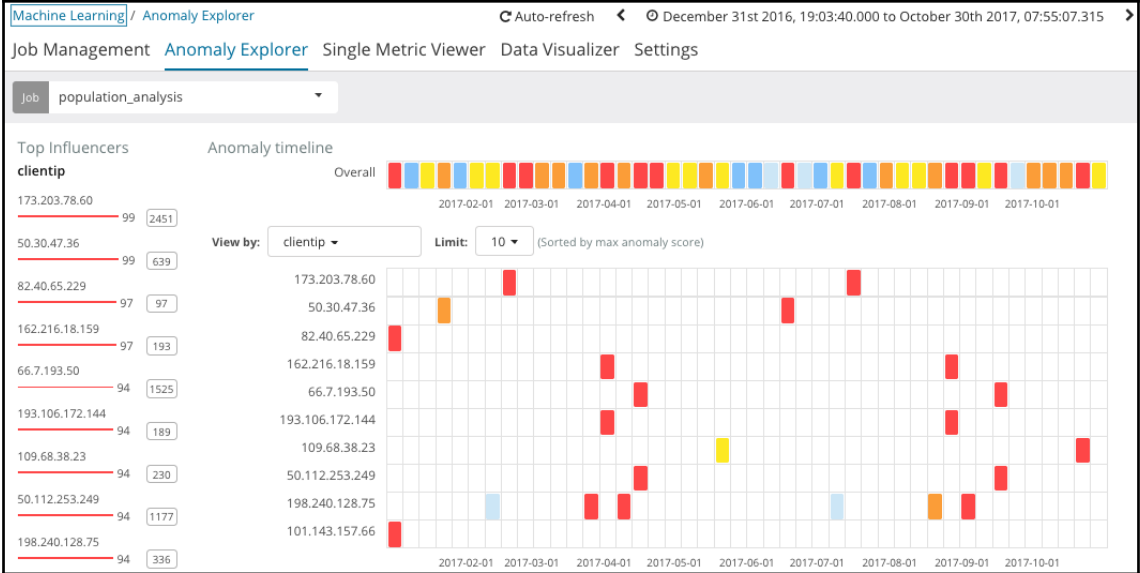
Results

Document count

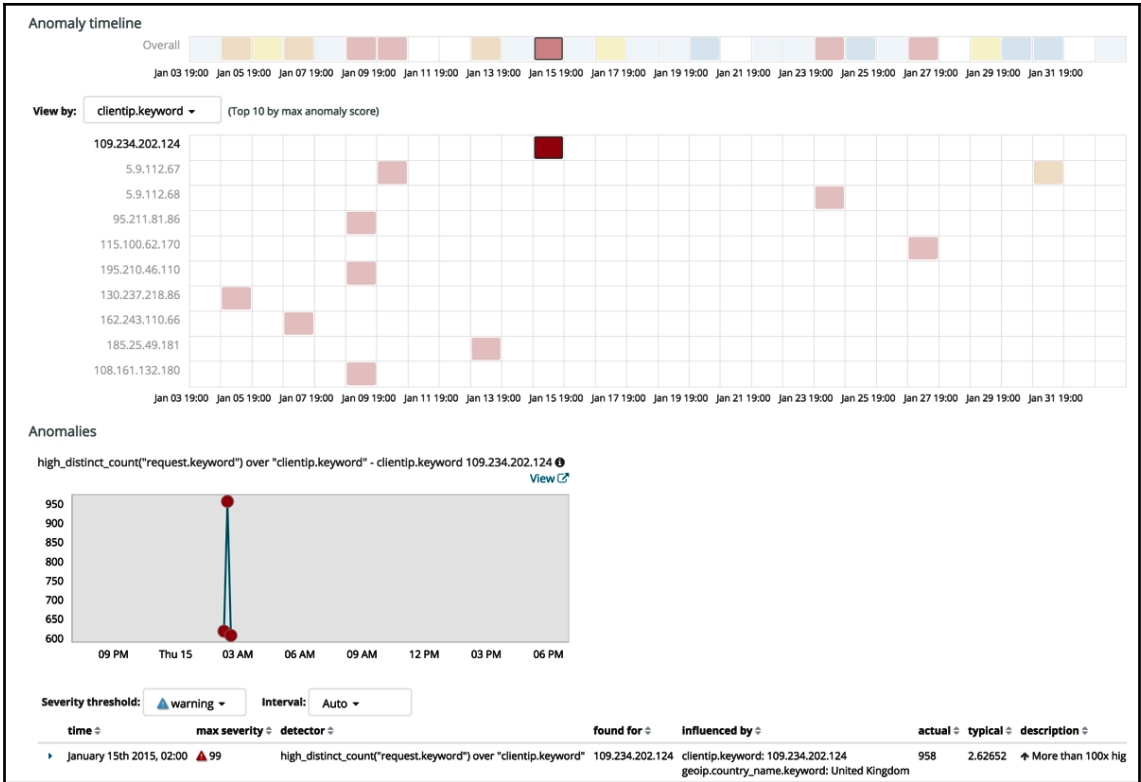


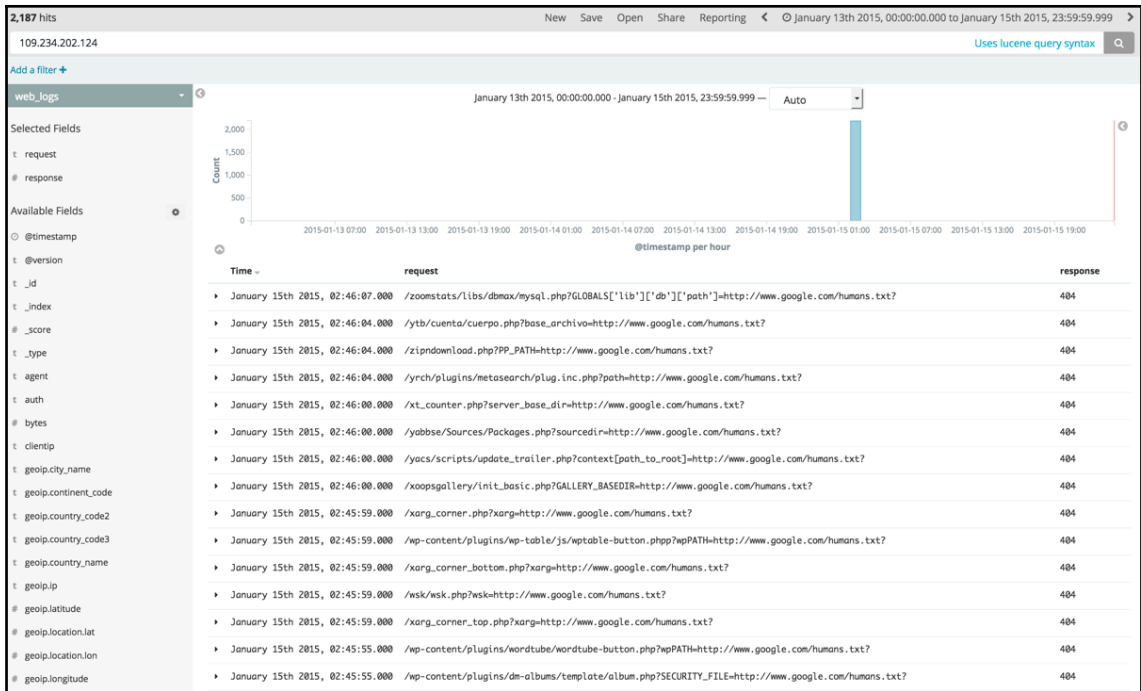
Count event rate over clientip split by status











Add new detector

Description ⓘ

Rare Country

function ⓘ **field_name** ⓘ **by_field_name** ⓘ

rare geoiip.country_name

over_field_name ⓘ **partition_field_name** ⓘ **exclude_frequent** ⓘ

Help for rare ↗

Add Cancel

Create a new job

Job Details

Analysis Configuration

Datafeed

Edit JSON

Data Preview

bucket_span ⓘ

10m

summary_count_field_name ⓘ

categorization_field_name ⓘ

message

Categorization Filters ⓘ

+ Add Categorization Filter

Detectors ⓘ

+ Add Detector

Add new detector

Description ⓘ

count by mlcategory

function ⓘ

count

field_name ⓘ

by_field_name ⓘ

mlcategory

over_field_name ⓘ

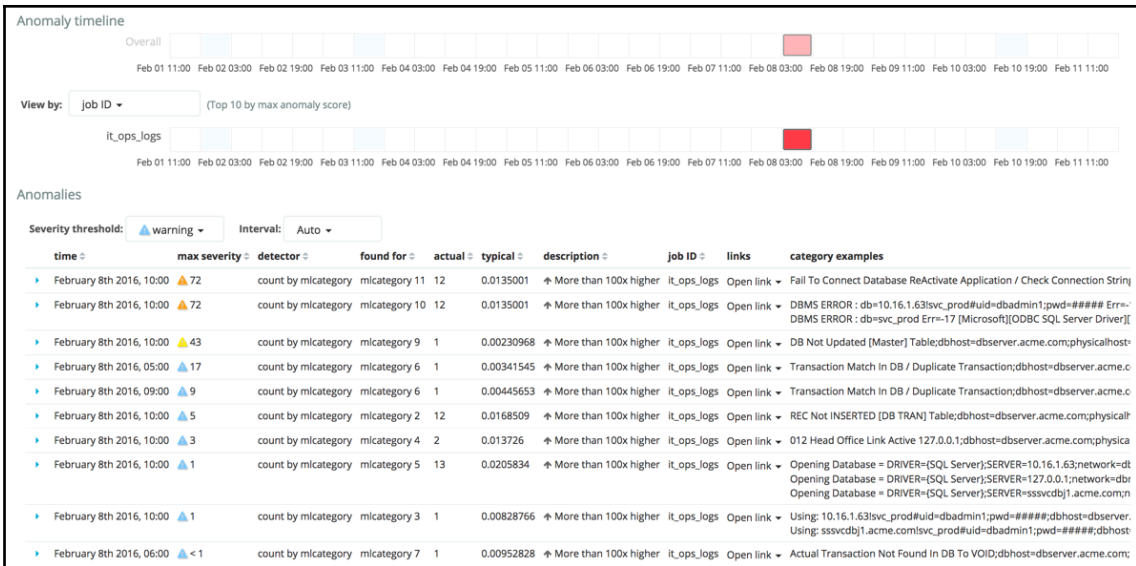
partition_field_name ⓘ

exclude_frequent ⓘ

[Help for count](#)

Add

Cancel



Chapter 4: IT Operational Analytics and Root Cause Analysis



Machine Learning / Job Management / Create New Job / Advanced Job Configuration

kibana

- Discover
- Visualize
- Dashboard
- Timelion
- Machine Learning**
- Graph
- Dev Tools
- Monitoring
- Management

Create a new job

Job Details | Analysis Configuration | **Datafeed** | Edit JSON | Data Preview

Datafeed job ⓘ

Query ⓘ

```
 {"match_all":{}}
```

Query delay ⓘ

60s

Frequency ⓘ

450s

scroll_size ⓘ

1000

Input index

Choose index from list

kibana

72,223,884 hits

Search... (e.g. status:200 AND extension:PHP)

Add a filter +

Add filter ✕

Filter Edit Query DSL

beat.name ▾ is one of ▾ site-search-es-1 ✕ site-search-es-2 ✕

Label

Optional

- site-search-es-9
- site-search-es-3**
- site-search-es-7
- site-search-es-8
- site-search-es-4
- site-search-es-11
- site-search-es-10
- site-search-es-6

_score

t _type

kibana 21,145,314 hits

Search... (e.g. status:200 AND extension:PHP)

Discover **beat.name: "site-search-es-1, site-search-es-2, site-search-es-3"**

Visualize operational-analytics-metricbeat-*

kibana 21,145,314 hits New Save

Save Search

Discover only_es1_es2_es3

Visualize Save

kibana Machine Learning / Job Management / Create New Job / Multi Metric job

Discover

Visualize

Dashboard

Timeline

Machine Learning

Graph

Dev Tools

Monitoring

Management

From a New Search, Select Index 5 of 5

Filter... Name ▲

- demo-elastic-logs-2017.03
- operational-analytics-filebeat-*
- operational-analytics-metricbeat-*
- search-http-logs-*
- elastic-logs-*

Or, From a Saved Search 1-1 of 1 Manage saved searches

Filter... Name ▲

- only_es1_es2_es3

New job from saved search only_es1_es2_es3

Job settings

Fields

- event rate Count
- apache.status.bytes_per_request Mean
- apache.status.bytes_per_sec Mean
- apache.status.connections.async.closing Mean
- apache.status.connections.async.keep_alive Mean
- apache.status.connections.async.writing Mean

Sparse data ⓘ

Split Data

beat.name

Key Fields (Influencers)

- system.socket.local.ip
- system.socket.remote.ip
- added
- apache.status.hostname
- beat.hostname
- beat.name

Results

Document count

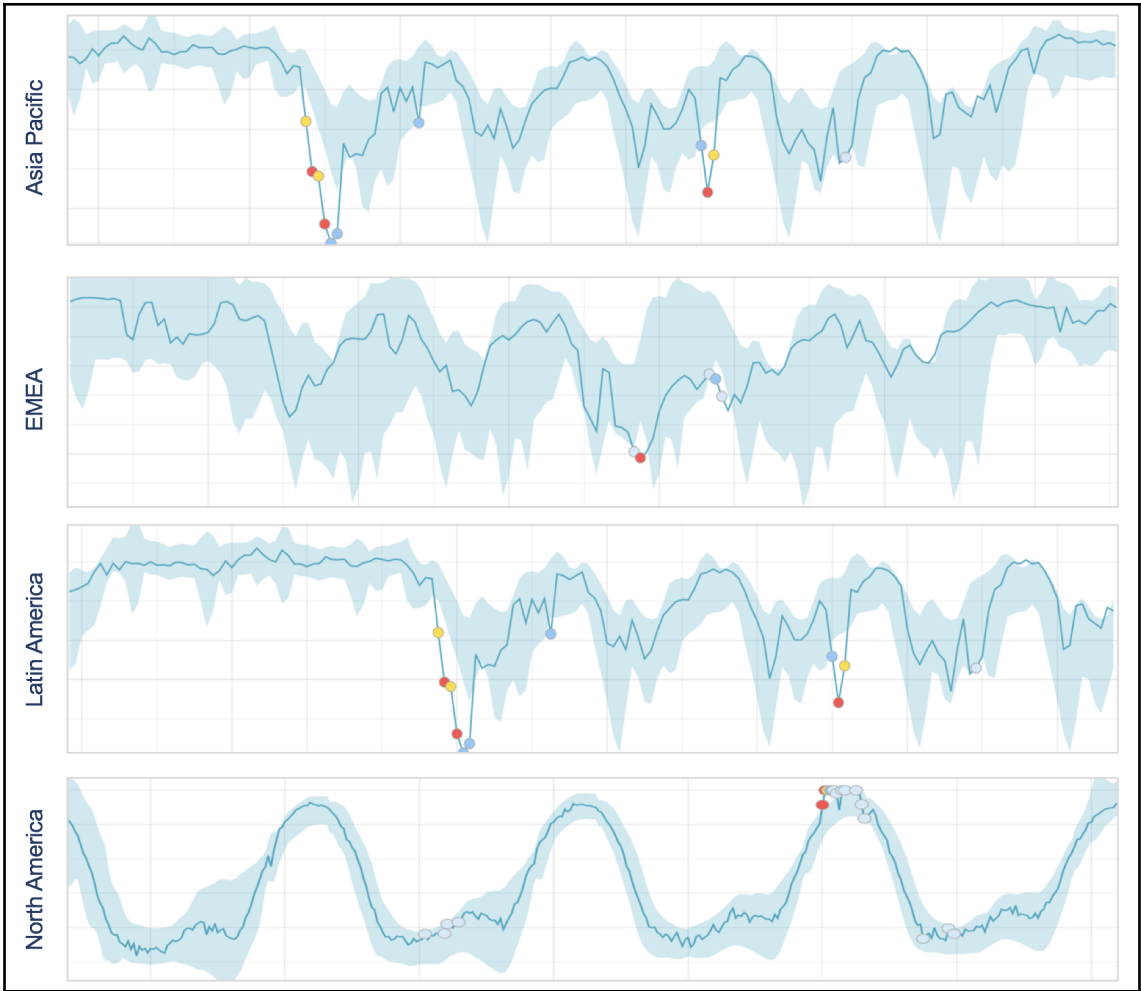
Beat Name	Document Count
site-search-es-3	~550,000
site-search-es-2	~650,000
site-search-es-1	~650,000

Data split by beat.name

- site-search-es-3
- site-search-es-2
- site-search-es-1

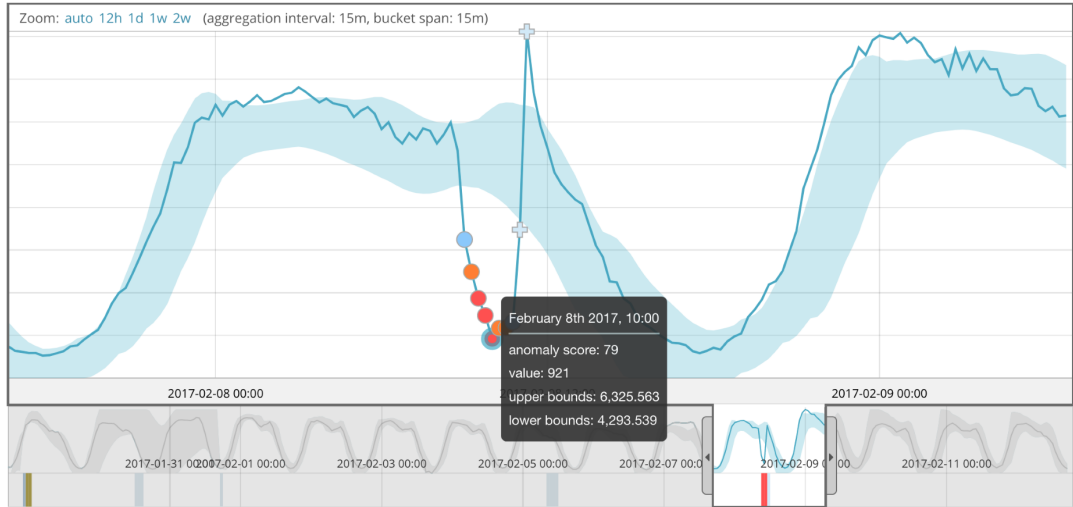
Count event rate

Time	Count event rate
Fri 17 12 PM	~14,000
Sat 18 12 PM	~14,000
Mar 19 12 PM	~14,000



Single time series analysis of sum events_per_min

show model bounds



Anomalies

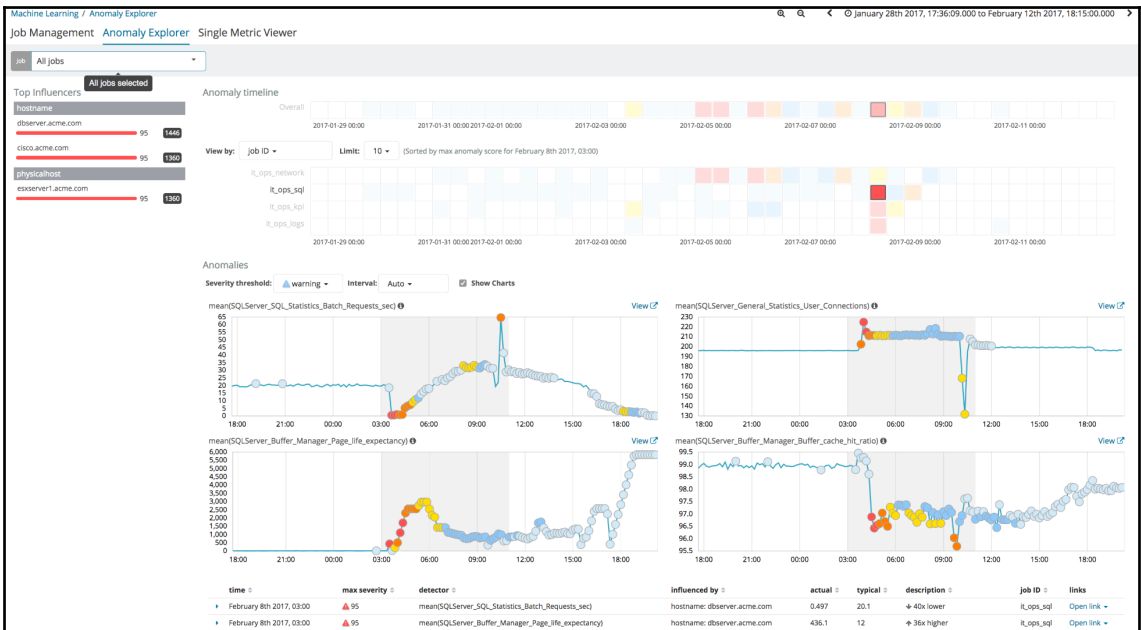
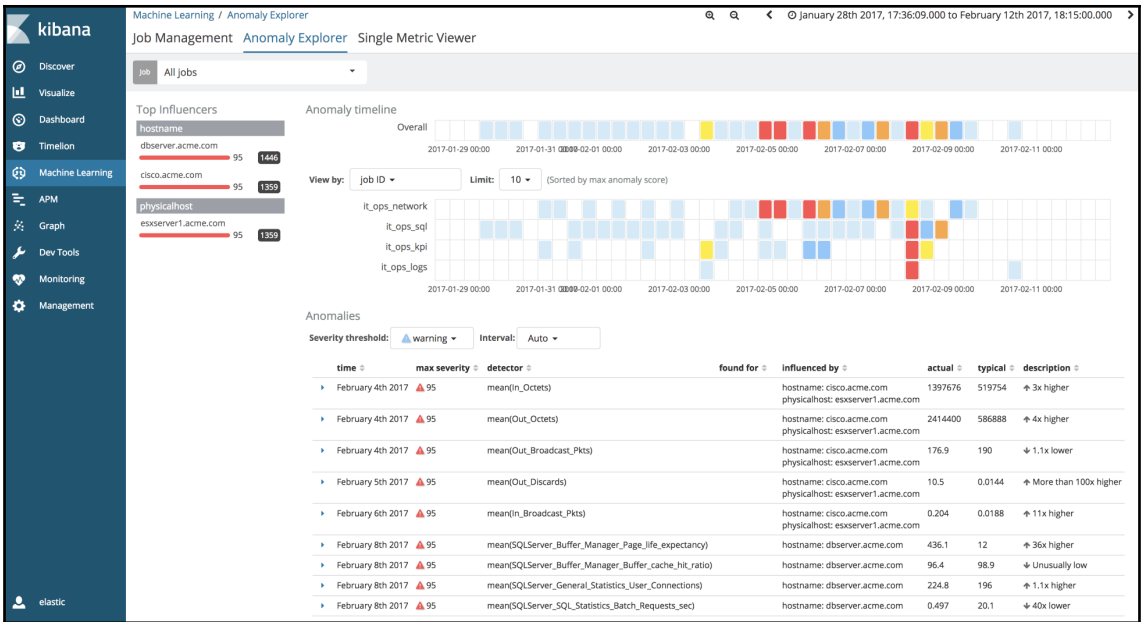
Severity threshold

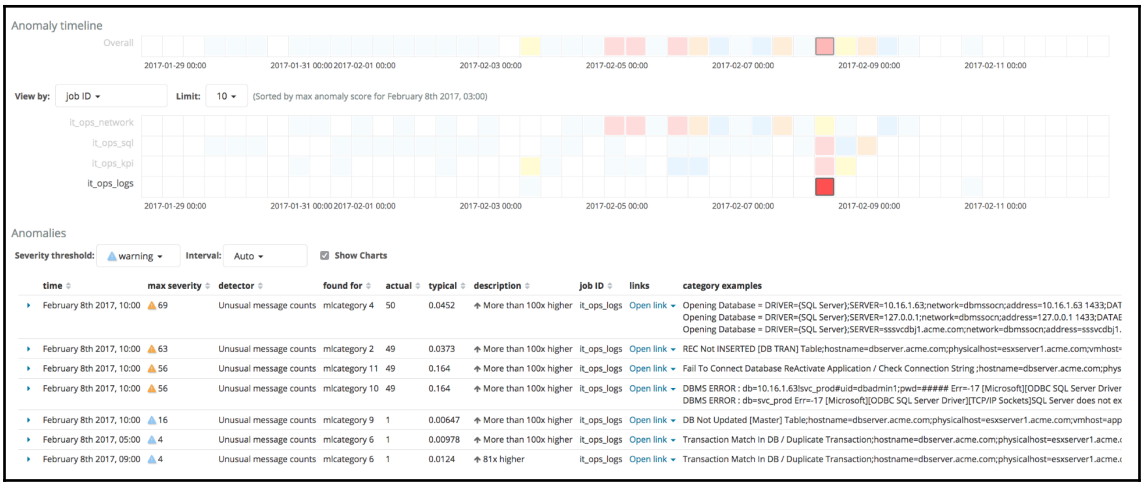
warning

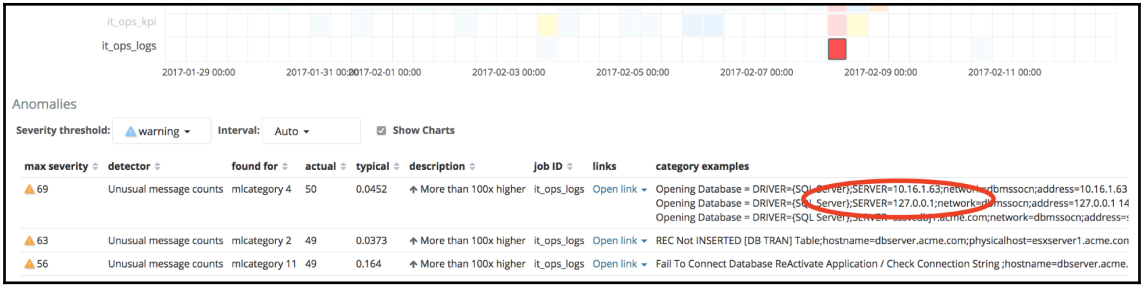
Interval

Auto

time	max severity ↓	detector	actual	typical	description	job ID	actions
> February 8th 2017, 09:00	● 94	Unexpected drop in orders	1,869	5,277.556	↓ 3x lower	a_orders_kpi	⚙️
> February 8th 2017, 10:00	● 79	Unexpected drop in orders	921	5,314.775	↓ 6x lower	a_orders_kpi	⚙️







Machine Learning / Anomaly Explorer

Job Management Anomaly Explorer Single Metric Viewer

Job: All jobs

Top Influencers

hostname	Score	Count
dbserver.acme.com	95	1446
cisco.acme.com	95	1360

physicalhost	Score	Count
esxserver1.acme.com	95	1360

Anomaly timeline

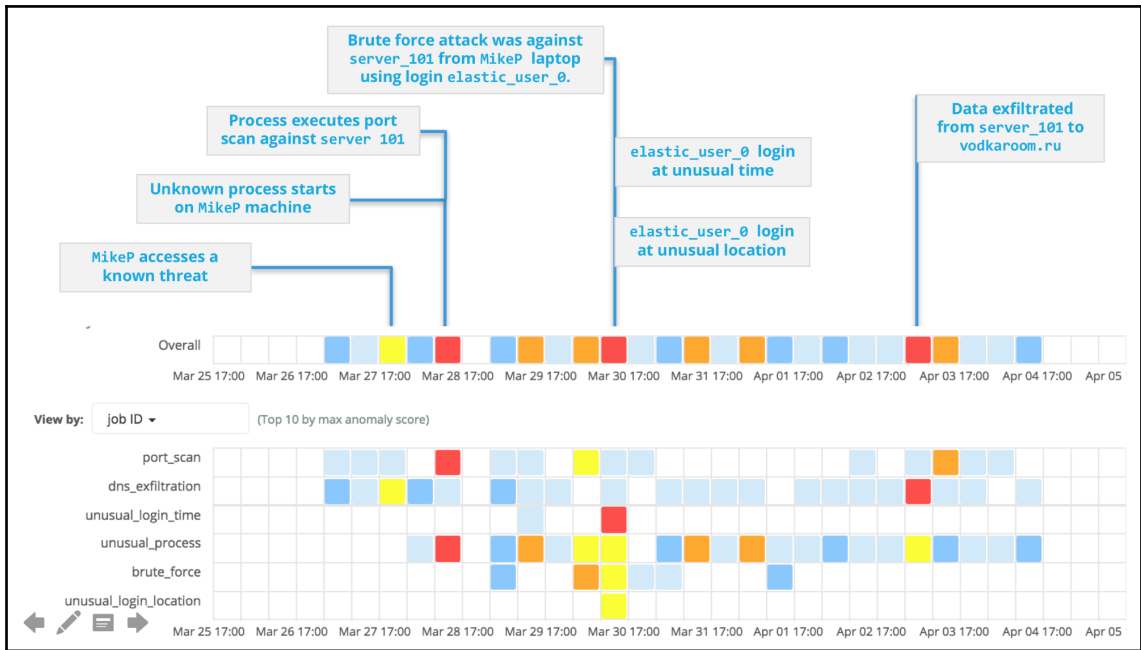
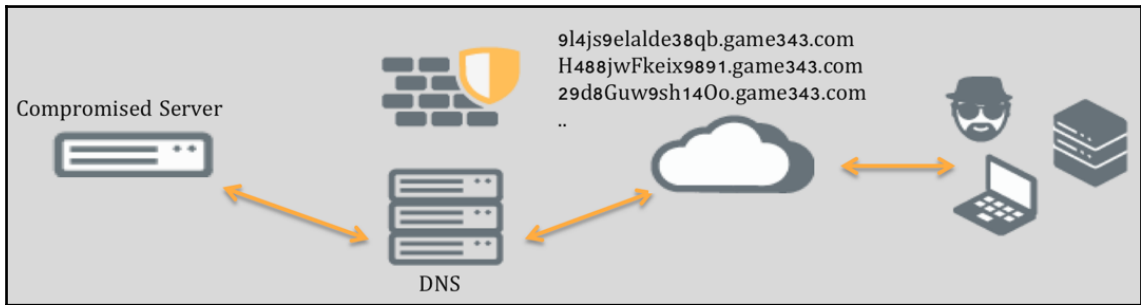
Overall: [Timeline visualization]







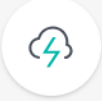

2017-01-29

View by: job ID

Metric	Score
it_ops_network	[Score]
it_ops_sql	[Score]
it_ops_kpi	[Score]
it_ops_logs	[Score]

Chapter 5: Security Analytics with Elastic Machine Learning



 <p>Filebeat Real-time insight into log data.</p> <p>Download</p>	 <p>Packetbeat Analyze network packet data.</p> <p>Download</p>	 <p>Winlogbeat Analyze Windows event logs.</p> <p>Download</p>	 <p>Metricbeat Ship and analyze metrics.</p> <p>Download</p>
 <p>Heartbeat Ping your Infrastructure.</p> <p>Download</p>	 <p>Auditbeat Send audit data to Elasticsearch.</p> <p>Download</p>	 <p>Functionbeat Ship cloud data with serverless infrastructure.</p> <p>Download</p>	 <p>Journalbeat Analyze Journald logs.</p> <p>Download</p>

-
- *AMQP fields*
 - *Beat fields*
 - *Cassandra fields*
 - *Cloud provider metadata fields*
 - *Common fields*
 - *DNS fields*
 - *Docker fields*
 - *Flow Event fields*
 - *HTTP fields*
 - *ICMP fields*
 - *Kubernetes fields*
 - *Memcache fields*
 - *MongoDb fields*
 - *MySQL fields*
 - *NFS fields*
 - *PostgreSQL fields*
 - *Raw fields*
 - *Redis fields*
 - *Thrift-RPC fields*
 - *TLS fields*
 - *Transaction Event fields*
 - *Measurements (Transactions) fields*

2,345,357 hits

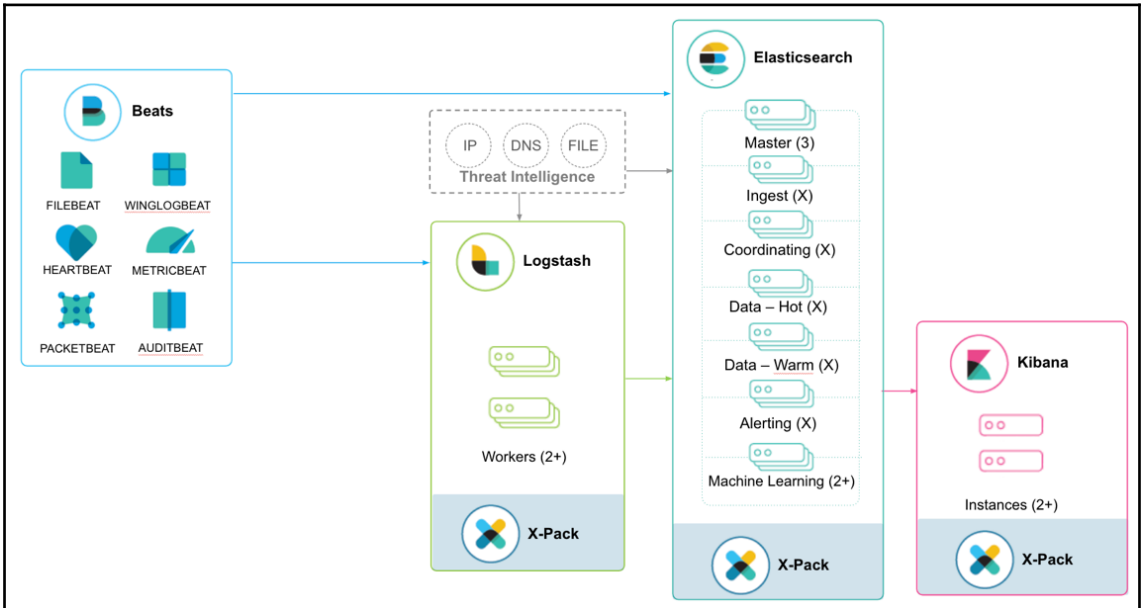
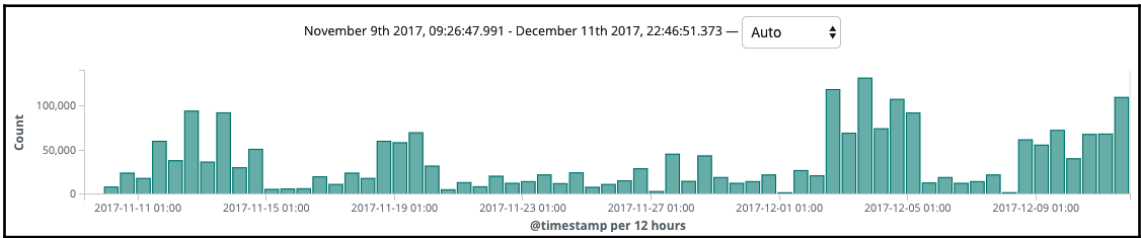
Search... (e.g. status:200 AND exte

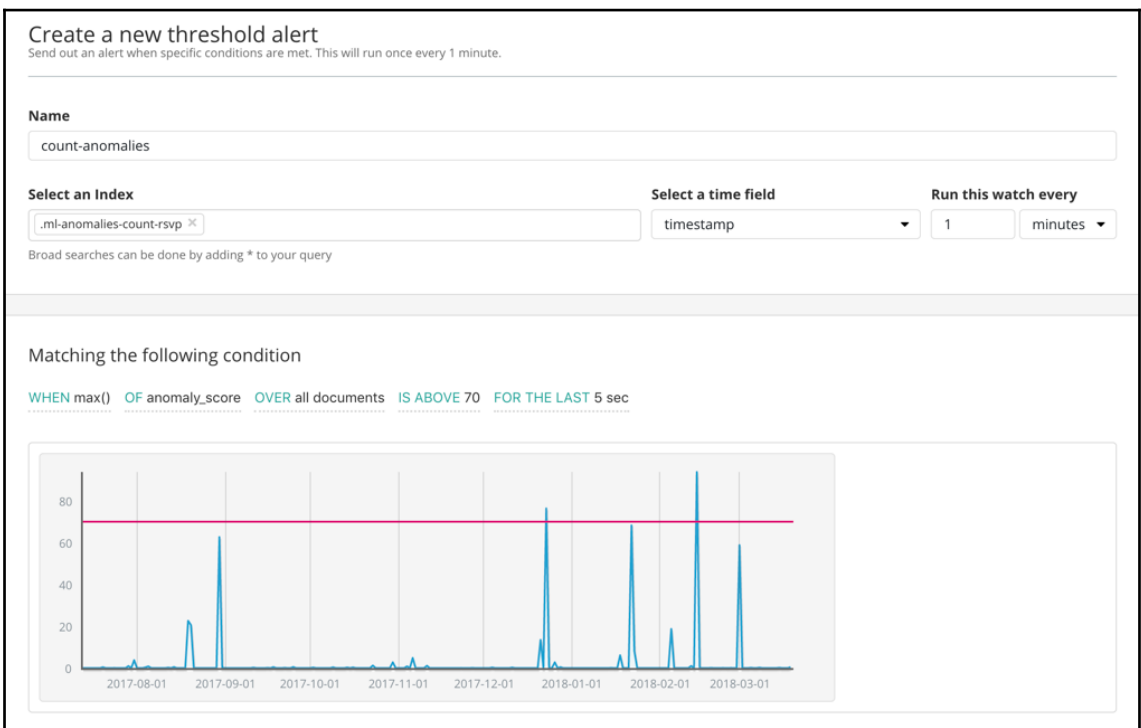
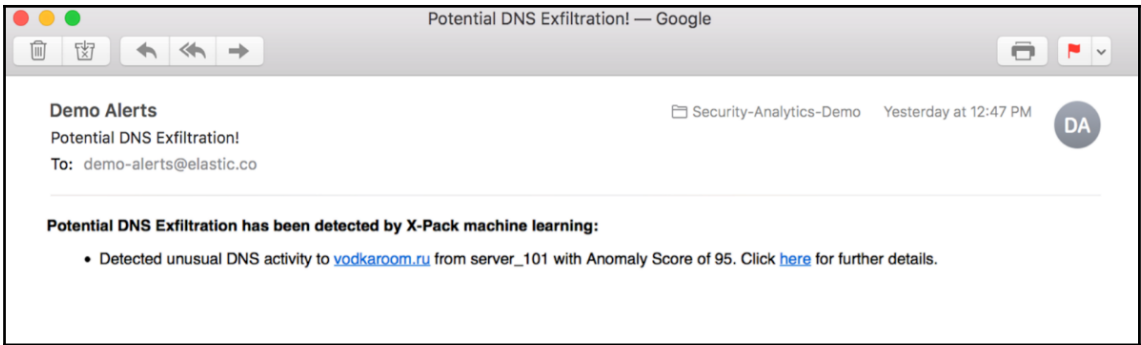
Add a filter +

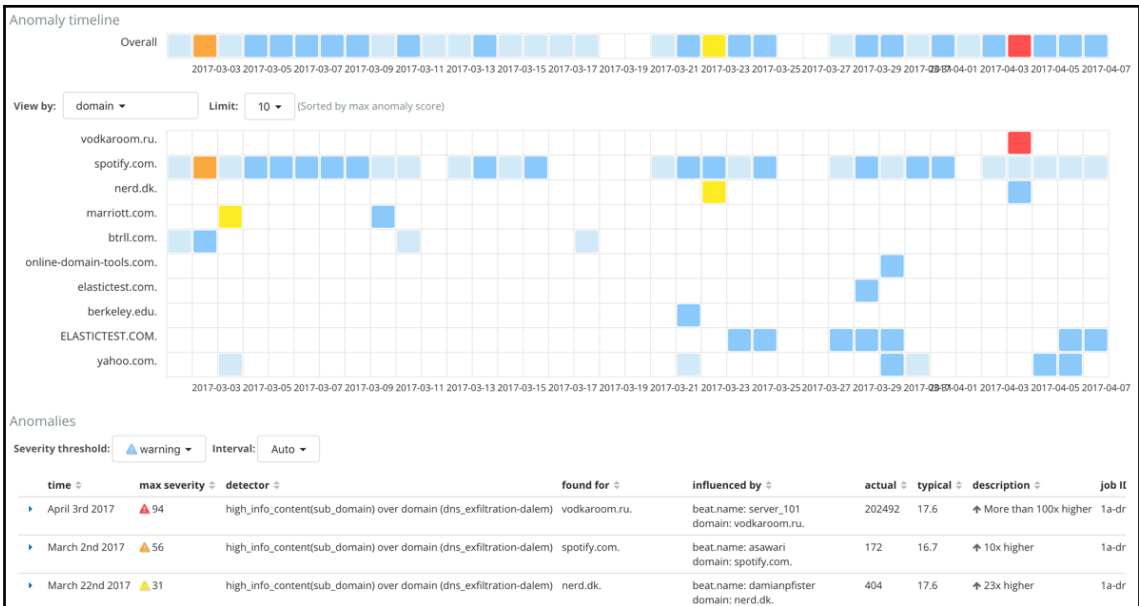
security-analytics-*

security-analytics-packetbeat-*

security-analytics-winlogbeat-*







Edit detector

Description ⓘ

high_info_content(sub_domain) over domain (dns_exfiltration-dalem)

function ⓘ **field_name** ⓘ **by_field_name** ⓘ

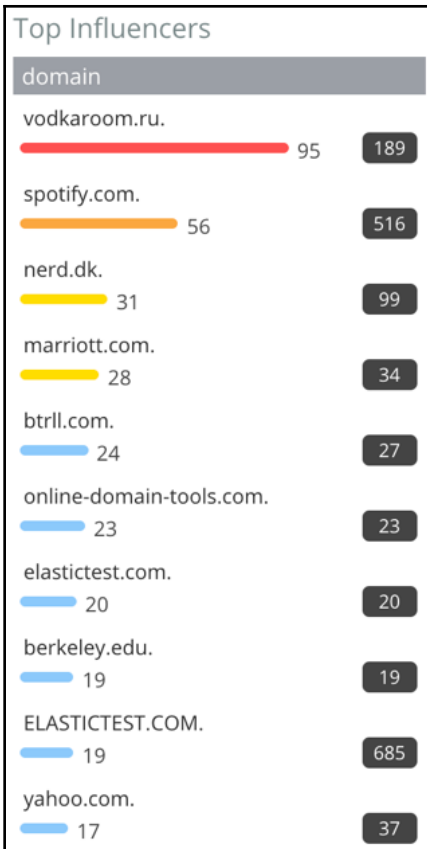
high_info_content × sub_domain × Select...

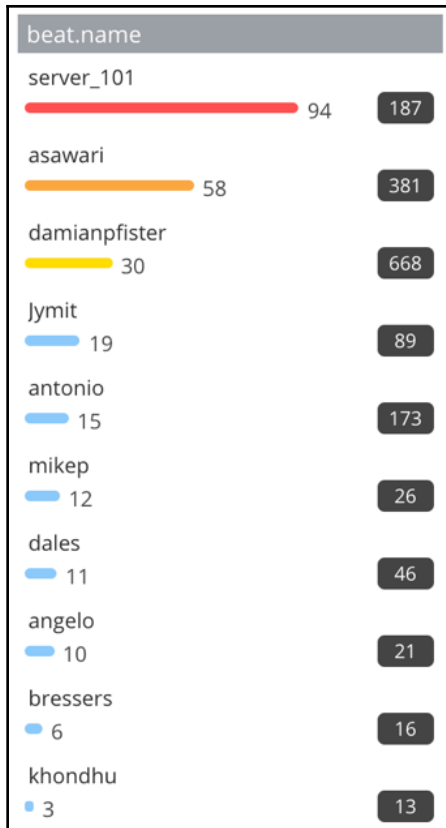
over_field_name ⓘ **partition_field_name** ⓘ **exclude_frequent** ⓘ

domain × Select... × all ×

[Help for high_info_content](#)

Update **Cancel**





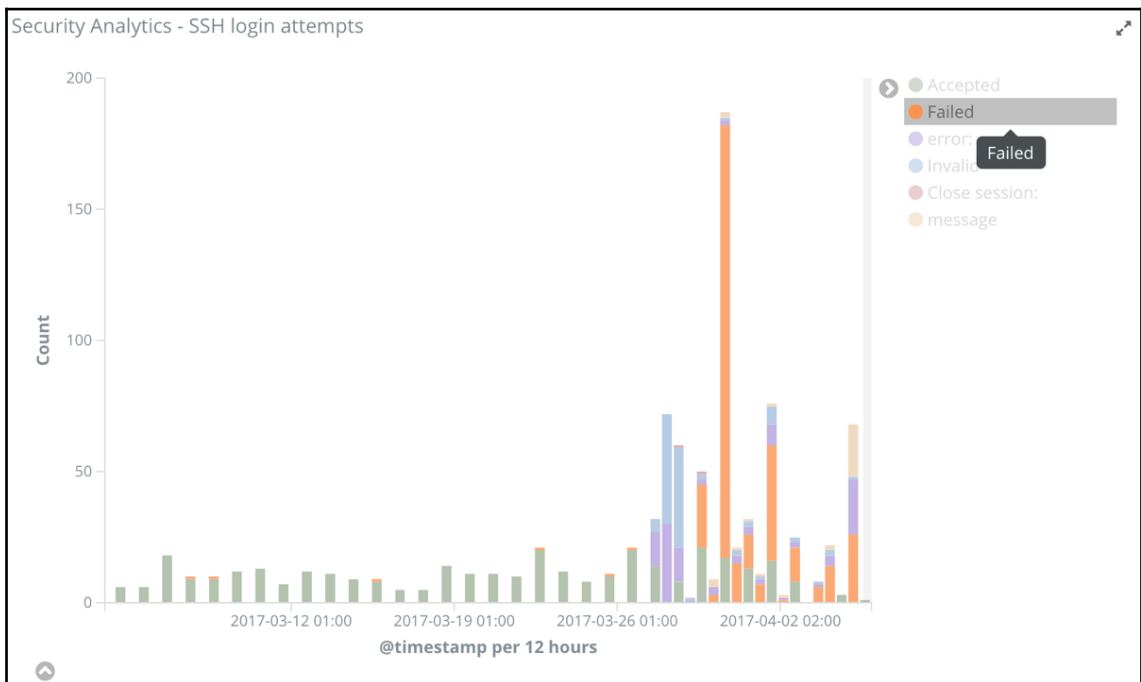
time	max severity	detector	found for	influenced by	actual	typical	description
April 3rd 2017, 14:00	▲ 94	high_info_content(sub_domain) over domain (dns_exfiltration-dalem)	vodkaroom.ru.	beat.name: server_101 domain: vodkaroom.ru.	202492	17.6	↑ More than 100x higher
<p>Description: critical anomaly in high_info_content(sub_domain) over domain (dns_exfiltration-dalem) found for domain vodkaroom.ru.</p> <p>Details on highest severity anomaly: domain: vodkaroom.ru. time: April 3rd 2017, 14:40:00 to April 3rd 2017, 14:45:00 function: high_info_content fieldName: sub_domain actual: 202492 typical: 17.6 job ID: 1a-dns_exfiltration probability: 4.216341836121852e-165</p> <p>Influenced by: beat.name: server_101 domain: vodkaroom.ru.</p>							

description	job ID	links
↑ More than 100x higher	1a-dns_exfiltration	Open link
Explore Server		

Dashboard / Server Overview

beat.name:server_101

[Add a filter +](#)



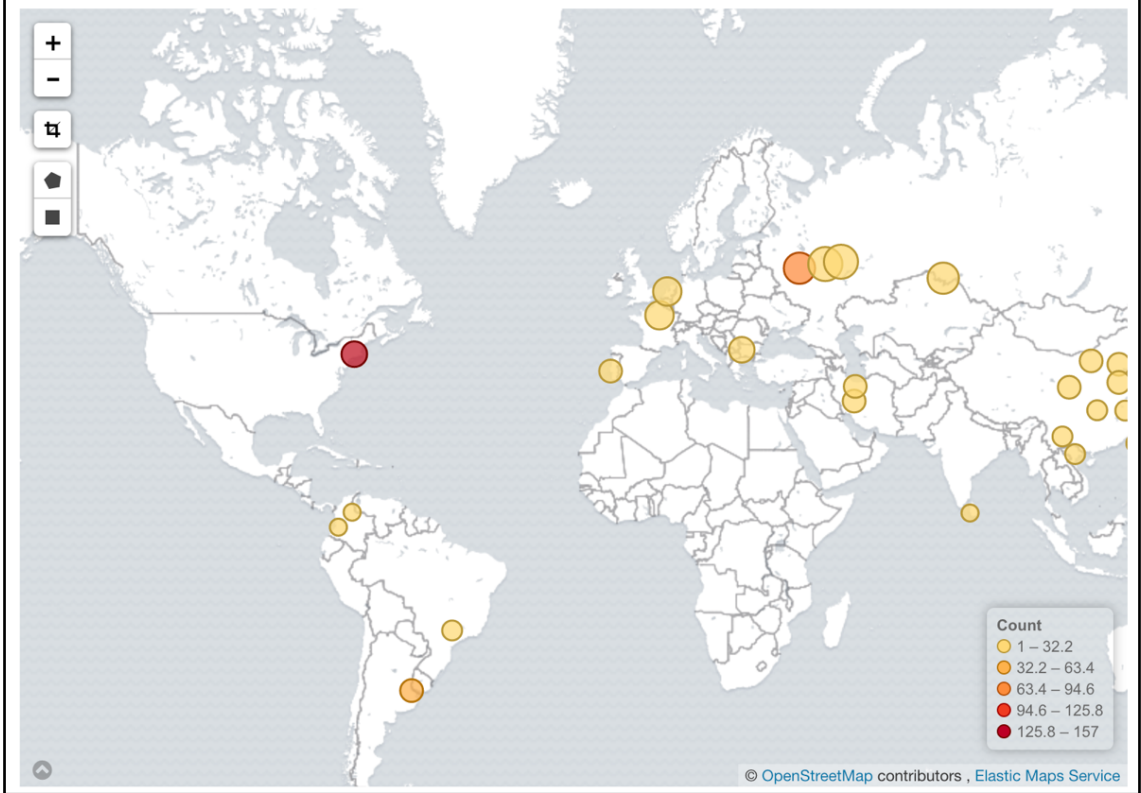
Security Analytics - SSH login attempts

1-50 of 934

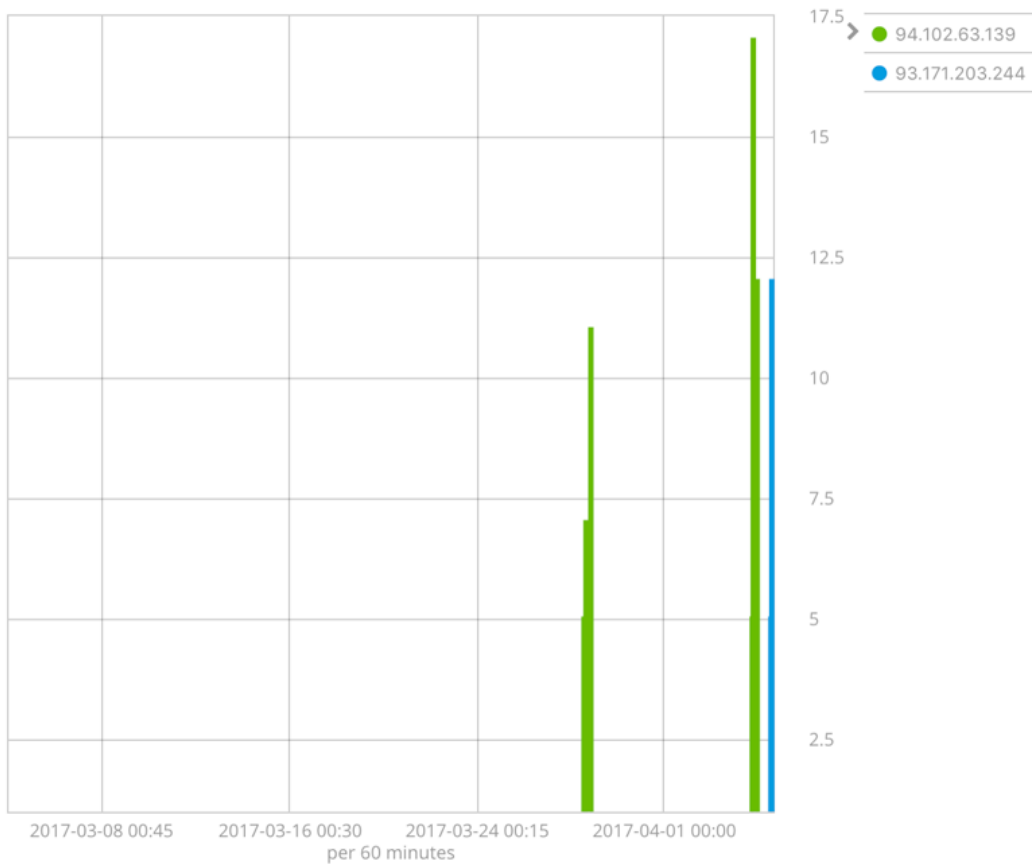


Time	system.auth.ssh.event	system.auth.ssh.method	system.auth.user	S
▶ April 5th 2017, 13:13:44.000	Accepted	publickey	ubuntu	8
▶ April 5th 2017, 09:45:38.000	error:	maximum authentication attempts exceeded	webconfig	6
▶ April 5th 2017, 09:45:38.000	Failed	password	webconfig	6
▶ April 5th 2017, 09:45:36.000	Failed	password	webconfig	6
▶ April 5th 2017, 09:45:34.000	Failed	password	webconfig	6
▶ April 5th 2017, 09:45:31.000	Failed	password	webconfig	6
▶ April 5th 2017, 09:45:29.000	Failed	password	webconfig	6
▶ April 5th 2017, 09:45:27.000	Failed	password	webconfig	6
▶ April 5th 2017, 09:45:25.000	Invalid	-	webconfig	6

Security Analytics - SSH failed login attempts source locations



Security Analytics - Threats Over Time

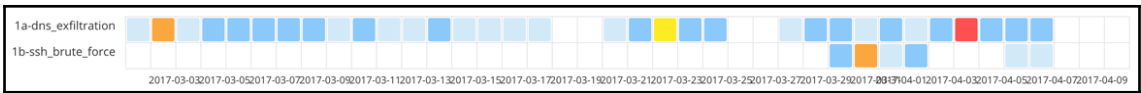


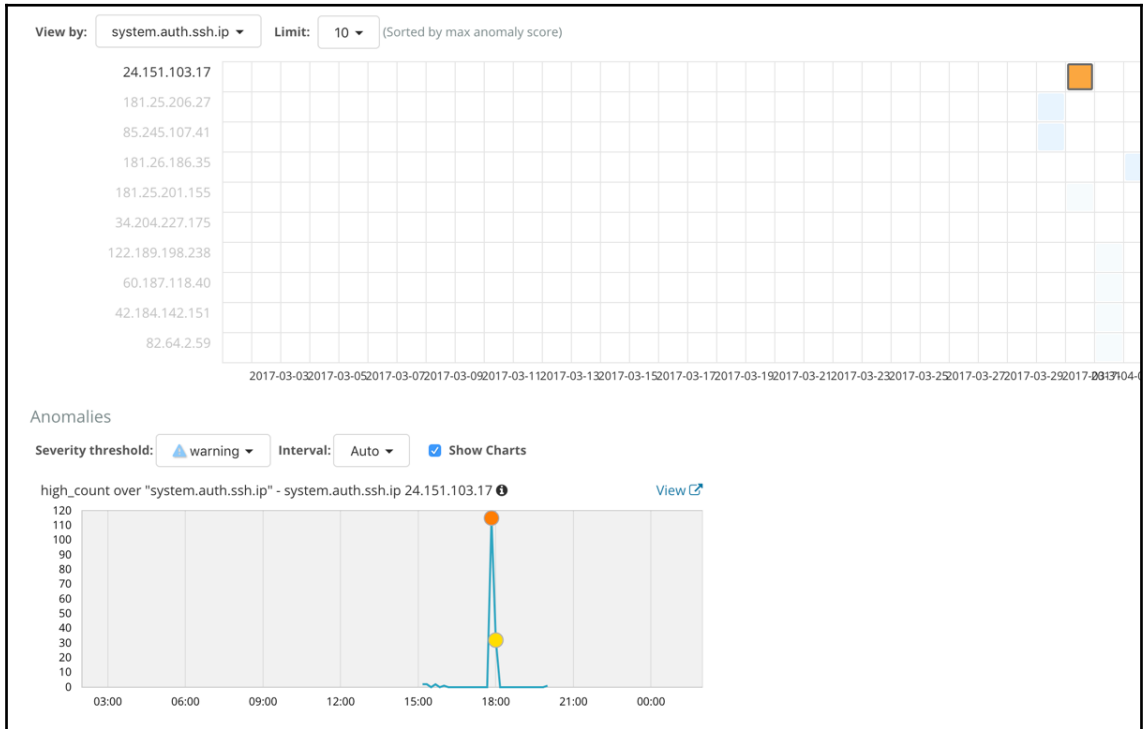
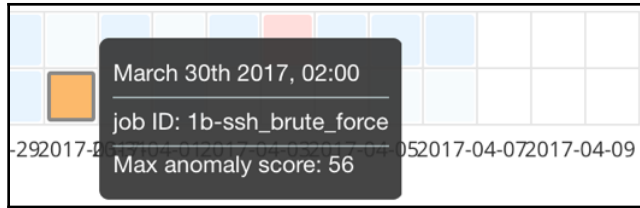
Job: 1a-dns_exfiltration and 1 other

Job Selection

Jobs

- 1a-dns_exfiltration
- 1b-ssh_brute_force



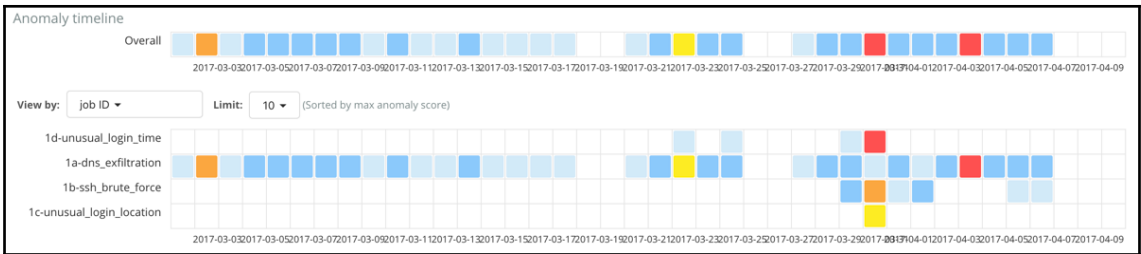


time	max severity	detector	found for	influenced by	actual	typical	description	job ID	links
March 30th 2017, 17:00	▲ 57	high_count over "system.auth.ssh.ip"	24.151.103.17	beat.name: server_101 system.auth.ssh.ip: 24.151.103.17 system.auth.user: elastic_user_0	115	1.09	⬆ More than 100x higher	1b-ssh_brute_force	Open link

Description:
 major anomaly in high_count over "system.auth.ssh.ip" found for system.auth.ssh.ip 24.151.103.17

Details on highest severity anomaly:
 system.auth.ssh.ip: 24.151.103.17
 time: March 30th 2017, 17:50:00 to March 30th 2017, 18:00:00
 function: high_count
 actual: 115
 typical: 1.09
 job ID: 1b-ssh_brute_force
 probability: 1.9642774070161522e-11

Influenced by:
 beat.name: server_101
 system.auth.ssh.ip: 24.151.103.17
 system.auth.user: elastic_user_0

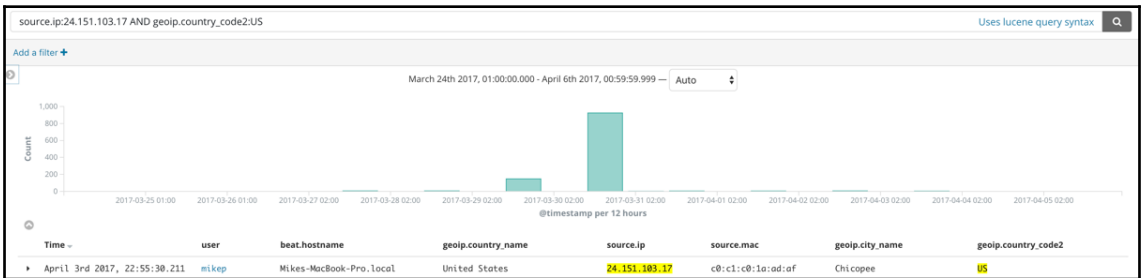


rare by user_location

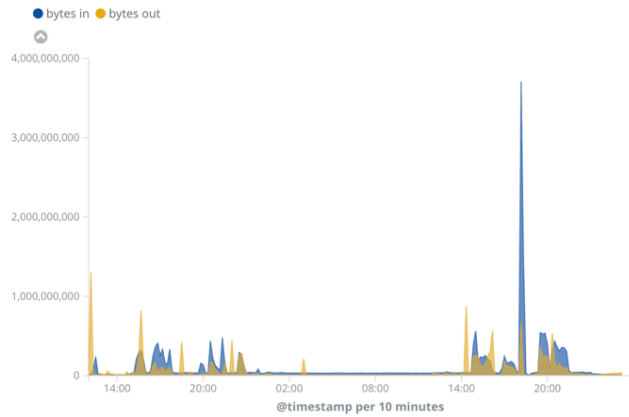
elastic_user_0_US beat.name: server_101
 system.auth.ssh.geolip.country_iso_code: US
 system.auth.ssh.ip: 24.151.103.17
 system.auth.user: elastic_user_0

1c-unusual_login_location [Open link](#)

[Identify Traffic Source](#)



Security Analytics - Bytes in vs Bytes Out



Security Analytics - Key Metrics

595 Unique # Domains

5,798 Unique # Ports

Security Analytics - Common Domains

akadns.net. storage.googleapis.com.

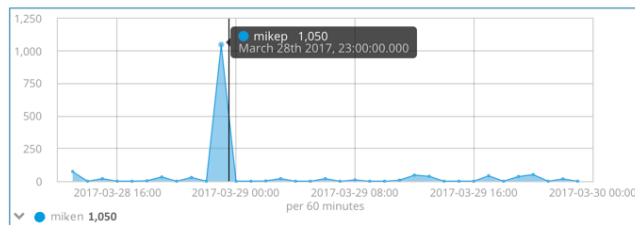
google.com.

gmail.com. gstatic.com. gvt2.com.

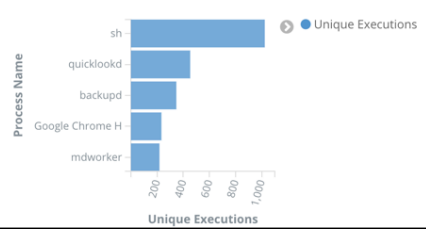
elastic.co. slack.com.

maps.googleapis.com. traveladvisories.com.

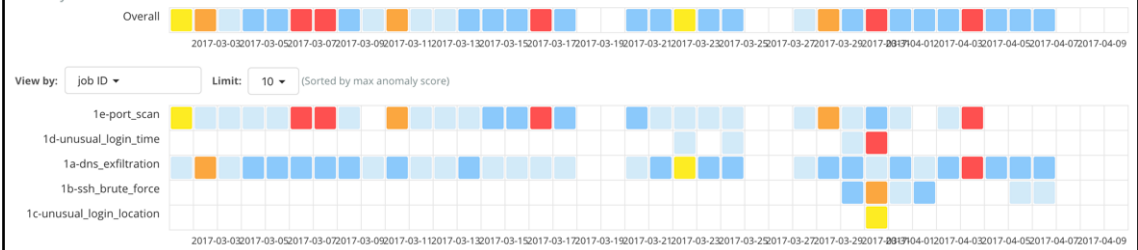
Security Analytics - Change in Outbound Port Usage



Security Analytics - Unique Process Executions



Anomaly timeline



time	max severity	detector	found for	influenced by	actual	typical	description	job ID	links
March 28th 2017, 23:00	▲ 85	high_distinct_count("dest.port") partitionfield="beat.name"	mikep	beat.name: mikep dest.ip: 34.253.76.153	654	39.7	↑ 16x higher	1e-port_scan	Open link
<p>Description: critical anomaly in high_distinct_count("dest.port") partitionfield="beat.name" found for beat.name mikep</p> <p>Details on highest severity anomaly: beat.name: mikep time: March 28th 2017, 23:20:00 to March 28th 2017, 23:30:00 function: high_distinct_count fieldName: dest.port actual: 654 typical: 39.7 job ID: 1e-port_scan probability: 2.762639714887249e-7</p> <p>Influenced by: beat.name: mikep dest.ip: 34.253.76.153</p>									

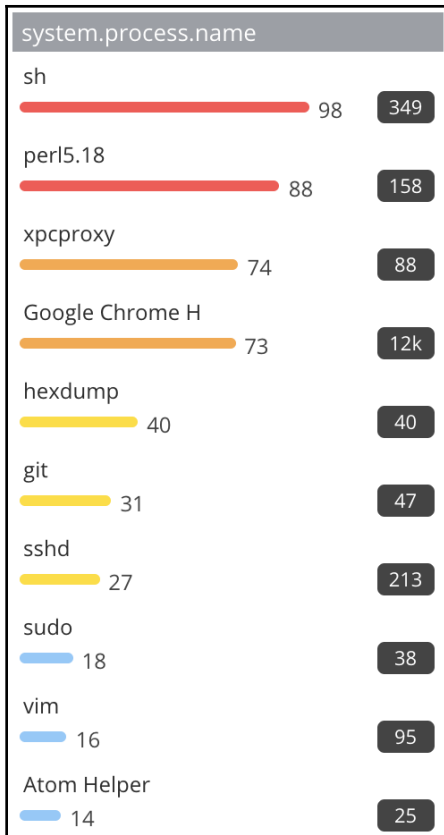
Job All jobs ▾

Job Selection

Jobs

- 1a-dns_exfiltration
- 1b-ssh_brute_force
- 1c-unusual_login_location
- 1d-unusual_login_time
- 1e-port_scan
- 1f-unusual_process

Apply
Cancel
 Also apply time range



Security Analytics - Domains by Unique Subdomain Count

Domains	IP	Graph Analysis	# of Subdomains
vodkaroom.ru.	5.101.152.77	Graph Analysis - vodkaroom.ru	5,445
ubuntu.com.	54.195.20.85	Graph Analysis - ubuntu.com	1
ubuntu.com.	54.216.255.40	Graph Analysis - ubuntu.com	1
ubuntu.com.	54.217.129.123	Graph Analysis - ubuntu.com	1

Threat Analysis

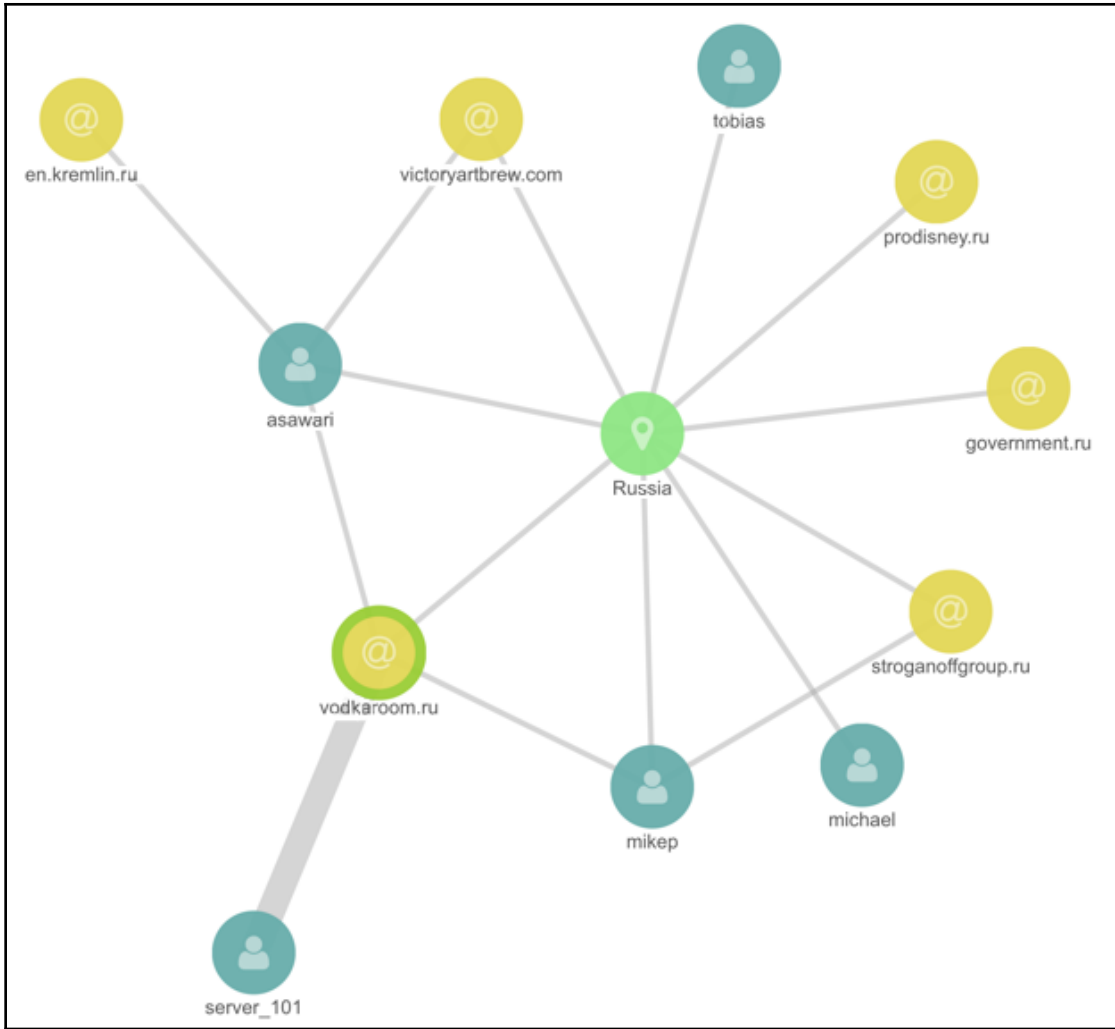
security-analytics-graph-*

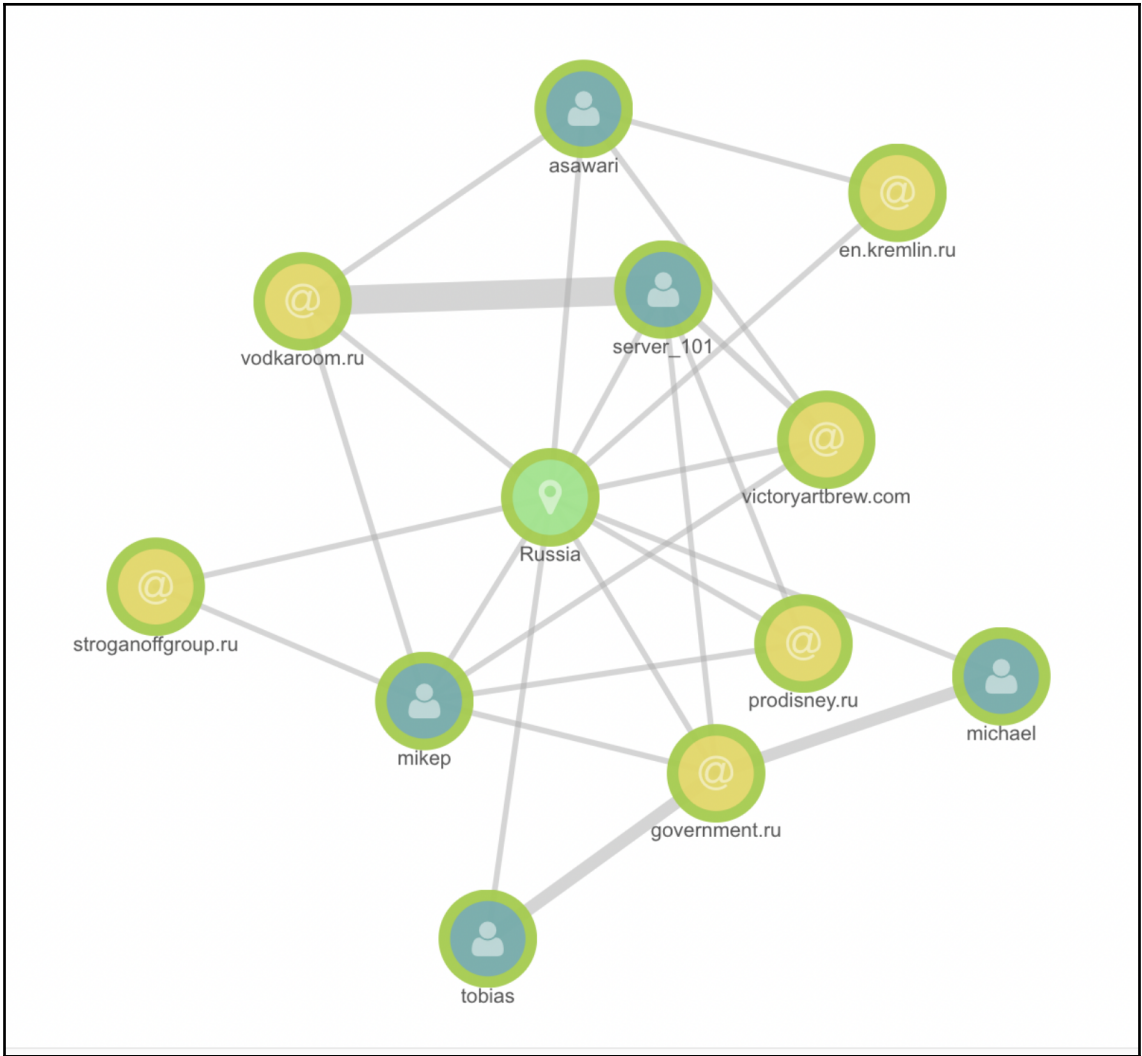


{"query_string": {"query": "vodkaroom.ru"}}



Sample size	<input type="text" value="2000"/>
	Terms are identified from samples of the most relevant documents. Bigger is not necessarily better - can be slower and less relevant.
	<input type="checkbox"/> Significant links
	Identify terms that are "significant" rather than simply popular
Certainty	<input type="text" value="3"/>
	The min number of documents that are required as evidence before introducing a related term
Diversity field	<input type="text" value="[No diversification] ↓"/>
	To avoid document samples being dominated by a single voice, pick the field that helps identify the source of bias. <i>This must be a single-term field or searches will be rejected with an error</i>
Timeout (ms)	<input type="text" value="5000"/>
	Max time in milliseconds a request can run






Chapter 6: Alerting on ML Analysis




Continue job in real-time




Create watch for real-time job

Time range **Severity threshold**

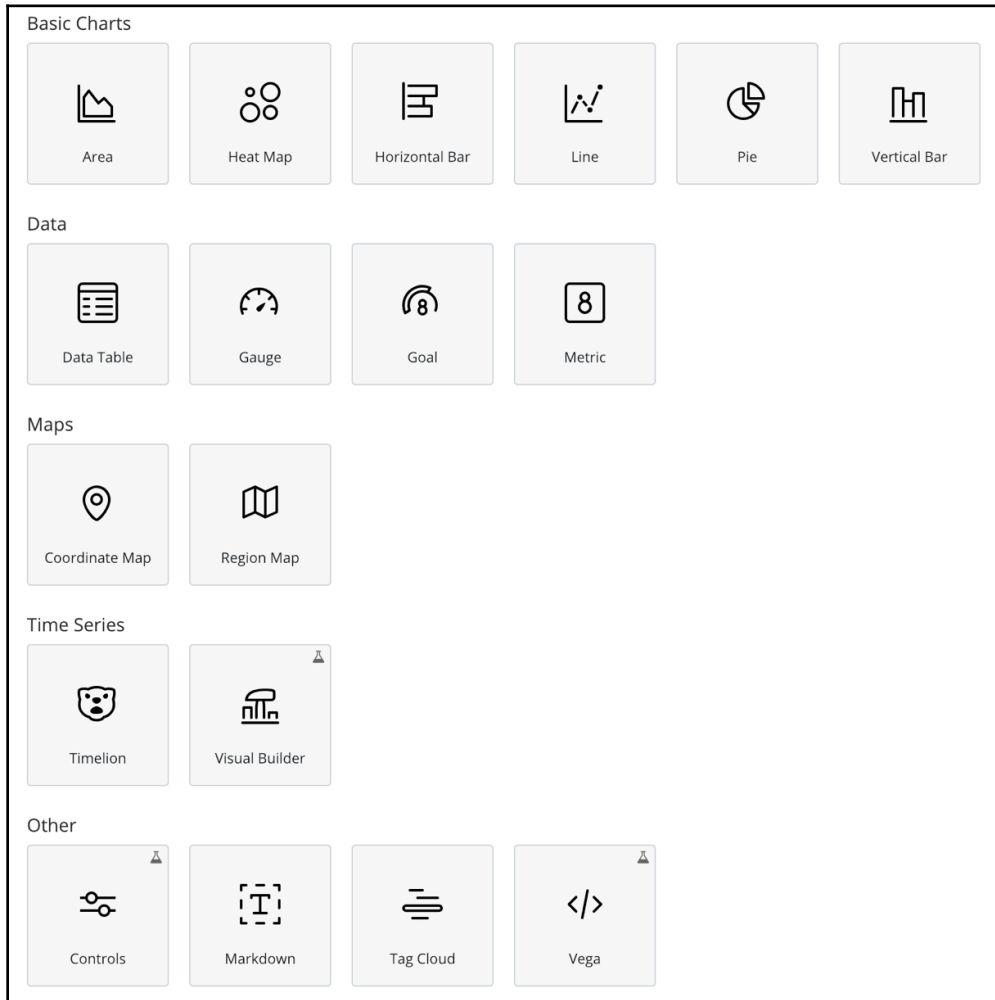
Now - 30m  critical ▾

Send email

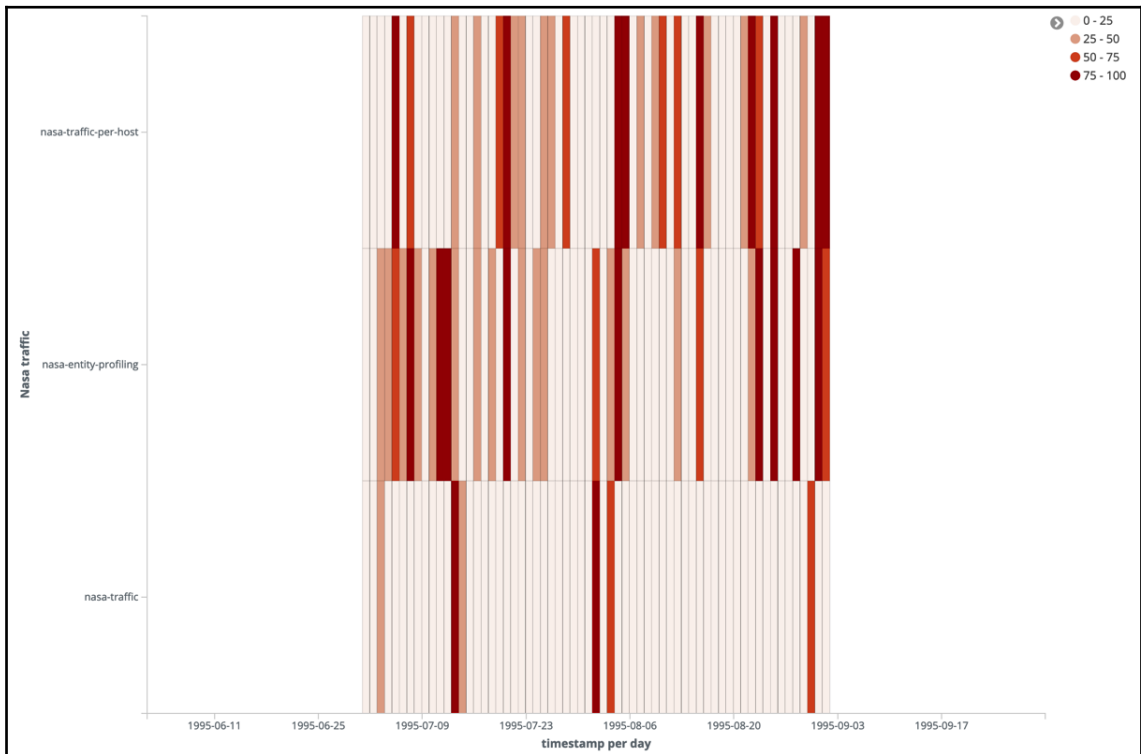
```
68 ▾ |      "aggs": {
69 ▾ |          "bucket_results": {,
139 ▾ |          "influencer_results": {,
180 ▾ |          "record_results": {}
224 ▾ |      }
```

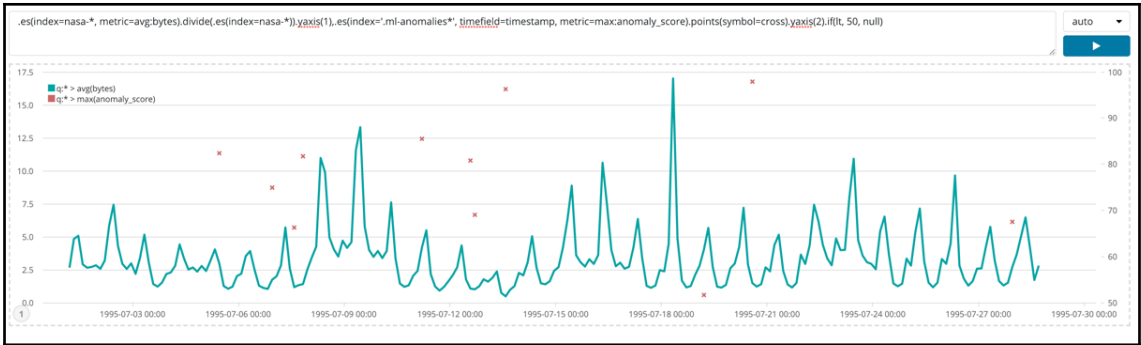
```
"input": {
  "chain": {
    "inputs": [
      {
        "job1": {}
      },
      {
        "job2": {}
      },
      {
        "job3": {}
      }
    ]
  }
},
```

Chapter 7: Using Elastic ML Data in Kibana Dashboards

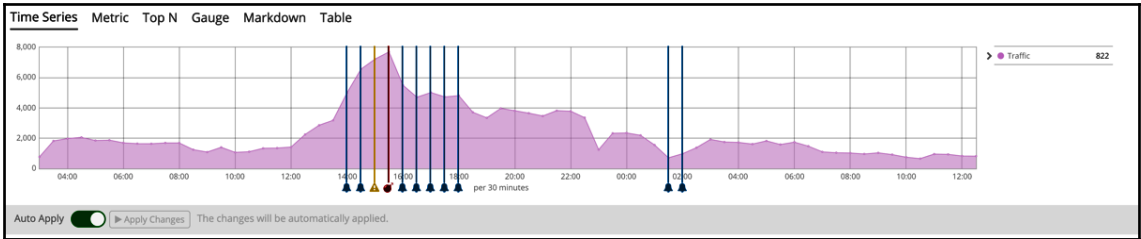


URI ▾	Hits ◆
/shuttle/missions/sts-69/mission-sts-69.html	24,589
/shuttle/missions/missions.html	47,298
/shuttle/countdown/liftoff.html	29,860
/shuttle/countdown/	64,737
/ksc.html	83,874
/images/WORLD-logosmall.gif	125,928
/images/USA-logosmall.gif	127,076
/images/NASA-logosmall.gif	208,728
/images/MOSAIC-logosmall.gif	127,912
/images/launchmedium.gif	40,684





Time Series Metric Top N Gauge Markdown Table

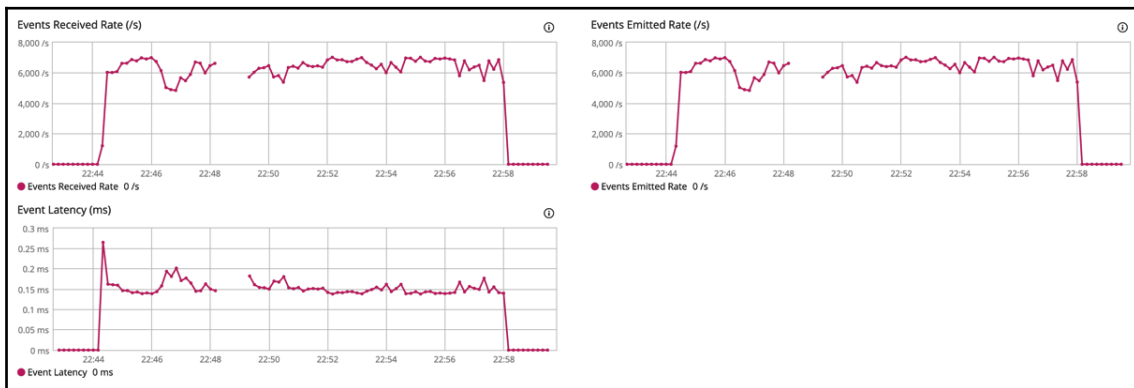


Description

NASA 90s HTTP Logs pipeline

Pipeline

```
1 input {
2   file {
3     id => "nasa_file"
4     path => "/Users/baha/Downloads/data/*.log"
5     start_position => "beginning"
6     sinedb_path => "/dev/null"
7   }
8 }
9
10 filter {
11   grok {
12     id => "nasa_grok_filter"
13     match => { "message" => "%{COMMONAPACHELOG}" }
14   }
15   date {
16     match => ["timestamp", "dd/MMM/yyyy:HH:mm:ss Z"]
17     target => "@timestamp"
18     remove_field => [ "timestamp" ]
19   }
20 }
21
22 output {
23   elasticsearch {
24     id => "nasa_elasticsearch_output"
25     hosts => "localhost:9200"
26     user => "elastic"
27     password => "*****"
28     index => "nasa-%{+YYYY.MM}"
29     template => "/Users/baha/Downloads/data/template.conf"
30     template_name => "nasa"
31     template_overwrite => "false"
32   }
33 }
34
35
36
```



Nodes: 1 Indices: 73 Memory: 702.0 MB / 990.8 MB Total Shards: 254 Unassigned Shards: 27 Documents: 30,508,248 Data: 11.4 GB

Q nasa

Name	Status ↓	Document Count	Data	Index Rate
nasa-1995.07	Yellow	1.9m	580.4 MB	0 /s
nasa-1995.08	Yellow	1.6m	469.5 MB	0 /s
nasa-1995.09	Yellow	10.6k	3.7 MB	0 /s

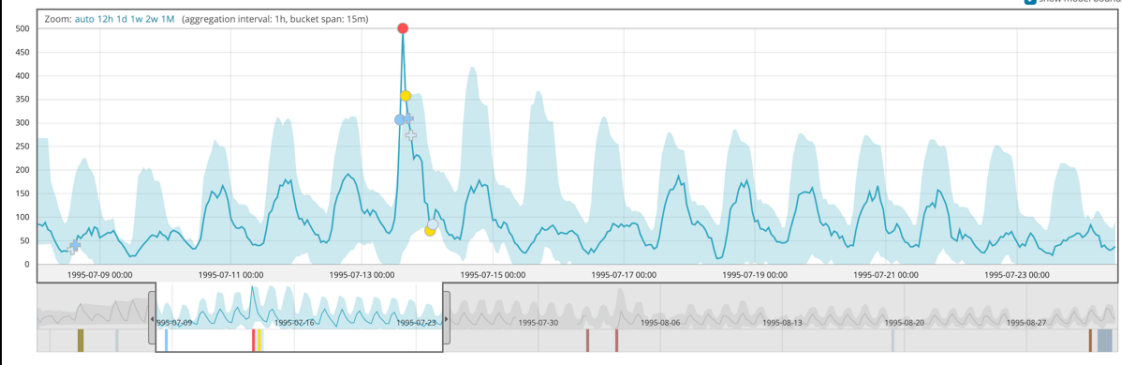
New job from index pattern nasa-*

Chart interval: 2h Use full nasa-* data



Single time series analysis of cardinality clientip.keyword

show model bounds



Create a job from the index pattern nasa-*

Use a wizard

Use one of the wizards to create a machine learning job to find anomalies in your data.



Single metric

Detect anomalies in a single time series.



Multi metric

Detect anomalies in multiple metrics by splitting a time series by a categorical field.



Population

Detect activity that is unusual compared to the behavior of the population.



Advanced

Use the full range of options to create a job for more advanced use cases.

Create a new job

Job Details

Analysis Configuration

Datafeed

Edit JSON

Data Preview

Name ?

nasa-response-code-analysis

Description ?

Job description

Job Groups ?

Job Group

Create a new job

Job Details

Analysis Configuration

Datafeed

Edit JSON

Data Preview

bucket_span ?

15m


summary_count_field_name ?

Select...

categorization_field_name ?

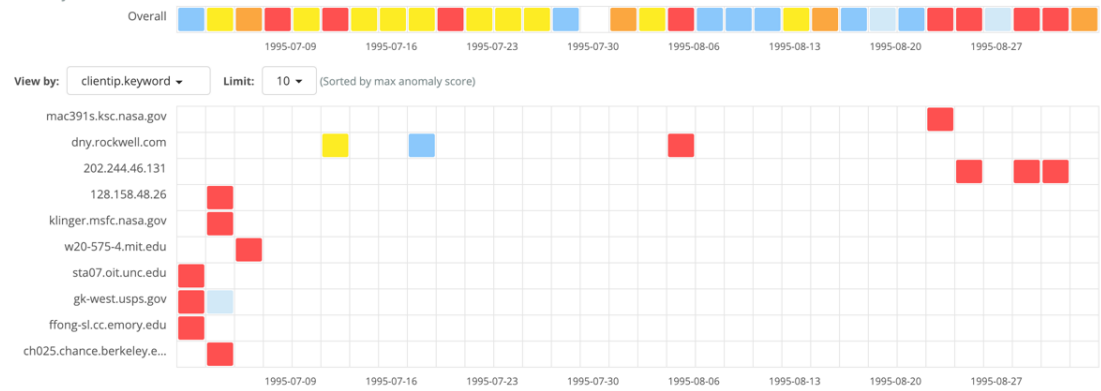
Select...

Detectors ?

high_count by "response.keyword" over "clientip.keyword"  

+ Add Detector

Anomaly timeline



Anomalies

Severity threshold

warning

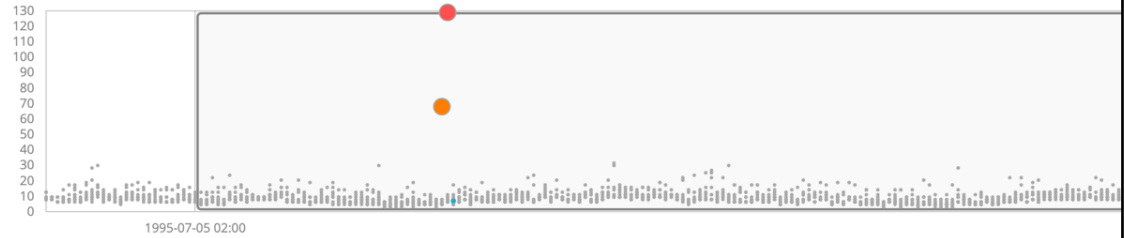
Interval

Auto

Show charts

high_count by "response.keyword" over "clientip.keyword" ⓘ

clientip.keyword **w20-575-4.mit.edu**



time	max severity ↓	detector	found for	influenced by	actual	typical	description
<input checked="" type="checkbox"/> July 5th 1995, 13:00	● 98	high_count by "response.keyword" over "clientip.keyword"	w20-575-4.mit.edu	clientip.keyword: w20-575-4.mit.edu			

Description

critical anomaly in high_count by "response.keyword" over "clientip.keyword" found for clientip.keyword w20-575-4.mit.edu

Details on highest severity anomaly

clientip.keyword	w20-575-4.mit.edu
time	July 5th 1995, 13:00:00 to July 5th 1995, 13:15:00
function	high_count
job ID	nasa-entity-profiling
probability	1.4375301598989583e-11
response.keyword values	200 (actual 119, typical 4.65, probability 2.2909176231980907e-9)
	404 (actual 10, typical 1.35, probability 0.00016246674219092243)

Influencers

clientip.keyword	w20-575-4.mit.edu
------------------	-------------------

Create a new job

Job Details

Analysis Configuration

Datafeed

Edit JSON

Data Preview

bucket_span ?

15m

summary_count_field_name ?

Select...

categorization_field_name ?

Select...

Detectors ?

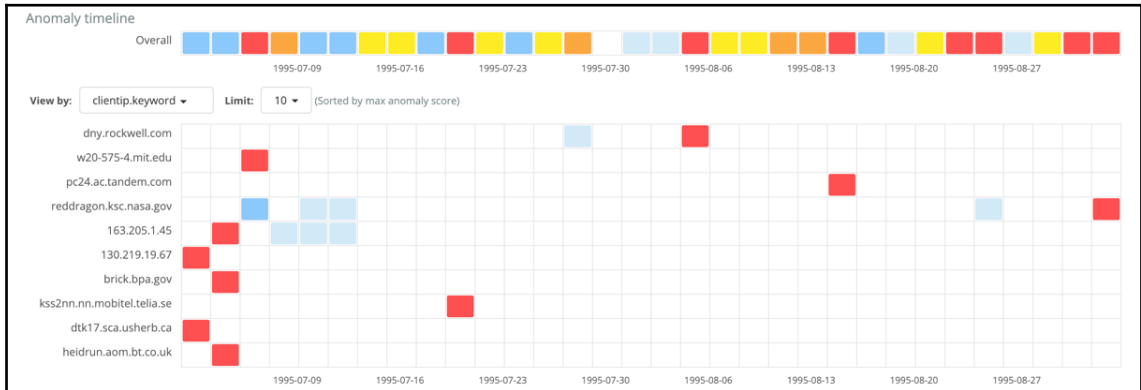
high_count over "clientip.keyword"



+ Add Detector

Influencers ?

- @version.keyword
- auth
- auth.keyword
- clientip
- clientip.keyword





Create index pattern

Kibana uses index patterns to retrieve data from Elasticsearch indices for things like visualizations. Include system indices

Step 1 of 2: Define index pattern

Index pattern

`.ml-anomalies*`

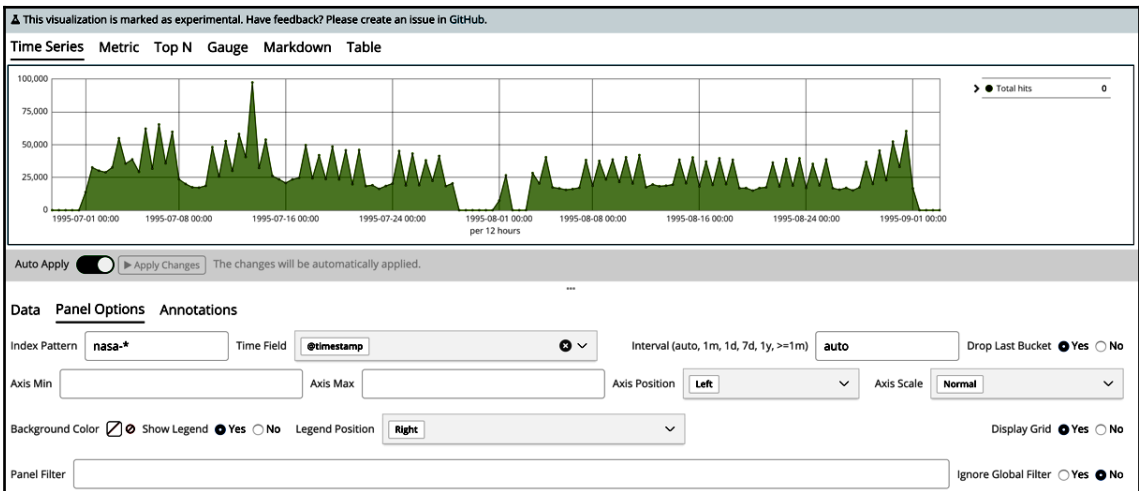
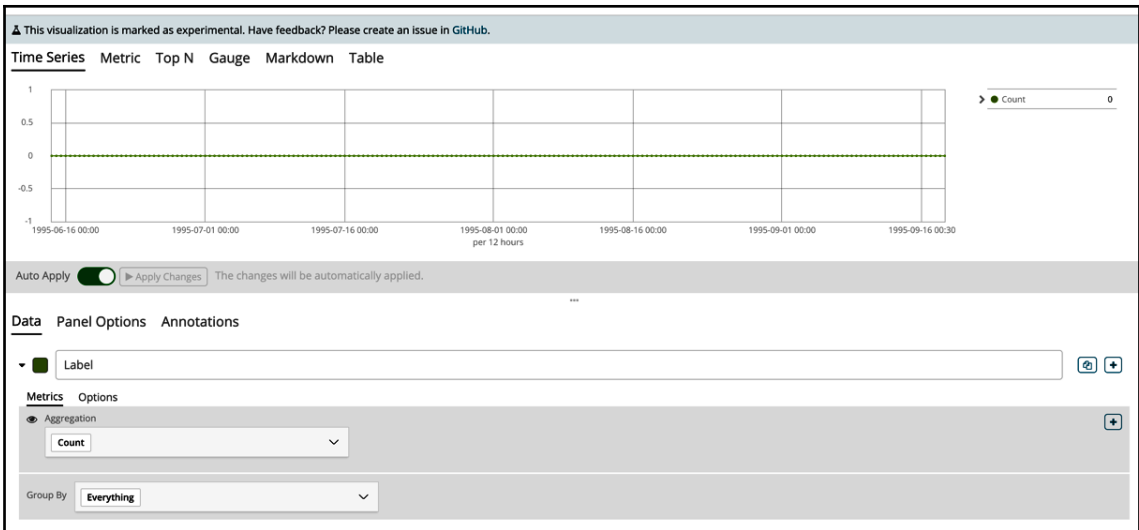
You can use a * as a wildcard in your index pattern.
You can't use spaces or the characters \, /, ?, ", <, >, |.

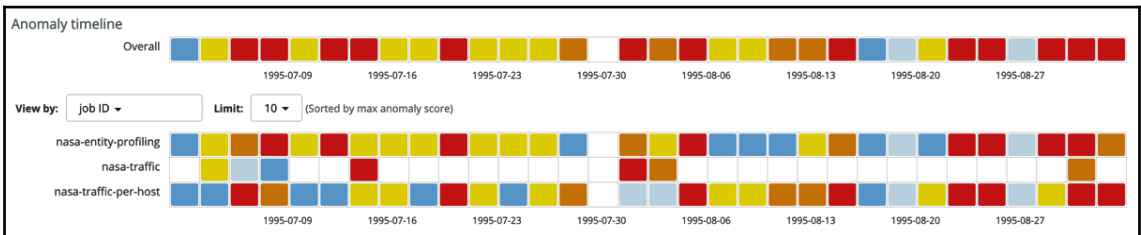
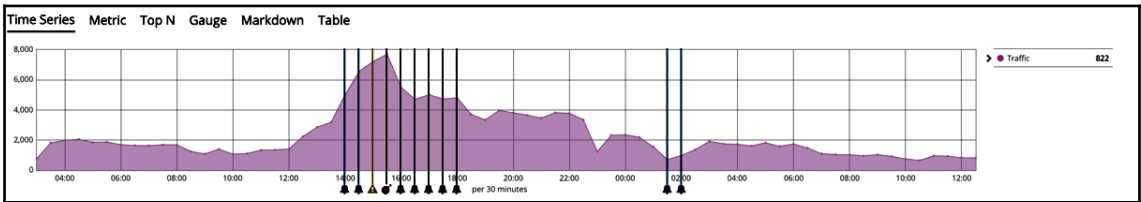
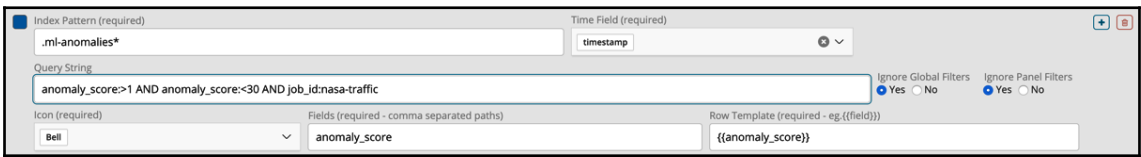
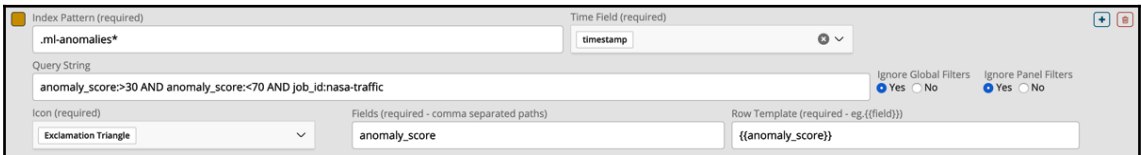
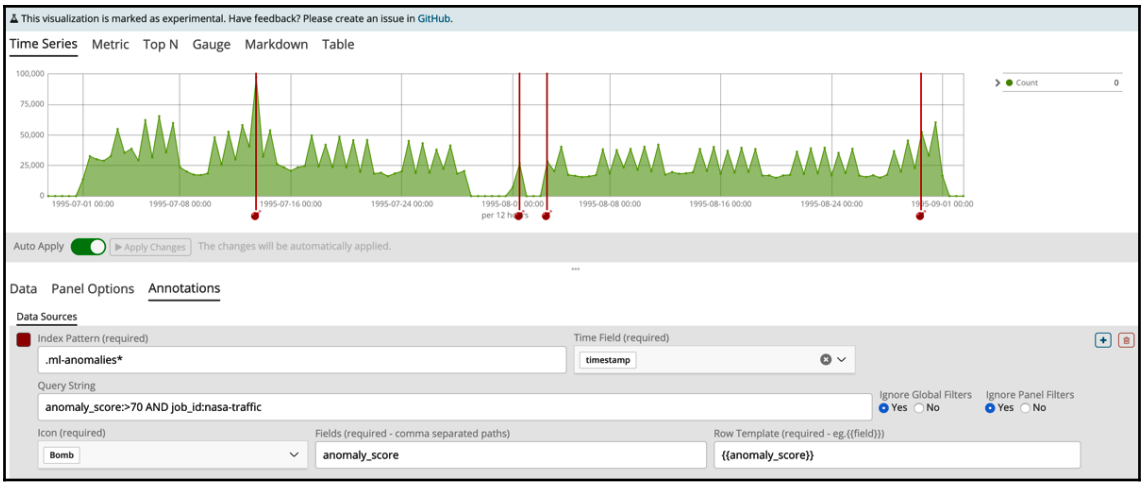
[> Next step](#)

✓ **Success! Your index pattern matches 3 indices.**

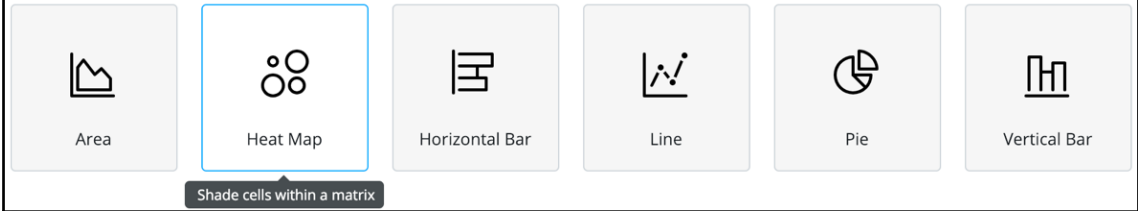
- `.ml-anomalies-custom-nasa-entity-profiling`
- `.ml-anomalies-custom-nasa-traffic-per-host`
- `.ml-anomalies-shared`

Rows per page: 10



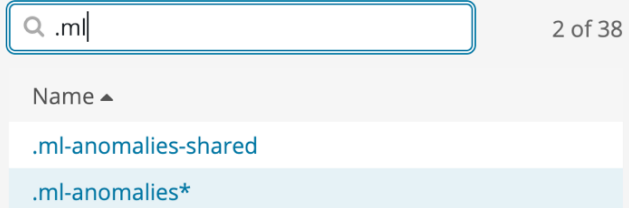


Basic Charts



A horizontal menu titled "Basic Charts" containing six chart type icons: Area, Heat Map, Horizontal Bar, Line, Pie, and Vertical Bar. The "Heat Map" icon is highlighted with a blue border. Below the "Heat Map" icon is a tooltip that reads "Shade cells within a matrix".

From a New Search, Select Index



A search interface showing a search bar with the text ".ml" and a magnifying glass icon. To the right of the search bar, it says "2 of 38". Below the search bar, there is a list of search results under the heading "Name ▲". The results are ".ml-anomalies-shared" and ".ml-anomalies*", with the latter being highlighted in blue.

.ml-anomalies*

Data Options ▶ ×

Metrics

▶ Value Count

Buckets

▼ X-Axis ☐ ×

Aggregation [Date Histogram help](#)

Date Histogram ▼

Field

timestamp ▼

Interval

Auto ⬆ ⬇ ⬆

Custom Label

[Advanced](#)

[Add sub-buckets](#)

Y-Axis ← Advanced

Sub Aggregation Terms help

Terms

Field

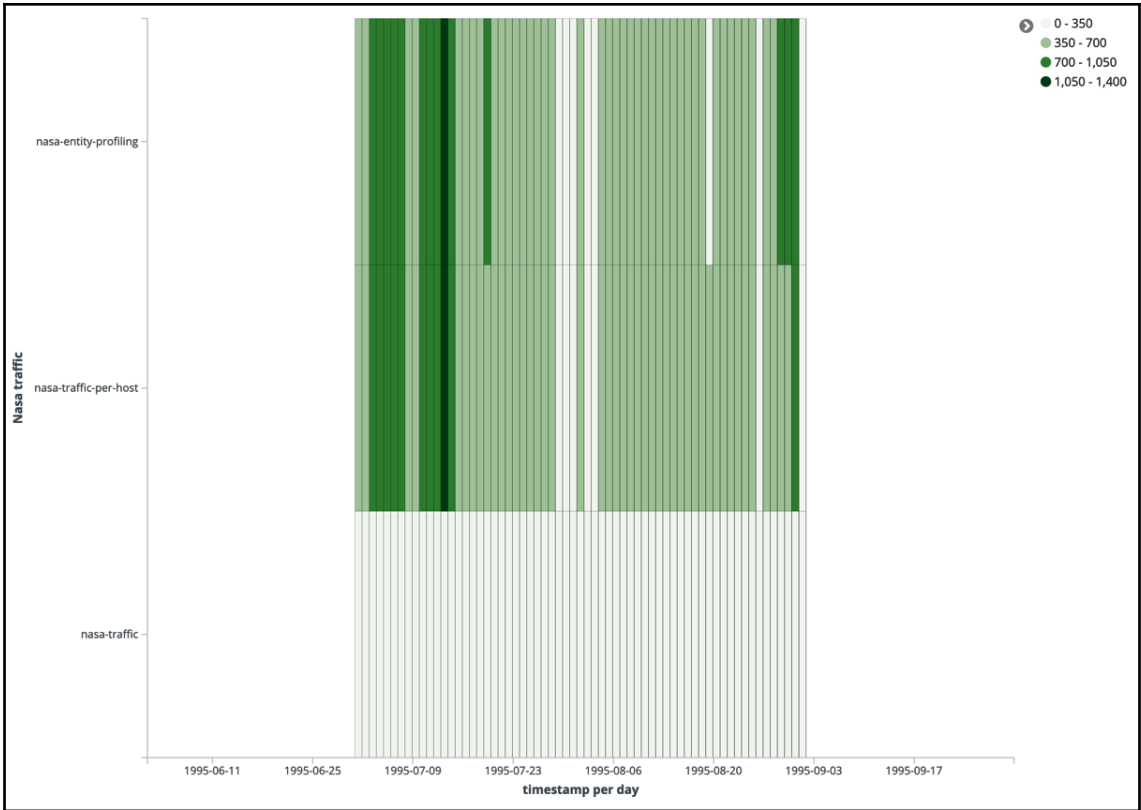
Order By

Order Size

Group other values in separate bucket (?)

Show missing values (?)

Custom Label



Metrics

Value

Aggregation [Max help](#)

Max

Field

anomaly_score

Custom Label

[Advanced](#)

.ml-anomalies*

Data Options ▶ ✕

Basic Settings

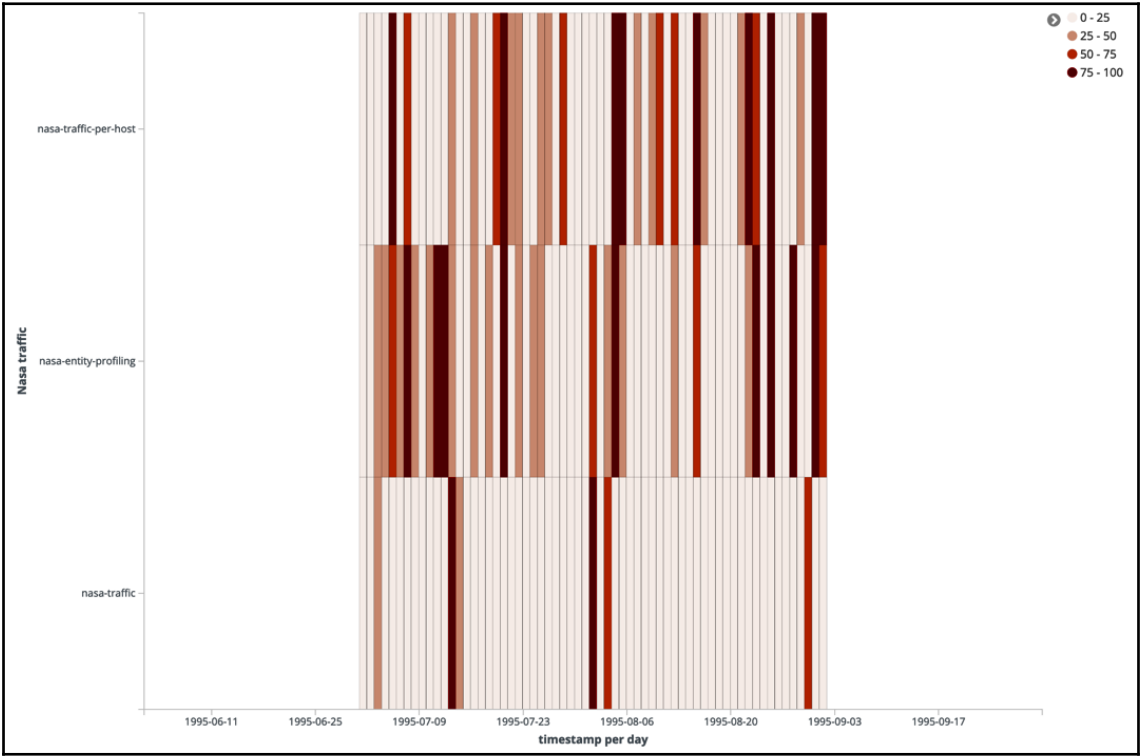
Show Tooltips

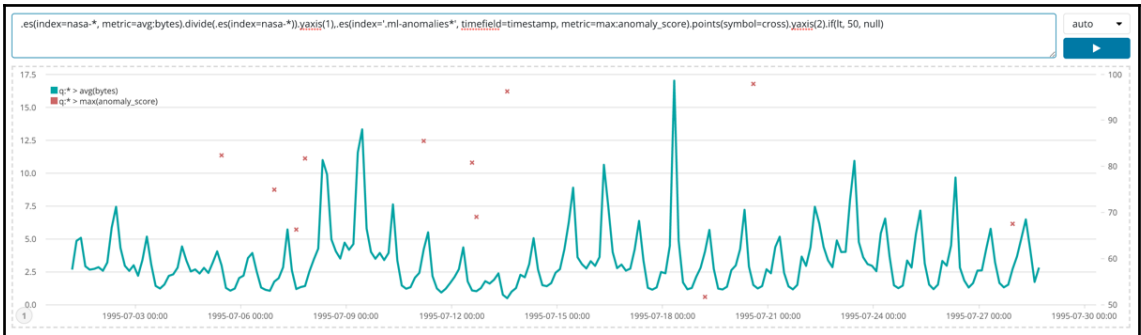
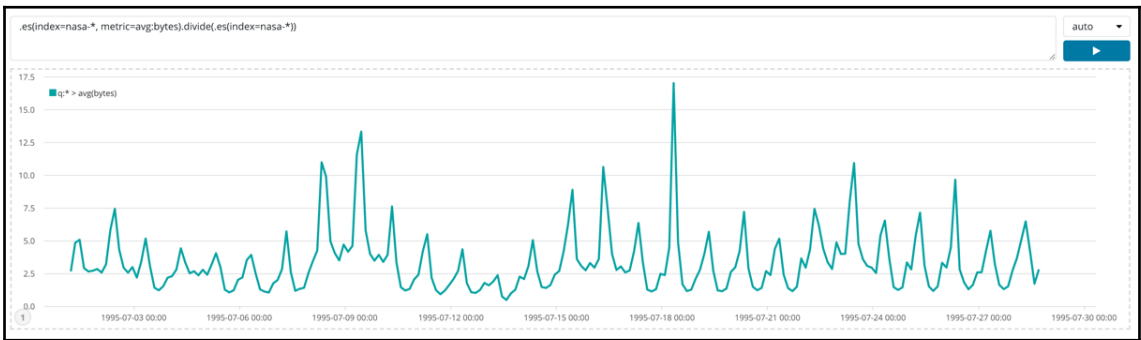
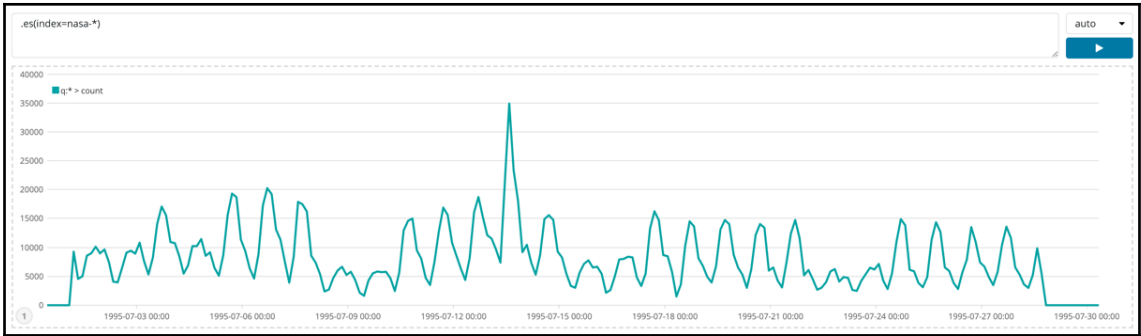
Highlight

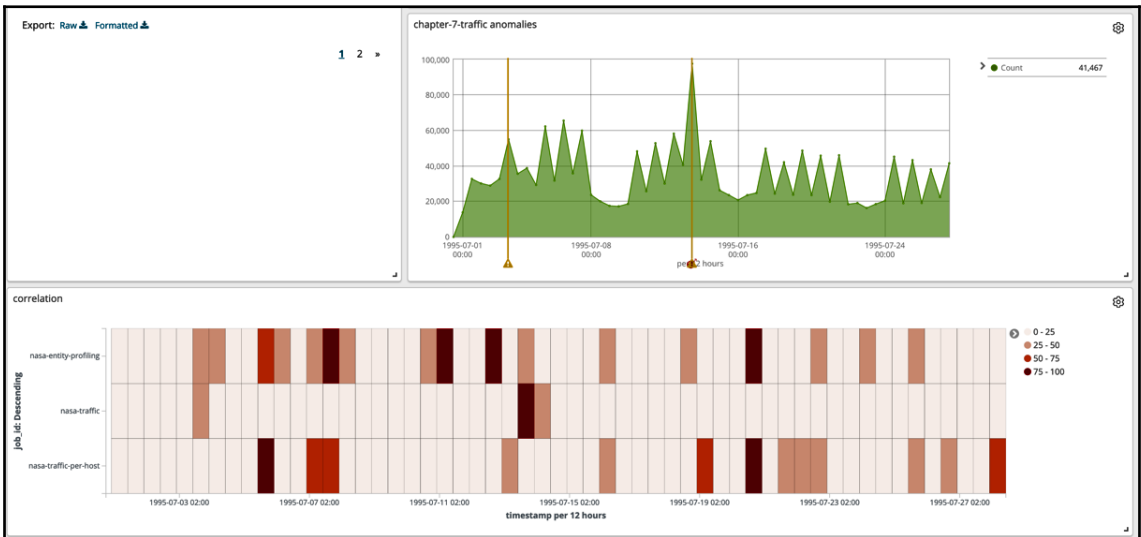
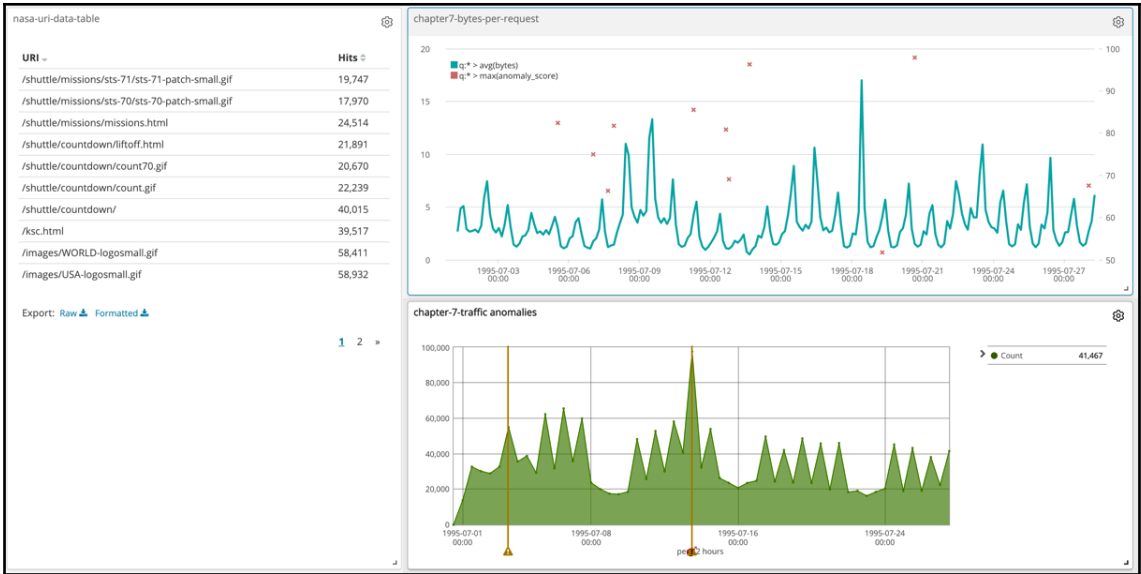
Legend Position right ▼

Heatmap Settings

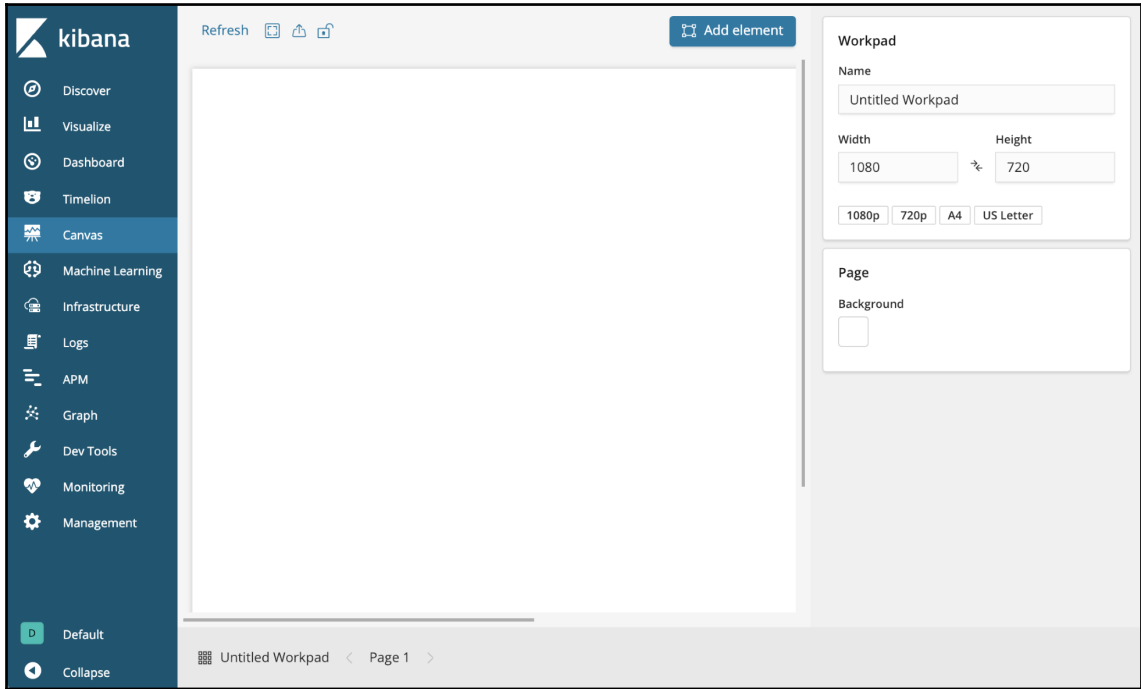
Color Schema Reds ▼








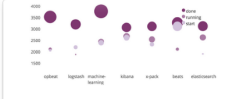
Chapter 8: Using Elastic ML with Kibana Canvas



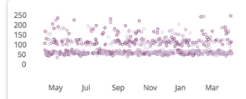
Q Filter elements ✕



Area chart
A line chart with a filled body



Bubble chart
A customizable bubble chart



Coordinate plot
Mixed line, bar or dot charts

cost #	username #	state #	cost #	price #
22.99	acothuap9	done	22.99	51
23.43	apuhidome	done	23.43	54
23.84	flrovec0	running	23.84	71
23.12	jarpanteric	done	23.12	53
21.93	studerbt1	running	21.93	67
23.13	apgethert0	done	23.13	60

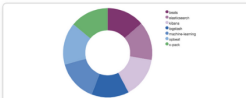
Data table
A scrollable grid for displaying data in a tabular format

```

{
  "time": 1468444000000,
  "username": "whitejp"
},
{
  "age": 74,
  "cost": 22.69,
  "country": "CN",
  "price": 79,

```

Debug
Just dumps the configuration of the element

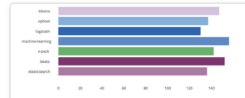


Donut chart
A customizable donut chart

▼
elasticsearch

- beats
- elasticsearch
- kibana
- logstash
- machine-learning
- opbeat

Dropdown filter
A dropdown from which you can select values for an "exactly" filter



Horizontal bar chart
A customizable horizontal bar chart

Dismiss

Refresh Add element

Selected layer ↑ ^ ↓ □

Display Data

Dimensions & measures

Slice Labels
Value

Determines the color of a mark or series

Slice Angles
Max

Determine the size of a mark

Chart style +

Inner radius
0 100

Radius of the hole

Labels

Show/hide labels

Legend position

Disable or position the legend

- beats
- elasticsearch
- kibana
- logstash
- machine-learning
- opbeat
- x-pack

Untitled Workpad < Page 1 > </> Expression editor

Refresh

Add element

Selected layer

Display Data

[Change your data source](#) →

You are using demo data

This data source is connected to every Canvas element by default. Its purpose is to give you some playground data to get started. The demo set contains 4 strings, 3 numbers and a date. Feel free to experiment and, when you're ready, click **Change your data source** above to connect to your own data.

[Preview](#) [Save](#)

Legend:

- beats
- elasticsearch
- kibana
- logstash
- machine-learning
- opbeat
- x-pack

Untitled Workpad < Page 1 > </> Expression editor

Refresh Add element

Selected layer ↑ ^ ∨ ↓

Display Data

Dimensions & measures

Slice Labels
Value ∨ state ∨
Determines the color of a mark or series

Slice Angles
Max ∨ price ∨
Determine the size of a mark

Chart style +

Inner radius
0 ○ 100
Radius of the hole

Labels
 ∨
Show/hide labels

Legend position
Hidden ∨
Disable or position the legend

Element style +

Category	Percentage
start	34%
done	33%
running	33%

Untitled Workpad < Page 1 > </> Expression editor

Refresh
Add element

Selected layer ↑ ^ ↓ ▾

Display Data

Dimensions & measures

Slice Labels

Value ▼ state ▼

Determines the color of a mark or series

Slice Angles

Max ▼ price ▼

Determine the size of a mark

Chart style +

Inner radius

0
○
 100 25

Radius of the hole

Labels

```

filters
| demodata
| pointseries color="state" size="max(price)"
| pie hole=25 labels=true legend=false
| render

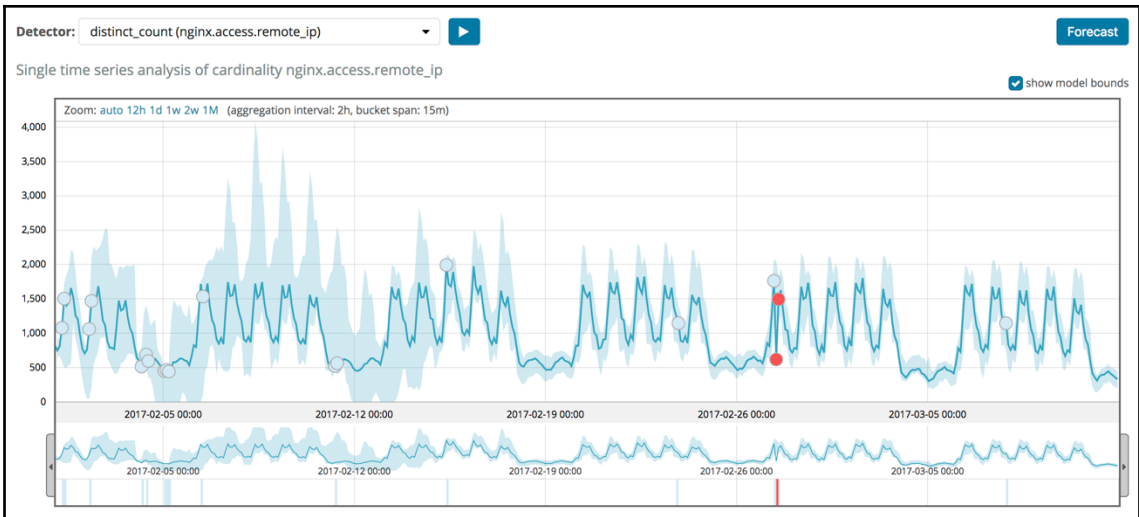
```

This is the coded expression that backs this element. You better know what you are doing here.

Enable autocomplete

Close
Run

Untitled Workpad < Page 1 >
</> Expression editor



Create index pattern

Kibana uses index patterns to retrieve data from Elasticsearch indices for things like visualizations.

Include system indices

Step 1 of 2: Define index pattern

Index pattern

`.ml-anomalies-*`

You can use a `*` as a wildcard in your index pattern.
You can't use spaces or the characters `\`, `/`, `?`, `"`, `<`, `>`, `|`.

[> Next step](#)

✓ **Success!** Your index pattern matches **1 index**.

`.ml-anomalies-shared`

Rows per page: 10 ▾

Create index pattern

Kibana uses index patterns to retrieve data from Elasticsearch indices for things like visualizations.

Include system indices

Step 2 of 2: Configure settings

You've defined `.ml-anomalies-*` as your index pattern. Now you can specify some settings before we create it.

Time Filter field name

Refresh

timestamp



The Time Filter will use this field to filter your data by time. You can choose not to have a time field, but you will not be able to narrow down your data by a time range.

[Show advanced options](#)

[Back](#)

Create index pattern

time 📅	cost #	username a	price #	age #	country a	state a	project a
2016-04-10T09:00:00+02:00	22.99	acollinsd9	51	30	GY	done	kibana
2016-04-10T09:00:00+02:00	23.43	kphillipsmv	54	18	CN	done	opbeat
2016-04-10T09:00:00+02:00	21.84	jfloresn0	71	35	NO	running	logstash
2016-04-11T09:00:00+02:00	23.12	jcarpenter6c	53	47	CU	done	machine-learning
2016-04-11T09:00:00+02:00	21.93	sbutlerb1	67	44	RU	running	kibana
2016-04-11T09:00:00+02:00	23.13	agardnerd0	60	49	ID	done	logstash
2016-04-11T09:00:00+02:00	22.73	preyesej	53	33	CN	done	machine-learning
2016-04-12T09:00:00+02:00	22.75	swhitejp	53	32	CN	done	opbeat
2016-04-13T09:00:00+02:00	22.69	rjackson2q	79	74	CN	done	opbeat
2016-04-13T09:00:00+02:00	23.63	sgraya7	64	70	ID	start	logstash

1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39 40 41
42 43 44 45 46 47 48 49 50 51 52 53 54 55 56 57 58 59 60 61 62 63 64 65 66 67 68 69 70 71 72 73 74 75 76 77 78 79
80 81 82 83 84 85 86 87 88 89 90 91 92 93 94 95 96 97 98 99 100 >

Refresh
Add element

time	cost #	username †	price #	age #	country †	state †	project †	perc
2016-04-10T03:00:00-04:00	22.99	acollinsd9	51	30	GY	done	kibana	0.77
2016-04-10T03:00:00-04:00	23.43	kphillipsmv	54	18	CN	done	opbeat	0.29
2016-04-10T03:00:00-04:00	21.84	jfloresn0	71	35	NO	running	logstash	0.8
2016-04-11T03:00:00-04:00	23.12	jcarpenter6c	53	47	CU	done	machine-learning	0.58
2016-04-	21.93	sbutlerb1	67	44	RU	running	kibana	0.21

< 1 2 3 4 5 ... 100 >

Selected layer ↑ ^ v ↓

Display Data

Elasticsearch raw documents
Pull back raw documents from elasticsearch

Timelion
Use Timelion syntax to retrieve a timeseries

Demo data
Mock data set with usernames, prices, projects, countries, and phases

Elasticsearch SQL

Be careful

The Elasticsearch Docs datasource is used to pull documents directly from Elasticsearch without the use of aggregations. It is best used with low volume datasets and in situations where you need to view raw documents or plot exact, non-aggregated values on a chart.

Index

.ml-anomalies-*

Enter an index name or select an index pattern

Query

job_id:nginx-traffic AND result_type:bu

Lucene query string syntax

Sort Field

anomaly_score

Document sort field

Sort Order

Descending

Document sort order

Fields

job_id × timestamp × anomaly_score ×

The fields to extract. Kibana scripted fields are not currently available

Preview

Save

Refresh Add element

job_id ↑	timestamp 📅	anomaly_score #
nginx-traffic	2017-02-27T06:30:00-05:00	97.21203983943794
nginx-traffic	2017-02-27T06:15:00-05:00	93.37517
nginx-traffic	2017-02-27T06:45:00-05:00	90.12433
nginx-traffic	2017-02-27T06:00:00-05:00	86.75044
nginx-traffic	2017-02-27T05:45:00-05:00	83.56907
nginx-traffic	2017-02-27T05:30:00-05:00	44.29194
nginx-traffic	2017-02-11T05:30:00-05:00	3.421841
nginx-traffic	2017-02-16T08:45:00-05:00	1.20845
nginx-traffic	2017-02-16T09:00:00-05:00	0.7695461
nginx-traffic	2017-02-20T15:00:00-05:00	0.7077153

< 1 2 3 4 5 ... 10 >

Selected layer ↑ ^ v ↓ 📄

Display Data

[Change your data source →](#)

Elasticsearch SQL query

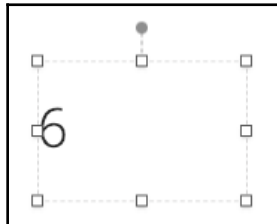
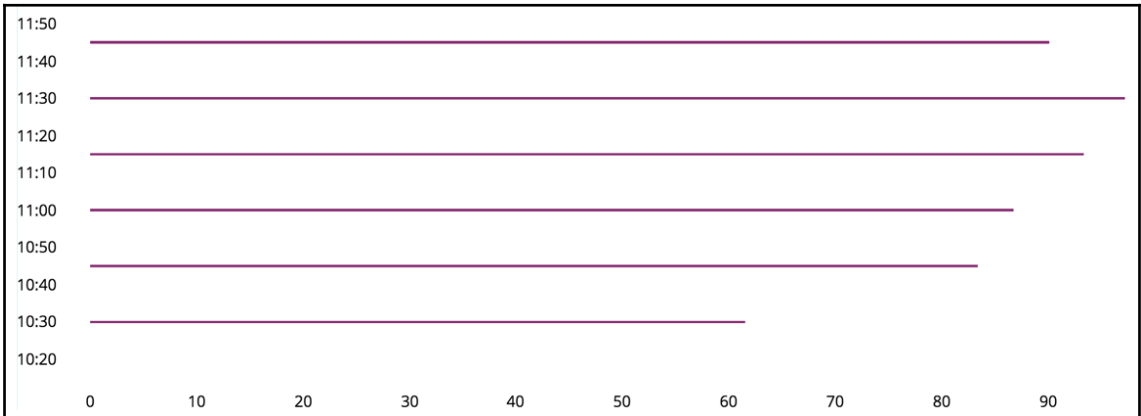
```
SELECT job_id, timestamp,
anomaly_score FROM ".ml-
anomalies-*" WHERE
job_id='nginx-traffic' AND
result_type='bucket' ORDER BY
anomaly_score DESC
```

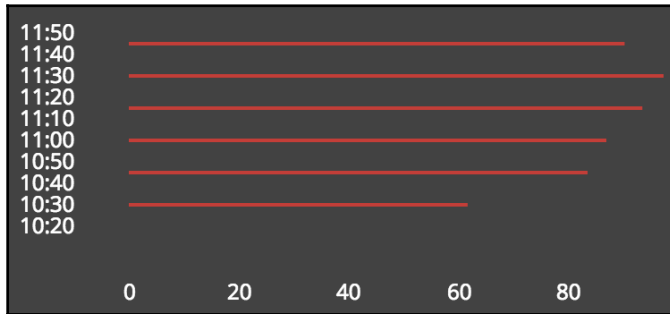
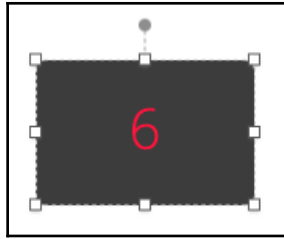
Preview Save

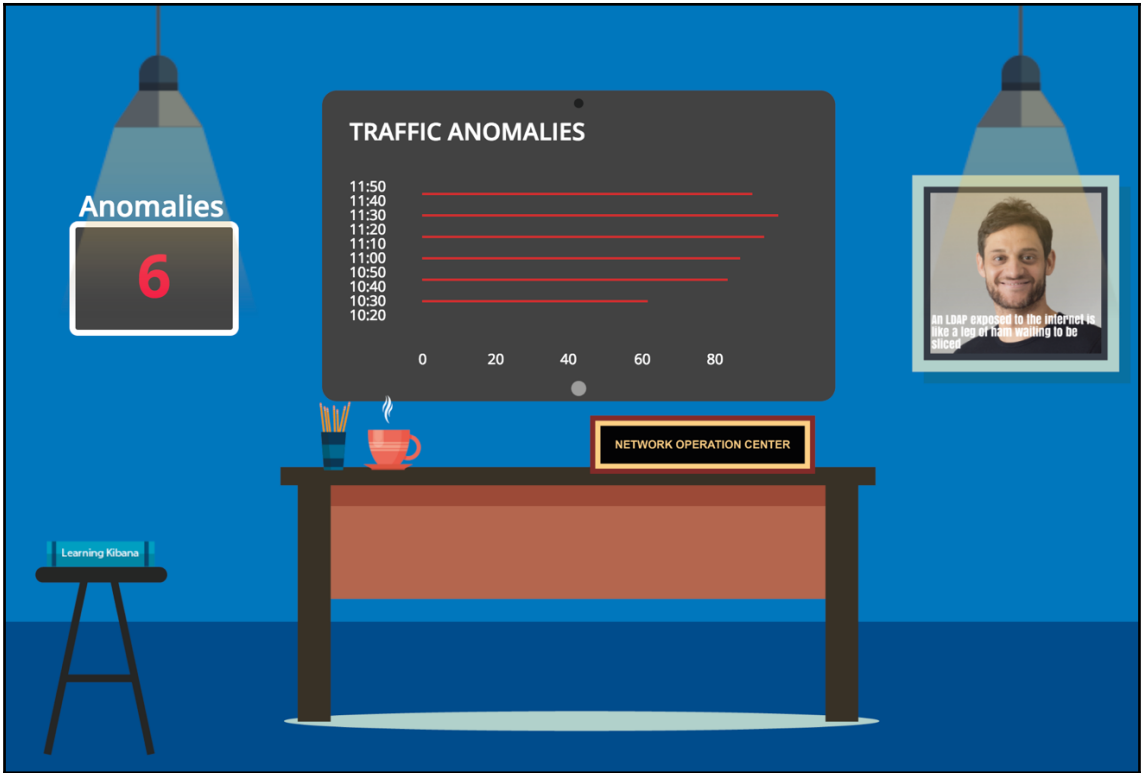
Refresh Add element

job_id ↑	timestamp 📅	anomaly_score #
nginx-traffic	2017-02-27T06:30:00-05:00	97.21203983943794
nginx-traffic	2017-02-27T06:15:00-05:00	93.37517
nginx-traffic	2017-02-27T06:45:00-05:00	90.12433
nginx-traffic	2017-02-27T06:00:00-05:00	86.75044
nginx-traffic	2017-02-27T05:45:00-05:00	83.56907
nginx-traffic	2017-02-27T05:30:00-05:00	44.29194
nginx-traffic	2017-02-11T05:30:00-05:00	3.421841
nginx-traffic	2017-02-16T08:45:00-05:00	1.20845
nginx-traffic	2017-02-16T09:00:00-05:00	0.7695461
nginx-traffic	2017-02-20T15:00:00-05:00	0.7077153

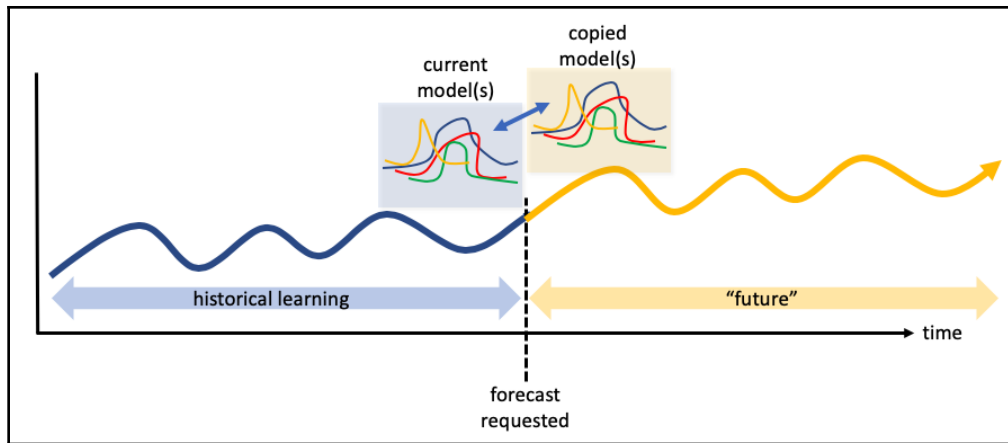
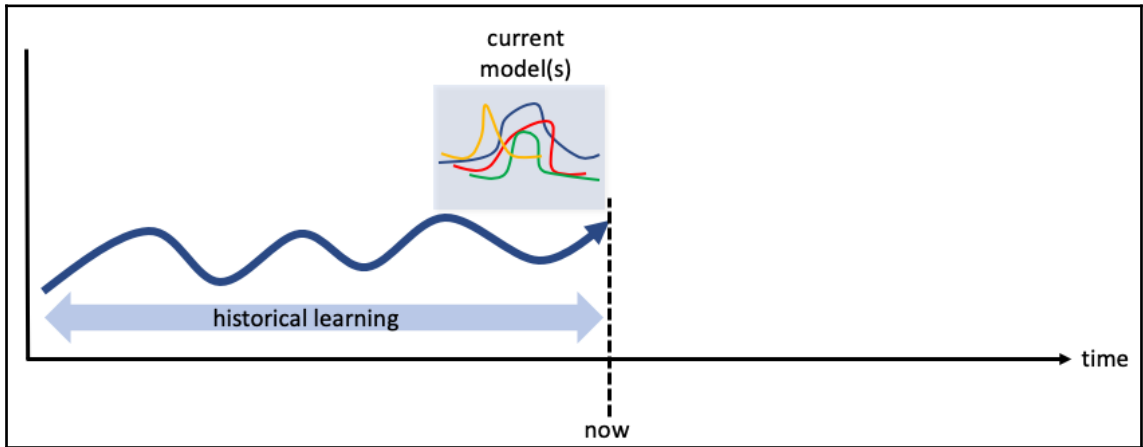
< 1 2 3 4 5 ... 10 >

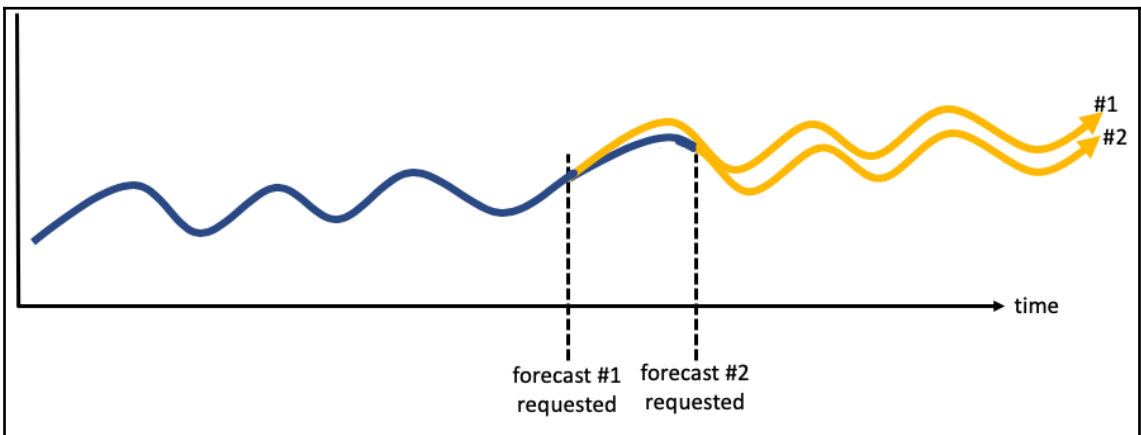
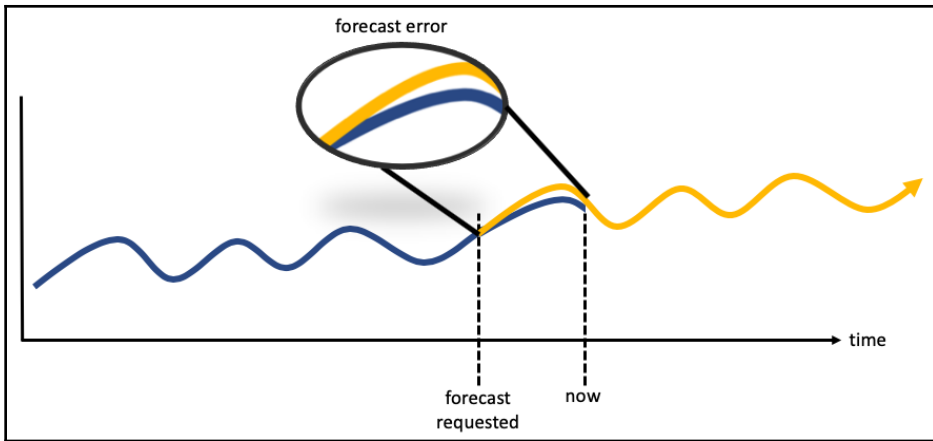






Chapter 9: Forecasting





Data Visualizer

The Machine Learning Data Visualizer tool helps you understand your data, by analyzing the metrics and fields in a log file or an existing Elasticsearch index.

EXPERIMENTAL



Import data

Import data from a log file. You can upload files up to 100 MB.

Upload file



Select an index pattern

Visualize the data in an existing Elasticsearch index.

Select index

kibana

Machine Learning / File Data Visualizer (Experimental)
30 seconds

Job Management Anomaly Explorer Single Metric Viewer Data Visualizer Settings

File contents

First 1000 lines

```

1 {"index":{"_id":"GHIVimAB82QVfHFyTVcz","_type":"doc"}}
2 {"amount":3588,"@timestamp":1485907200000}
3 {"index":{"_id":"HXIVimAB82QVfHFyTVcz","_type":"doc"}}
4 {"amount":2243,"@timestamp":1485911700000}
5 {"index":{"_id":"IHIVimAB82QVfHFyTVcz","_type":"doc"}}
6 {"amount":2518,"@timestamp":1485914400000}
7 {"index":{"_id":"I3IVimAB82QVfHFyTVcz","_type":"doc"}}
8 {"amount":1786,"@timestamp":1485917100000}
9 {"index":{"_id":"NXIVimAB82QVfHFyTVcz","_type":"doc"}}
10 {"amount":4650,"@timestamp":1485933000000}
11 {"index":{"_id":"OHIVimAB82QVfHFyTVcz","_type":"doc"}}
12 {"amount":5164,"@timestamp":1485936000000}

```

Summary

Number of lines analyzed 1000

Format ndjson

Override settings

File stats

@timestamp	# amount																																				
<p style="margin: 0; font-size: 0.8em;">📁 500 documents (50%)</p> <p style="margin: 0; font-size: 0.8em;">🔑 500 distinct values</p> <table style="width: 100%; font-size: 0.7em;"> <tr> <td style="text-align: right;">min</td> <td style="text-align: center;">median</td> <td style="text-align: left;">max</td> </tr> <tr> <td style="text-align: right;">1485907200000</td> <td style="text-align: center;">1487064150000</td> <td style="text-align: left;">1488204900000</td> </tr> </table> <p style="margin: 5px 0 0 20px; font-size: 0.7em;">top values</p> <table style="width: 100%; font-size: 0.7em;"> <tr> <td style="width: 60%;">1485907200000 </td> <td style="width: 40%; text-align: right;">0.2%</td> </tr> <tr> <td>1485911700000 </td> <td style="text-align: right;">0.2%</td> </tr> <tr> <td>1485914400000 </td> <td style="text-align: right;">0.2%</td> </tr> <tr> <td>1485917100000 </td> <td style="text-align: right;">0.2%</td> </tr> <tr> <td>1485933300000 </td> <td style="text-align: right;">0.2%</td> </tr> <tr> <td>1485936000000 </td> <td style="text-align: right;">0.2%</td> </tr> </table>	min	median	max	1485907200000	1487064150000	1488204900000	1485907200000	0.2%	1485911700000	0.2%	1485914400000	0.2%	1485917100000	0.2%	1485933300000	0.2%	1485936000000	0.2%	<p style="margin: 0; font-size: 0.8em;">📁 500 documents (50%)</p> <p style="margin: 0; font-size: 0.8em;">🔑 488 distinct values</p> <table style="width: 100%; font-size: 0.7em;"> <tr> <td style="text-align: right;">min</td> <td style="text-align: center;">median</td> <td style="text-align: left;">max</td> </tr> <tr> <td style="text-align: right;">1786</td> <td style="text-align: center;">6758</td> <td style="text-align: left;">14277</td> </tr> </table> <p style="margin: 5px 0 0 20px; font-size: 0.7em;">top values</p> <table style="width: 100%; font-size: 0.7em;"> <tr> <td style="width: 60%;">2289 </td> <td style="width: 40%; text-align: right;">0.4%</td> </tr> <tr> <td>2871 </td> <td style="text-align: right;">0.4%</td> </tr> <tr> <td>5456 </td> <td style="text-align: right;">0.4%</td> </tr> <tr> <td>5909 </td> <td style="text-align: right;">0.4%</td> </tr> <tr> <td>6906 </td> <td style="text-align: right;">0.4%</td> </tr> <tr> <td>7093 </td> <td style="text-align: right;">0.4%</td> </tr> </table>	min	median	max	1786	6758	14277	2289	0.4%	2871	0.4%	5456	0.4%	5909	0.4%	6906	0.4%	7093	0.4%
min	median	max																																			
1485907200000	1487064150000	1488204900000																																			
1485907200000	0.2%																																				
1485911700000	0.2%																																				
1485914400000	0.2%																																				
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1485933300000	0.2%																																				
1485936000000	0.2%																																				
min	median	max																																			
1786	6758	14277																																			
2289	0.4%																																				
2871	0.4%																																				
5456	0.4%																																				
5909	0.4%																																				
6906	0.4%																																				
7093	0.4%																																				

Import
Cancel

Import data

EXPERIMENTAL

Simple

Advanced

Index name

forecast_example|

Create index pattern

Import

Import data

EXPERIMENTAL

Simple Advanced

Index name

forecast_example

Create index pattern

Reset



✓ Import complete

Index	forecast_example
Index pattern	forecast_example
Documents ingested	7488



View index in Discover



Create new ML job



Open in Data Visualizer



Index Management



Index Pattern Management

New job from index pattern forecast_example

Chart interval: 2h [Use full forecast_example data](#)

Aggregation [?]

Sum

Field [?]

#amount

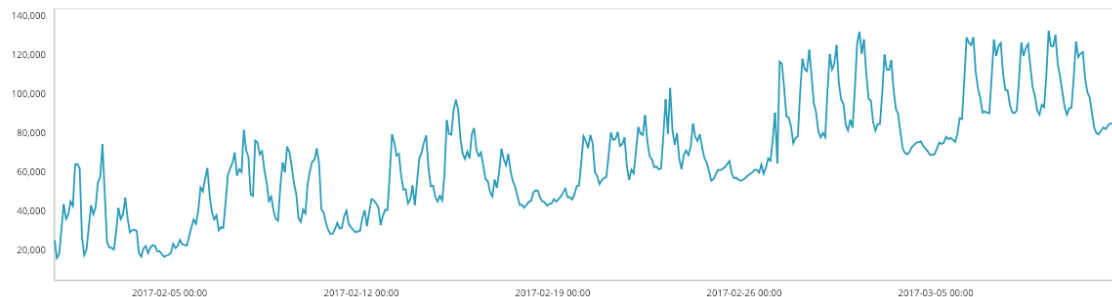
Bucket span [?]

15m

[Estimate bucket span](#)



Sparse data [?]



Name [?]

a_forecast_example

Description [?]

job description

Job Groups [?]

job Group

Advanced [?]

[Move to advanced job configuration](#)

[Validate job](#) [?]

[Create Job](#)

◀ January 31st 2017, 19:00:00.000 to March 1st 2017, 00:00:00.000 ▶

Time Range

Quick Relative **Absolute** Recent

From Set To Now **To** Set To Now

2017-01-31 19:00:00.000 2017-03-01 00:00:00.000

YYYY-MM-DD HH:mm:ss.SSS YYYY-MM-DD HH:mm:ss.SSS

◀ January 2017 ▶							◀ March 2017 ▶						
Sun	Mon	Tue	Wed	Thu	Fri	Sat	Sun	Mon	Tue	Wed	Thu	Fri	Sat
01	02	03	04	05	06	07				01	02	03	04
08	09	10	11	12	13	14	05	06	07	08	09	10	11
15	16	17	18	19	20	21	12	13	14	15	16	17	18
22	23	24	25	26	27	28	19	20	21	22	23	24	25
29	30	31					26	27	28	29	30	31	

Go

New job from index pattern forecast_example

Chart interval: 2h [Use full forecast_example data](#)

Aggregation [?]

Sum

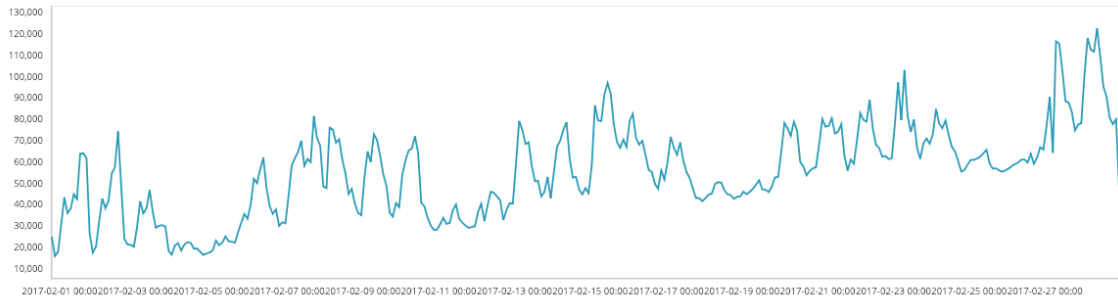
Field [?]

#amount

Bucket span [?]

15m [Estimate bucket span](#)

Sparse data [?]



Name [?]

a_forecast_example

Description [?]

job description

Job Groups [?]

job Group

Advanced [?]

[Move to advanced job configuration](#)

[Validate job](#) [?]

[Create Job](#)

Machine Learning / Job Management / Create New Job / Single Metric Job

January 31st 2017, 19:00:00.000 to March 1st 2017, 00:00:00.000

New job from index pattern forecast_example

Chart interval: 2h Use full forecast_example data

Aggregation: Sum Field: #amount Bucket span: 15m Estimate bucket span

Sparse data

Job a_forecast_example created ✓

Reset View Results

Continue job in real-time

Machine Learning / Single Metric Viewer

Untitled Workpad - Kibana

Auto-refresh January 31st 2017, 19:00:00.000 to March 1st 2017, 00:00:00.000

Job Management Anomaly Explorer Single Metric Viewer Data Visualizer Settings

Job: a_forecast_example

Detector: sum(amount) Forecast

Single time series analysis of sum amount show model bounds

Zoom: auto 12h 1d 1w 2w (aggregation interval: 2h, bucket span: 15m)

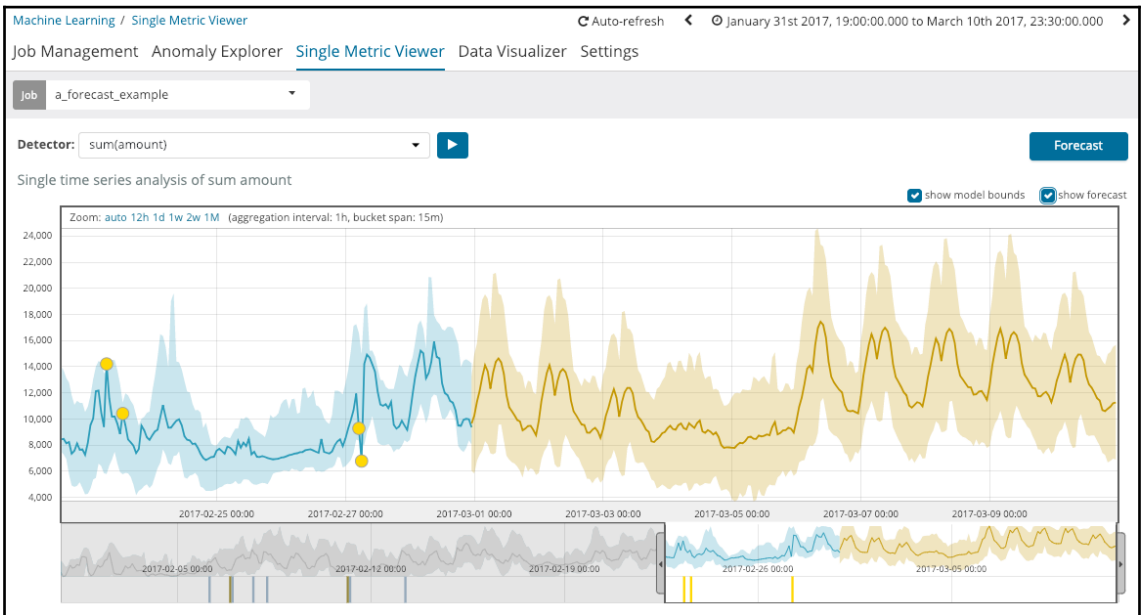
Forecasting

Run a new forecast

Duration


Length of forecast, up to a maximum of 8 weeks. Use s for seconds, m for minutes, h for hours, d for days, w for weeks.

Close



Forecasting ✕

Previous forecasts ?

Created	From	To	View
January 20th 2019, 15:26:56	February 28th 2017, 23:45:00	March 10th 2017, 23:45:00	

Run a new forecast





Duration

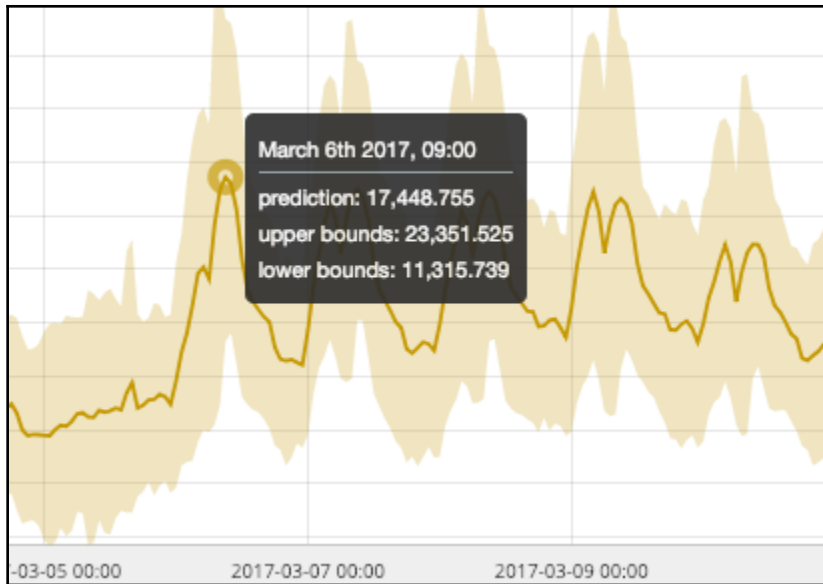
1d

Run

Length of forecast, up to a maximum of 8 weeks. Use s for seconds, m for minutes, h for hours, d for days, w for weeks.

Close

<input type="checkbox"/> a_forecast_example		2,708	ok	closed	stopped	2017-02-28 23:45:00			
Job settings		Job config	Datafeed	Counts	JSON	Job messages	Datafeed preview	Forecasts	
Created	From	To	Status	Memory size	Processing time	Expires	Messages	View	
2019-01-20 15:26:56	2017-02-28 23:45:00	2017-03-10 23:45:00	finished	37KB	51 ms	2019-02-03 15:26:56			
Rows per page: 5 v									



Machine Learning / Single Metric Viewer Auto-refresh ◀ January 31st 2017, 19:00:00.000 to March 10th 2017, 23:30:00.000 ▶

Job Management Anomaly Explorer [Single Metric Viewer](#) Data Visualizer Settings

Job: a_forecast_example

Detector: sum(amount) Forecast

Single time series analysis of sum amount show forecast

Zoom: auto 12h 1d 1w 2w 1M (aggregation interval: 15m, bucket span: 15m)

March 6th 2017, 09:45
 prediction: 17,718.229
 upper bounds: 23,351.525
 lower bounds: 12,084.933

2017-03-05 12:00 2017-03-06 00:00 2017-03-06 12:00 2017-03-07 00:00 2017-03-07 12:00

Active ML Nodes: 1 Total jobs: 63 Open Jobs: 3 Closed Jobs: 60 Active datafeeds: 1

Refresh

+ Create new job

Search...

Opened Closed Failed Started Stopped Group

ID	Description	Processed records	Memory status	Job state	Datafeed state	Latest time
<input type="checkbox"/> a_forecast_example		2,708	ok	closed	stopped	2017-02-28

- > Start datafeed
- Clone job
- Edit job
- Delete job

Job settings Job config Datafeed Counts JSON Job messages Datafeed preview Forecasts

General

job_id	a_forecast_example
job_type	anomaly_detector
job_version	6.5.1
description	
create_time	2019-01-20 15:08:39
finished_time	2019-01-20 15:26:56
established_model_memory	95.3 KB
model_snapshot_retention_days	1
model_snapshot_id	1548014921
results_index_name	shared
state	closed

Start a_forecast_example



Search start time

Continue from 2017-02-28 23:45:00

Continue from now

Continue from specified time

Search end time

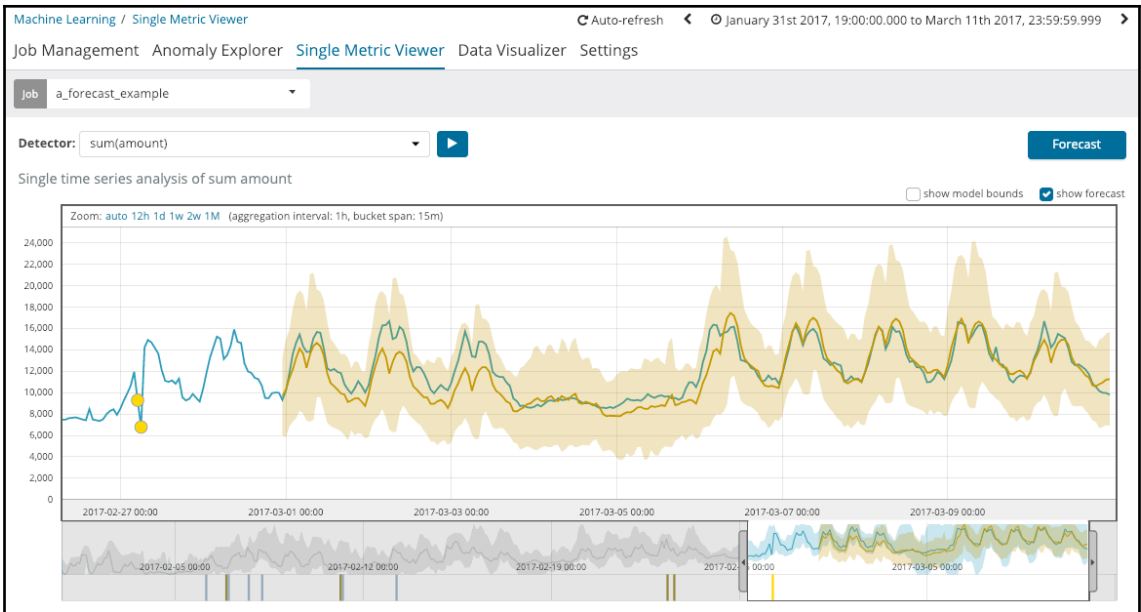
No end time (Real-time search)

Specify end time

March 2017							12:00 AM
SU	MO	TU	WE	TH	FR	SA	12:30 AM
26	27	28	1	2	3	4	01:00 AM
5	6	7	8	9	10	11	01:30 AM
12	13	14	15	16	17	18	02:00 AM
19	20	21	22	23	24	25	02:30 AM
26	27	28	29	30	31	1	03:00 AM
							03:30 AM
							04:00 AM

Cancel

Start



Job settings

Fields

- event rate Count
- nginx.access.body_sent.bytes Mean
- nginx.access.response_code Mean
- nginx.access.user_agent.major Mean
- nginx.access.user_agent.minor Mean
- nginx.access.user_agent.os_ma Mean

Sparse data ?

Split Data Remove split

tnginx.access.geoip.country_iso_code

Key Fields (Influencers)

tnginx.access.geoip.country_iso_code

Bucket span

15m Estimate bucket span

Job Details

Name

web_traffic_per_country

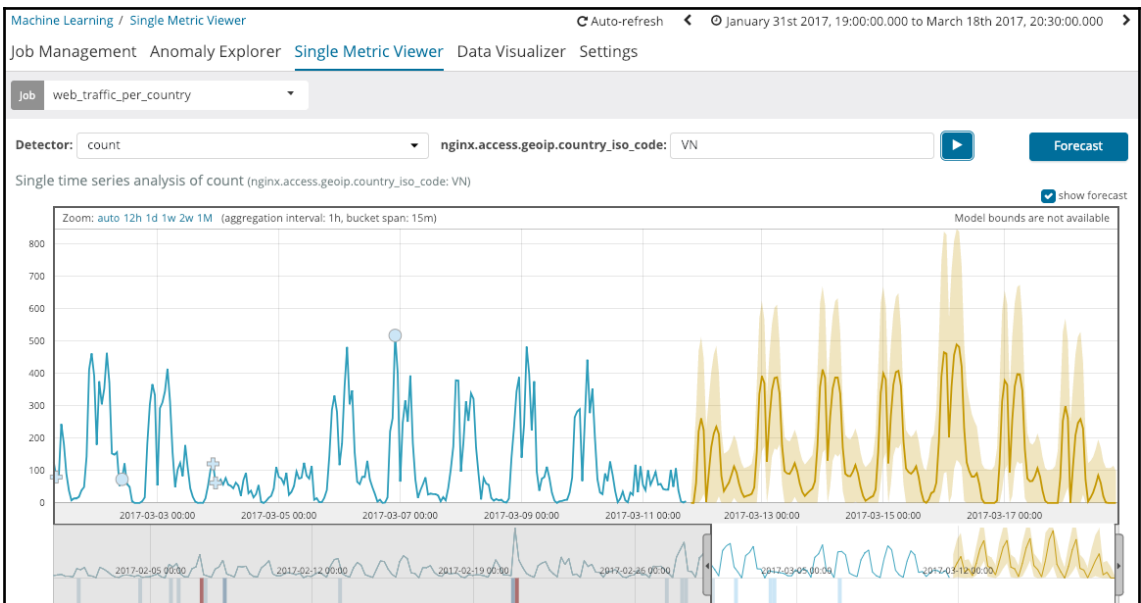
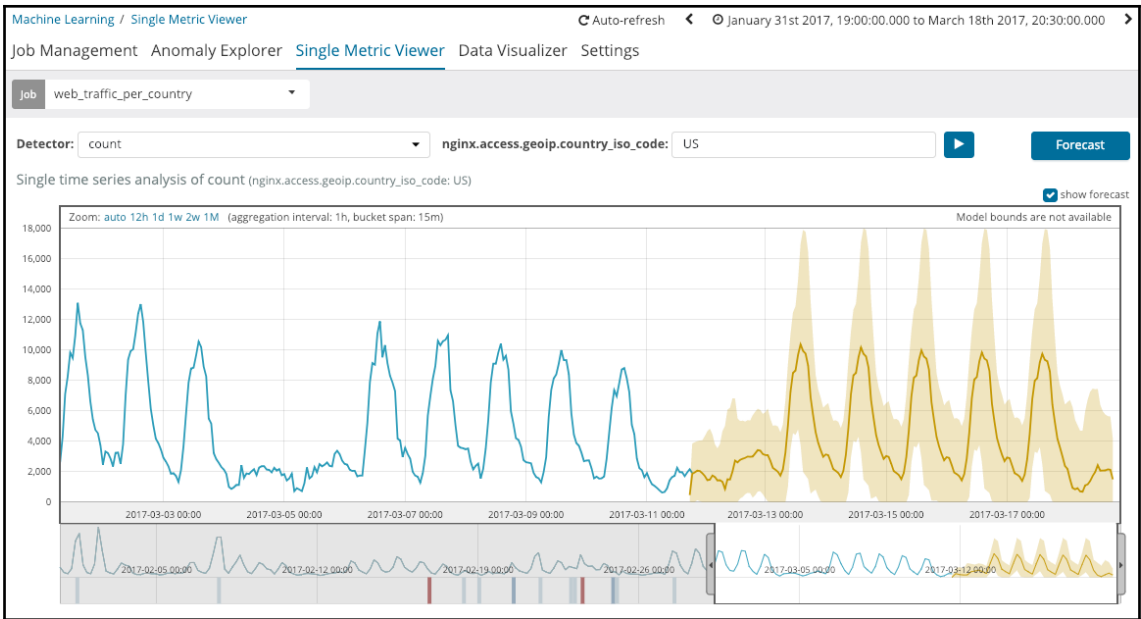
Results

Document count

Data split by nginx.access.geoip.country_iso_code

US

Count event rate



Chapter 10: ML Tips and Tricks

Edit ✕

[Job details](#) Detectors Datafeed Custom URLs

Job description

IT Ops KPI Low Sum Orders per min

Job groups

online_purchases ▾

Hit ENTER to add **online_purchases** as a custom option

1024mb

Edit ✕

[Job details](#) Detectors Datafeed Custom URLs

Job description

IT Ops Application Logs

Job groups

it_ops ✕ | ✕ ✓

- apache2
- nginx
- qa
- production
- online_purchases
- taxi

Machine Learning / Anomaly Explorer 30 seconds

Job Management **Anomaly Explorer** Single Metric Viewer Data Visualizer

Job: online_purchases

Job Selection

Groups

- apache2
- nginx
- qa
- production
- online_purchases
- it_ops

Jobs

- a_forecast_example
- bot_detection
- bot_detection_filtered
- bot_detection_filtered

Also apply time range

Active ML Nodes: 1 Total jobs: 64 Open jobs: 1 Closed jobs: 63 Active datafeeds: 0

Refresh

+ Create new job

Q groups:(nginx)

Opened Closed Failed Started Stopped Group

ID	Description	Processed records	Memory status	Job state	Datafeed state	Latest timestamp	Actions
> filebeat-nginx-access-low_request_rate	Nginx Access Logs: Detect low request rate nginx qa	0	ok	closed	stopped		
> filebeat-nginx-access-remote_ip_request_rate	Nginx Access Logs: Detect unusual remote_ips - high request rates nginx qa	0	ok	closed	stopped		
> filebeat-nginx-access-remote_ip_url_count	Nginx Access Logs: Detect unusual remote_ips - high distinct count of urls nginx qa	0	ok	closed	stopped		
> filebeat-nginx-access-response_code	Nginx Access Logs: Detect unusual response_code rates production nginx	0	ok	closed	stopped		
> filebeat-nginx-access-visitor_rate	Nginx Access Logs: Detect unusual visitor rate nginx production	0	ok	closed	stopped		

Rows per page: 10

job farequote_count_nosplit

Top Influencers

- airline
- AAL 97
- UAL <1
- AWE <1
- AMX <1

Anomaly timeline

Overall

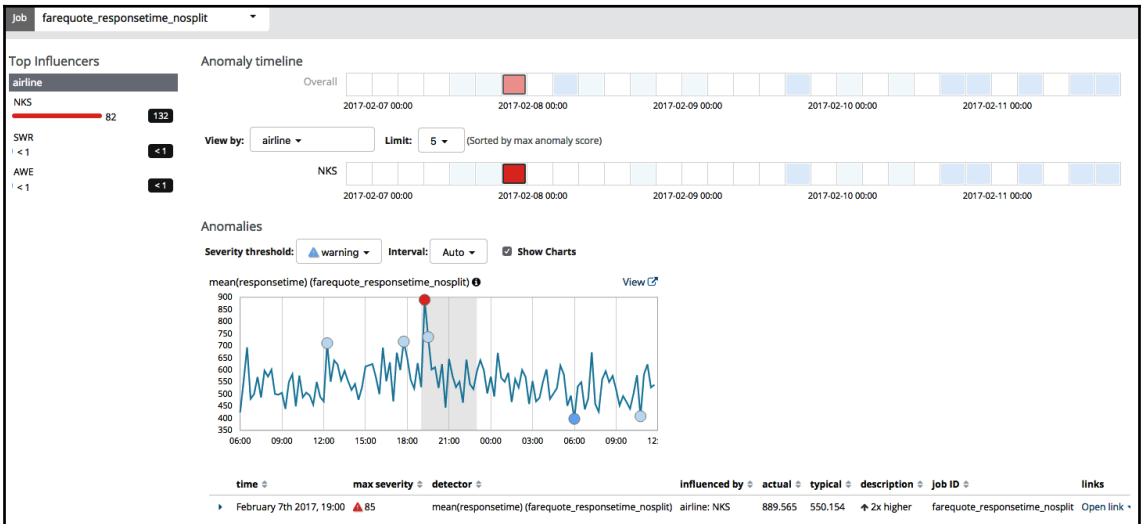
View by: airline Limit: 10 (Sorted by max anomaly score)

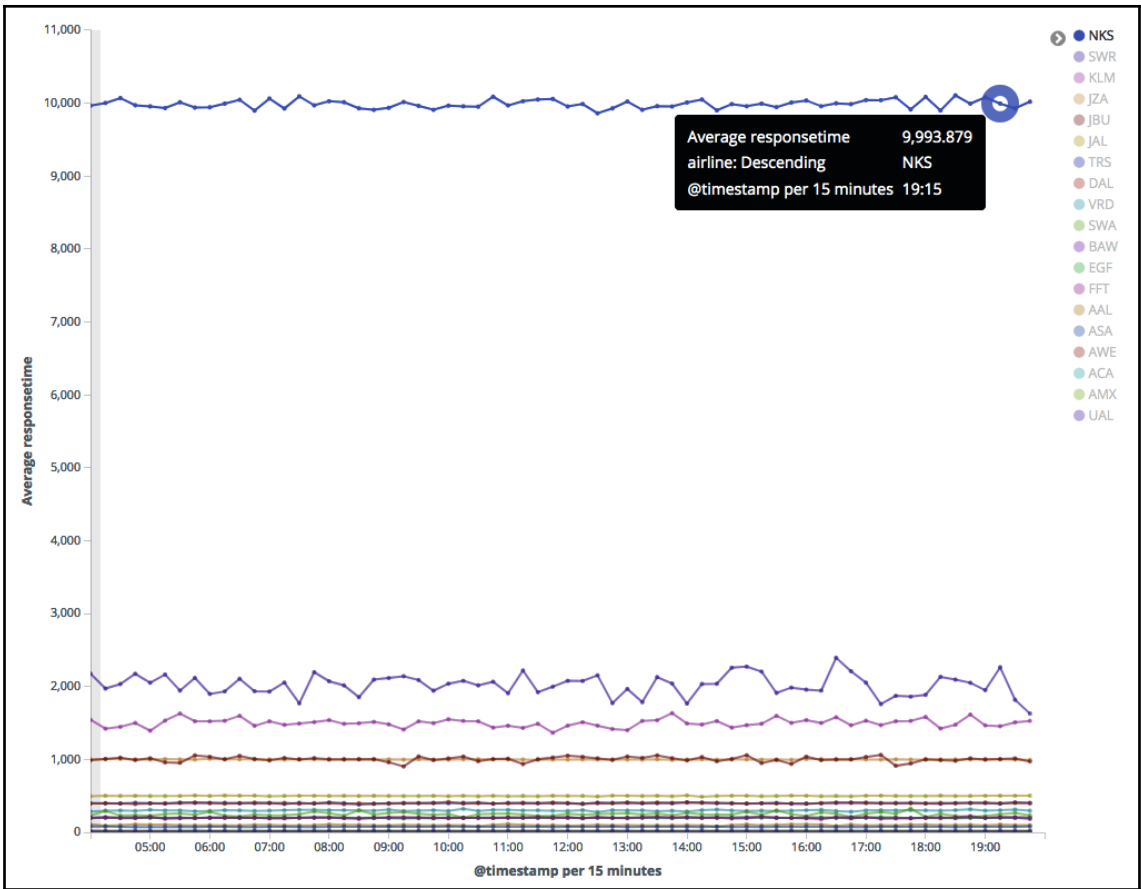
Anomalies

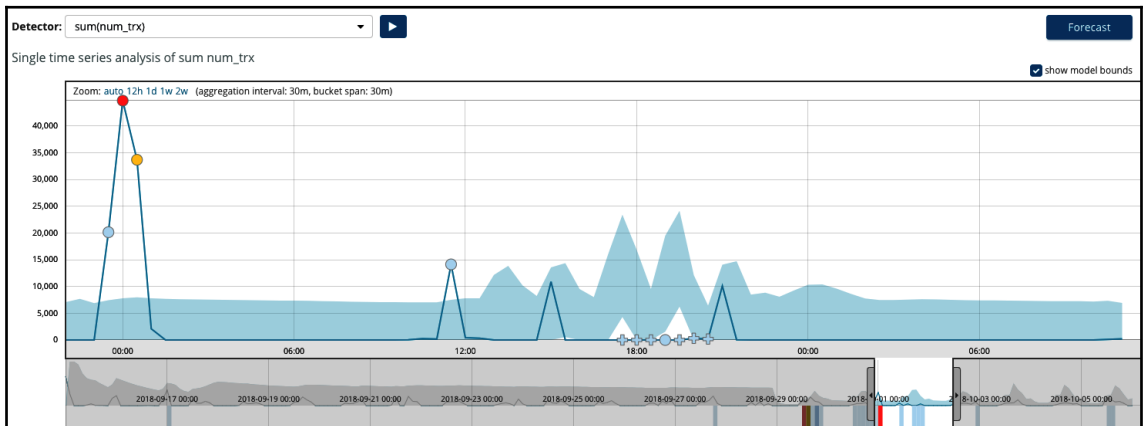
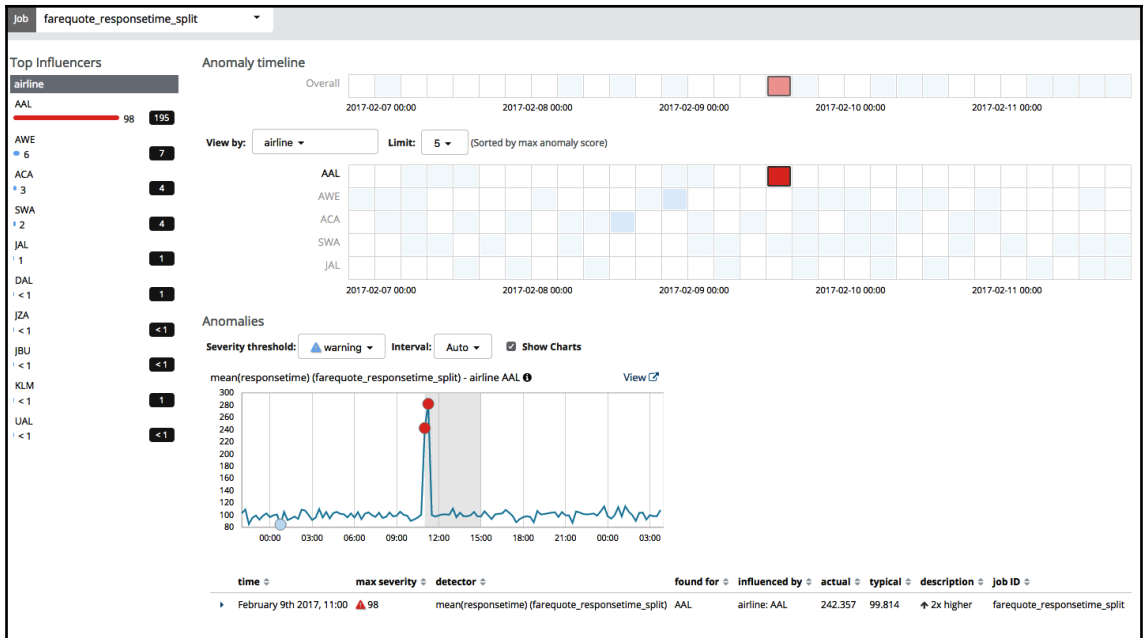
Severity threshold: warning Interval: Auto Show Charts

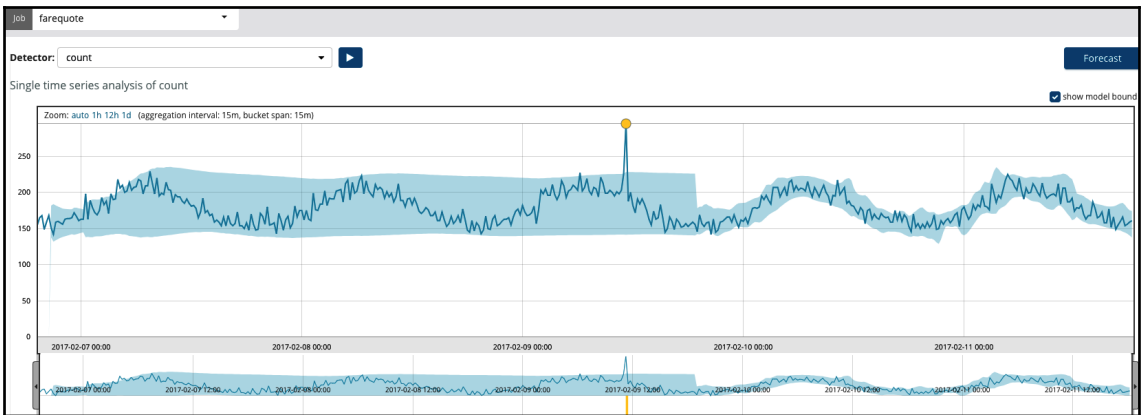
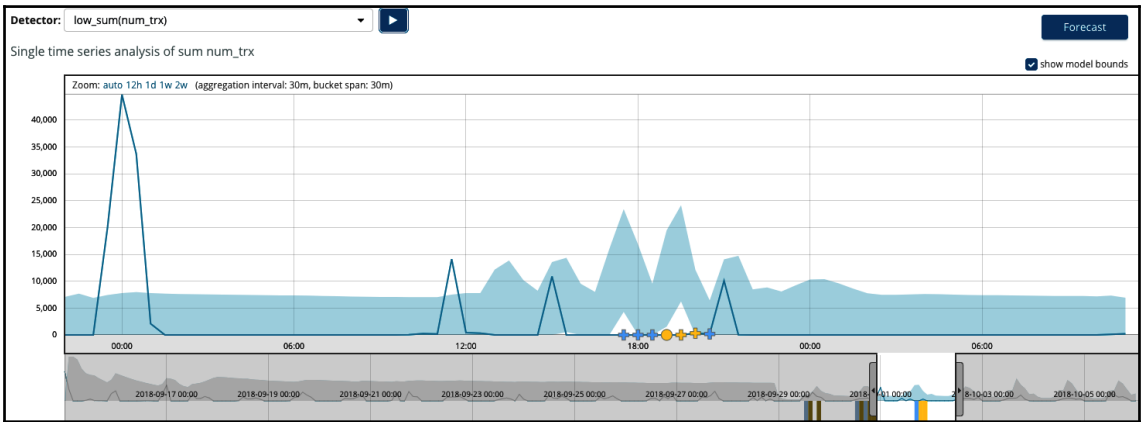
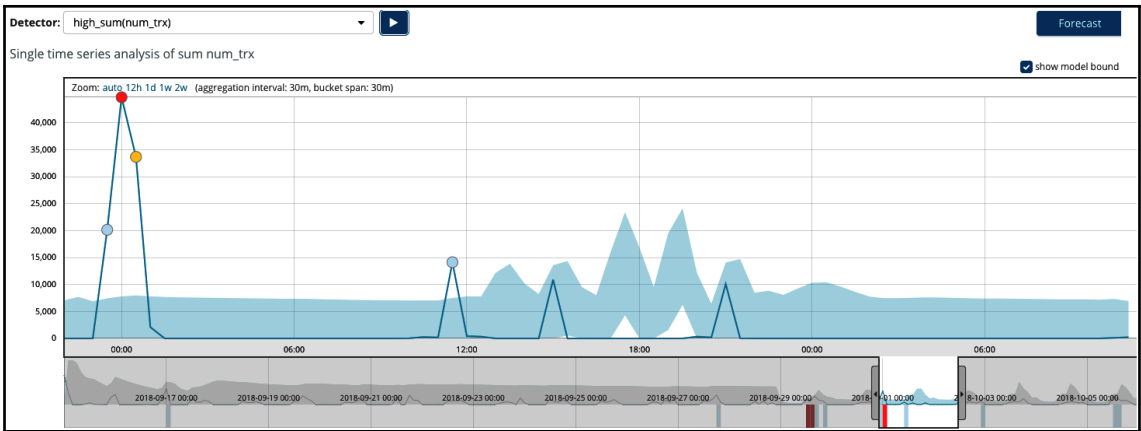
count (farequote_count_nosplit)

time	max severity	detector	influenced by	actual	typical	description	job ID	links
February 9th 2017, 11:00	▲ 90	count (farequote_count_nosplit)	airline: AAL	295	180.8	↑ 2x higher	farequote_count_nosplit	Open link









Edit calendar ignore_feb9 Save Cancel

Calendar ID

Description

Jobs

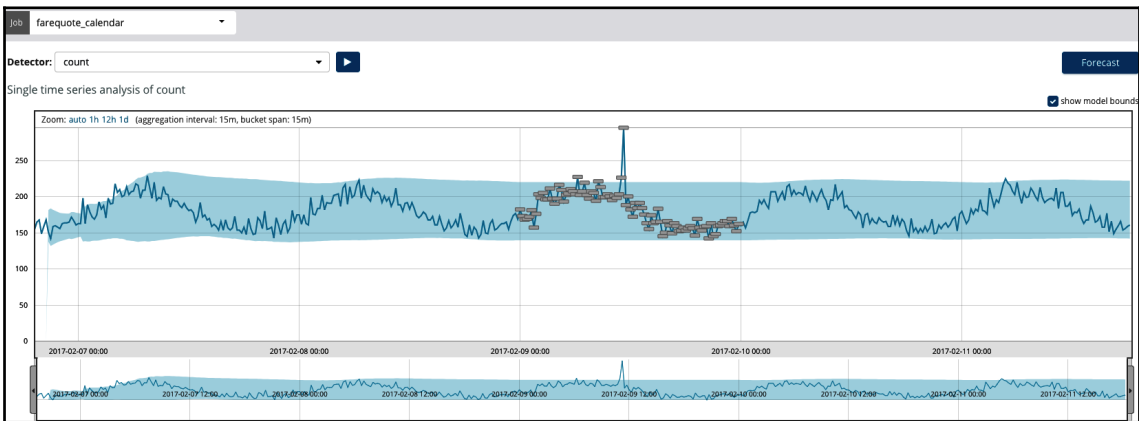
Groups

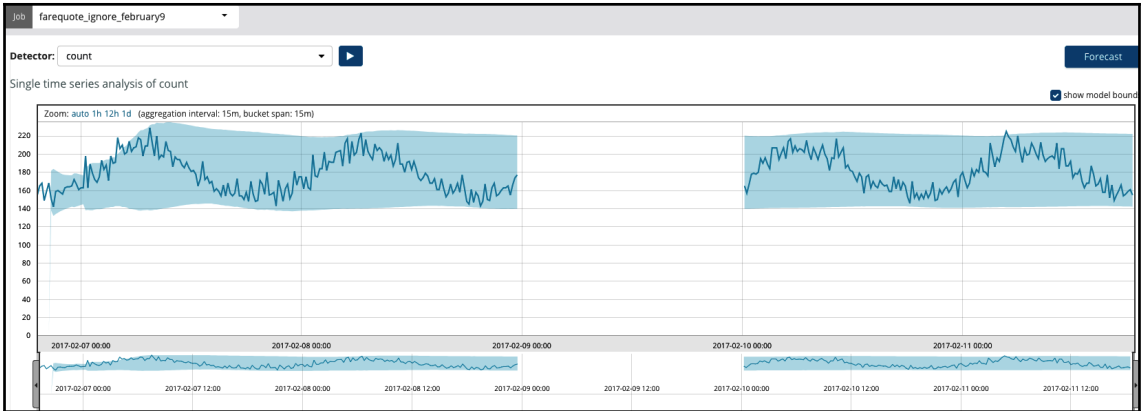
Events

+ New event Import events 1-1 of 1 < >

Description ↑	Start	End	
feb9	2017-02-09 00:00:00	2017-02-10 00:00:00	Delete

Times are displayed in the browser timezone





Metric Viewer Settings

Anomaly timeline

Overall

View by: instance - Limit: 10 (Sorted by max anomaly score)

i-8270d519	■	■	■	■	■	■	■	■	■	■
i-ebc323df	■	■	■	■	■	■	■	■	■	■
i-3b3565e0	■	■	■	■	■	■	■	■	■	■
i-20d061fa	■	■	■	■	■	■	■	■	■	■
i-8d4bcb40	■	■	■	■	■	■	■	■	■	■
i-3acd3ca0	■	■	■	■	■	■	■	■	■	■
i-7db7c747	■	■	■	■	■	■	■	■	■	■
i-b118880c	■	■	■	■	■	■	■	■	■	■
i-4ff414ac	■	■	■	■	■	■	■	■	■	■
i-ec626ff	■	■	■	■	■	■	■	■	■	■

Anomalies

Severity threshold: warning Interval: Auto

time	max severity	detector	found for
> November 7th 2016	98	high_mean(CPUUtilization) (system_performance)	i-20d061fa
> November 7th 2016	97	high_mean(CPUUtilization) (system_performance)	i-ebc323df
> November 8th 2016	93	high_mean(CPUUtilization) (system_performance)	i-ebc323df
> November 4th 2016	84	high_mean(CPUUtilization) (system_performance)	i-3b3565e0
> November 7th 2016	83	high_mean(CPUUtilization) (system_performance)	i-f1e949

Edit Rule

job ID: system_performance
detector: high_mean(CPUUtilization)

Rules instruct anomaly detectors to change their behavior based on domain-specific knowledge that you provide. When scope, and actions. When the conditions of a rule are satisfied, its actions are triggered. [Learn more](#)

Action

Choose the action(s) to take when the rule matches an anomaly.

- Skip result (recommended)
- Skip model update

Conditions

- Add numeric conditions for when the rule applies. Multiple conditions are combined using AND.

WHEN actual IS LESS THAN 90

Add new condition

Scope

- Add a filter list to limit where the rule applies.

Rerun job

Changes to rules take effect for new results only.

To apply these changes to existing results you must clone and rerun the job. Note rerunning the job may take some completed all your changes to the rules for this job.

[Close](#)