



BDA 308

Deep Dive: Log Analytics With Amazon Elasticsearch Service

Case Study: Amazon ES at Expedia Group

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AWS Databases and Analytics

Broad and deep portfolio, purpose-built for builders

Business Intelligence & Machine Learning



QuickSight



SageMaker



Comprehend

Relational Databases



Aurora



RDS

Non-Relational Databases



DynamoDB



ElastiCache
(Redis, Memcached)



Neptune
(Graph)

Analytic



DW | Big Data Processing | Interactive
Amazon Redshift



EMR



Athena

Real-time



Elasticsearch
Service



Kinesis Data
Analytics

Data Lake



S3/Amazon Glacier



AWS Glue
(ETL & Data Catalog)

Data Movement

Database Migration Service | Snowball | Snowmobile | Kinesis Data Firehose | Kinesis Data Streams



Things with purpose



Database characteristics

Relational



Referential integrity with strong consistency, transactions, and hardened scale

Complex query support via SQL

Key-value



Low-latency key based queries with high throughput and fast ingestion of data

Simple query methods with filters

Document



Indexing and storing documents with support for query on any property

Simple query with filters, projections and aggregates

Graph



Creating and navigating relations between data easily and quickly

Easily express queries in terms of relations

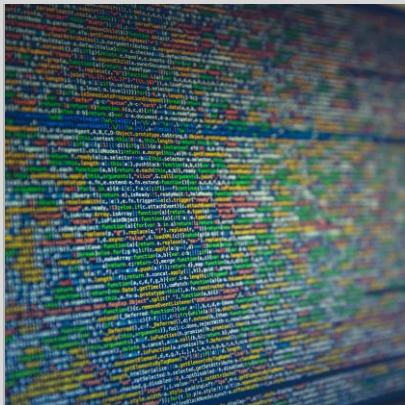
Time Series



Time-stamped data with large range-scans for summarization and processing

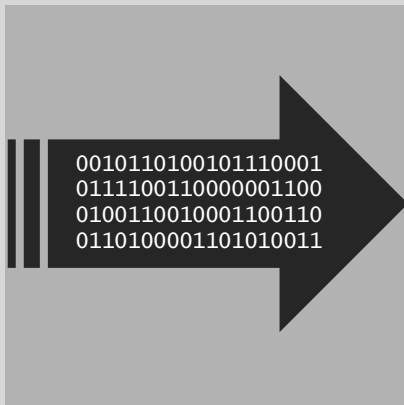
Computational support for summarized results

Elasticsearch's purpose



Text search

Natural language
Boolean queries
Relevance



Streaming data

High-volume ingest
Near real time
Distributed storage



Analysis

Time-based visualizations
Nestable statistics
Time series tools

Amazon Elasticsearch Service



Amazon Elasticsearch Service is a **fully managed service** that makes it easy to deploy, manage, and scale Elasticsearch and Kibana in the AWS Cloud



elasticsearch

+



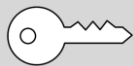
kibana

Amazon Elasticsearch Service's Storage Layer


```
199.72.81.55 -- [01/Jul/1995:00:00:01 -0400] "GET /history/apollo/ HTTP/1.0" 200 6245
unicomp6.unicomp.net -- [01/Jul/1995:00:00:06 -0400] "GET /shuttle/countdown/ HTTP/1.0" 200 3985
199.120.110.21 -- [01/Jul/1995:00:00:09 -0400] "GET /shuttle/missions/sts-73/mission-sts-73.html HTTP/1.0" 200 4085
burger.letters.com -- [01/Jul/1995:00:00:11 -0400] "GET /shuttle/countdown/liftoff.html HTTP/1.0" 304 0
199.120.110.21 -- [01/Jul/1995:00:00:11 -0400] "GET /shuttle/missions/sts-73/sts-73-patch-small.gif HTTP/1.0" 200 4179
burger.letters.com -- [01/Jul/1995:00:00:12 -0400] "GET /images/NASA-logosmall.gif HTTP/1.0" 304 0
burger.letters.com -- [01/Jul/1995:00:00:12 -0400] "GET /shuttle/countdown/video/livevideo.gif HTTP/1.0" 200 0
205.212.115.106 -- [01/Jul/1995:00:00:12 -0400] "GET /shuttle/countdown/countdown.html HTTP/1.0" 200 3985
d104.aa.net -- [01/Jul/1995:00:00:13 -0400] "GET /shuttle/countdown/ HTTP/1.0" 200 3985
129.94.144.152 -- [01/Jul/1995:00:00:13 -0400] "GET / HTTP/1.0" 200 7074
unicomp6.unicomp.net -- [01/Jul/1995:00:00:14 -0400] "GET /shuttle/countdown/count.gif HTTP/1.0" 200 40310
unicomp6.unicomp.net -- [01/Jul/1995:00:00:14 -0400] "GET /images/NASA-logosmall.gif HTTP/1.0" 200 786
unicomp6.unicomp.net -- [01/Jul/1995:00:00:14 -0400] "GET /images/KSC-logosmall.gif HTTP/1.0" 200 1204
d104.aa.net -- [01/Jul/1995:00:00:15 -0400] "GET /shuttle/countdown/count.gif HTTP/1.0" 200 40310
d104.aa.net -- [01/Jul/1995:00:00:15 -0400] "GET /images/NASA-logosmall.gif HTTP/1.0" 200 786
d104.aa.net -- [01/Jul/1995:00:00:15 -0400] "GET /images/KSC-logosmall.gif HTTP/1.0" 200 1204
129.94.144.152 -- [01/Jul/1995:00:00:17 -0400] "GET /images/ksclogo-medium.gif HTTP/1.0" 304 0
199.120.110.21 -- [01/Jul/1995:00:00:17 -0400] "GET /images/launch-logo.gif HTTP/1.0" 200 1713
ppptky391.asahi-net.or.jp -- [01/Jul/1995:00:00:18 -0400] "GET /facts/about_ksc.html HTTP/1.0" 200 3977
net-1-141.eden.com -- [01/Jul/1995:00:00:19 -0400] "GET /shuttle/missions/sts-71/images/KSC-95EC-0916.jpg HTTP/1.0" 200 34029
```

Each log line or other event constitutes a search *document*


```
199.72.81.55 - - [01/Jul/1995:00:00:01 -0400] "GET /history/apollo/ HTTP/1.0" 200 6245
unicomp6.unicomp.net - - [01/Jul/1995:00:00:06 -0400] "GET /shuttle/countdown/ HTTP/1.0" 200 3985
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129.94.144.152 - - [01/Jul/1995:00:00:17 -0400] "GET /images/ksclogo-medium.gif HTTP/1.0" 304 0
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ppptky391.asahi-net.or.jp - - [01/Jul/1995:00:00:18 -0400] "GET /facts/about_ksc.html HTTP/1.0" 200 3977
net-1-141.eden.com - - [01/Jul/1995:00:00:19 -0400] "GET /shuttle/missions/sts-71/images/KSC-95EC-0916.jpg HTTP/1.0" 200 34029
```



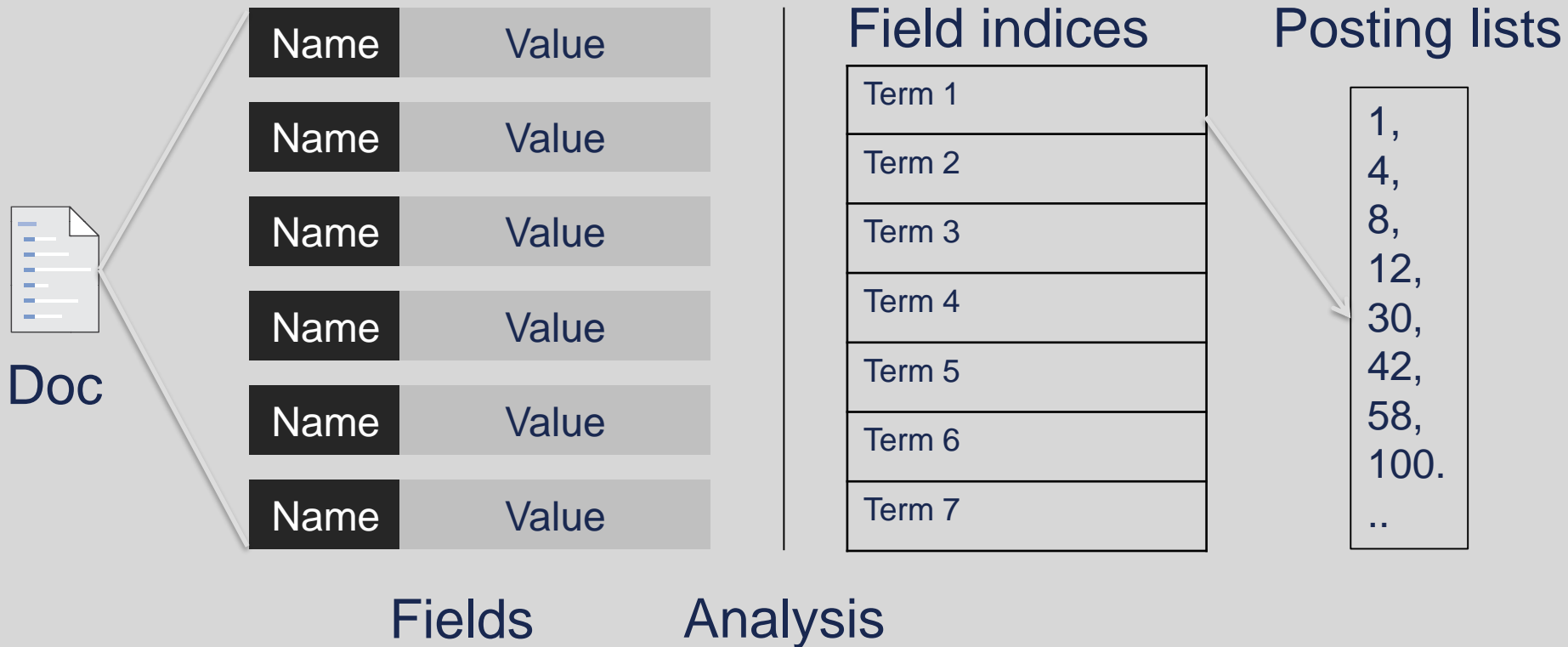
Key Idea

Log lines contain fields

Send JSON to
Elasticsearch, with fields
and values

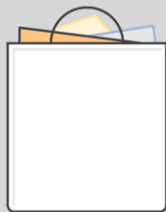
```
{  
  "host": "199.72.81.55",  
  "verb": "GET",  
  "request":  
    "GET /history/apollo/  
    HTTP/1.0",  
  "@timestamp":  
    "1995-07-01T00:00:01",  
  "timezone": "-0400",  
  "ident": "-",  
  "authuser": "-",  
  "response": 200,  
  "bytes": 6245  
}
```

Lucene creates and stores an index for each field



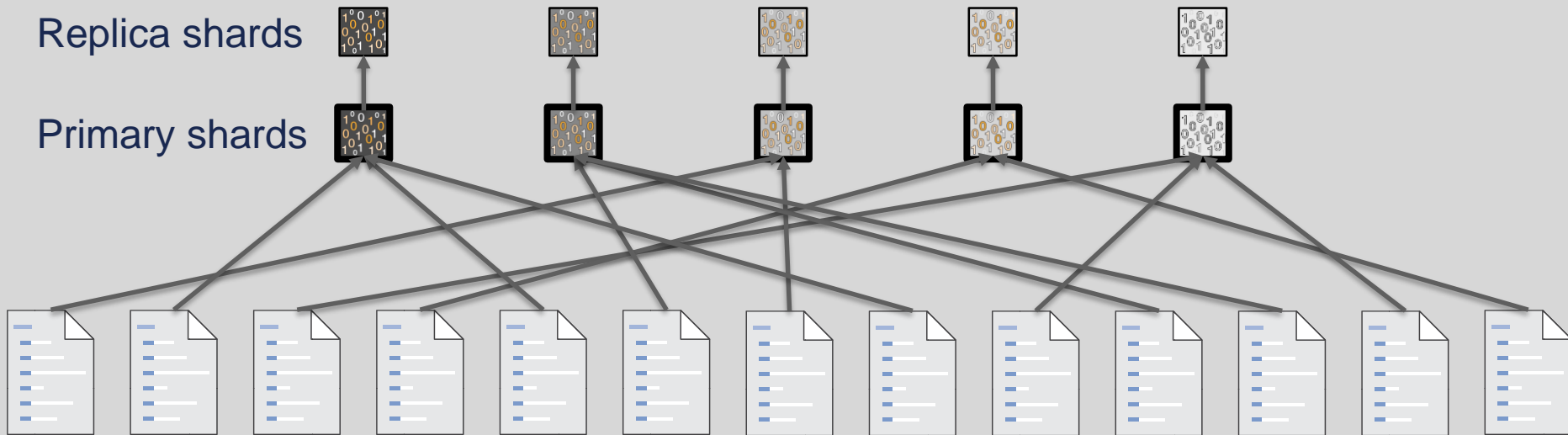
Field indices are managed by shards, organized into API-level indices

Logs index

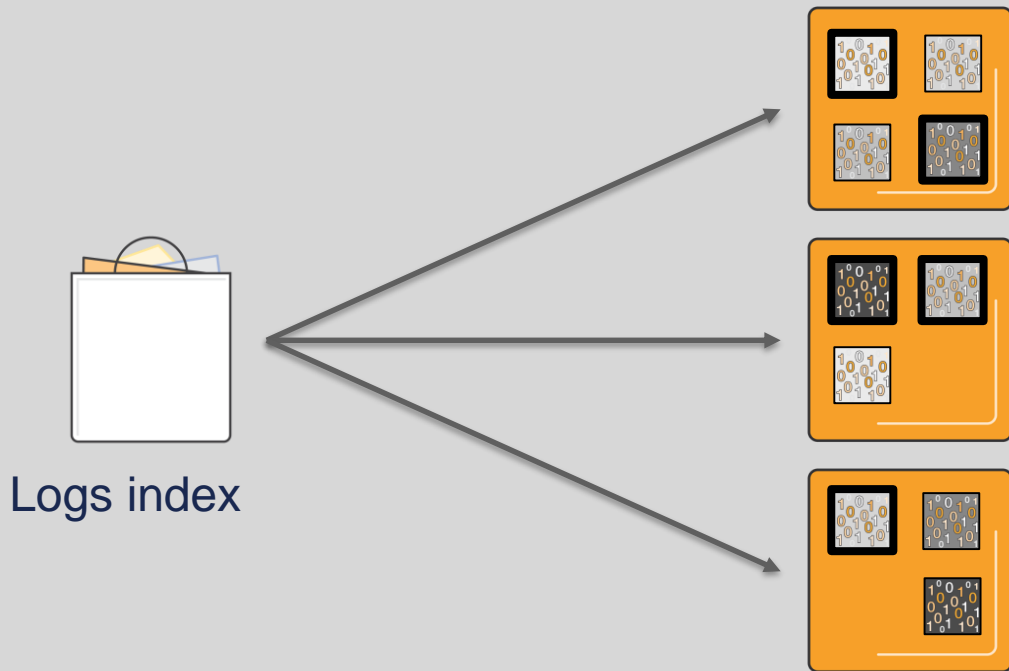


Replica shards

Primary shards



Elasticsearch assigns shards to instances



Storage required

- On disk, indices are ~10% larger than source
- Each replica adds an additional 1x storage requirement
- You choose the per-instance storage

Example: a 1 TB corpus will need 2 instances

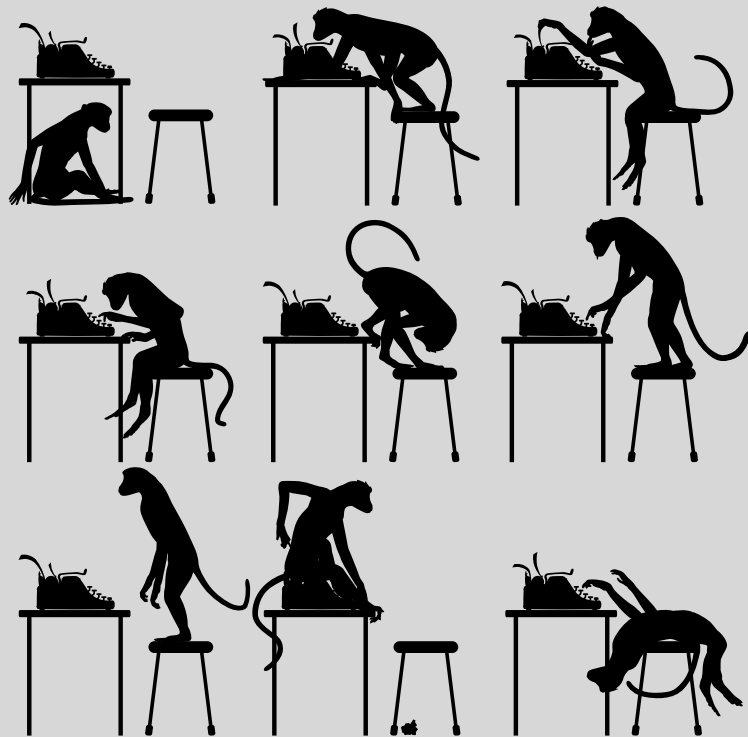
With one replica and 10% inflation, you need 2.2 TB of storage

Choose 1.5 TB of EBS per instance, and you need 2

Shards as units of storage

- Set primary shard count based on storage, 40 GB per primary (90 GB for I3 instances)
- Always use at least 1 replica in production
- Keep shard sizes as equivalent as possible

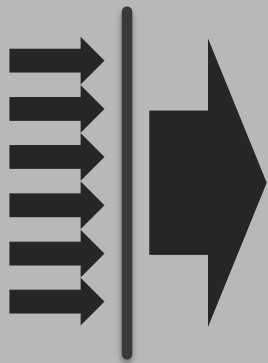
Example: Set shard count = 50 for a 2-TB corpus ($2 \text{ TB} / 40 \text{ GB} = 50 \text{ shards}$)



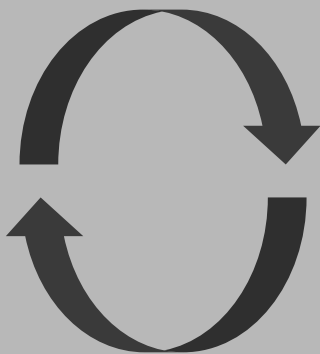
Build an ingest pipeline that completes these tasks



Data source



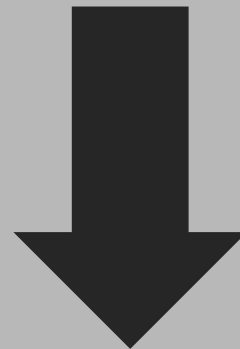
Collect



Transform



Buffer



Deliver

Organize data in daily indexes

logs_01.21.2018

logs_01.22.2018

logs_01.23.2018

logs_01.24.2018

logs_01.25.2018

logs_01.26.2018

logs_01.27.2018

logs_01.28.2018

logs_01.29.2018

- On ingest, create indexes with a root string, e.g., logs_
- Depending on volume, rotate at regular intervals – normally daily
- Daily indexes simplify index management. Delete the oldest index to create more space on your cluster.

Use templates to set shard count

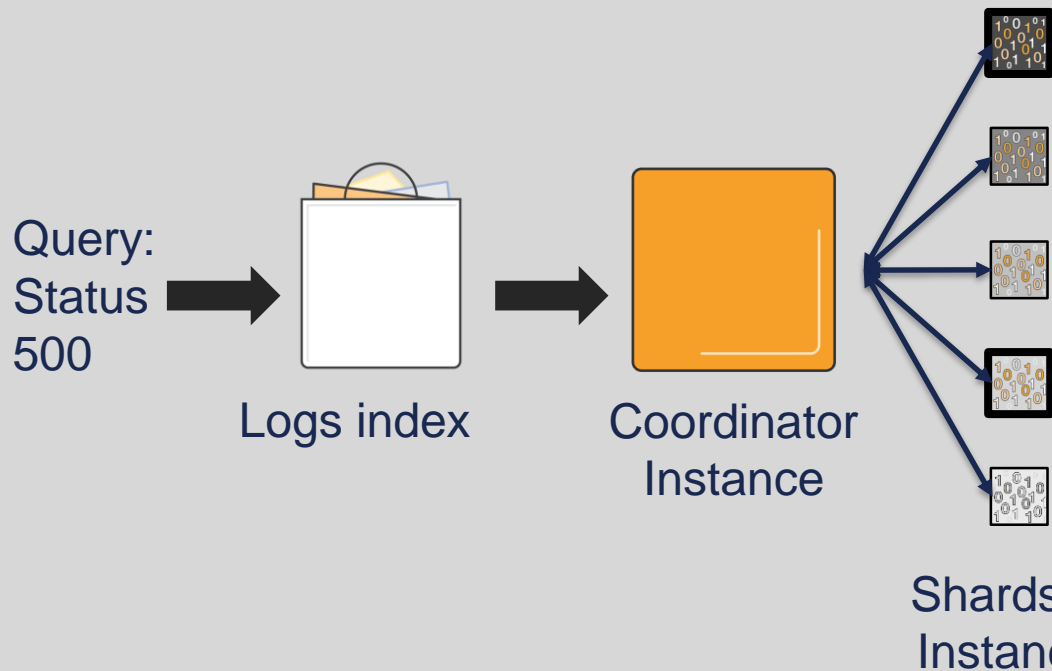
```
PUT* <endpoint>/_template/template1
{
  "index_patterns": ["movies*"],
  "settings": {
    "number_of_shards": 50,
    "number_of_replicas": 1
  }
}
```

All new indexes that match the index pattern receive the settings

***Note: ES 6.0+ syntax**

Amazon Elasticsearch Service's Query Engine

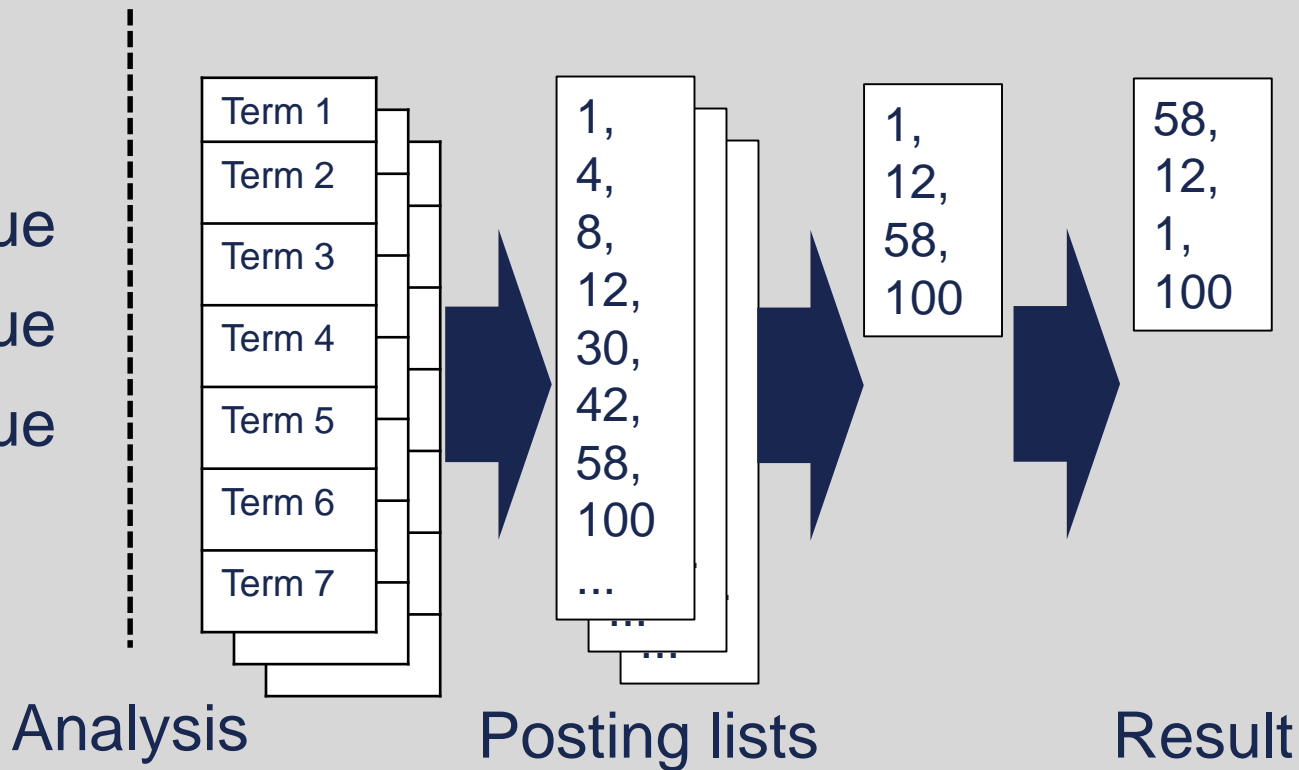
Query distribution



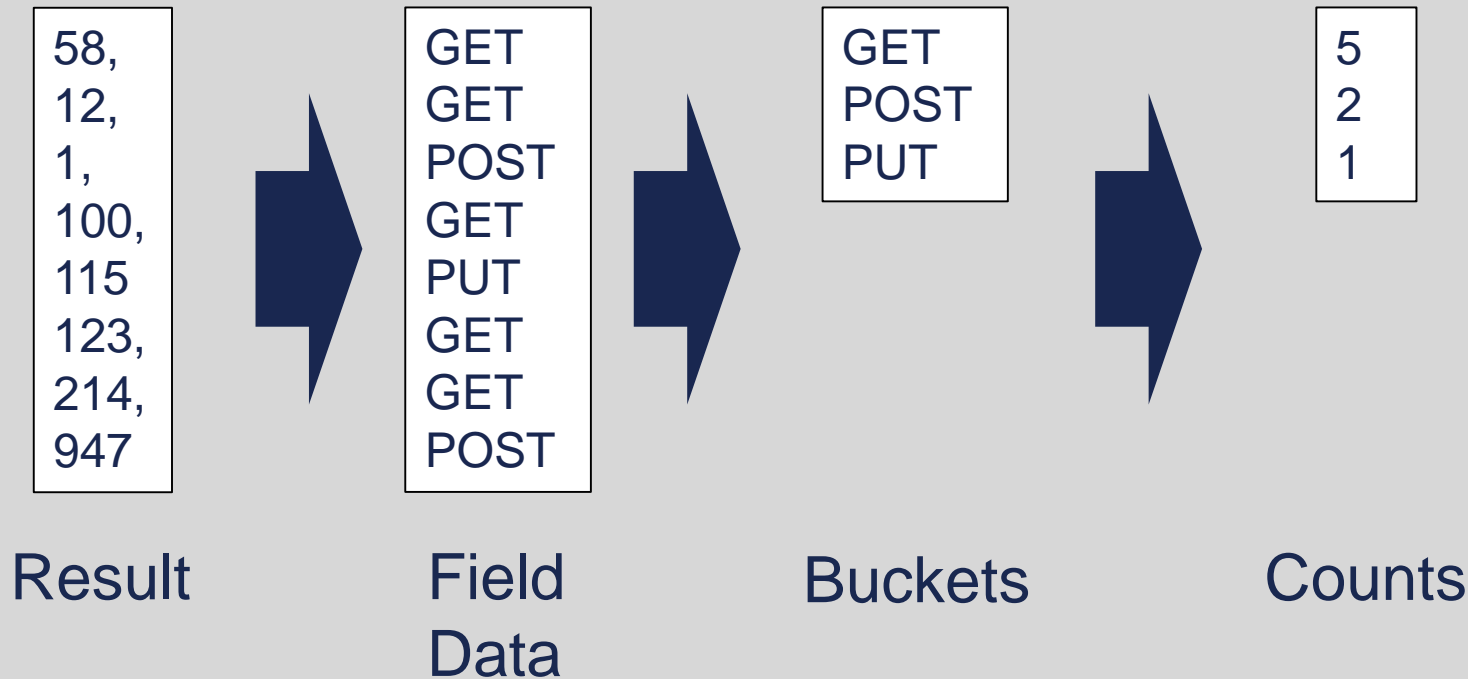
Each shard computes and returns a result to the coordinator, which re-aggregates a final result

Query processing

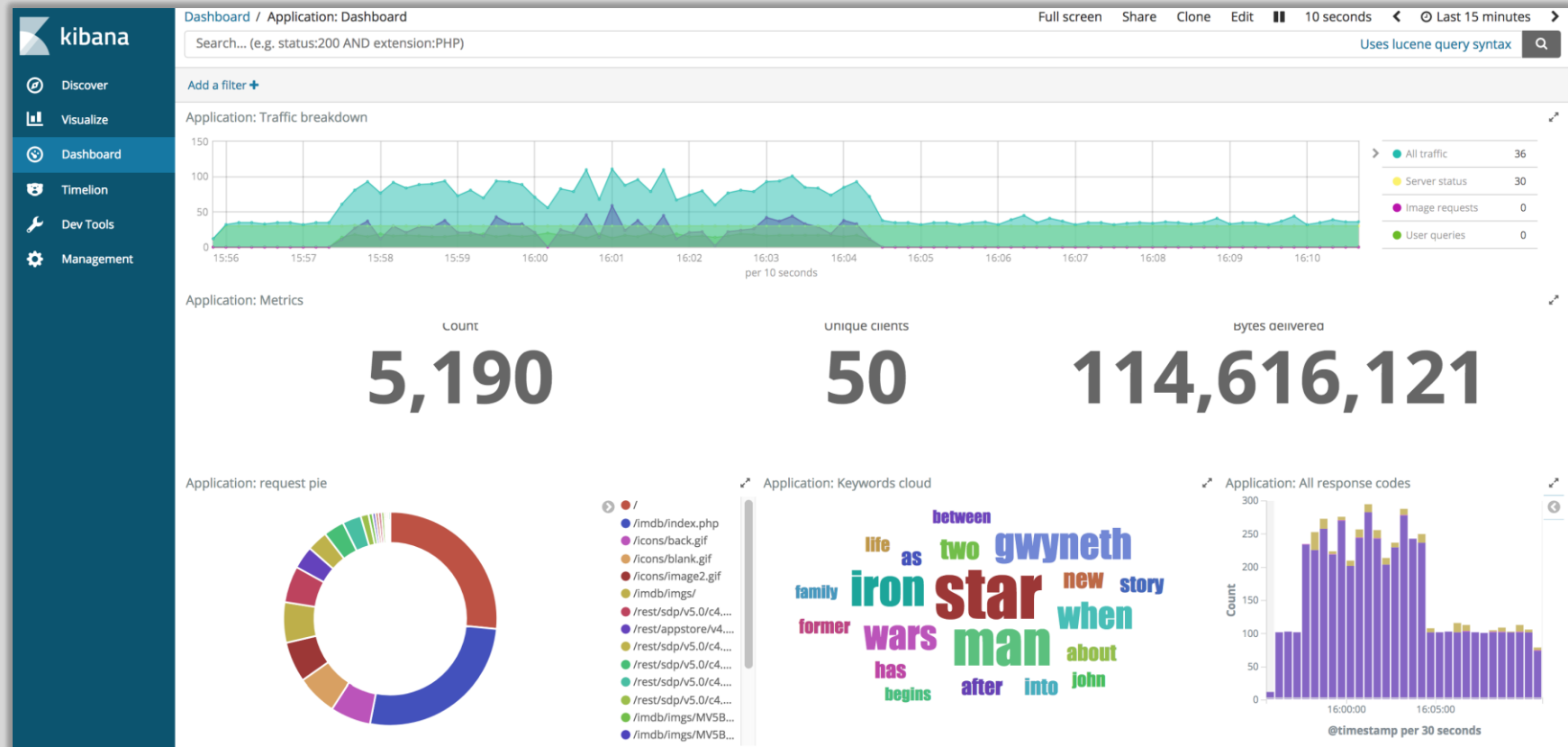
Field1:value
Field2:value
Field3:value



Analyze field values to get statistics and build visualizations



Visualize your data



Case study: MirrorWeb

Full text search



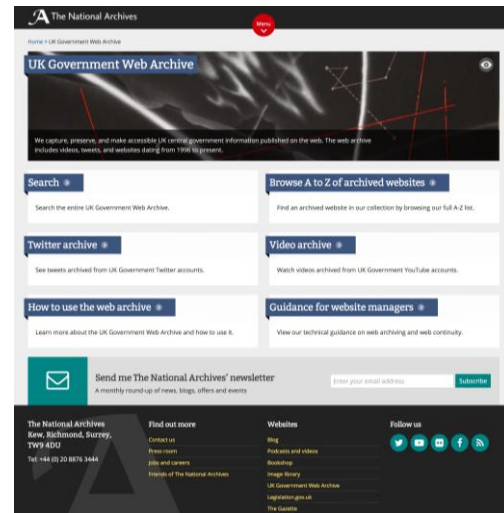
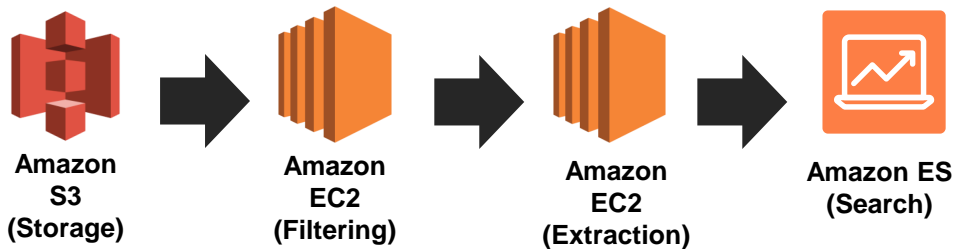
MirrorWeb

PROBLEM

Make the UK Government and UK Parliament's web archives searchable

Large scale ingestion scenario: 120 TB of data (1.2 MM 100-MB files), duplicates and bad data, Warc format

SOLUTION



BENEFITS

Scalability: Started on a 9-node, R4.4Xlarge cluster for fast ingest, reduced to 6 R4.Xlarge instances for search. Able to reconfigure the cluster with no down time

Cost effective: Indexed 1.4 billion documents for \$337

Fast: 146 MM docs per hour indexed. 14x faster than the previous best for this data set (using Hadoop)

For more on this case, see <http://tinyurl.com/ybqwbolq>

Case study: Financial Times

Business and Clickstream Analytics



PROBLEM

What stories do our readers care about? What's hot?

Required a custom clickstream analytics solution

Need a solution that delivers analytics in real time

Did not have a team to manage analytics infrastructure

SOLUTION

Streaming user data to **Amazon ES** for analysis. Created their own custom dashboards for editors and journalists – Lantern.

Lantern - "shines a light" on reader activity for the editors and journalists at the FT

Critical tool for making editorial decisions. Daily editorial meetings start by looking at Lantern dashboard



BENEFITS

Reliability : Lantern is used throughout the day by journalists and editors. Relying on Amazon to manage their systems for maximum uptime.

Cost savings: Able to easily tune their cluster to meet their needs with minimal management overhead

Amazon Elasticsearch Service

Benefits of Amazon Elasticsearch Service



Supports open-source APIs and tools

Drop-in replacement with no need to learn new APIs or skills



Easy to use

Deploy a production-ready Elasticsearch cluster in minutes



Scalable

Resize your cluster with a few clicks or a single API call



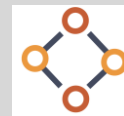
Secure

Deploy into your VPC and restrict access using security groups and IAM policies



Highly available

Replicate across Availability Zones, with monitoring and automated self-healing



Tightly integrated with other AWS services

Seamless data ingestion, security, auditing and orchestration

Service architecture

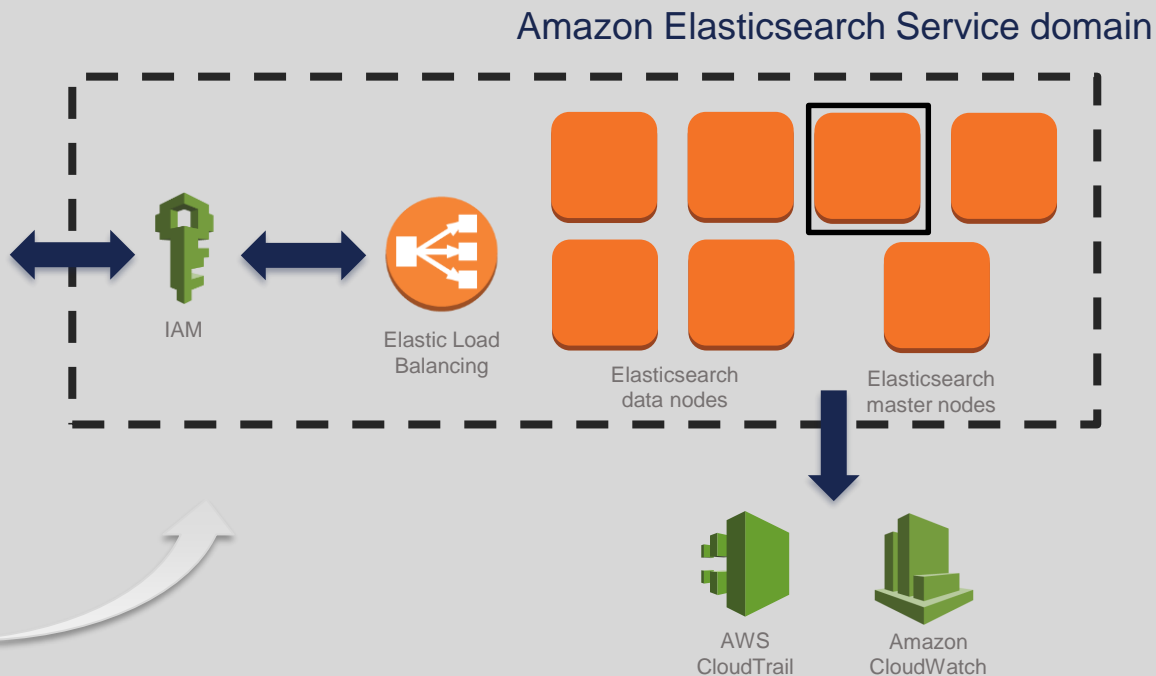


AWS SDK

AWS CLI



AWS CloudFormation



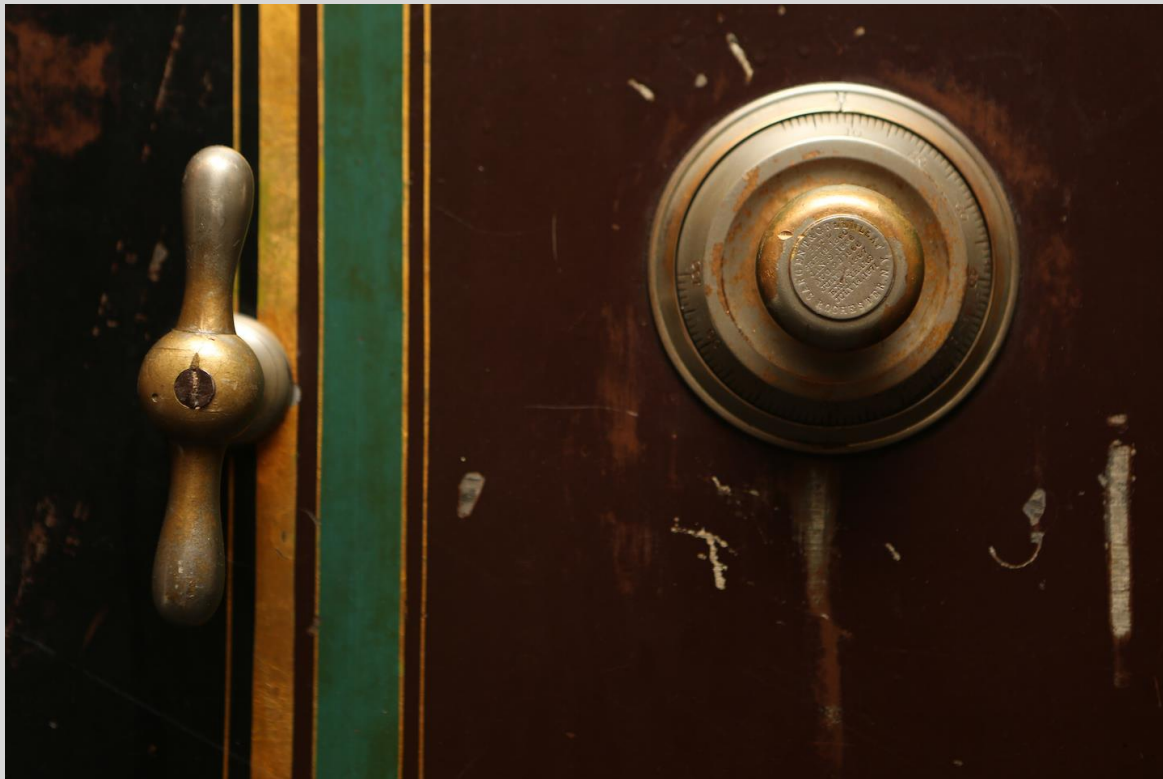
Security

- ☒ VPC access (Recommended)
- ☐ Public access

Public endpoints – IAM

Private endpoints – IAM
and security groups

Encryption



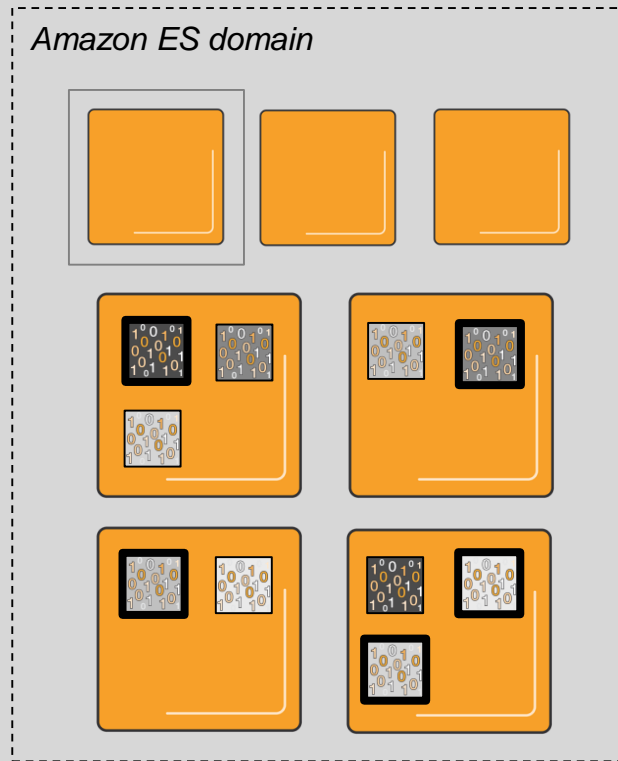
Use three dedicated master instances in production

☒ Enable dedicated master ⓘ

Dedicated master instance type m4.large.elasticsearch (default) ⓘ

Dedicated master instance count 3 (default) ⓘ

Master instances orchestrate and make your cluster more stable



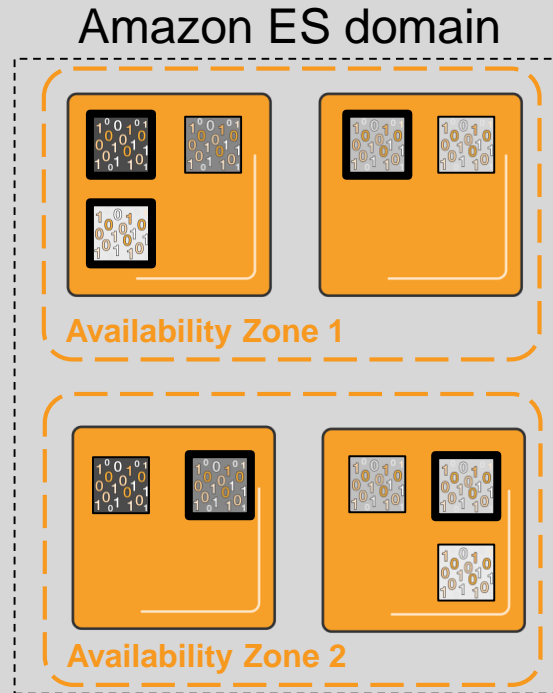
Use zone awareness in production



Enable zone awareness



100% data redundancy in two zones makes your cluster more highly available



Set CloudWatch metrics and alarms

Name	Metric	Threshold	Periods
ClusterStatus.red	Maximum	≥ 1	1
ClusterIndexWritesBlocked	Maximum	≥ 1	1
CPUUtilization/MasterCPUUtilization	Average	$\geq 80\%$	3
JVMMemoryPressure/Master...	Maximum	$\geq 80\%$	3
FreeStorageSpace	Minimum	$\leq (25\% \text{ of avail space})$	1
AutomatedSnapshotFailure	Maximum	≥ 1	1

Monitor Elasticsearch slow logs



- Easy console setup
- Integrated with CloudWatch Logs
- Set thresholds to receive log events corresponding to slow queries and slow indexing

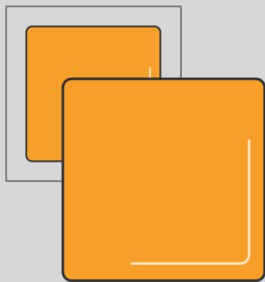
```
• index.search.slowlog.threshold.query.warn
• index.search.slowlog.threshold.query.info
• index.search.slowlog.threshold.query.debug
• index.search.slowlog.threshold.query.trace

• index.search.slowlog.threshold.fetch.warn
• index.search.slowlog.threshold.fetch.info
• index.search.slowlog.threshold.fetch.debug
• index.search.slowlog.threshold.fetch.trace

• index.indexing.slowlog.threshold.index.warn
• index.indexing.slowlog.threshold.index.info
• index.indexing.slowlog.threshold.index.debug
• index.indexing.slowlog.threshold.index.trace

• index.indexing.slowlog.level: trace
• index.indexing.slowlog.source: 255
```

Pay only for what you use



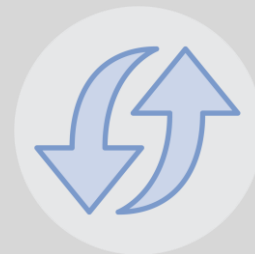
Instance hours

For data and master
instances



EBS GB/Mo

For volumes
deployed



AWS data transfer

For transfer out

Amazon Elasticsearch Service usage @ Expedia

Kuldeep Chowhan

**Principal Engineer
@ Expedia Group, Inc.**

@this_is_kuldeep





+175 Amazon ES
clusters



+500 EC2
instances



+40B documents



+35 TB of data

Why did we choose Amazon Elasticsearch Service?

Easy to set up

Set up for high availability

Instance count ⓘ

Instance type ⓘ

☒ Enable dedicated master ⓘ

Dedicated master instance type ⓘ

Dedicated master instance count ⓘ

☒ Enable zone awareness ⓘ

Storage configuration is **Active**

Choose a storage type for your data nodes. If you choose the EBS storage type, you will need to specify the EBS volume type and EBS volume size for the cluster. The EBS volume size setting is configured per instance. Multiply the volume size by the number of data nodes in your cluster for the total storage size available in your cluster. Take into account size of indices, shards, and replicas you intend to create in your cluster when configuring storage settings. Storage settings do not apply to any dedicated master nodes in the cluster.

Storage type ⓘ

Snapshot configuration

Once a day, Amazon ES takes an automated snapshot of your cluster. You can set the start hour for the snapshot. We recommend that you choose a time when traffic on your cluster is low.

Automated snapshot start hour ⓘ

Security

Elasticsearch access policy example

```
{
  "Effect": "Allow",
  "Principal": {
    "AWS": "arn:aws:iam::xxxxx:root"
  },
  "Action": "es:*",
  "Resource": "arn:aws:es:us-west-2:xxxxx:domain/xxxxx/*"
},
{
  "Effect": "Allow",
  "Principal": {
    "AWS": "*"
  },
  "Action": "es:Http*",
  "Resource": "arn:aws:es:us-west-2:xxxx:domain/xxxxx/*",
  "Condition": {
    "IpAddress": {
      "aws:SourceIp": [
        "0.0.0.0/28"
      ]
    }
  }
}
```


Monitoring & backups

Different log analytics architectures using Elasticsearch Service @ Expedia

Different Log Analytics Architectures

- Docker startup logs to Elasticsearch
- CloudTrail log analytics using Elasticsearch Service
- Distributed tracing platform using Elasticsearch Service

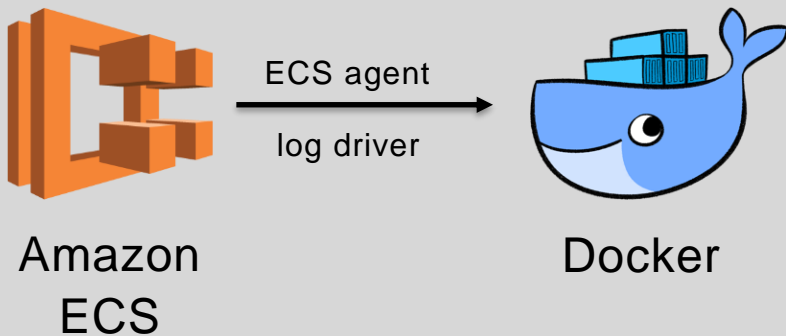
Docker start-up logs to Elasticsearch

Docker startup logs to Elasticsearch

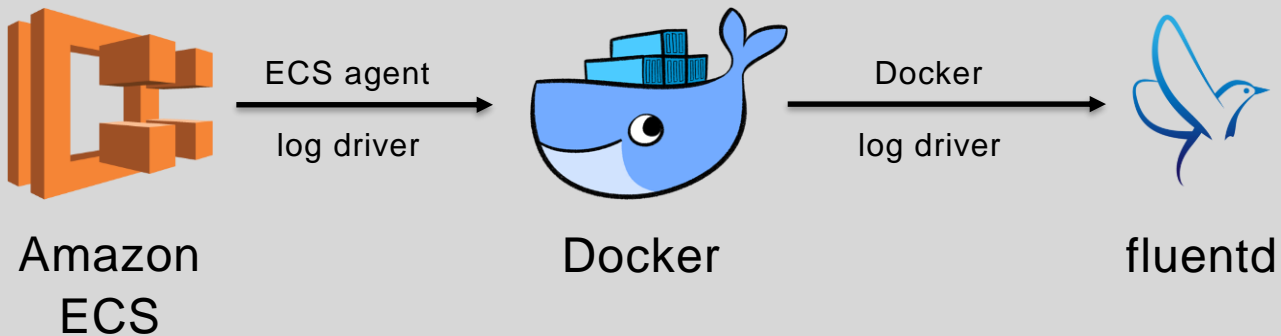


Amazon
ECS

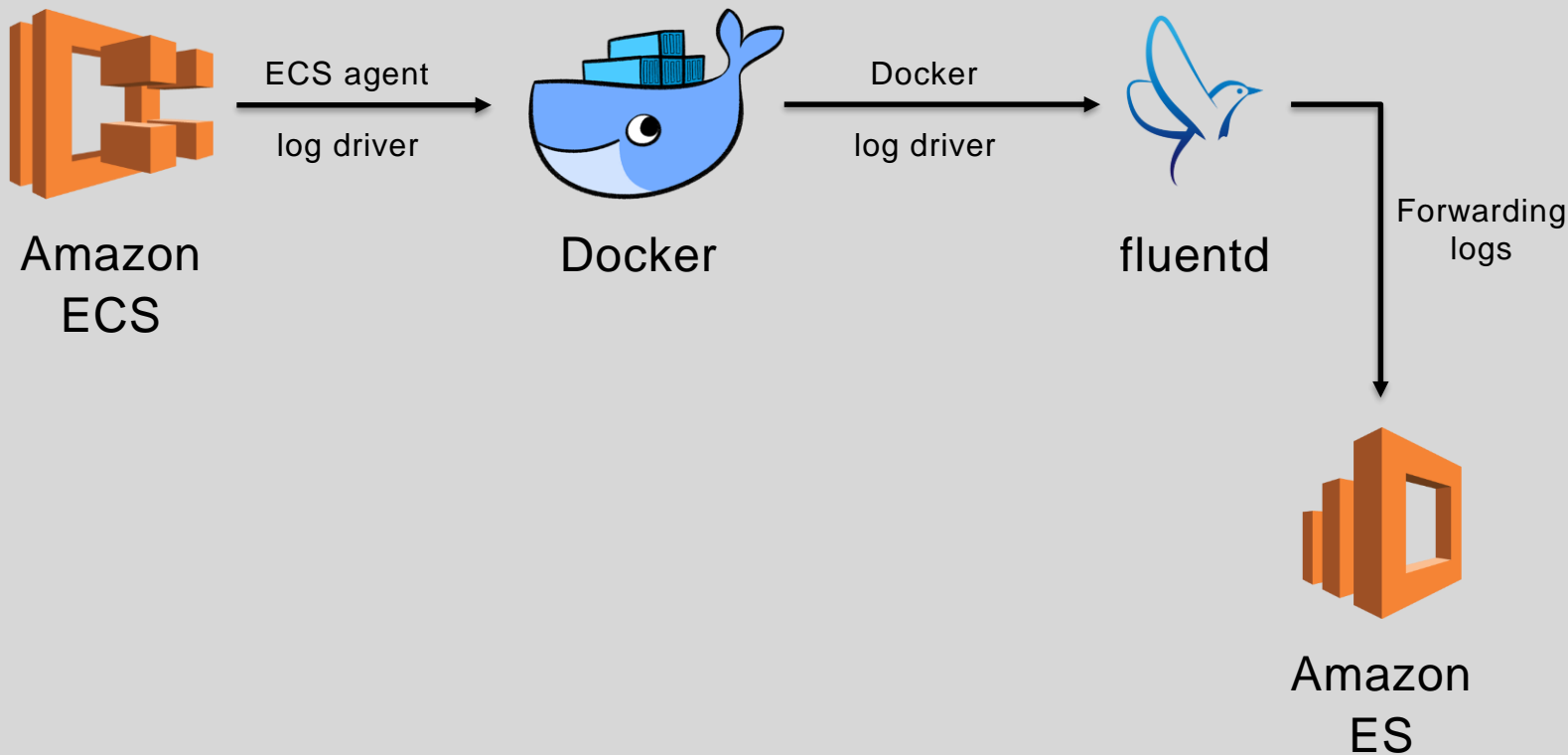
Docker startup logs to Elasticsearch



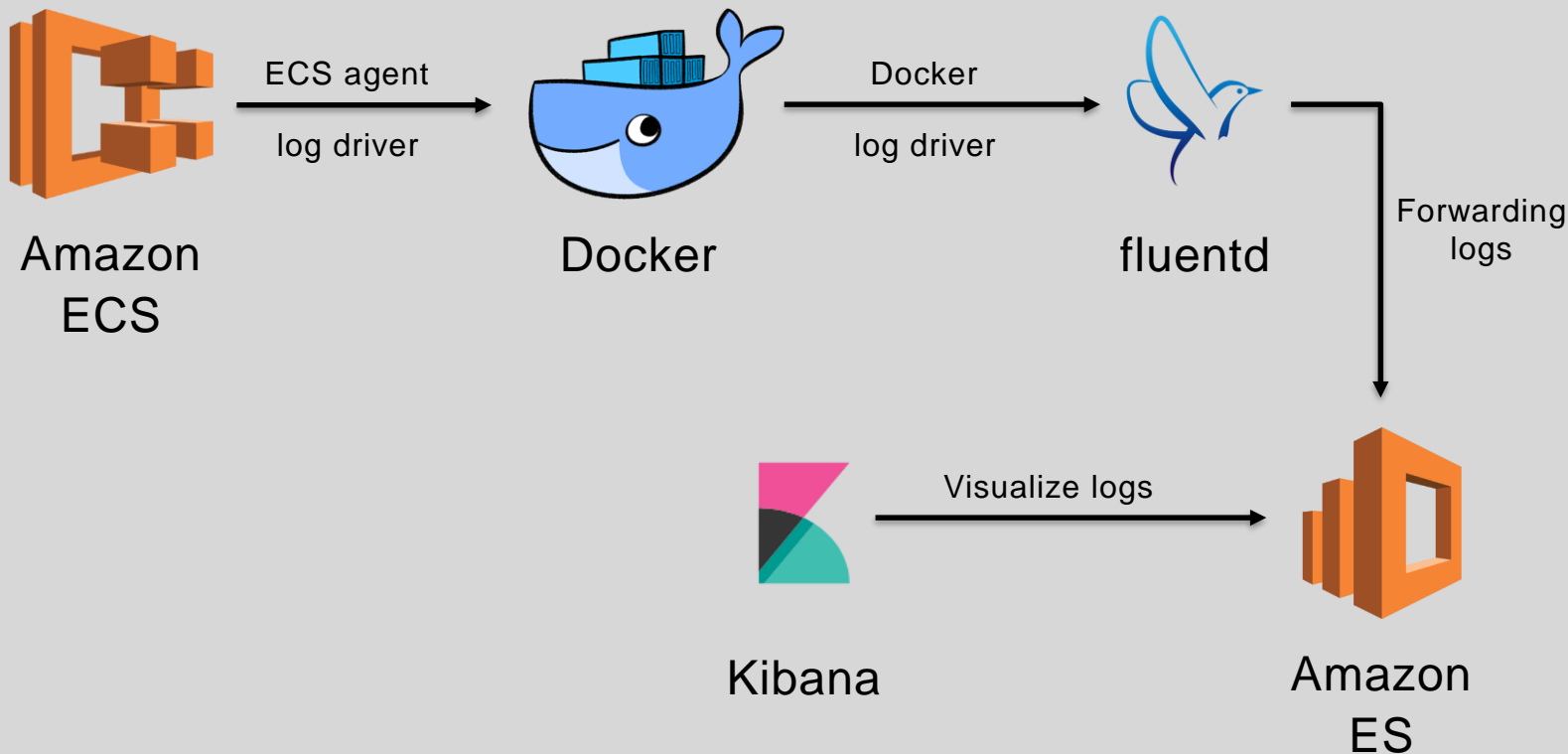
Docker startup logs to Elasticsearch



Docker startup logs to Elasticsearch



Docker startup logs to Elasticsearch



Docker fluentd log_driver configuration

```
{  
  "log_driver": "fluentd",  
  "options": {  
    "fluentd-address": "<fluentd>:24224",  
    "tag": "#{ImageName}"  
  }  
}
```

fluentd configuration to receive Docker logs

```
<source>  
  @type forward  
  port 24224  
  bind 0.0.0.0  
</source>  
<match *.**>  
  @type copy
```

fluentd to ES configuration

```
<match *.**>
  @type copy
  <store>
    @type elasticsearch
    host <elasticsearch domain>
    include_tag_key true
    tag_key @log_name
    flush_interval 1s
  </store>
```

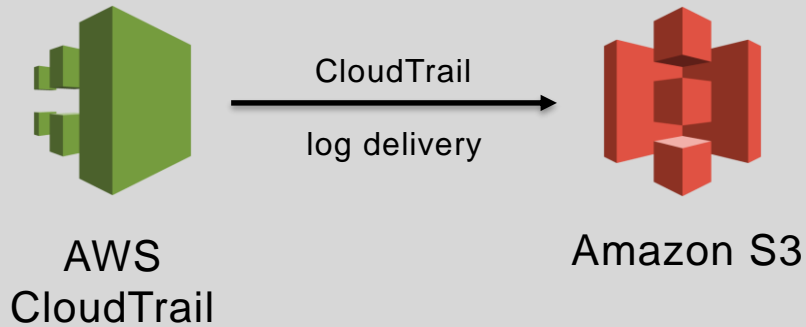
CloudTrail log analytics using Elasticsearch Service

CloudTrail log analytics using Elasticsearch

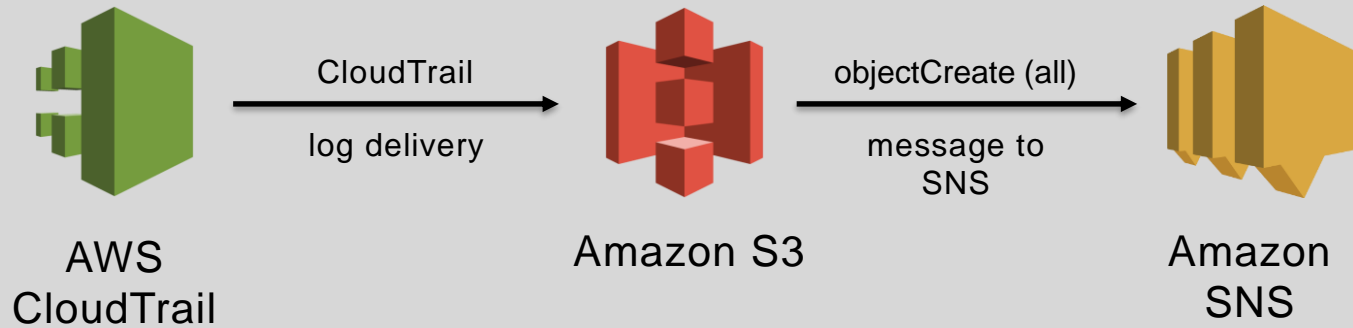


AWS
CloudTrail

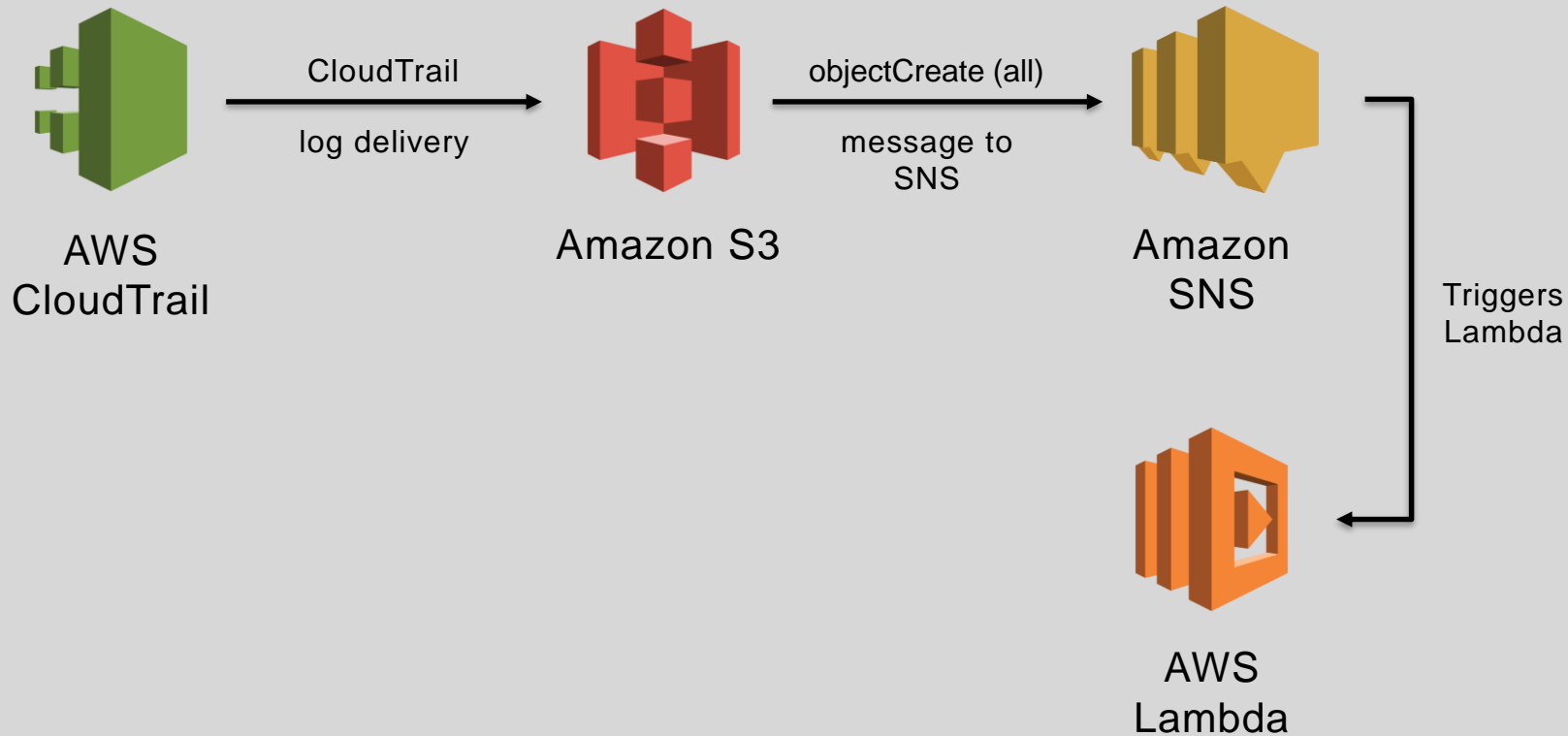
CloudTrail log analytics using Elasticsearch



CloudTrail log analytics using Elasticsearch



CloudTrail log analytics using Elasticsearch



CloudTrail log analytics using Elasticsearch



CloudTrail log analytics using Elasticsearch



CloudTrail log analytics using Elasticsearch

CloudTrail to S3 and SNS

▼ Storage location

S3 bucket

Encrypt log files ☐ No


Enable log file validation ☐ Yes

Publish to SNS ☐ Yes

SNS topic

SNS to Lambda trigger

Configuration **Triggers** Monitoring

 SNS: **cloudtrail-events**

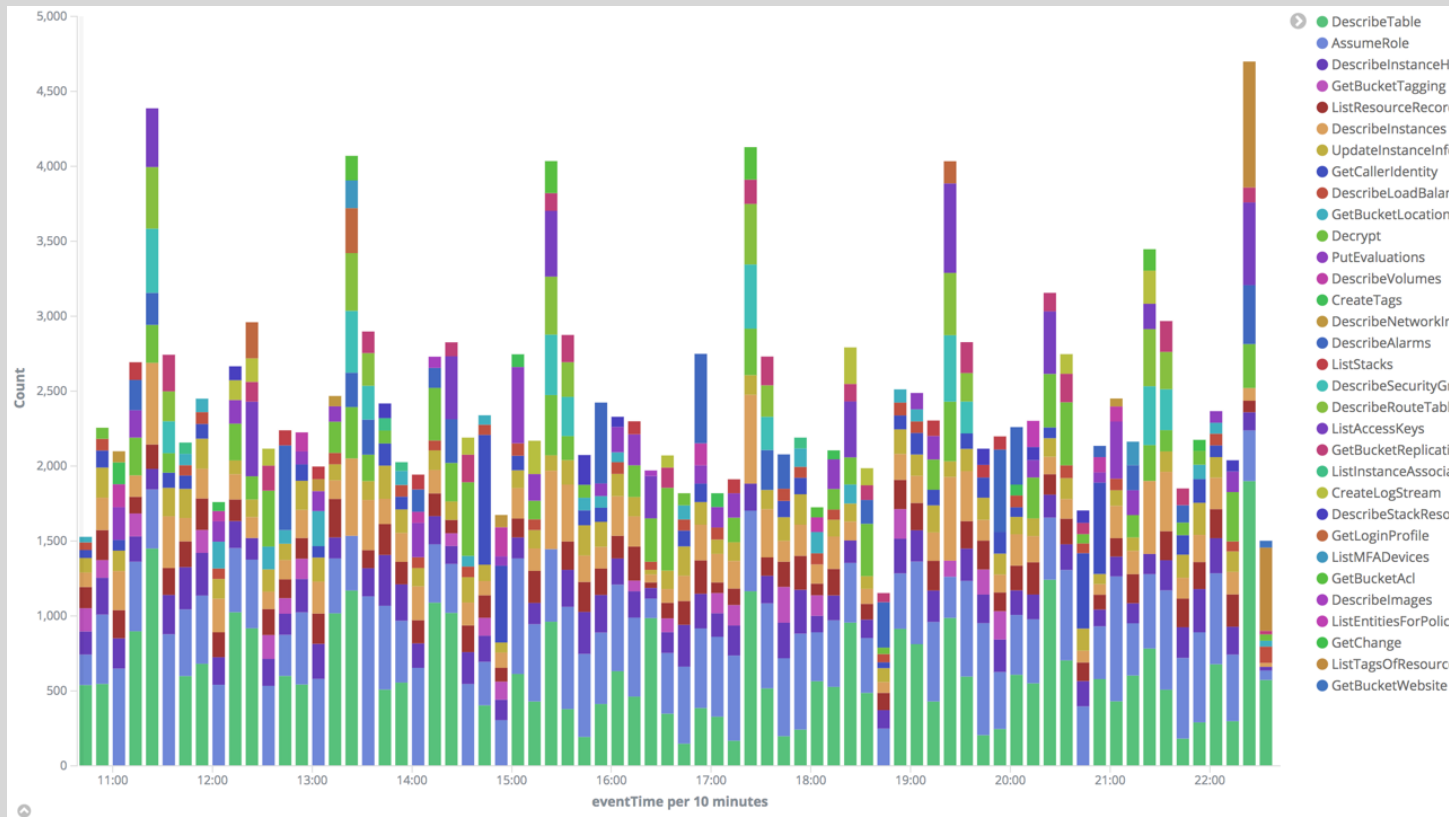
arn:aws:sns:us-east-1:cloudtrail-events

CloudTrail logs from S3 to Elasticsearch

```
try:
    response = s3.get_object(Bucket=s3Bucket, Key=s3ObjectKey)
    content =
gzip.GzipFile(fileobj=StringIO(response['Body'].read())).read()
for record in json.loads(content)['Records']:
    recordJson = json.dumps(record)
    logger.info(recordJson)
    indexName = 'ct-' + datetime.datetime.now().strftime("%Y-%m-%d")
    res = es.index(index=indexName, doc_type='record', id=record['eventID'],
body=recordJson)
    logger.info(res)
return True
```

How did we use this CloudTrail log data that is in Elasticsearch?

Top 10 AWS API calls (per 10 mins) dashboard



This solution is open sourced at

<https://github.com/ExpediaDotCom/cloudtrail-log-analytics>

as a serverless application

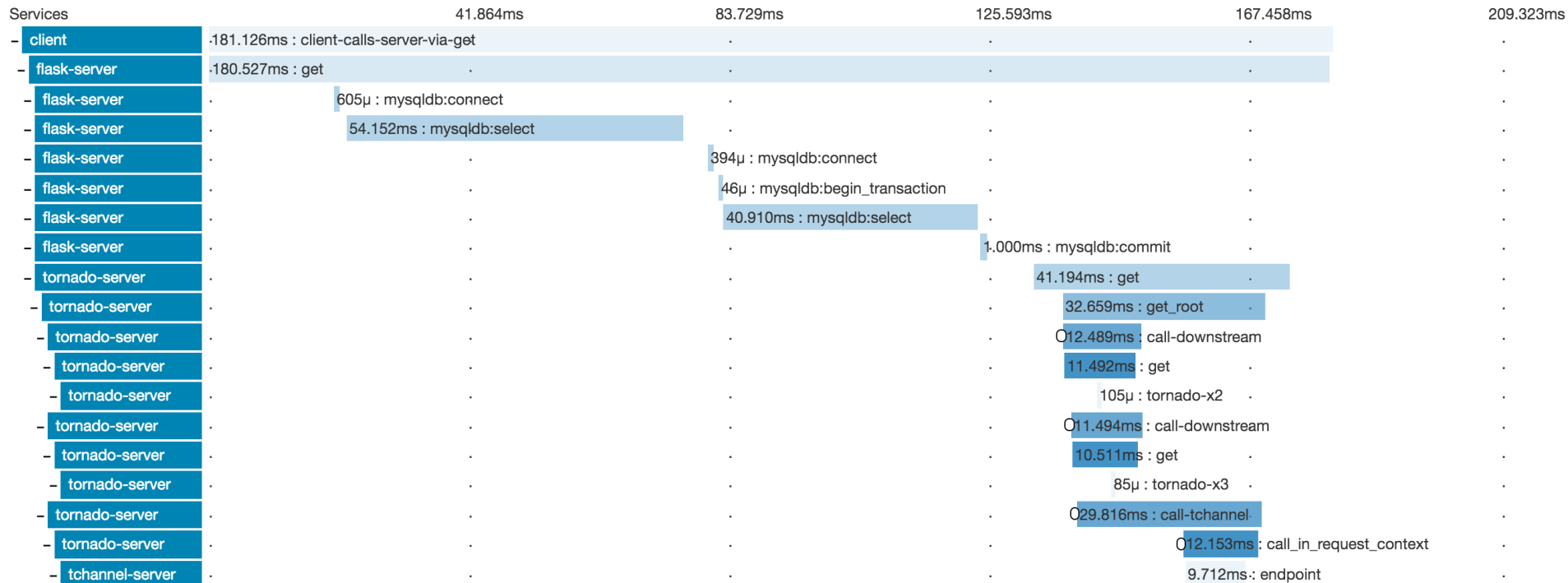
Distributed tracing platform using Elasticsearch Service

Duration: **209.323ms** Services: **5** Depth: **7** Total Spans: **24**

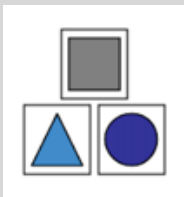
JSON

Expand All Collapse All Filter Service Se... ▼

client x4 flask-server x10 missing-service-name x2 tchannel-server x2 tornado-server x11

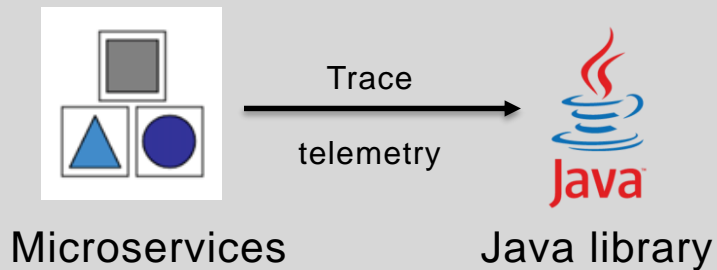


Distributed tracing platform using Elasticsearch

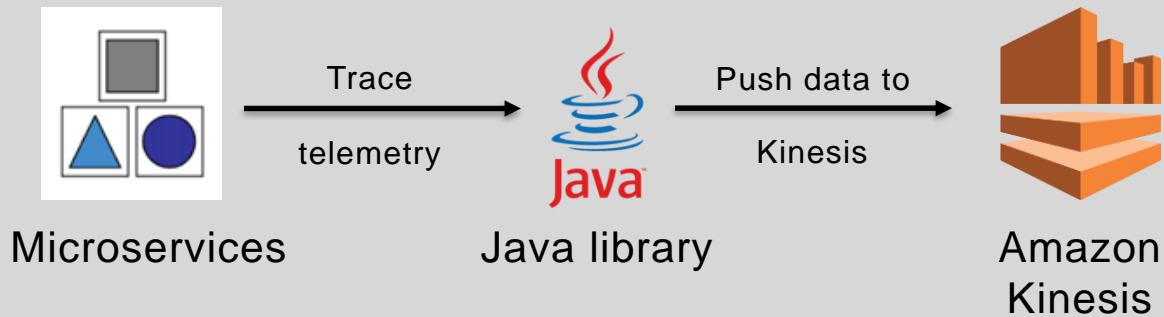


Microservices

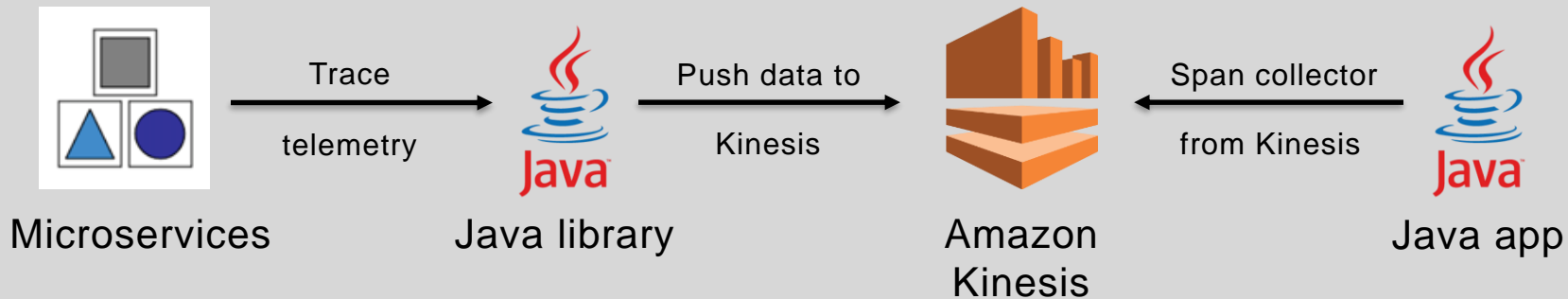
Distributed tracing platform using Elasticsearch



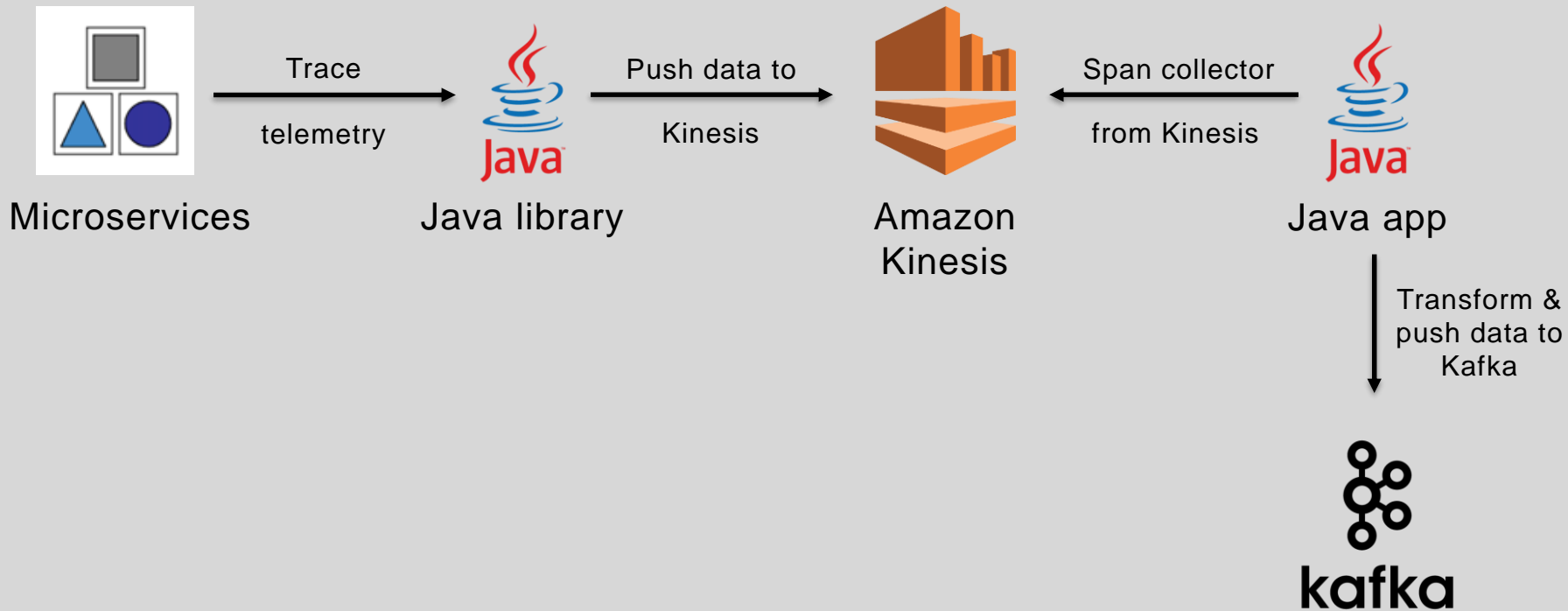
Distributed tracing platform using Elasticsearch



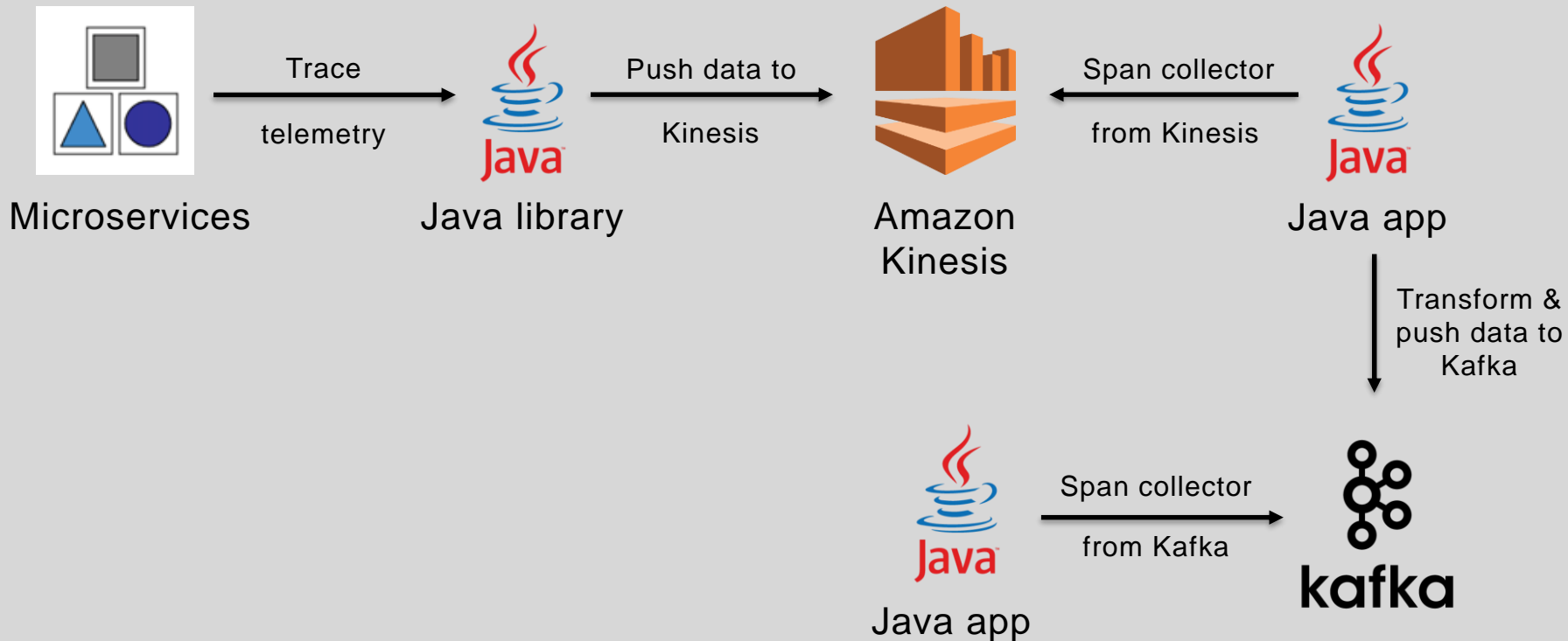
Distributed tracing platform using Elasticsearch



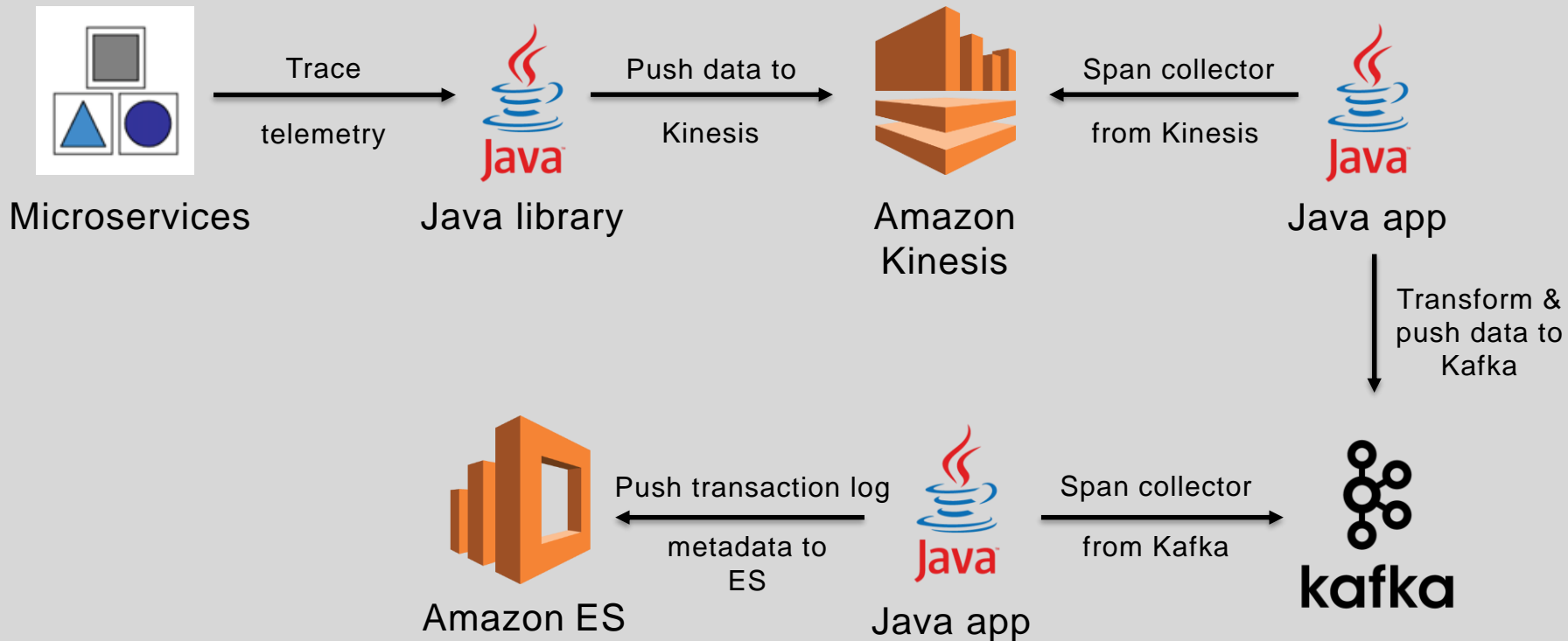
Distributed tracing platform using Elasticsearch



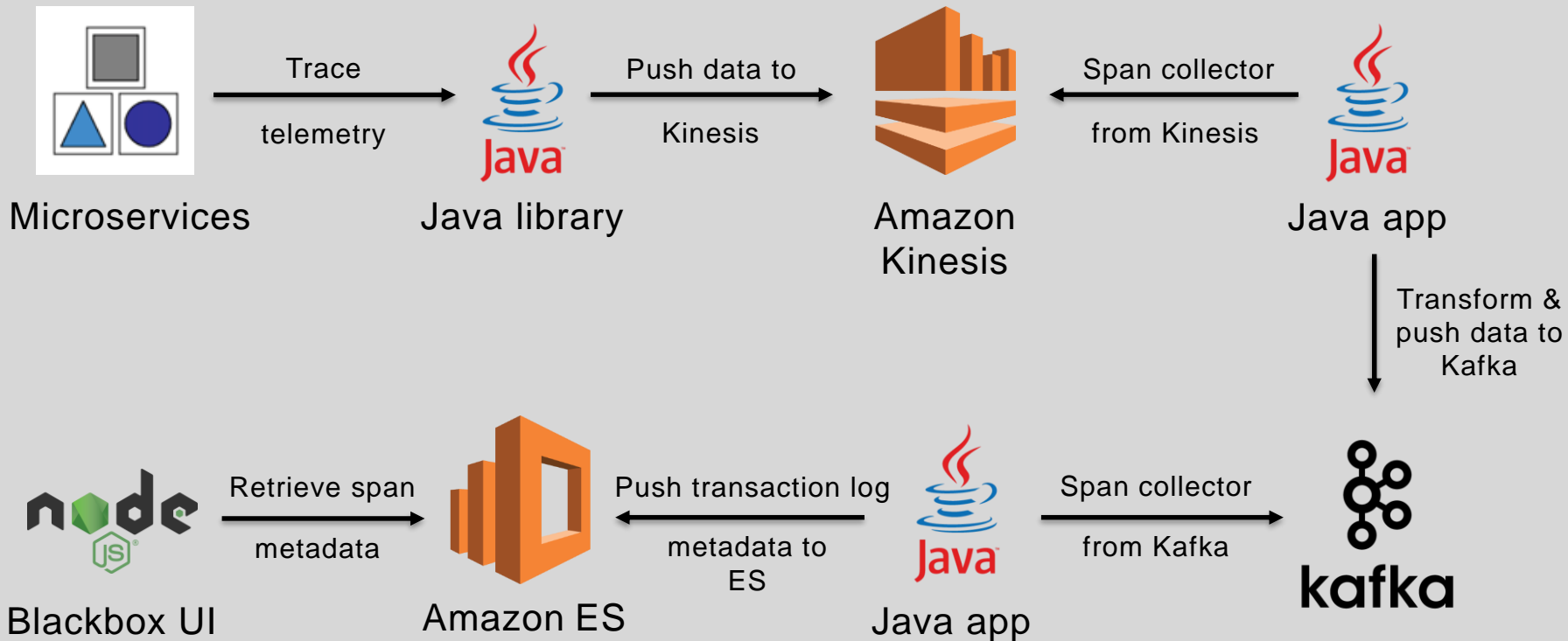
Distributed tracing platform using Elasticsearch



Distributed tracing platform using Elasticsearch



Distributed tracing platform using Elasticsearch



Haystack document in Elasticsearch

```
{
  "_index": "transactions-2017-10-26-04",
  "_type": "transactions_logs",
  "_id": "AV9W9lCq5Jdrc3Uj0vCg",
  "_score": null,
  "_source": {
    "transactionid": "5e66cad8-d7ea-49e8-94c8-24d2298d4cdc"
  },
  "fields": {
    "startTime": [
      1508992503395
    ]
  },
  "sort": [
    1508992503395
  ]
}
```

How is Elasticsearch used in distributed tracing?

Time-based queries for traces

Filtering traces by services

Things to keep in mind

- Scaling of cluster results in a new cluster with the data being synchronized
- Monitor and optimize the cluster yourself
- No upgrade button between Elasticsearch versions (wish list)
- Monitoring doesn't show how much disk space in use (wish list)



Wrap up

Benefits of using Amazon Elasticsearch Service:

- Easy to set up
- Setup for high availability
- Security
- Monitoring and backup

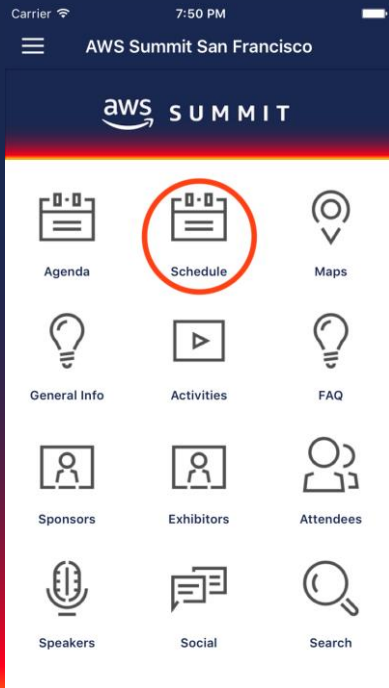
**Please complete the session
survey in the summit mobile app.**

Thank you!

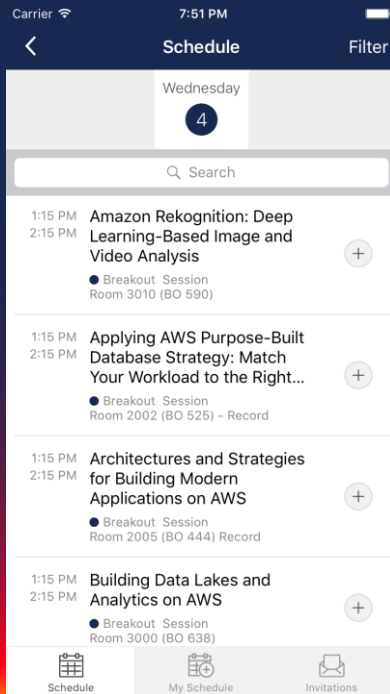
@this_is_kuldeep

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1. Tap the **Schedule** icon.



2. Select the session you attended.



3. Tap **Session Evaluation** to submit your feedback.

