



The Institute  
for Quantitative Social Science  
*at Harvard University*



# What's New with Apache Spark on Kubernetes

Ellen Kraffmiller - Senior Software Engineer  
Robert Treacy - Senior Software Architect

The Institute for Quantitative Social Science at Harvard  
University

# Agenda

- Who we are/Why we are interested in Spark on Kubernetes
- Overview of Spark on Kubernetes implementation
- What's new since last year (Spark 2.4 features)
- What's coming in Spark 3.0
- Spark Operator for Kubernetes
  - For configuring your Spark app
  - For monitoring your Spark app
- Demo of Spark Operator running Spark ML application

# Consilience: Text Analysis Tool for Researchers

Consilience Beta

## Upload Document Set

### Set Name

Wine Reviews Demo

### Description

Reviews from Wine Spectator

### Documents ZIP/CSV File

wine\_reviews500.csv *Uploaded*

### Text Analysis

Select at least one column that will be used for text analysis.

text

### Metadata Landmarks (Optional)

Optionally select one or more columns to create clusterings based on your metadata.

country, points, price

Save Changes



Consilience Beta

Document Sets > Set Preview

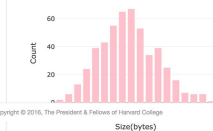
Wine Reviews 501 Documents description

## Document Set Summary

### Term Frequency Cloud



### Document Size Distribution

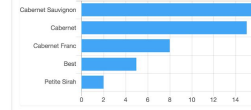


Copyright © 2016, The President & Fellows of Harvard College

### Most Frequent Entities



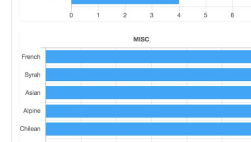
### ORGANIZATION



### PERSON



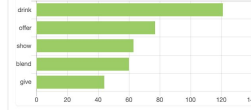
### MSG



### Most Frequent Parts of Speech



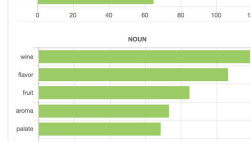
### VERB



### ADJECTIVE



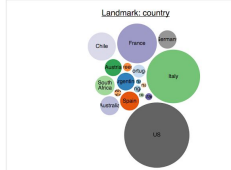
### NOUN



## Sample Classifications

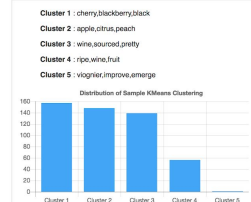
### Metadata Clustering Landmark

Explore



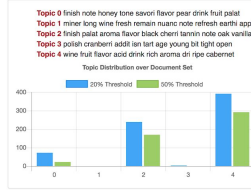
### KMeans Clustering Landmark

Explore

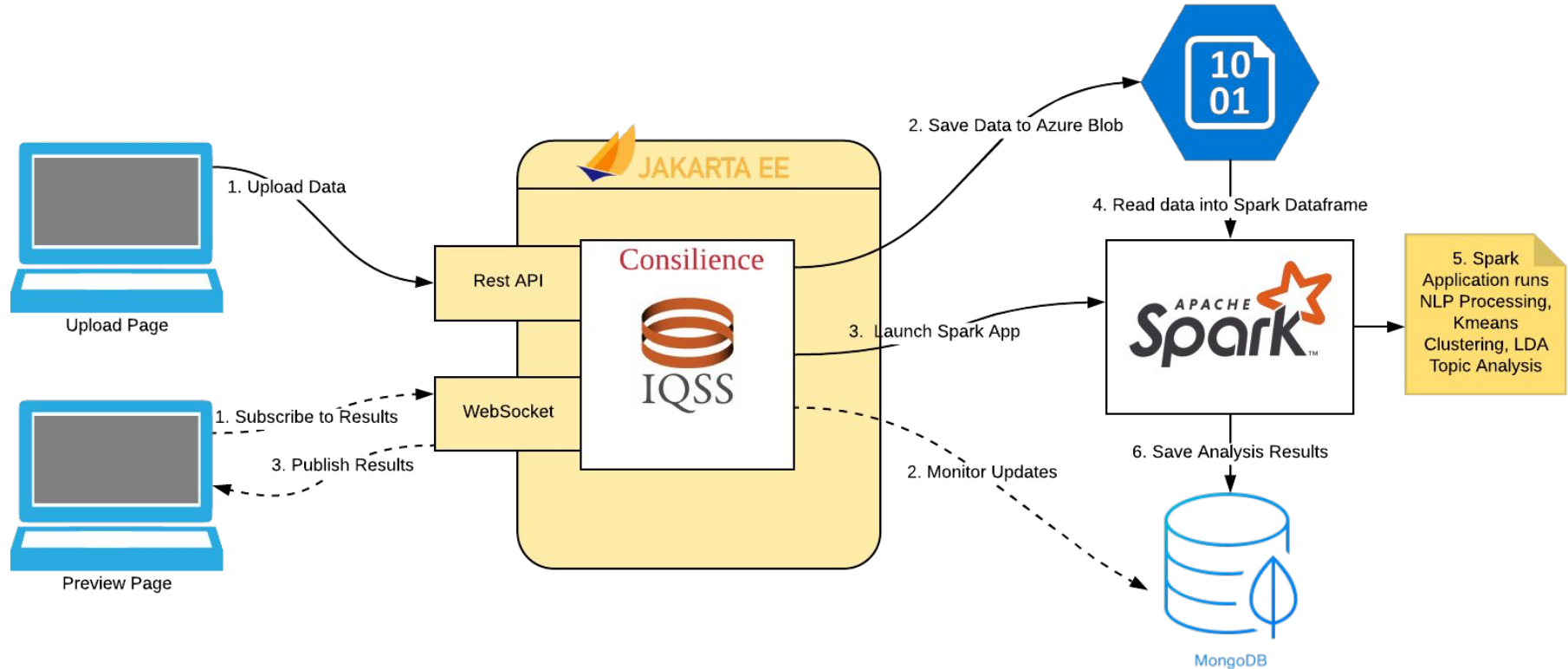


### LDA: 5 Topics

Explore



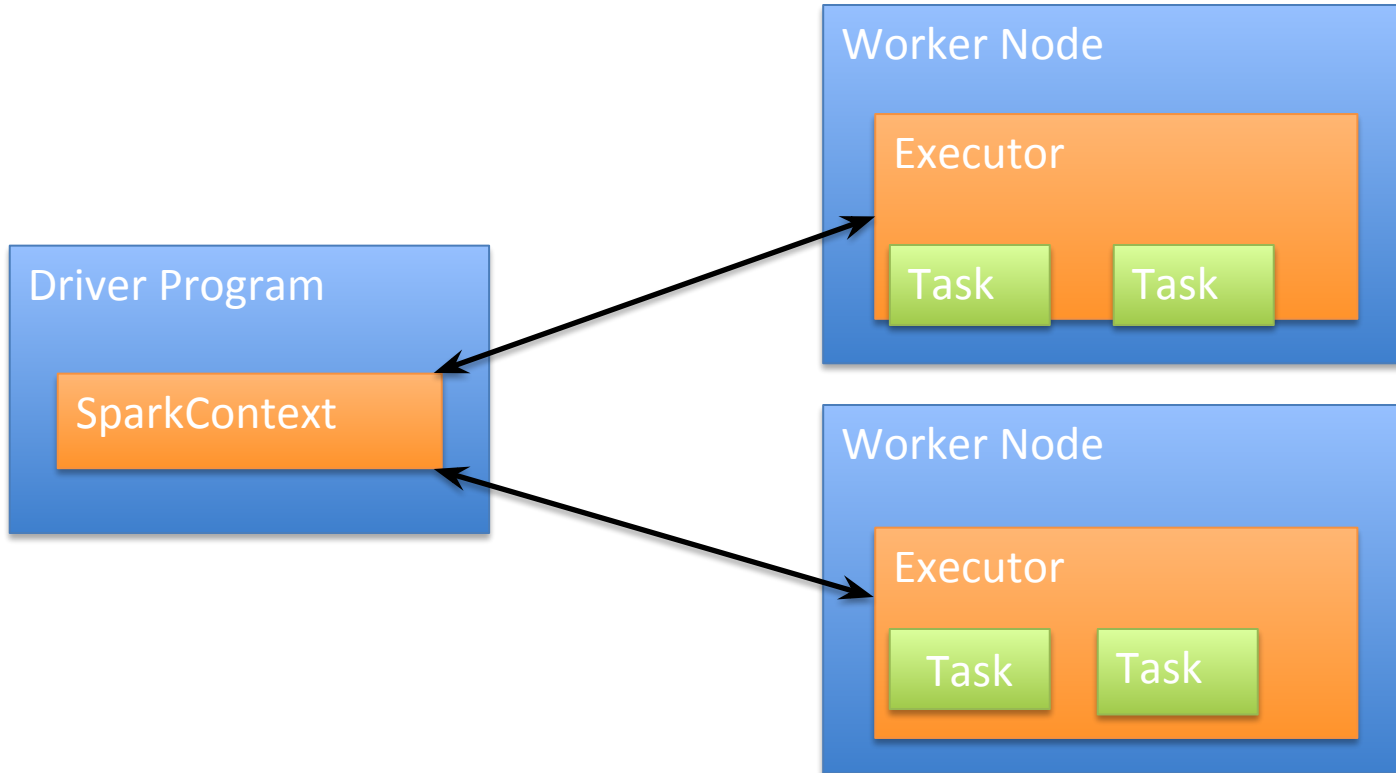
# Consilience: Data Processing Workflow



# Apache Spark

- A fast and general engine for large scale data processing
- k8s support began in v 2.3.x
- 100x faster than Hadoop MapReduce in memory, 10x faster in disk

# Cluster execution



# Spark Components

Spark SQL

Spark  
Streaming

MLlib

GraphX

Spark Core

Standalone Cluster

YARN

Mesos

Kubernetes

# Kubernetes

- Container-orchestration
- Operating system for clusters
  - Simplifies application deployment
  - Improves utilization of resources
- Standard for running distributed applications
- Containers



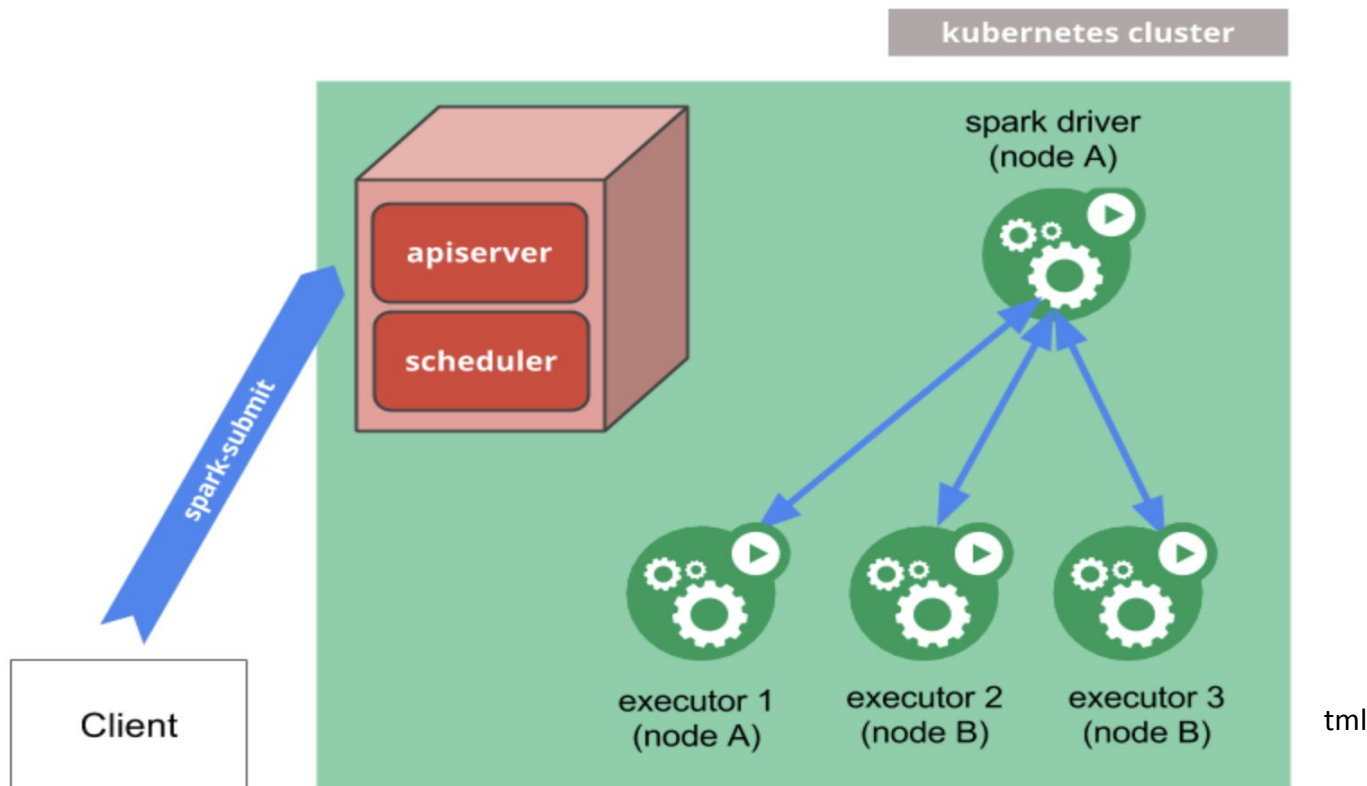
# Kubernetes Automatic Scaling

- Google Kubernetes Engine
- Google Compute Engine
- Amazon Web Services
- Azure

# Spark Kubernetes

- Spark v 2.3+
- Kubernetes 1.6+
- Docker

# Spark on Kubernetes



Reference: <https://spark.apache.org/docs/latest/img/k8s-cluster-mode.png>

# Deploy to Kubernetes with spark-submit

```
bin/spark-submit --master
```

```
k8s://https://iqcodeone-73142460.hcp.eastus.azmk8s.io:443 --deploy-mode
```

```
cluster --name spark-pi --class org.apache.spark.examples.SparkPi --conf
```

```
spark.executor.instances=5 --conf
```

```
spark.kubernetes.container.image=bobtreacy/text-analysis --conf
```

```
spark.kubernetes.authenticate.driver.serviceAccountName=spark
```

```
local:///opt/spark/examples/jars/spark-examples_2.11-2.3.2.jar 50000
```

# Spark 2.4

- PySpark bindings for K8S
- R bindings for K8S
- Support client mode for Kubernetes cluster backend
- Support for mounting K8S volumes

# Future

Dynamic resource allocation and external shuffle service

Local file dependency management

Spark application management

Job queues and resource management

# Spark 3.0

Pod Templates

GPU-aware scheduling

Sub path mounting

Improve behavior with dynamic allocation

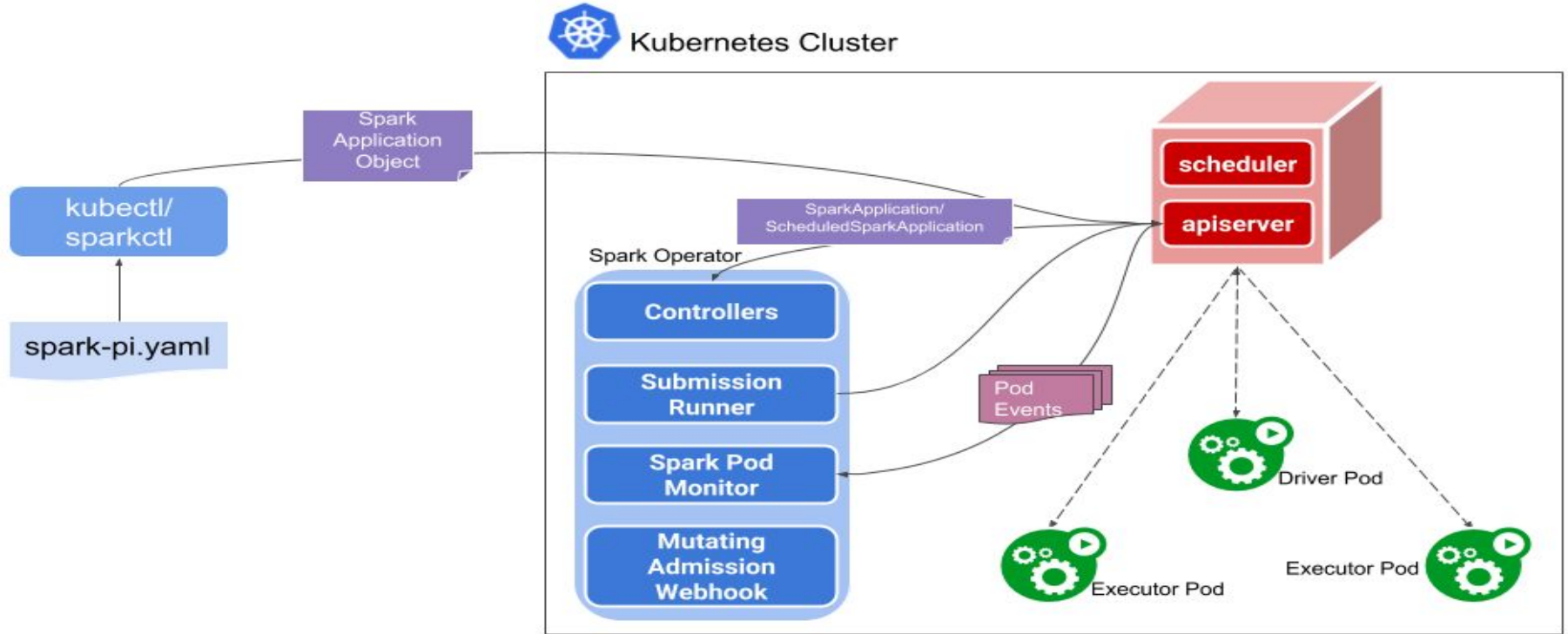
Integration testing improvements

# Kubernetes Operator for Apache Spark

- Google
  - Google Kubernetes Engine
  - Run on any Kubernetes 1.8+
- Supports Spark 2.3 +
- Customization of Spark pods
  - Kubernetes Mutating Admission Webhook



# Kubernetes Operator for Spark



Google Cloud Platform

Reference: <https://github.com/GoogleCloudPlatform/spark-on-k8s-operator/blob/master/docs/architecture-diagram.png>

# Spark & RBAC

If RBAC is enabled, the Spark driver pod needs permission to create and watch Spark executor pods:

```
$ kubectl create serviceaccount spark
```

```
$ kubectl create clusterrolebinding spark-role --clusterrole=edit  
--serviceaccount=default:spark --namespace=default
```

# Custom Resource Definitions (CRD)

- SparkApplication
  - `kubectl apply -f <YAML file>` or `sparkctl create <YAML file>`
- ScheduledSparkApplication
  - cron schedule

# SparkApplication Spec

apiVersion: sparkoperator.k8s.io/v1beta1

kind: SparkApplication

metadata:

name: spark-pi

namespace: default

spec:

type: Scala

mode: cluster

image: gcr.io/spark/spark:v2.4.0

mainClass: org.apache.spark.examples.SparkPi

mainApplicationFile: local:///opt/spark/examples/jars/spark-examples\_2.11-2.4.0.jar

# Mutating Admission Webhook

Optional - customize Spark driver and executor pods

Kubernetes 1.9+

```
kubectl apply -f manifest/spark-operator-with-webhook.yaml
```

```
--set enableWebhook=true (as a param for helm/install)
```

# Mutating Admission Webhook use

Mounting a ConfigMap

Spark Configuration Files

Hadoop Configuration Files

Mounting Volumes

Pod Security Context

DNS Settings

# Tolerations and Pod Affinity

## Tolerations

Node resources reserved for specific pods

## Pod Affinity

Grouping pods on specific node to work together

# sparkctl

- Command line tool – like kubectl extended
  - Create, list, check status, get logs ...
- Flags
  - --namespace
  - --kubeconfig
- Mount local Hadoop config as a ConfigMap



# Demo

<https://github.com/ekraffmiller/CodeOne2019>

# Related Presentations

DEV2410 - Getting Started with Spark

DEV5377 - Our Experience Writing a Kubernetes  
Operator

DEV1641-Data Pipelines with Apache Spark

# Thank you!

- Demo on Github:

<https://github.com/ekraffmiller/CodeOne2019>

- Questions?