

# The Future of Apache Spark

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## A Week in Spark Development

500 patch updates

200 updates to our issue tracker

140 user list e-mails

80 merged patches



## Spark's Future

Spark has seen rapid growth in the last year... where are we going now?

Spark releases and developer process Technical roadmap over future releases



# Goal of the Spark project

Empower data scientists and engineers

Expressive, clean APIs

Unified runtime across many environments

Powerful standard libraries



## **API** stability

In 1.0+ Spark has well defined public API's and well defined experimental API's

Apps written against Spark API will be portable in new versions

Patches that break our API automatically fail our build



### Developer-friendly release cadence

Minor releases every 3 months 1.1 (August), 1.2, 1.3

Maintenance releases with fixes as necessary 1.0.1, 1.0.2, etc

Extremely conservative about patch releases



Spark SQL Relational operators MLLib machine learning GraphX
Graph
processing

Spark
Streaming
real-time

### Spark Runtime

**Cluster Managers** 

YARN, Mesos, AWS

**Data Sources** 

HDFS, S3, Cassandra, Hana



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Newer, focused on adding capabilities

### Spark Runtime

More mature, focus on optimization and pluggability



## The future of Spark is libraries

Critical component of any successful runtime

Packaged and distributed with Spark to provide full inter-operability

Lead by experts in respective fields, highly curated and integrated with Spark core API



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# Spark SQL

Growing faster than any other component

Support for SQL language and notion of typed schema RDDs

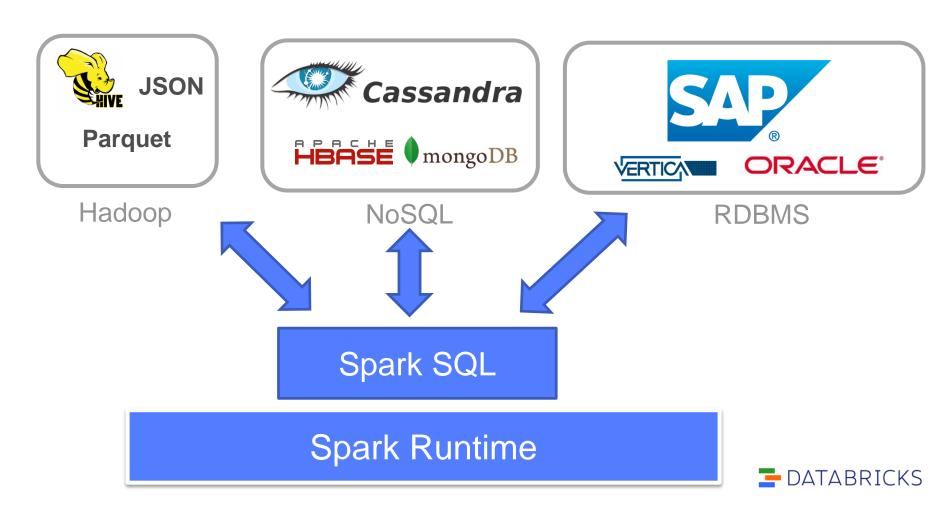
### Focuses going forward:

- Optimization (code gen, faster joins, etc)
- Language extensions (towards SQL92)
- Integration (next slide...)

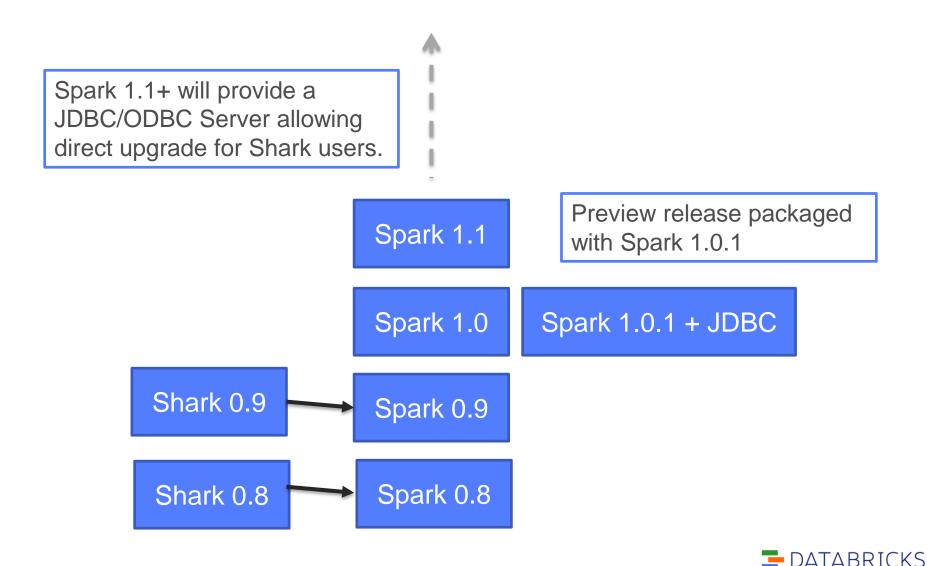


## Spark SQL and SchemaRDD

Will facilitate deeper integration with other systems



## Spark SQL and Shark



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### **MLlib**

Second fastest growing component ©

MLLib 1.0 has about ~15 algorithms

MLLib 1.1 should roughly double that...

traditional descriptive statistics:
sampling, correlation, estimators, tests
learning algorithms:

NMF, Sparse SVD, LDA...



## SparkR



Make SparkR "production ready" (Alteryx and Databricks).

Integration with Mllib.

Consolidating the the data frame and RDD concepts.



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### Notable trends

### **Hardware**

Memory prices continue to fall, 256+GB machines not uncommon

SSD's becoming widely deployed

### **Software**

Tachyon and other cluster memory managers



## Spark Core

Allow extension/innovation by defining internal API's:

### Internal storage API

Support for SSDs

Shared memory systems like Tachyon, and (eventually) HDFS caching/DDMs.

### Spark shuffle API

Sort-based shuffle

Pipelined shuffle



### Timeline

Spark 1.0.1

JSON support in Spark SQL

#### Spark 1.1

Generalized shuffle interface MLLib stats algorithms JDBC server Sort-based shuffle\*

### Spark 1.2

Refactored storage support

#### Spark 1.3+ SparkR



### I've only scratched the surface...

Streaming: new data sources and tighter flume integration

Graphx: optimizations and API stability

Core: Elastic scaling on YARN, user-defined metrics and counters

[Your work here]



# Wrapping it all up

Spark will grow substantially in the next year

Focus is on libraries and improving core internals for future innovation

Release process and cadence provides users with stable releases despite fast growth





Thank You!