

# Apache Spark最新技术进展和 3.0+展望

## 李呈祥(司麟) 阿里巴巴高级技术专家 计算平台事业部





#### Data Warehouse Enhancement



Spark on Cloud







#### A Unified Analytics Engine for Large-scale Data Processing

# Spark<br/>SQLSpark<br/>StreamingMLlib<br/>(machine<br/>learning)GraphX<br/>(graph)

#### Apache Spark





#### Tungsten

#### Catalyst

Easy-to-use API

#### Rich Ecosystem Support

Efficient Engine





## Data Warehouse Enhancement





#### **Delta Lake**

- ACID Transactions
- Scalable Metadata Handling
- Time Travel (data versioning)
- Open Format
- Unified Batch and  $\bullet$ Streaming Source and Sink
- Schema Enforcement





#### Coming soon:

- Audit History  $\bullet$
- Full DML Support
- Expectations



- Unified API for batch and streaming
- Flexible API for high performance implementation
- Flexible API for metadata management
- Target 3.0

#### **Data Source V2**



#### Adaptive Execution

Dynamic optimize the execution plan at runtime based on the statistic of previous stage.

- Self tuning the number of reducers
- Adaptive join strategy
- Automatic skew join handling

## **Runtime Optimization**

#### EMR Runtime Filter

- Filter big table with runtime statistic of join key.
- Support both partitioned • table and normal table.





#### User may analyze data in certain access pattern

Regularly join 2 tables?

. . . . . .

- Regularly aggregate by certain fields?
- Regularly filter by certain fields?

#### **EMR Spark Relational Cache**

Data Organization:

- partition, bucket, sort ullet
- file index, zorder ullet

Data pre-computation:

- pre-filter  $\bullet$
- denormalization
- pre-aggregation

Make data adaptive to compute, so spark compute faster.



#### EMR Spark Relational Cache

#### Easy to build and maintain

CREATE VIEW emp\_flat AS SELECT \* FROM employee, address WHERE e\_addrId = a\_addrId;

CACHE TABLE emp\_flat USING parquet PARTITIONED BY (e\_ob\_date) -- User Query --SELECT \* FROM employee, address WHERE e\_addrId = a\_addrId and a\_cityName = 'ShangHai'

#### Transparent to user





# Spark on Cloud





#### **Storage and Computing Disaggregation**



Why disaggregate storage and computing:

- Pay as you go.
- Scale independently of each other.
- More reliable storage.

The challenge of disaggregation:

- Object store metadata management.
- Limited network resource.



## **Storage and Computing Disaggregation**

# **EMR JindoFS** fill the gap between object store and compute framework:

- File System API and meta management.
- Local replication support. Remote reliable storage and fast local access.
- Automatic and transparent cold data separation and migration
- Optimized for machine learning and Spark AI





#### Spark on Cloud: Remote Shuffle Service

- Data source storage is disaggregated from computing while local shuffle data is not.
- Local storage has poor elasticity.
- Current external shuffle service make cost extra effort for worker/nodemanager, and is not available for k8s.
- [SPARK-25299] would support write shuffle file to remote storage, remote shuffle service is still on the way.



- Pay as you go.
- Service run on hosts optimized for it.





#### **Spark on Kubernetes**

#### Natively support since 2.3

Pyspark/R binding and client mode supported since 2.4

#### Spark 3.0+

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- Dynamic allocation support
- Kerberos support





# Spark + AI





#### Project Hydrogen: Spark + AI

- Better AI need big data
- Data analysis get deeper
- Hydrogen make Spark a unified AI processing pipeline

Barrier Execution Mode Accelerator Aware Scheduling Optimized Data Exchange





#### **Project Hydrogen: Barrier Execution**



- Gang scheduling enabled to run DL job as Spark stage.
- Specific recovery strategy supported for gang scheduled stage.
- Available since 2.4





## **Project Hydrogen: Accelerator Aware Scheduling**

- GPUs are applied at application level.
- User can retrieve assigned GPUs from task context.
- Can extend to other accelerator, such as: FPGA
- Available at 3.0, see [SPARK-27362], [SPARK-27363]





#### **Project Hydrogen: Optimized Data Exchange**

- Spark loads/saves data from/to persistent storage in a data format used by a DL/AI framework.
- Spark feeds data into DL/AI frameworks for training.
- Prefer to use Apache Arrow as exchange data format.
- [SPARK-24615] WIP





# Spark 3.0





## **3.0 Targets**

#### • Project Hydrogen

- GPU-Aware scheduling
- Optimized data exchange
- Adaptive Execution
  - Self tuning the number of reducers
  - Adaptive join strategy
- Data Source V2

This presentation may contain projections or other forward-looking statements regarding the upcoming release (Apache Spark 3.0). The statements are intended to outline our general direction. They are intended for information purposes only. They are not a commitment to deliver code or functionality. The development, release and timing of any feature or functionality described for Apache Spark remains at the sole discretion of ASF and the Apache Spark PMC.

- Spark on K8s
  - Dynamic resource allocation
  - Kerberos support
- Hadoop 3.x support
- Hive 2.3 support
- Scala 2.12 GA
- Better ANSI SQL compliance







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