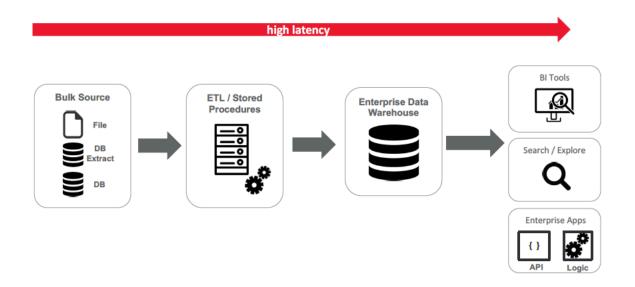
Lambda architecture

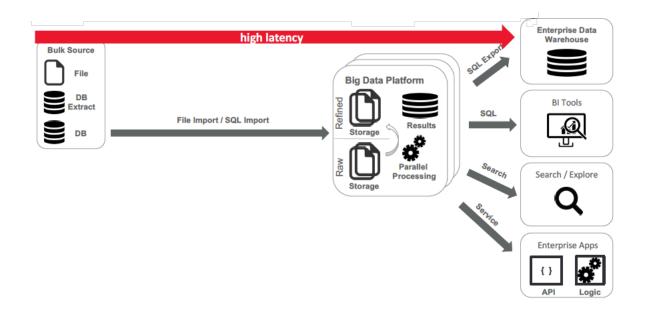
Viet-Trung Tran

School of Information and Communication Technology

Traditional BI infrastructures



Hadoop solves Volume and Variety – not Velocity



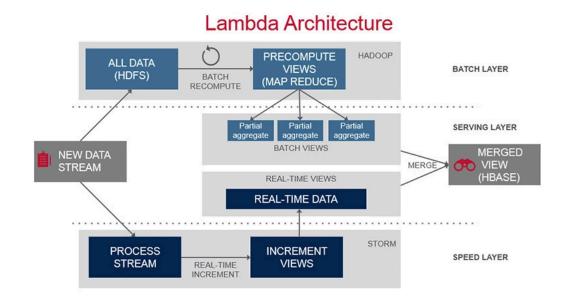
Lambda Architecture

- A data-processing architecture designed to handle massive quantities of data by taking advantage of both batch and stream processing methods.
- Spark is one of the few data processing frameworks that allows you to seamlessly integrate batch and stream processing
 - Of petabytes of data
 - In the same application

I need fast access
to historical data
on the fly for
predictive modeling
with real time data
from the stream



Lambda architecture



Relevance of data

```
query = function(batch view, real time view)
real time view = function(real time view, new data)
batch view = function(all data)
```

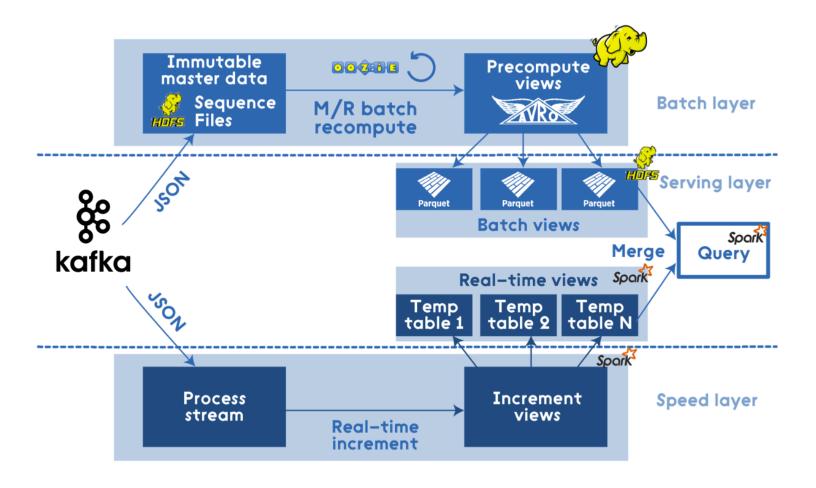
data absorbed into batch view

data absorbed into real–time view

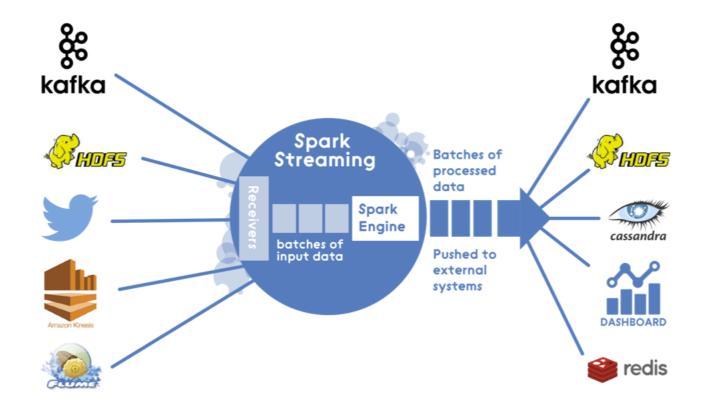
time

now

Lambda architecture: one



Spark streaming



Spark streaming

- Scalable, fault-tolerance stream processing system
- a streaming computation as: a series of very small, deterministic batch jobs
 - Chop up the live stream into batches of X seconds
 - Spark treats each batch of data as RDDs and processes them using RDD operations
 - Finally, the processed results of the RDD operations are returned in batches



Streaming landscape



Apache Storm

- True streaming, low latency lower throughput
- · Low level API (Bolts, Spouts) + Trident



Spark Streaming

- •Stream processing on top of batch system, high throughput higher latency
- Functional API (DStreams), restricted by batch runtime



Apache Samza

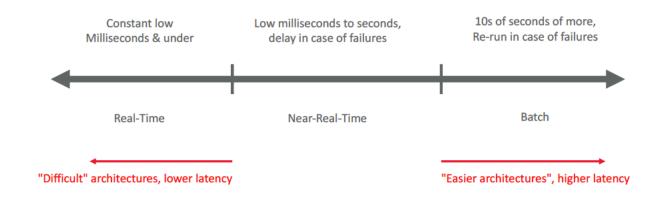
- •True streaming built on top of Apache Kafka, state is first class citizen
- ·Slightly different stream notion, low level API



Apache Flink

- True streaming with adjustable latency-throughput trade-off
- Rich functional API exploiting streaming runtime; e.g. rich windowing semantics

Stream vs. Batch processing



- https://github.com/OryxProject/oryx
- https://github.com/MicrosoftDocs/azure-docs/blob/master/articles/cosmos-db/lambda-architecture.md
- https://github.com/apssouza22/lambda-arch
- https://github.com/knoldus/Lambda-Arch-Spark



TRƯỜNG ĐẠI HỌC BÁCH KHOA HÀ NỘI

HANOI UNIVERSITY OF SCIENCE AND TECHNOLOGY

Thank you for your attention! Q&A