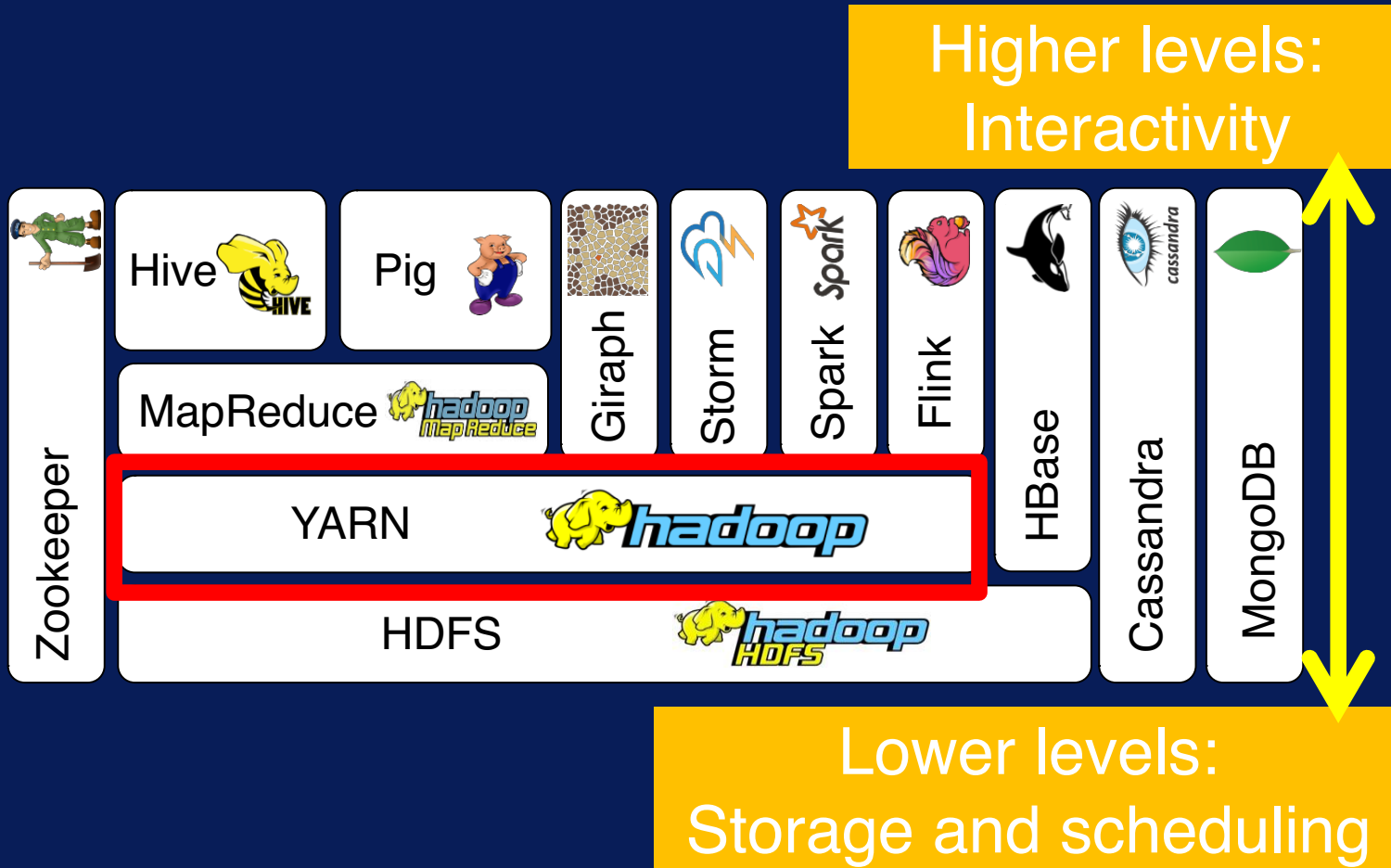


# Overview of Big Data Processing Systems

# After this video you will be able to..

- Recall the Hadoop Ecosystem
- Draw a layer diagram with three layers for data storage, data processing and workflow management
- Summarize an evaluation criteria for big data processing systems
- Explain the properties of Hadoop, Spark, Flink, Beam and Storm

# One possible layer diagram for Hadoop tools



# Another way to look at the Hadoop Ecosystem

**COORDINATION AND  
WORKFLOW MANAGEMENT**

**DATA INTEGRATION  
AND PROCESSING**

**DATA MANAGEMENT  
AND STORAGE**

# Another way to look at the Hadoop Ecosystem

**COORDINATION AND  
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**DATA INTEGRATION  
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**DATA MANAGEMENT  
AND STORAGE**

# DATA MANAGEMENT AND STORAGE



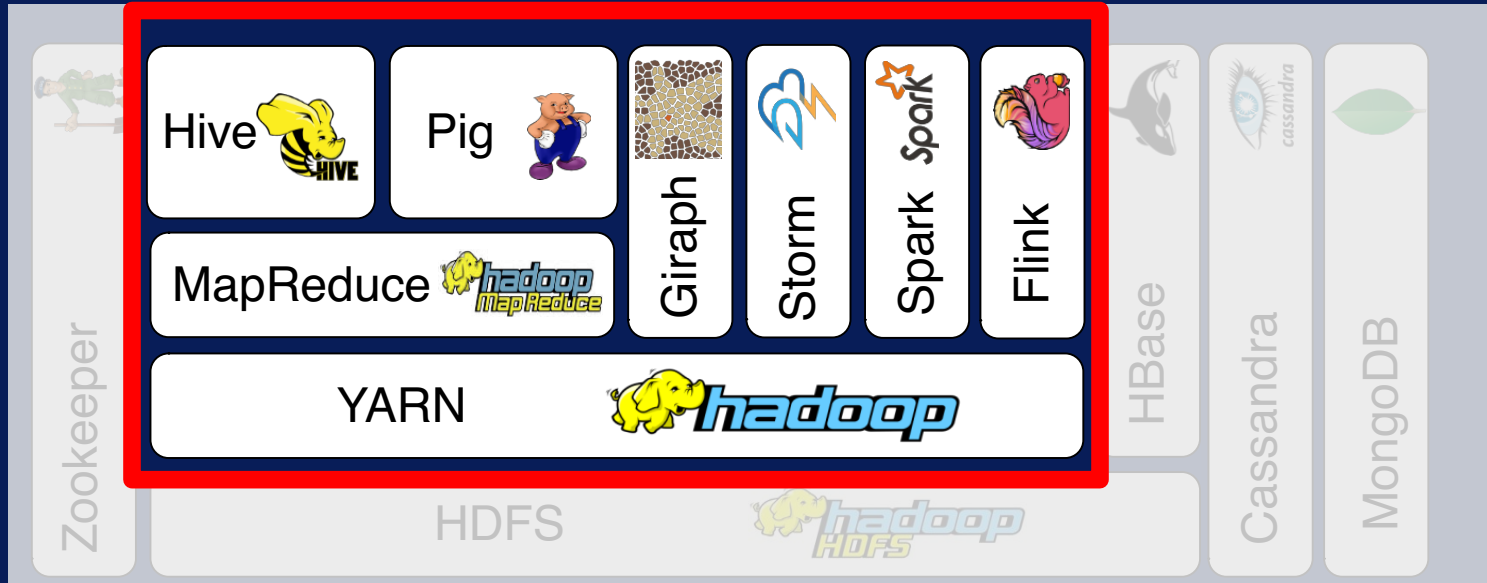
# Another way to look at the Hadoop Ecosystem

**COORDINATION AND  
WORKFLOW MANAGEMENT**

**DATA INTEGRATION  
AND PROCESSING**

**DATA MANAGEMENT  
AND STORAGE**

# DATA INTEGRATION AND PROCESSING





# Another way to look at the Hadoop Ecosystem

## COORDINATION AND WORKFLOW MANAGEMENT

## DATA INTEGRATION AND PROCESSING

## DATA MANAGEMENT AND STORAGE

- where integration, scheduling, coordination and monitoring of applications across many tools take place
- where results of big data analysis gets communicated to other programs, websites, visualization tools, and business intelligence tools

# COORDINATION AND WORKFLOW MANAGEMENT

develop automated solutions to  
manage and coordinate the process  
of combining data management and  
analytical tasks in big data pipeline  
?

ACQUIRE

PREPARE

ANALYZE

REPORT

ACT



# Another way to look at the Hadoop Ecosystem

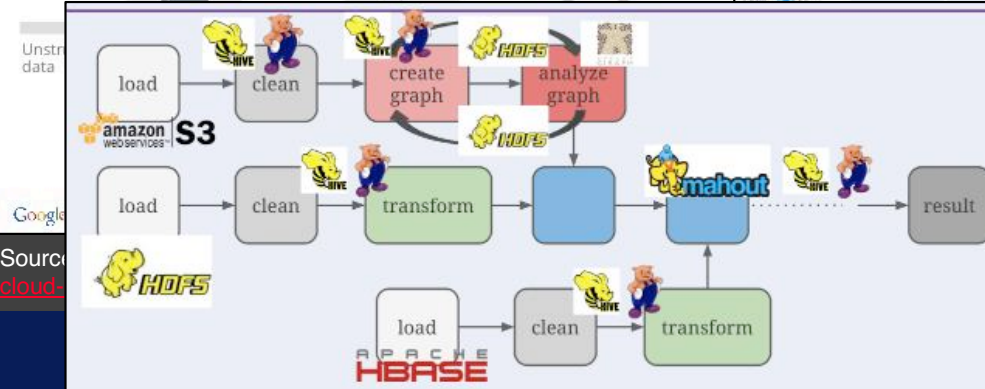
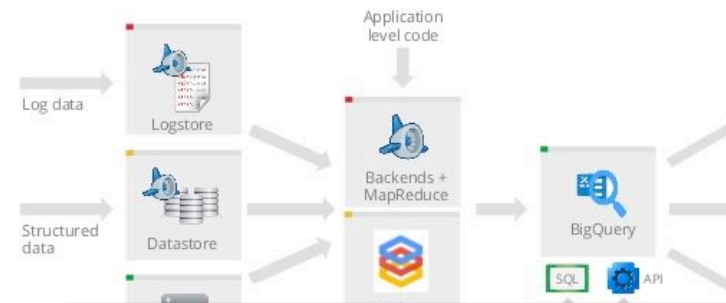
**COORDINATION AND  
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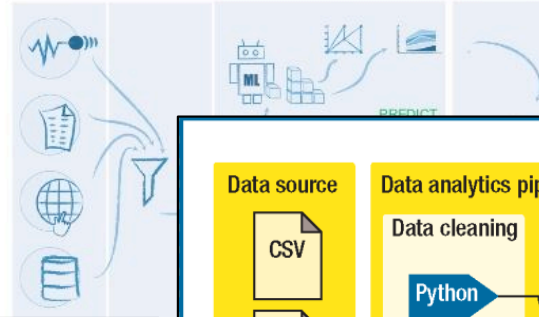
# Example Big Data Processing Pipelines

## Big Data Processing Pipeline



Source: <https://www.mapr.com/blog/distributed-stream-and-graph-processing-apache-flink>

## The big data pipeline



data cleaning

\* make sure to use right tools

### Data source

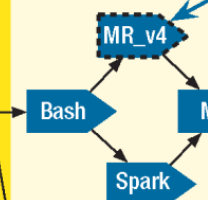


### Data analytics pipeline

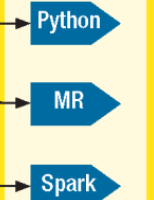
#### Data cleaning



#### Data preprocessing



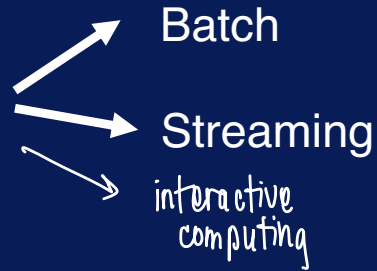
#### Data analysis



Source: <https://www.computer.org/csdl/mags/so/2016/02/mso2016020060.html>

# Categorization of Big Data Processing Systems

Execution Model



Latency

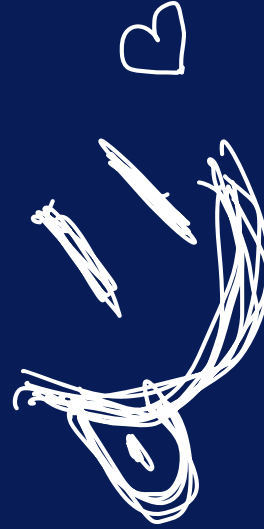
Scalability

Programming Language

— support for various

Fault Tolerance

— how it is handled



# Big Data Processing Systems



# MapReduce



Execution Model

Batch processing using disk storage  
↳ data from HDFS gets loaded into mappers before processing

Latency

High-latency  
↳ less scalable execution

Scalability

Programming Language

Java — others, like python offer libraries with less efficiency

Fault Tolerance

<sup>data</sup> Replication  
↳ affects scalability and execution speed further

# Spark



**Execution Model**

Batch and stream processing using  
disk or memory storage

*to support interactive and iterative big data processing*  
*\* micro batching*

**Latency**

Low-latency for small micro-batch size

**Scalability**

**Programming Language**

Scala, Python, Java, R

**Fault Tolerance**

*— less impact on performance*



# Flink

↳ original version  
was stratosphere



**Execution Model**

Batch and stream processing using disk or memory storage

**Latency**

Low-latency

**Scalability**

**Programming Language**

Java and Scala

**Fault Tolerance**

\* advantage:  
comes from its optimizer to  
pick and apply the best pattern  
and execution strategy

# Beam



*from google*

**Execution Model**

Batch and stream processing

**Latency**

Low-latency

**Scalability**

**Programming Language**

Java and Scala

**Fault Tolerance**

# Storm



APACHE  
**STORM**<sup>TM</sup>  
Distributed • Resilient • Real-time

Execution Model

Stream processing

Latency

Very low-latency

Scalability

pipelined  
together

input stream interface  
abstractions: spouts  
computation  
abstractions: bolts

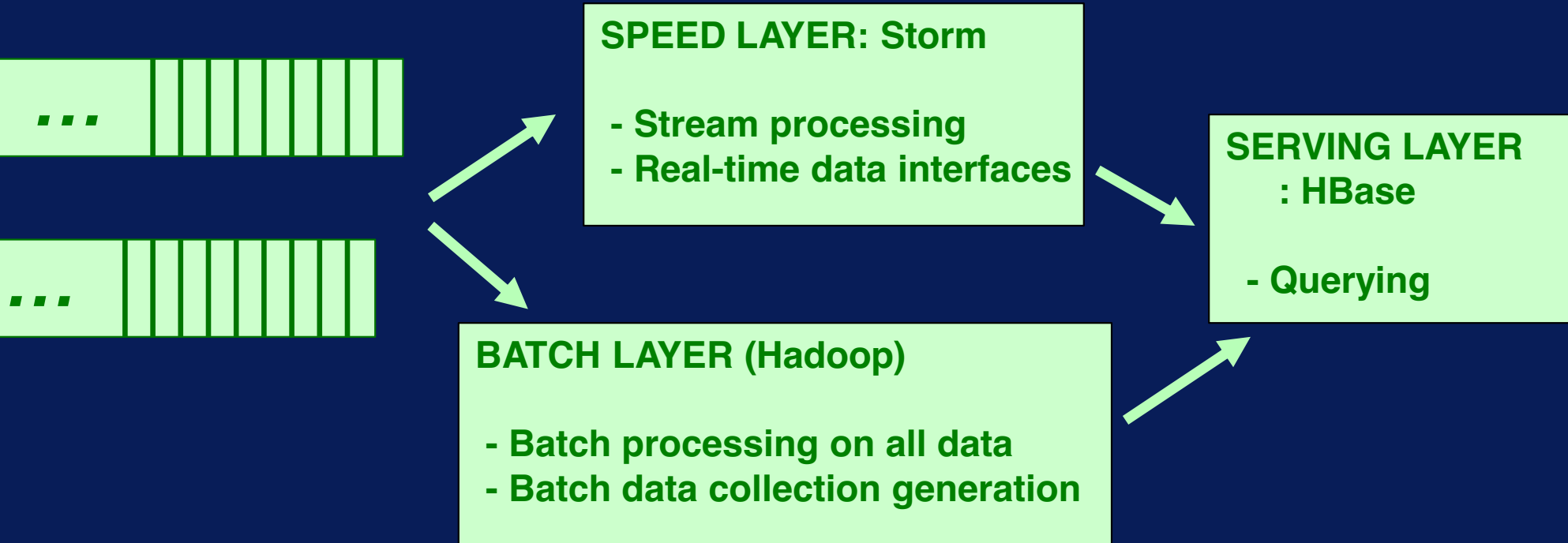
Programming Language

Many programming languages

Fault Tolerance

# Lambda Architecture:

## A Hybrid Data Processing Architecture



# Lambda Architecture: A Hybrid Data Processing Architecture

