

# Introduction to Stream Processing with Apache Flink®

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#### Who are we?



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#### Overview



- What is Stream Processing?
- What is Apache Flink?
- Windowed computations over streams
- Handling time
- Handling node failures
- Handling planned downtime
- Handling code upgrades

#### Demo instructions...

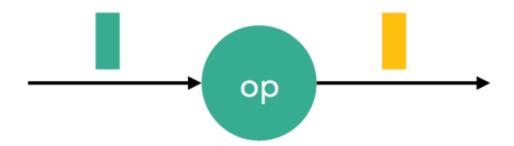


Robust Stream Processing with Apache Flink®: A Simple Walkthrough <a href="http://data-artisans.com/robust-stream-processing-flink-walkthrough/#more-1181">http://data-artisans.com/robust-stream-processing-flink-walkthrough/#more-1181</a>

Make sure you download: Apache Flink 1.0.3

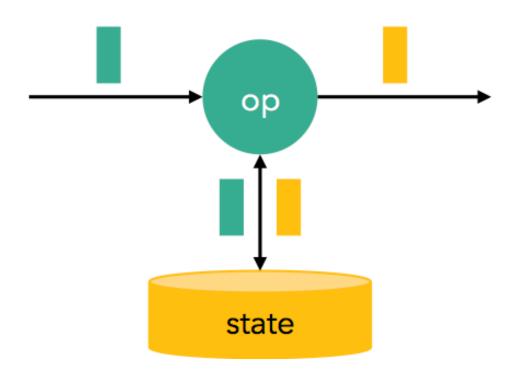
# Stateless stream processing





# Stateful stream processing





# Why should you care?



Data production is and has always been a continuous process.

Stream processing enables the obvious:

Continuous processing on data that is

continuously produced

# What is Apache Flink?



### A data processing engine

Apache Flink



Apache Flink is an open source platform for distributed stream and batch processing

#### The Apache Flink Ecosystem



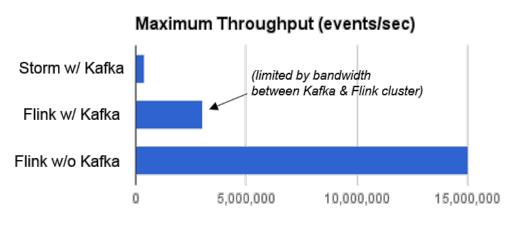
APIs & Libraries	<b>CEP</b> Event Processing	<b>Table</b> Relational	SQL		<b>FlinkML</b> Machine Learning	<b>Gelly</b> Graph Processing	<b>Table</b> Relational	SQL
	DataStream API Stream Processing				DataSet API Batch Processing			
Core	Runtime  Distributed Streaming Dataflow							
Deploy	<b>Local</b> Single JVM			<b>Cluster</b> Standalone, YARN			Cloud GCE, EC2	

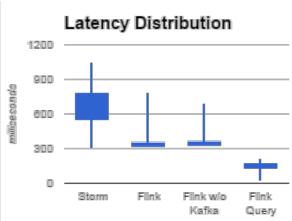
### What does Flink provide?



#### High Throughput and Low Latency

- Yahoo! Benchmark: <a href="https://yahooeng.tumblr.com/post/135321837876/benchmarking-streaming-computation-engines-at">https://yahooeng.tumblr.com/post/135321837876/benchmarking-streaming-computation-engines-at</a>
- Extended by Data Artisans: http://data-artisans.com/extending-the-yahoo-streaming-benchmark/





### What does Flink provide?



- High Throughput and Low Latency
- Event-time (out-of-order) processing
- Exactly-once semantics
- Flexible windowing
- Fault-Tolerance

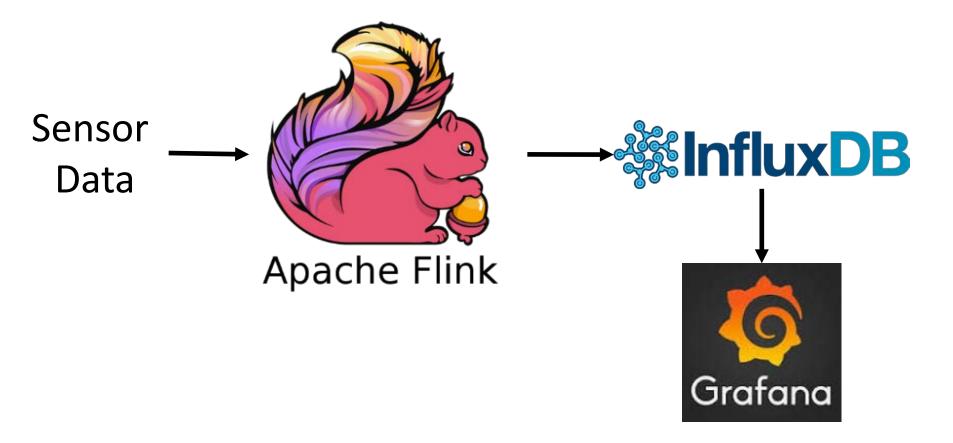
#### Time for demo...



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### Setup:





# Windowed computations



# Handling time



# Handling time



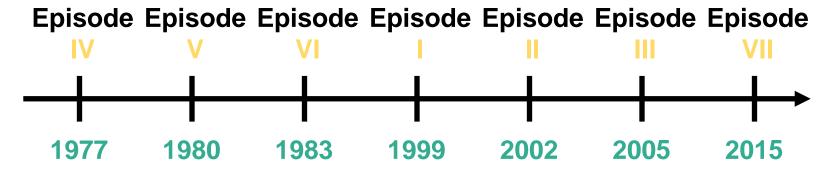
The system has to respect the same clock as the data.

#### **Event Time vs Processing Time**





#### **Event Time**



#### **Processing Time**

# Handling time: Watermarks



Special events generated by the sources.

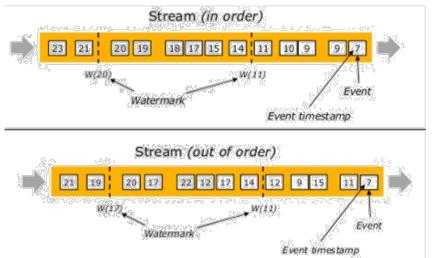
 A watermark for time T states that event time has progressed to T in that particular stream (or partition).

No events with a timestamp smaller than T can arrive any more.

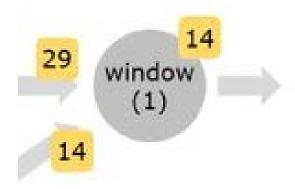
### Handling time: Watermarks



Sources emit elements and watermarks....

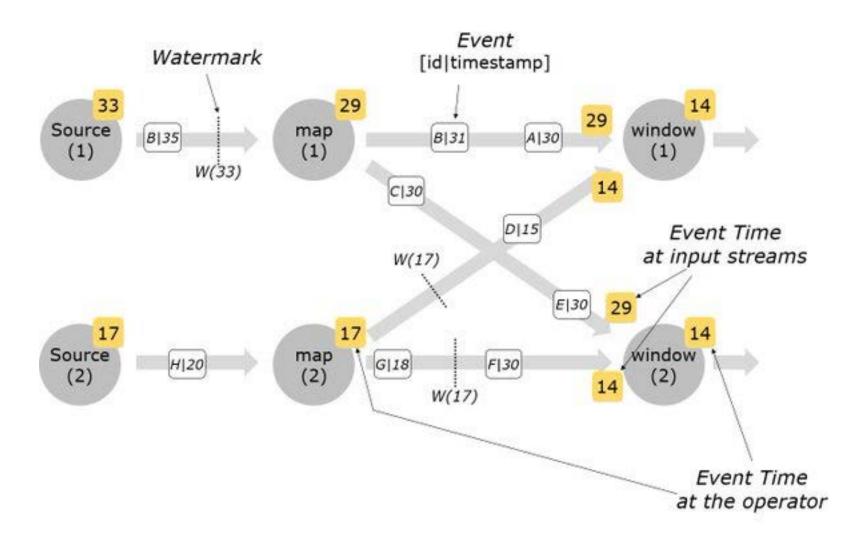


...operators always emit the lowest watermark



### Handling time: Watermarks





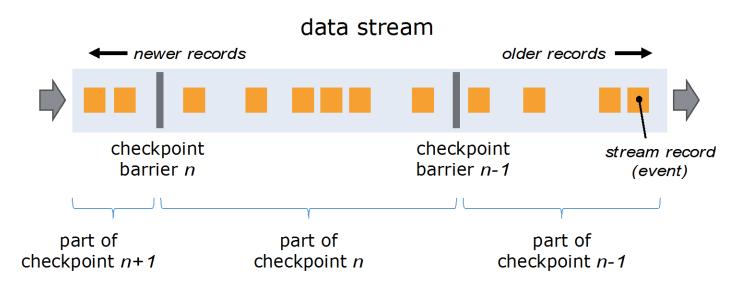
# Handling node failures



### Checkpoints



Sources emit elements and checkpoints....



# Checkpoints



#### Handling planned downtime



# Handling code upgrades



### Is Apache Flink only that?

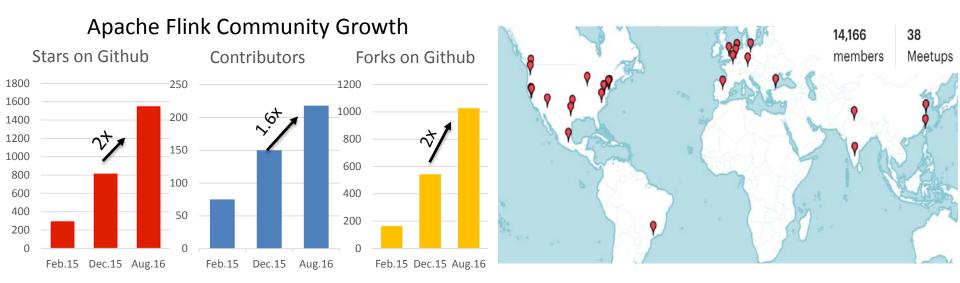
Apache Flink



Apache Flink is an open source platform for distributed stream and batch processing

### Its lively community





#### You can join:

- Follow: @ApacheFlink, @dataArtisans
- Read: flink.apache.org/blog, data-artisans.com/blog
- Subscribe: (news | user | dev) @ flink.apache.org

#### Its Users











ResearchGate





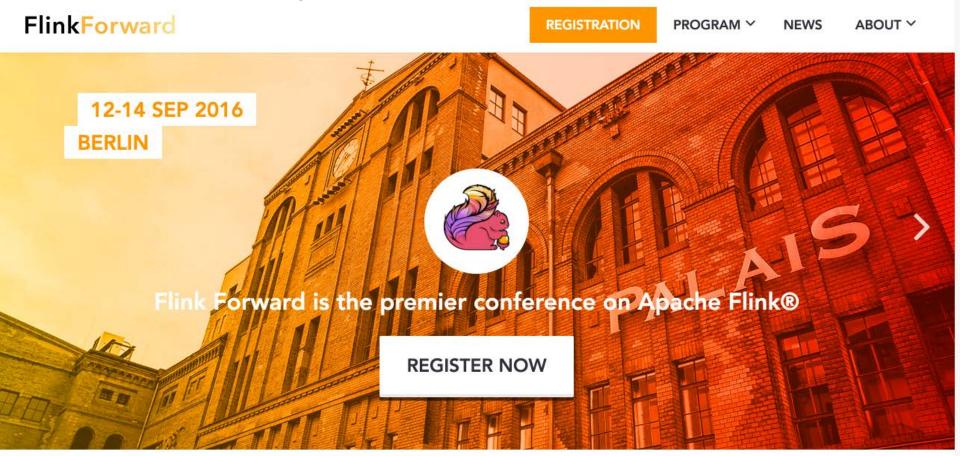


...https://flink.apache.org/poweredby.html

#### All of them will meet at...



#### http://flink-forward.org/



#### All of them will meet at...



#### http://flink-forward.org/



### Further Reading



#### Event-time processing:

- The Dataflow Model: http://www.vldb.org/pvldb/vol8/p1792-Akidau.pdf
- http://data-artisans.com/how-apache-flink-enables-new-streaming-applications-part-1/

#### Checkpointing and State:

- Distributed Snapshots: Determining Global States of Distributed Systems <a href="http://research.microsoft.com/en-us/um/people/lamport/pubs/chandy.pdf">http://research.microsoft.com/en-us/um/people/lamport/pubs/chandy.pdf</a>
- Lightweight Asynchronous Snapshots for Distributed Dataflows <a href="https://arxiv.org/abs/1506.08603">https://arxiv.org/abs/1506.08603</a>
- Working with State in Flink: <a href="https://ci.apache.org/projects/flink/flink-docs-master/dev/state.html">https://ci.apache.org/projects/flink/flink-docs-master/dev/state.html</a>

#### Savepoints:

https://ci.apache.org/projects/flink/flink-docs-master/setup/savepoints.html