



# High Throughput Transactional Stream Processing

Terence Yim (@chtyim)

### Who We Are

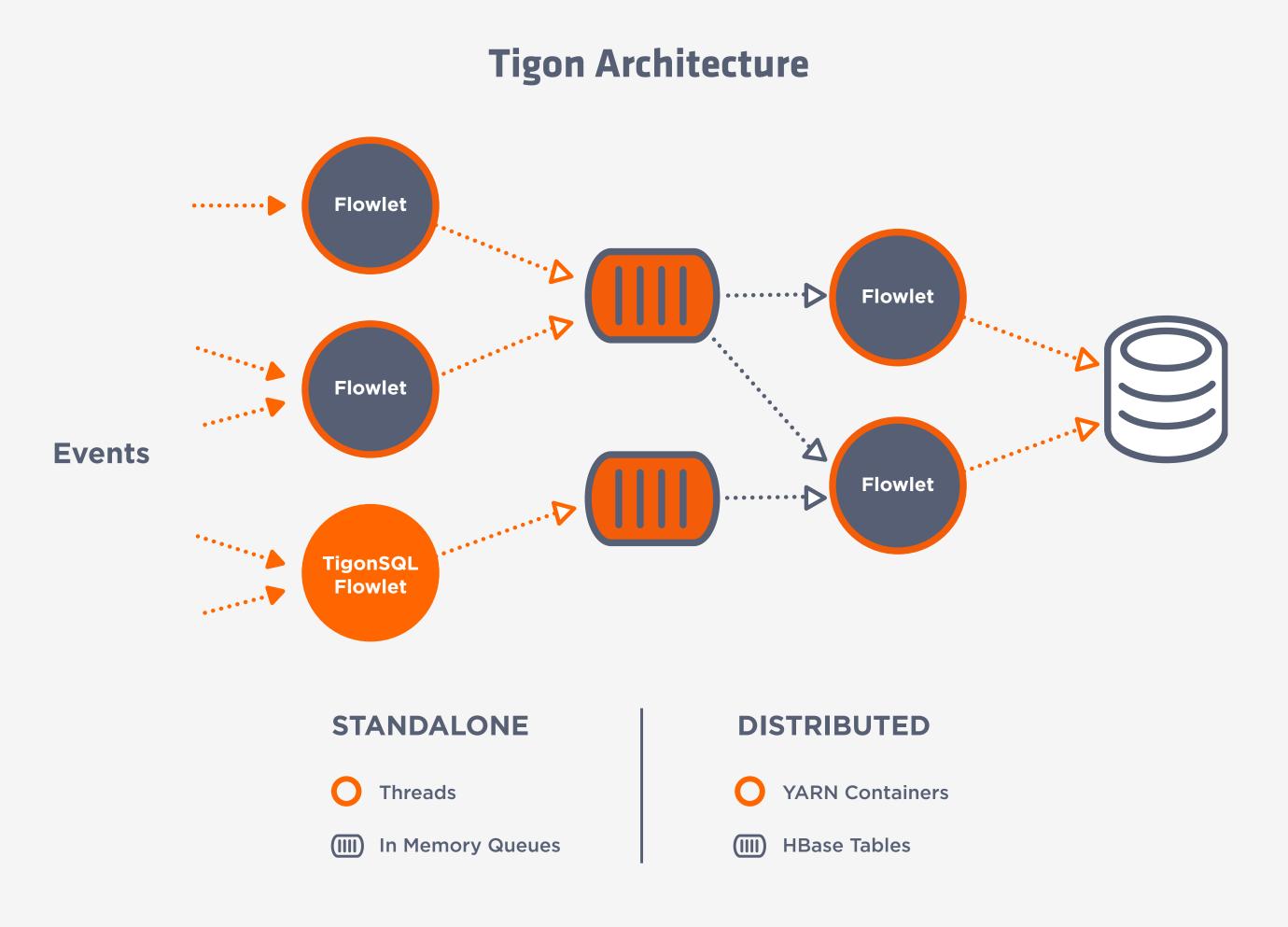
- Create open source software than provides simple access to powerful technologies
- Cask Data Application Platform (<a href="http://cdap.io">http://cdap.io</a>) ( CDAP
  - A platform runs on top of Hadoop to provide data and application virtualization
    - Virtualization of data through logical representations of underlying data
    - Virtualization of applications through application containers
    - Services and tools that enable faster application development and better operational control in production
- Coopr (<u>http://coopr.io</u>)



COOPR

- Clusters with a Click
- Self-service, template-based cluster provisioning system

# Tigon Architecture



- Basic unit of execution is called Flow
  - A Directed Acyclic Graph (DAG) of Flowlets
- Multiple modes of execution
  - Standalone
    - Useful for testing
  - Distributed
    - Fault tolerant, scalable

## Execution Model

#### Distributed mode

- Runs on YARN through Apache Twill
- One YARN container per one flowlet instance
- One active thread per flowlet instance
- Flowlet instances can scale dynamically and independently
  - No need to stop Flow

#### Standalone mode

- Single JVM
- One thread per flowlet instance
- Queues are in-memory, not really persisted

#### Flowlet

- Processing unit of a Flow
- Flowlets within a Flow are connected through *Distributed Queue*
- Consists of one or more *Process Method*(s)
  - User defined Java method
  - No restriction on what can be done in the method
- A *Process Method* in a Flowlet can be triggered by
  - Dequeue objects emitted by upstream flowlet(s)
  - Repeatedly triggered by time delay
    - Useful for polling external data (Twitter Firehose, Kafka, ...)
- Inside Process Method, you can emit objects for downstream Flowlet(s)

```
public class WordSplitter extends AbstractFlowlet {
  private OutputEmitter<String> output;
  @Tick(delay=100, unit=TimeUnit.MILLISECONDS)
  public void poll() {
    // Poll tweets from Twitter Firehose
    // . . .
    for (String word : tweet.split("\\s+")) {
      output.emit(word);
```

```
public class WordCounter extends AbstractFlowlet {
    @ProcessInput
    public void process(String word) {
        // Increments count for the word in HBase
    }
}
```

```
public class WordCountFlow implements Flow {
  @Override
  public FlowSpecification configure() {
    return FlowSpecification.Builder.with()
      .setName("WordCountFlow")
      .setDescription("Flow for counting words)
      .withFlowlets()
        .add("splitter", new WordSplitter())
        .add("counter", new WordCounter())
      .connect()
        .from("splitter").to("counter")
      .build();
```

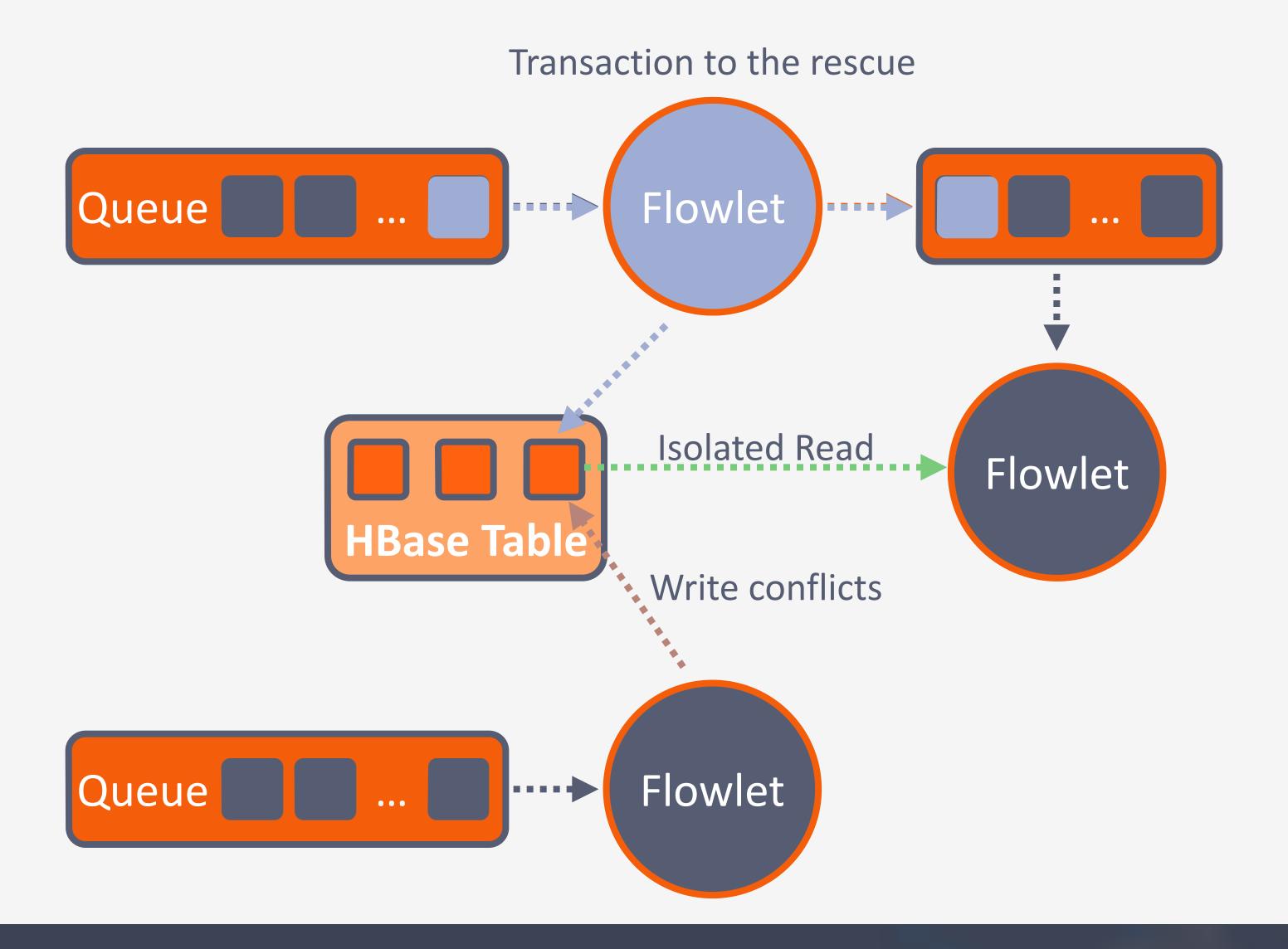
# Data Consistency

- Node dies
- Process method throws Exception
  - Transient IO issues (e.g. connection timeout)
- Conflicting updates
  - Writes to the same cell from two instances

## Data Consistency

- Resume from failure by replaying queue
  - At least once
    - Data logic be idempotent
    - Program handles rollback / skipping
  - At most once
    - Lossy computation
  - Exactly once
    - Ideal model for data consistency as if failure doesn't occurred
- How about data already been written to backing store?

## Flowlet Transaction



# Tigon and HBase

- Tigon uses HBase heavily
  - Queues are implemented on HBase Tables
  - Optionally integrated with HBase as user data stores

- HBase has limited support on transaction
  - Has atomic cell operations
  - Has atomic batch operations on rows within the same region
  - NO cross region atomic operations
  - NO cross table atomic operations
  - NO multi-RPC atomic operations

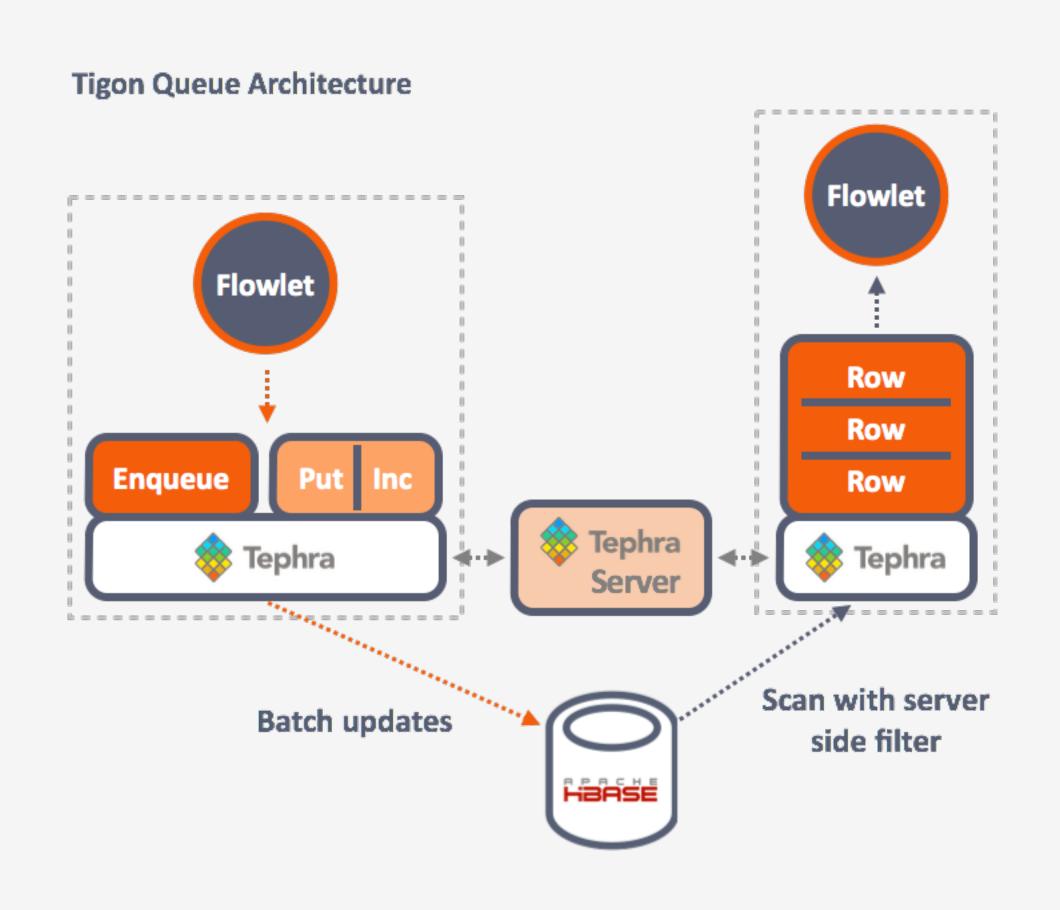
## Tephra on HBase

- Tephra (<a href="http://tephra.io">http://tephra.io</a>) **Tephra**
- - Brings ACID to HBase
    - Extends to multi-rows, multi-regions, multi-tables
  - Multi-Version Concurrency Control
    - Cell version = Transaction ID
      - All writes in the same transaction use the same transaction ID as version
      - Reads isolation by excluding uncommitted transactions
  - Optimistic Concurrency Control
    - Conflict detection at commit time
      - No locking, hence no deadlock
      - Performs good if conflicts happens rarely

## Flowlet Transaction

- Transaction starts before dequeue
- Following actions happen in the same transaction
  - Dequeue
  - Invoke Process Method
  - States updates
    - Only if updates are integrated with Tephra (e.g. *Queue* and *TransactionAwareHTable* in Tephra)
  - Enqueue
- Transaction failure will trigger rollback
  - Exception thrown from Process Method
  - Write conflicts

## Distributed Transactional Queue



- Persisted transactionally on HBase
- One row per queue entry
- Enqueue
  - Batch updates at commit time
  - Commits together with user updates
- Dequeue
  - Scans for uncommitted entries
  - Marks entries as processed on commit
- Coprocessor
  - Skipping committed entries on dequeue scan
  - Cleanup consumed entries on flush/compact

### Transaction Failure

- Rollback cost may be high, depends on what triggers the failure
  - User exception
    - Most likely low as most changes are still in local buffer
  - Write conflicts
    - Relatively low if conflicts are detected before persisting
    - High if changes are persisted and conflicts found during the commit phase
- Flowlet optionally implements the *Callback* interface to intercept transaction failure
  - Decide either retry or abort the failed transaction
- Default is to retry with limited number of times (Optimistic Concurrency Control)
  - Max retries is setting through the @ProcessInput annotation.

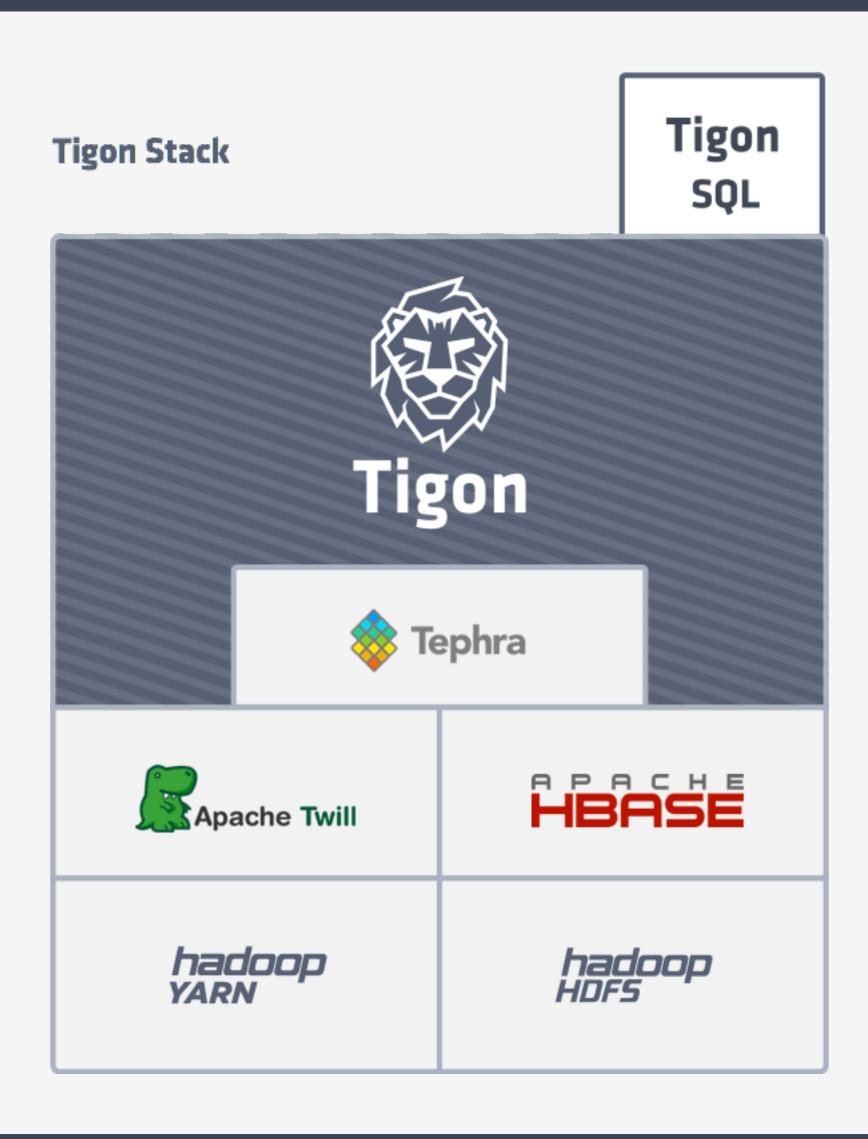
# Performance Tips

- Runs more Flowlet instances
- Dequeue Strategy
  - @HashPartition
    - Hash on the write key to avoid write conflicts
- Batch dequeue
  - Use @Batch annotation on Process Method
  - More entries will be processed in one transaction
    - Minimize IO and transaction overhead

```
public class WordSplitter extends AbstractFlowlet {
  private OutputEmitter<String> output;
  @Tick(delay=100, unit=TimeUnit.MILLISECONDS)
  public void poll() {
    // Poll tweets from Twitter Firehose
    // . . .
    for (String word : tweet.split("\\s+")) {
      output.emit(word, "key", word); // Hash by the word
```

```
public class WordCounter extends AbstractFlowlet {
    @ProcessInput
    @Batch(100)
    @HashPartition("key")
    public void process(String word) {
        // ...
    }
}
```

## Summary



- Real-time stream processing framework
- Exactly once processing guarantees
  - Transaction message queue on *Apache HBase*
- Transactional storage integration
  - Through **Tephra** transaction engine
- Executes on *Hadoop YARN* 
  - Through *Apache Twill*
- Simple Java Programmatic API
  - Imperative programming
  - Data model through Java Object

## Road map

- Partitioned queue
  - Better scalability, better performance
  - Preliminary tests shows 100K events/sec on 8 nodes cluster with 10 flowlet instances
    - Linearly scalable
- Drain / cleanup queue
  - Better controls for upgrade
- Supports more programming languages
- External logging and metrics system integration
- More source Flowlet types
  - Kafka, Twitter, Flume...

## Contributions

- Web-site: <a href="http://tigon.io">http://tigon.io</a>
- Tigon in CDAP: <a href="http://cdap.io">http://cdap.io</a>
- Source: <a href="https://www.github.com/caskdata/tigon">https://www.github.com/caskdata/tigon</a>
- Mailing lists
  - tigon-dev@googlegroups.com
  - tigon-user@googlegroups.com
- JIRA
  - <a href="http://issues.cask.co/browse/TIGON">http://issues.cask.co/browse/TIGON</a>