

# 基于 Pulsar 和 Flink 进行批流一体的弹性数据处理

Elastic data processing with Apache Pulsar and Apache Flink

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Senior Software Engineer at StreamNative

**FLINK FORWARD # ASIA**

实时即未来 # Real-time Is The Future

**FLINK  
FORWARD**



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# 批流融合的弹性处理需求

Motivation on Elastic Stream and Batch Processing

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**01**

# 对批流融合的弹性数据处理需求

Motivation on Elastic Stream and Batch Processing

## 无处不在的流数据

Sensors, logs from mobile app, IoT

Organizations got better at capturing data

## 快速发掘数据价值

Batch and interactive analysis,  
stream processing, machine  
learning, graph processing

## 计算引擎批流融合的趋势

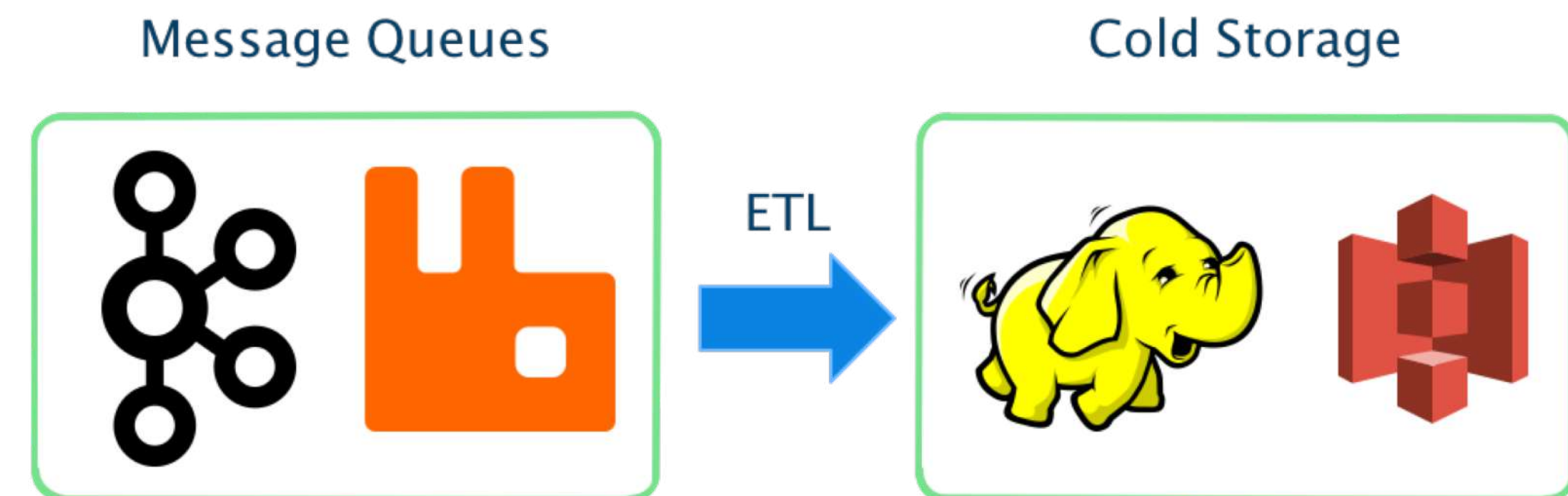
Unified / similar API for batch/interactive  
and stream processing



# 批流融合处理的挑战

Challenges for Traditional MQs or Log Storage Systems

- 云原生架构的兼容性  
Compatible with cloud native architecture
  - 多租户管理  
Multi-tenant management
  - 扩展性  
Scalability
- 数据存储组织的复杂度  
Complexity in a multi-system architecture
  - 多系统存储维护开销  
Maintenance as well as provisioning
  - 数据可见性问题  
Visibility of data



# Apache Pulsar 简介

Why Apache Pulsar

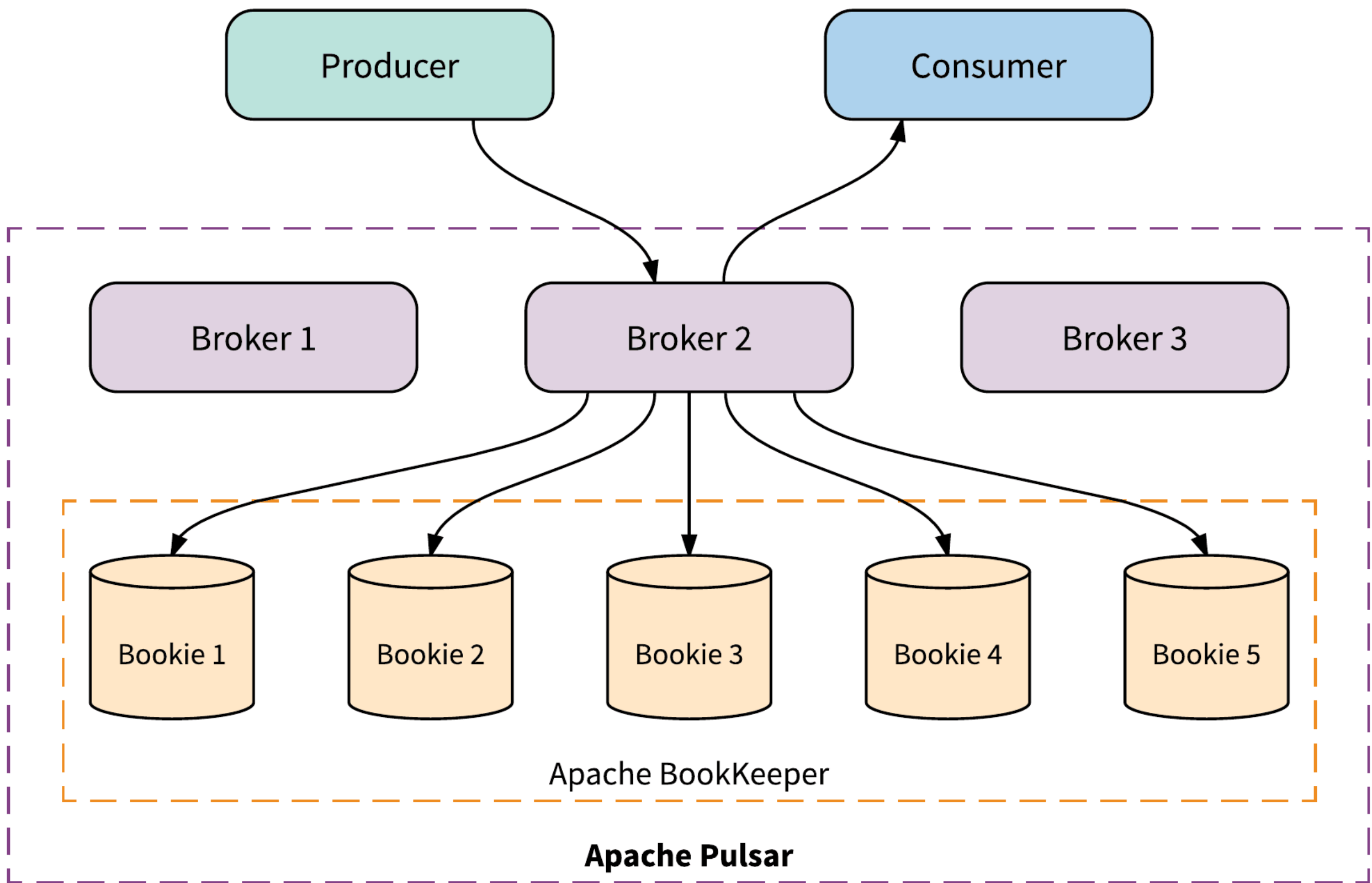
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02



# 云原生的架构

Pulsar -- Cloud Native Architecture



无状态服务层  
Stateless serving

数据持久层  
Durable storage

# 基于分片的数据存储

Pulsar -- Segment-based Storage

- **Managed Ledger**

- **Topic** 的存储抽象

Storage layer for a single topic

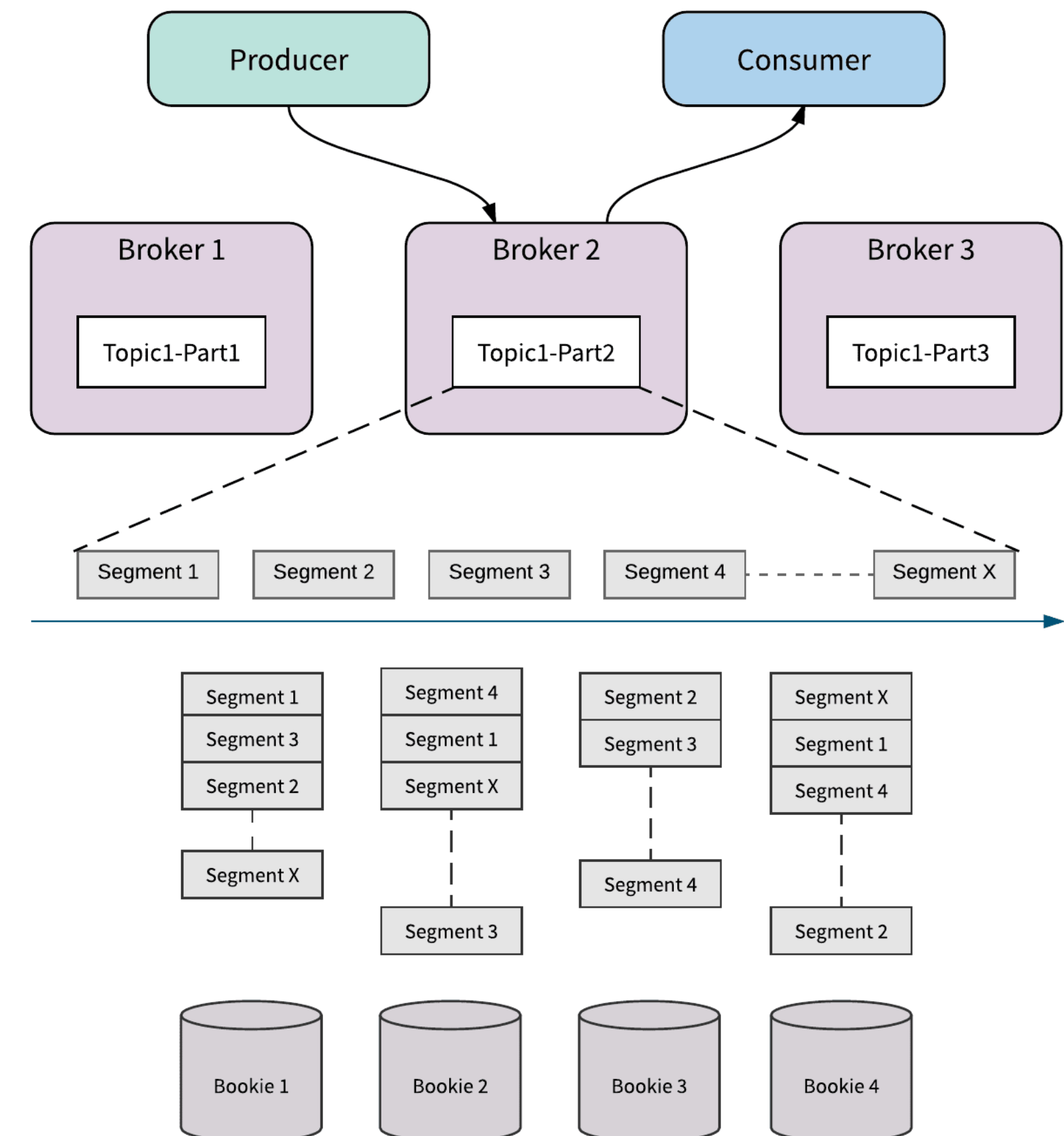
- **Ledger**

- 单写者，追加写

Single writer, append-only

- 被复制到多个 **bookie** 节点上

Replicated to multiple bookies

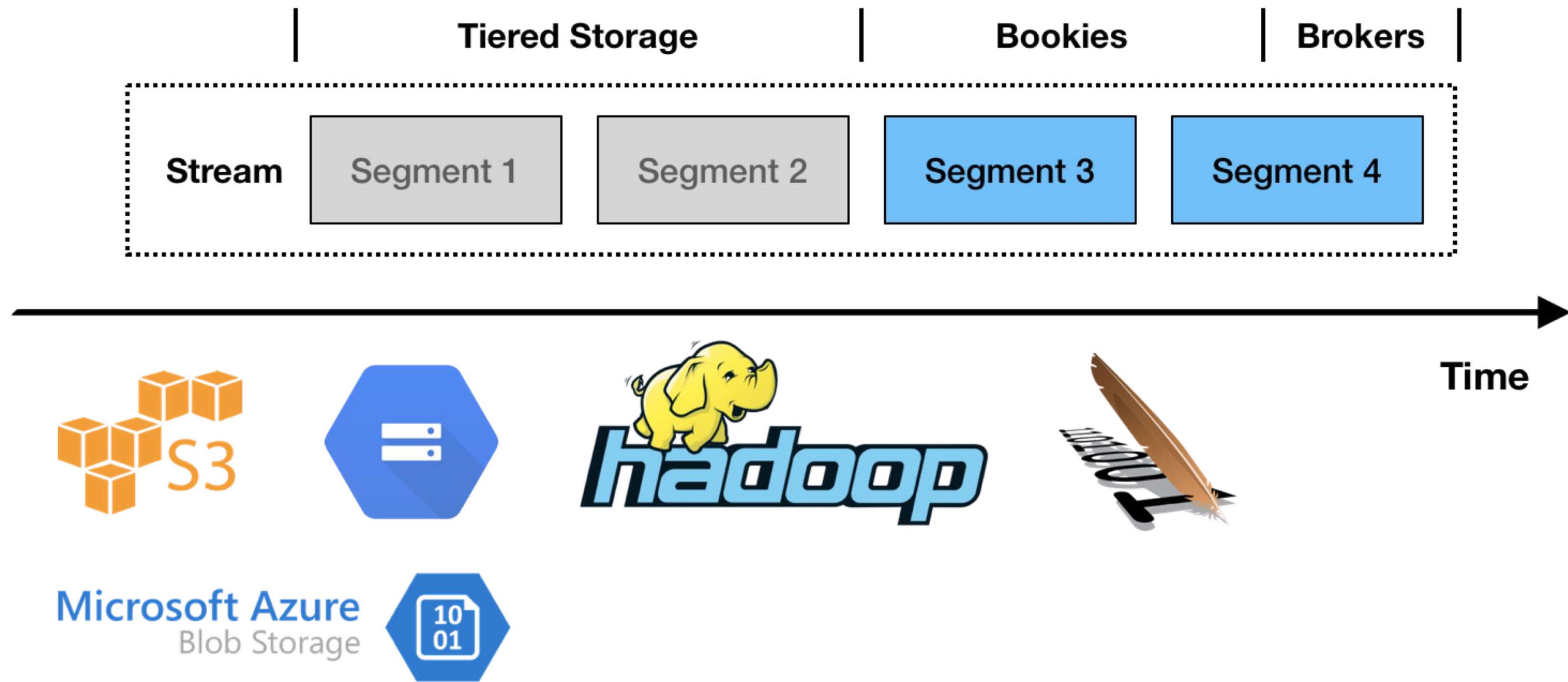




# 无限、廉价的数据存储

Pulsar -- Infinite Data Storage

- 使用廉价存储，持久化无限数据  
Reduce storage cost
- 按照分片粒度将数据卸载到廉价存储中  
Offloading segment to tiered storage one-by-one





# 有结构的数据

Pulsar - Structured Data

- 内置的 **Schema** 注册  
Built-in schema registry
  - 在服务器端的消息结构共识  
Consensus of data at server-side
  - **Topic** 级别的消息结构  
Data schema on a per-topic basis
- 直接产生、消费有结构的数据  
Send and receive typed message directly
  - **Pulsar** 进行消息验证  
Validation
  - 支持消息版本的演化  
Multi-version



# Pulsar Flink 连接器

Pulsar Flink Connector

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03



# 连接器API

Flink Pulsar Connector -- API

## • Read

```
val props = new Properties()
props.setProperty("service.url", ...)
props.setProperty("admin.url", ...)
props.setProperty("partitionDiscoveryInterval
Millis", "5000")
props.setProperty("startingOffsets", "earliest")
props.setProperty("topic", "test-source-topic")
val source = new FlinkPulsarSource(props)
val dataStream = env.addSource(source)
```

tEnv

```
.connect(new Pulsar().properties(props))
.inAppendMode()
.registerTableSource("pulsar-test-table")
```

## • Write

```
val prop = new Properties()
prop.setProperty("service.url", ...)
prop.setProperty("admin.url", ...)
prop.setProperty("flushOnCheckpoint", "true")
prop.setProperty("failOnWrite", "true")
props.setProperty("topic", "test-sink-topic")
stream.addSink(new FlinkPulsarSink[Row](prop,
DummyTopicKeyExtractor))
```



# 持久化、可重放的数据源

Durable and ordered source

- 故障无法避免

Failures are inevitable for engines

- Task 从 **checkpoint** 中恢复

Tasks recover from checkpoint

- Exactly-once

- 基于 **topic** 内消息有序的特性

Based on message order in topic

- 通过 **Seek & read** 实现

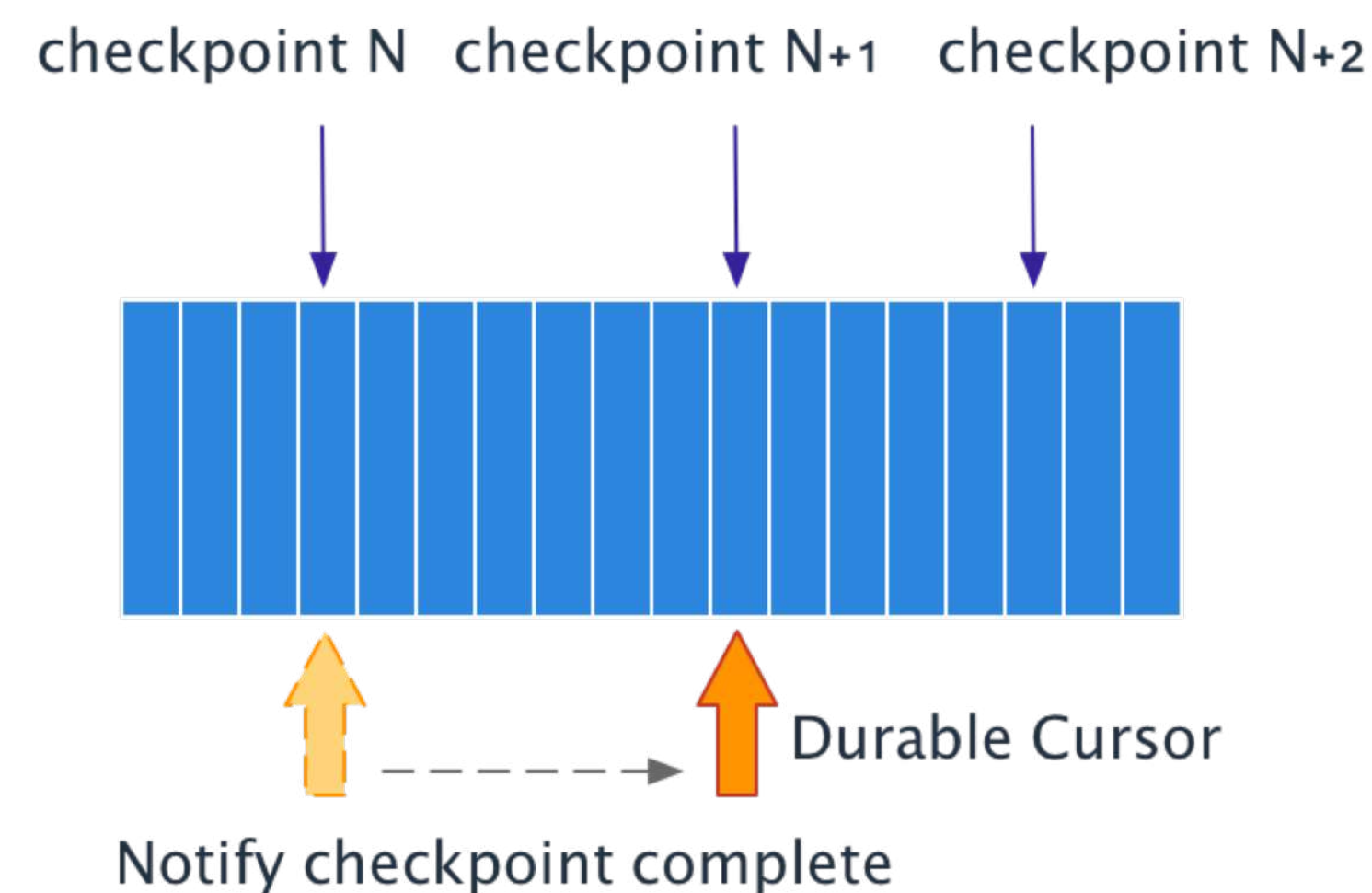
Implement based on seek and read

- 通过额外的订阅避免消息被删除

Messages "keep-alive" by subscription

- 在得到 **checkpoint** 完成通知时移动订阅游标

Move sub cursor on commit





# 结构化数据存取

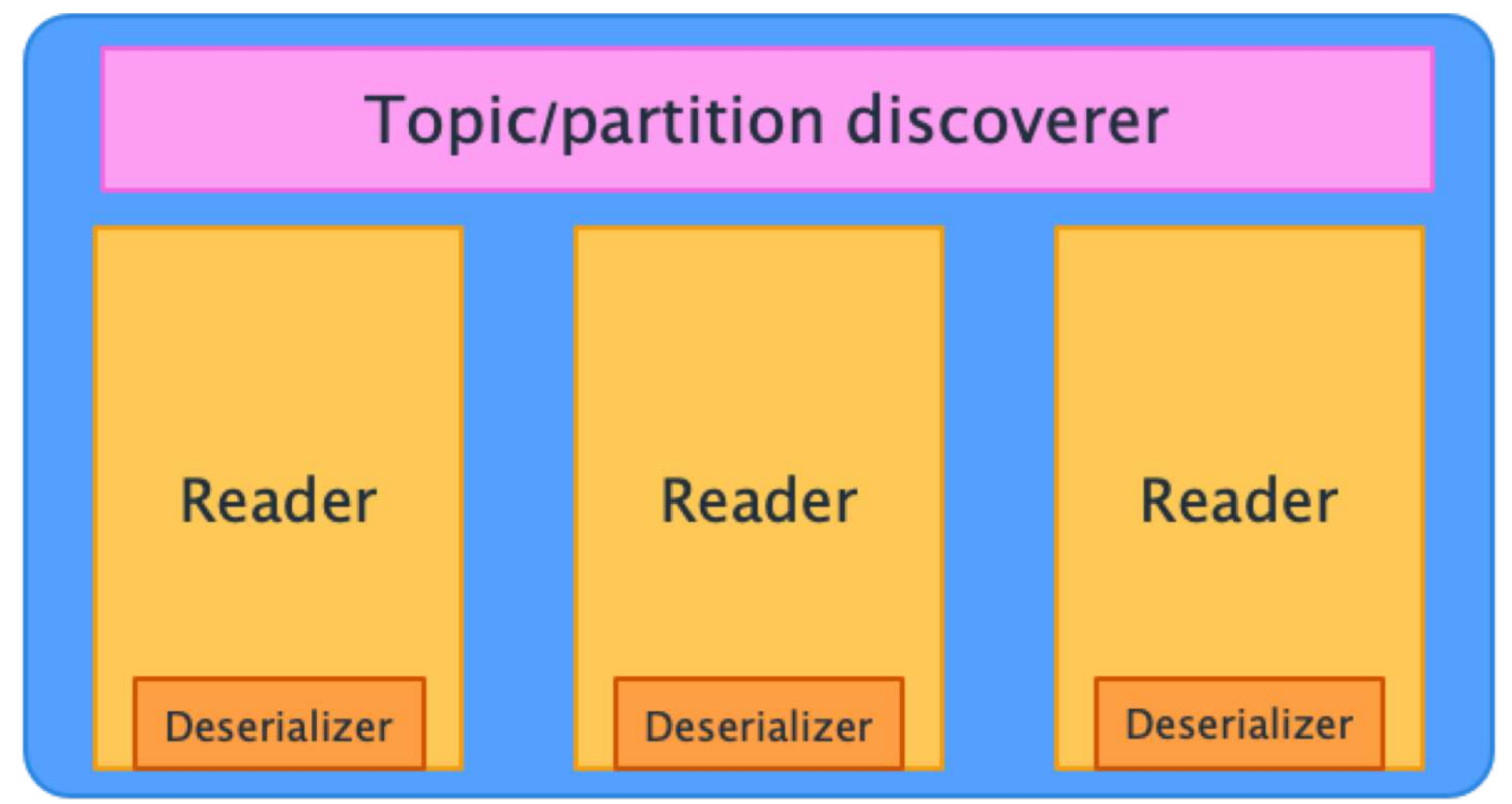
Processing typed records

- 将 **Pulsar topic** 看作是一张有结构的表  
Regard Pulsar as structured storage
- 在任务调度期获取表 **Schema** 定义  
Fetching schema as the first step
- 将 **Pulsar message** （反）序列化成**Row**  
SerDe your messages into Row
  - 支持 **avro/json/protobuf** 的消息转换  
Avro schema and avro/json/protobuf Message
- 消息元数据转化为表的内部列  
Message metadata as metadata fields
  - **\_\_key, \_\_publishTime, \_\_eventTime,**  
**\_\_messageId, \_\_topic**

# Topic 和 Partition 发现

Topic/Partition  
discovery

- 流处理作业是长时间运行的  
Streaming jobs are long running
- 在作业执行期间，**topic** 可能被添加或删除  
Topics & partitions may be added or removed during a job
- 阶段性检查 **topic** 状态  
Periodically check topic for status
- 每个 **task** 内部一个用于监控的线程  
With a monitoring thread in each task



Topic-0-partition-1 Topic-1-partition-2 Topic-2-partition-4



# 未来方向

Future Directions

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04



# 分析友好的数据组织、访问

Analytical-friendly data organizations and access method

- 谓词下推 + 粗粒度索引

Filter push down & coarse-grained index

- Segment** 级别的 **max**、**min**

Max/min at segment level

Generated by brokers

- Broker** 收集，写入

Indices are generated during broker put

- Segment** 的元数据

- 列形式组织 **Segment**

Organize segment data in columnar format

- 针对分析型负载

Target at analytical workloads

- 节约磁盘带宽

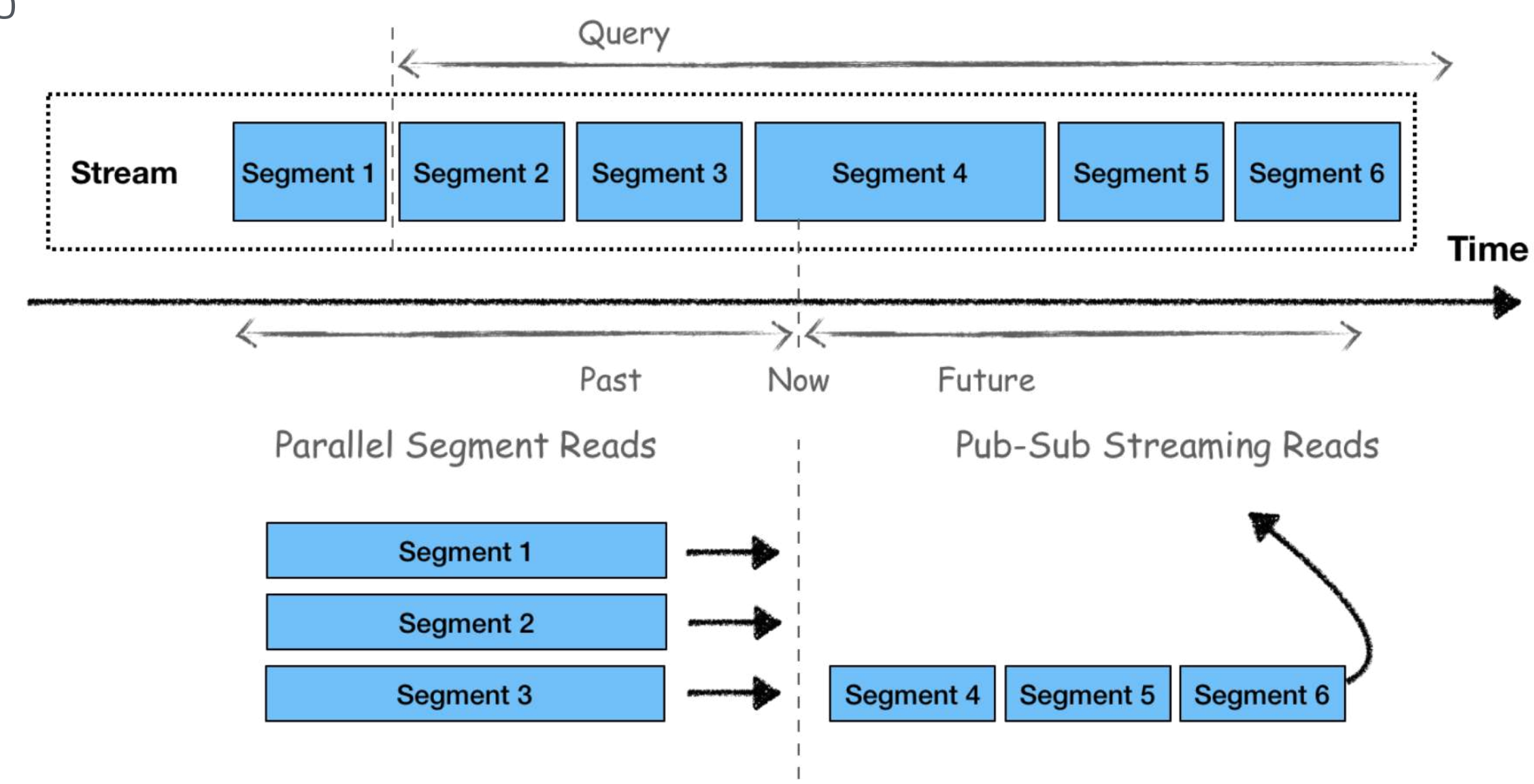
Save disk-bandwidth / network IO

- 节约 **CPU** 时间

Save CPU time

- 更灵活的数据消费模式

More flexible data consumption mode





# Pulsar 社



Pulsar Community



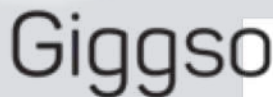


# Pulsar 社

Pulsar Community



One Click Retail  
ONLINE SIMPLIFIED



</ndustrial.io>







**THANKS**