Getting Started

```
public class User {
    String name;
    int age;
}
```



Parse Exceptions

- The field you're looking for doesn't exist any more
- The type of field has changed
 - e.g. what used to be a `String` is now an `Integer`



"I am starting to think that 'schemaless' just means your schema is scattered randomly throughout your code. It is almost impossible to troubleshoot anything non-trivial because there are endless assumptions, but few explicit requirements"

-Robert Kluin (@robertkluin) May 29, 2018



Introducing Schema



Schema

- Define how to serialize and deserialize data
- Define how to evolve your data format
- Handle backward compatibility



Schema Info

- 'type': the type of schema.
- `schema`: the schema data. Schema type implementation specific.
- `properties`: the properties associated with the schema.
 Application specific data.

```
"type": "JSON",
"schema": "{
    \"type\":\"record\",
    \"name\":\"User\",
    \"namespace\":\"com.foo\",
    \"fields\":[
           \"name\":\"file1\",
           \"type\":[\"null\",\"string\"],
           \"default\":null
           \"name\":\"file2\",
           \"type\":\"string\",
           \"default\":null
           \"name\":\"file3\",
           \"type\":[\"null\",\"string\"],
           \"default\":\"dfdf\"
}",
"properties": {}
```



Schema Types

- Primitive Types
- Complex Types



Primitive Types

- `BOOLEAN`: a binary value
- `INT8`: 8-bit signed integer
- `INT16`: 16-bit signed integer
- `INT32`: 32-bit signed integer
- `INT64`: 64-bit signed integer
- `FLOAT`: single precision (32-bit) IEEE 754 floating-point number
- `DOUBLE`: double precision (64-bit) IEEE 754 floating-point number
- `BYTES`: sequence of 8-bit unsigned bytes
- `STRING`: unicode character sequence
- `TIMESTAMP` (`DATE`, `TIME`): A logic type represents a specific instant in time, with millisecond precision. It stores the number of milliseconds since `January 1, 1970, 00:00:00 GMT` as a `INT64` value.



Primitive Types - Example

```
// Create producer with String schema and send messages
Producer<String> producer = client.newProducer(Schema.STRING).create();
producer.newMessage().value("Hello Pulsar!").send();

// Create consumer with String schema and receive messages
Consumer<String> consumer = client.newConsumer(Schema.STRING).create();
consumer.receive();
```



Complex Types

- Key-Value
- Struct



Struct Types

- Supported Types: AVRO / JSON / PROTOBUF
- Schema Definition AVRO
- Two approaches
 - Static The struct is predefined. POJO, or Avro/Protobuf generated classes
 - Generic The struct is unknown or not predefined.



Static Schema

```
java
// Create producer with Struct schema and send messages
Producer<User> producer = client.newProducer(Schema.AVRO(User.class)).create();
producer_newMessage()
  .value(User.builder()
      userName("pulsar-user")
      .userId(1L)
      build())
  .send();
// Create consumer with Struct schema and receive messages
Consumer<User> consumer = client.newConsumer(Schema.AVRO(User.class)).create();
consumer_receive();
```



Generic Schema

- `GenericSchemaBuilder`: Build a generic schema
- `GenericRecordBuilder`: Build a generic record



Generic Schema - Example

```
java
RecordSchemaBuilder recordSchemaBuilder = SchemaBuilder.record("schemaName");
recordSchemaBuilder
  .field("intField")
  .type(SchemaType.INT32);
SchemaInfo schemaInfo = recordSchemaBuilder.build(SchemaType.AVRO);
Producer<GenericRecord> producer = client.newProducer(Schema.generic(schemaInfo)).create();
producer.newMessage().value(schema.newRecordBuilder()
            .set("intField", 32)
            .build()).send();
```



Auto Schema

- AUTO_PRODUCE
 - Producers validate bytes according to the schema in the topic
- AUTO_CONSUME
 - Consumers deserialize messages into `GenericRecord`
 - Schema is unknown in advance



How does Schema work

```
'``java
Producer<User> producer = client.newProducer(Schema.AVRO(User.class)).create();
```

- 1. `Schema.AVRO(User.class)` => Generates SchemaInfo
- 2. 'newProducer' => connect to broker and send the schema info
- 3. Broker receives the schema info
 - 1. If a topic doesn't have a schema, creates the schema
 - 2. If a topic already have a schema, broker verifies if the schema is compatible with existing schemas.
 - 1. If it is compatible and is a new schema, generates a new version of schema
 - 2. If it is not compatible, fail the producer



Schema Evolution



Schema Compatibility Check

- Schema Compatibility Checker
 - One checker per schema type
 - Configured by `schemaRegistryCompatibilityCheckers`
 - Only AVRO and JSON supports schema evolution for now
 - All other schema types don't allow schema evolution



Compatibility Check Strategy

Strategy	Changes Allowed	Check against what schemas	Upgrade first
ALWAYS_INCOMPATIBLE	All changes are disabled	All previous versions	None
ALWAYS_COMPATIBLE	All changes are allowed	Latest version	Depends
BACKWARD	Delete fieldsAdd optional fields	Latest version	Consumers
FORWARD	Add fieldsDelete optional fields	Latest version	Producers
FULL	Modify optional fields	Latest version	Any Order



Order of upgrading clients

- BACKWARD: Upgrade all consumers before start producing new events
- FORWARD:
 - Upgrade all producers to new schema
 - Make sure the data produced using old schemas are not available to consumers anymore
 - Then upgrade producers and consumers independently
- FULL: Upgrade producers and consumers independently
- ALWAYS_COMPATIBLE: Be cautious about when to upgrade clients



Managing Schemas



Schema Restful API

- Upload Schema
- Get Schema: latest or by version
- Delete Schema

```
$ pulsar-admin schemas upload -f <schema-defination-file> <topic-name>
```

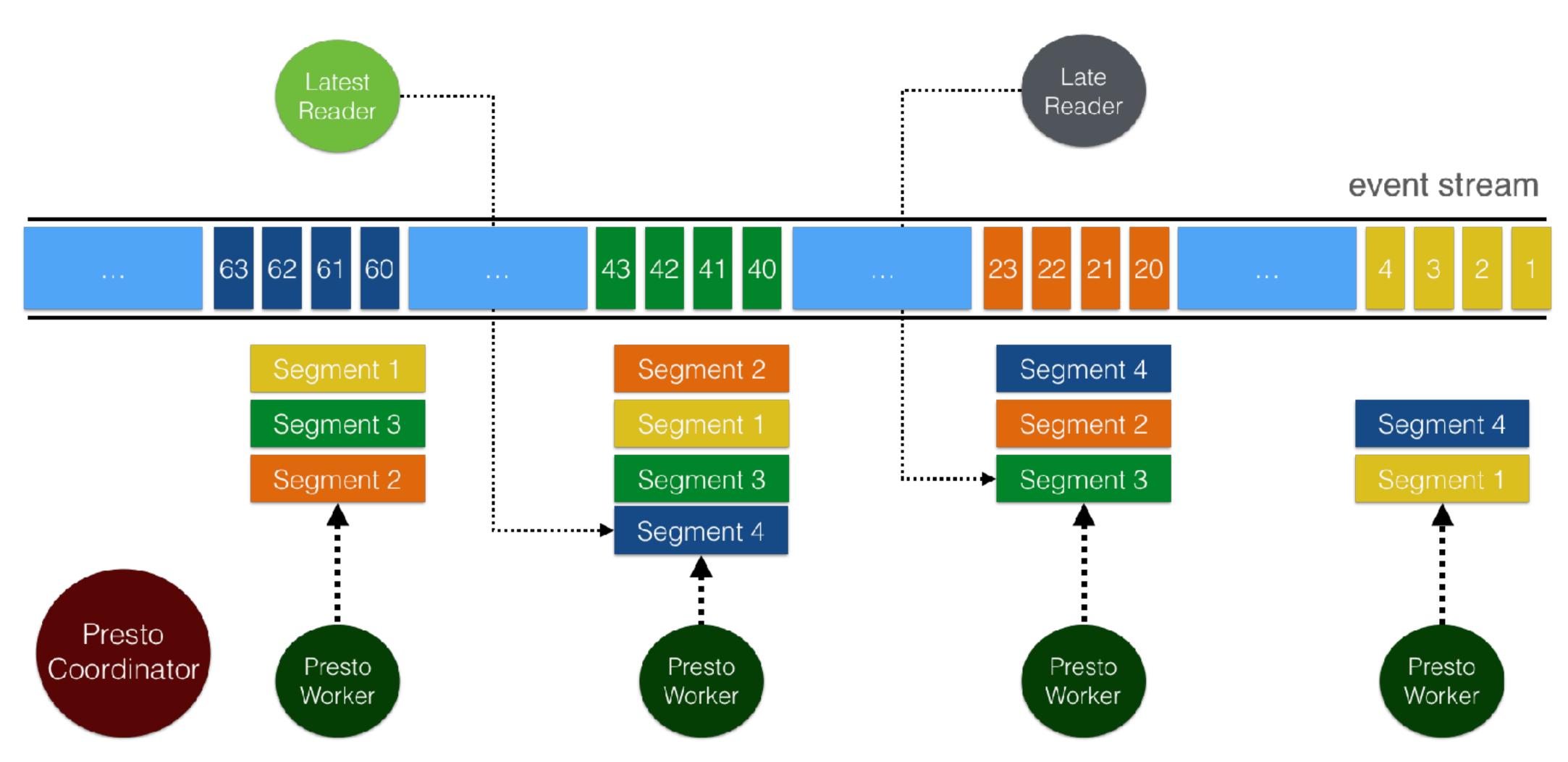


Query Streams using Schema

- Presto
- Hive
- Flink SQL
- Spark SQL



Pulsar Presto SQL





Pulsar Presto SQL

```
presto> select * from pulsar."public/default".generator_test;
  firstname
               middlename
                               lastname
                                                         email
 Genesis
               Katherine
                             Wiley
                                            genesis.wiley@gmail.com
 Brayden
                                            brayden.stanton@yahoo.com
                             Stanton
 Benjamin
               Julian
                             Velasquez
                                            benjamin.velasquez@yahoo.com
 Michael
                                            donovan@mail.com
               Thomas
                             Donovan
 Brooklyn
                                            brooklynroach@yahoo.com
               Avery
                             Roach
 Skylar
                                            skylarbradshaw@yahoo.com
                             Bradshaw
```

