Lab: Find distinct values in a stream of events

Problem Statement:

How can you filter out duplicate events from a Kafka topic based on a field in the event, producing a new stream of unique events per time window?

Example use case:

Consider a topic with events that represent clicks on a website. Each event contains an IP address, a URL, and a timestamp. In this lab, we'll write a program that filters click events by the IP address within a window of time.

Hands-on code example:

Run it

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Run it

Prerequisites

This lab installs Confluent Platform using Docker. Before proceeding:

• Connect with lab environment VM using SSH:

```
ssh USERNAME@YOUR_VM_DNS.courseware.io
```

- Username: Will be provided by Instructor.
- Password: Will be provided by Instructor.
- Verify that Docker is set up properly by ensuring no errors are output when you run docker info and docker compose version on the command line.

Initialize the project

To get started, make a new directory anywhere you'd like for this project:

```
mkdir finding-distinct && cd finding-distinct
```

Then make the following directories to set up its structure:

```
mkdir src test
```

Get Confluent Platform

Next, create the following docker-compose.yml file to obtain Confluent Platform:

```
version: '2'
services:
   image: confluentinc/cp-zookeeper:7.3.0
   hostname: zookeeper
   container name: zookeeper
     - "2181:2181"
   environment:
     ZOOKEEPER CLIENT PORT: 2181
     ZOOKEEPER_TICK_TIME: 2000
 broker:
   image: confluentinc/cp-kafka:7.3.0
   hostname: broker
   container name: broker
   depends_on:
     - zookeeper
   ports:
     - "29092:29092"
   environment:
     KAFKA BROKER ID: 1
     KAFKA_ZOOKEEPER_CONNECT: 'zookeeper:2181'
     KAFKA LISTENER SECURITY PROTOCOL MAP:
PLAINTEXT: PLAINTEXT, PLAINTEXT HOST: PLAINTEXT
     KAFKA ADVERTISED LISTENERS:
PLAINTEXT://broker:9092,PLAINTEXT HOST://localhost:29092
     KAFKA_OFFSETS_TOPIC_REPLICATION_FACTOR: 1
     KAFKA TRANSACTION STATE LOG MIN ISR: 1
     KAFKA TRANSACTION STATE LOG REPLICATION FACTOR: 1
     KAFKA LOG RETENTION MS: -1
     KAFKA GROUP INITIAL REBALANCE DELAY MS: 0
  schema-registry:
   image: confluentinc/cp-schema-registry:7.3.0
   hostname: schema-registry
   container name: schema-registry
   depends on:
     - broker
   ports:
     - "8081:8081"
   environment:
     SCHEMA REGISTRY HOST NAME: schema-registry
     SCHEMA REGISTRY KAFKASTORE BOOTSTRAP SERVERS: 'broker:9092'
  ksql-server:
```

```
image: confluentinc/ksqldb-server:0.28.2
 hostname: ksql-server
 container name: ksql-server
 depends on:
   - broker
   - schema-registry
 ports:
    - "8088:8088"
  environment:
   KSQL CONFIG DIR: "/etc/ksqldb"
   KSQL LOG4J OPTS: "-Dlog4j.configuration=file:/etc/ksqldb/log4j.properties"
   KSQL_BOOTSTRAP_SERVERS: "broker:9092"
   KSQL HOST NAME: ksql-server
   KSQL_LISTENERS: "http://0.0.0.0:8088"
   KSQL KSQL SCHEMA REGISTRY URL: "http://schema-registry:8081"
   KSQL KSQL STREAMS AUTO OFFSET RESET: "earliest"
   KSQL KSQL STREAMS CACHE MAX BYTES BUFFERING: 0
ksql-cli:
 image: confluentinc/ksqldb-cli:0.28.2
 container name: ksql-cli
 depends on:
   - broker
   - ksql-server
 entrypoint: /bin/sh
 environment:
   KSQL CONFIG DIR: "/etc/ksqldb"
 tty: true
 volumes:
   - ./src:/opt/app/src
    - ./test:/opt/app/test
```

And launch it by running:

```
docker compose up -d
```

Write the program interactively using the CLI

To begin developing interactively, open up the KSQL CLI:

```
docker exec -it ksql-cli ksql http://ksql-server:8088
```

To start off the implementation of this scenario, we will create a stream that represents the clicks from the users. Since we will be handling time, it is important that each click timestamp indicating when that click was done. A bit later in the lab you'll see how to use ROWTIME for that purpose.

```
CREATE STREAM CLICKS (IP_ADDRESS VARCHAR, URL VARCHAR)

WITH (KAFKA_TOPIC = 'CLICKS',

FORMAT = 'JSON',

PARTITIONS = 1);
```

Now let's produce some events that represent user clicks. Note that we are going to purposely produce duplicate events, in which each IP address will have clicked twice in the same URL.

```
INSERT INTO CLICKS (IP_ADDRESS, URL) VALUES ('10.0.0.1', 'https://ernesto.net/');
INSERT INTO CLICKS (IP_ADDRESS, URL) VALUES ('10.0.0.12',
'https://github.com/fenago/kafka-training');
INSERT INTO CLICKS (IP_ADDRESS, URL) VALUES ('10.0.0.13',
'https://github.com/fenago/kafka-training');
INSERT INTO CLICKS (IP_ADDRESS, URL) VALUES ('10.0.0.1', 'https://ernesto.net/');
INSERT INTO CLICKS (IP_ADDRESS, URL) VALUES ('10.0.0.12',
'https://github.com/fenago/kafka-training');
INSERT INTO CLICKS (IP_ADDRESS, URL) VALUES ('10.0.0.13',
'https://github.com/fenago/kafka-training');
```

Now that you have a stream with some events in it, let's start to leverage them. The first thing to do is set the following properties to ensure that you're reading from the beginning of the stream:

```
SET 'auto.offset.reset' = 'earliest';
```

Next, set cache.max.bytes.buffering to configure the frequency of output for tables. The value of 0 instructs ksqlDB to emit each matching record as soon as it is processed. Without this configuration, the queries below could appear to "miss" some records due to the default batching behavior.

```
SET 'cache.max.bytes.buffering' = '0';
```

Let's experiment with these events.

First, let's create a query to select the information we need and count each occurrence of an IP address.

```
SELECT

IP_ADDRESS,

COUNT(IP_ADDRESS) as IP_COUNT,

URL,

FORMAT_TIMESTAMP(FROM_UNIXTIME(EARLIEST_BY_OFFSET(ROWTIME)), 'yyyy-MM-dd

HH:mm:ss.SSS') AS TIMESTAMP

FROM CLICKS WINDOW TUMBLING (SIZE 2 MINUTES)

GROUP BY IP_ADDRESS, URL

EMIT CHANGES

LIMIT 6;
```

Notice that the duplicate IP addresses have an IP_COUNT value greater than one. So our next step is to filter out the duplicates by only selecting records where the IP_COUNT column equals 1.

You'll also notice that each ip-address + url combo have the same timestamp value. That's because this this statement <code>EARLIEST_BY_OFFSET(ROWTIME)</code> selects the earliest <code>ROWTIME</code>, the event timestamp, for the composite key of ip-address and url. This is the desired behavior because when you add the de-duplication, you'll only want the event timestamp of the first user click for the unique ip-address and url pair.

Now let's create some continuous queries to implement this scenario.

```
CREATE TABLE DETECTED_CLICKS AS

SELECT

IP_ADDRESS AS KEY1,
```

```
URL AS KEY2,
       AS VALUE(IP ADDRESS) AS IP ADDRESS,
       COUNT (IP ADDRESS) as IP COUNT,
       AS VALUE (URL) AS URL,
       FORMAT TIMESTAMP(FROM UNIXTIME(EARLIEST BY OFFSET(ROWTIME)), 'yyyy-MM-dd
HH:mm:ss.SSS') AS TIMESTAMP
   FROM CLICKS WINDOW TUMBLING (SIZE 2 MINUTES, RETENTION 1000 DAYS)
   GROUP BY IP ADDRESS, URL;
CREATE STREAM RAW VALUES CLICKS (IP ADDRESS VARCHAR, IP COUNT BIGINT, URL VARCHAR,
TIMESTAMP VARCHAR)
   WITH (KAFKA TOPIC = 'DETECTED CLICKS',
         PARTITIONS = 1,
         FORMAT = 'JSON');
CREATE STREAM DISTINCT CLICKS AS
       IP ADDRESS,
       URL,
       TIMESTAMP
   FROM RAW VALUES CLICKS
   WHERE IP COUNT = 1
   PARTITION BY IP ADDRESS;
```

In the first statement above, we created the query that finds click events, naming it <code>DETECTED_CLICKS</code> . We modeled it as a table since the query performs aggregations.

As we're grouping by ip-address and url, these columns will become part of the primary key of the table. Primary key columns are stored in the Kafka message's key. As we'll need them in the value later, we use AS_VALUE to copy the columns into the value and set their name. To avoid the value column names clashing with the key columns, we add aliases to rename the key columns.

As it stands, the key of the <code>DETECTED_CLICKS</code> table contains the ip-address, and url columns, and as the table is windowed, the window start time. Wouldn't it be nice if the key was just the IP address? You'll take care of that as well as finding distinct IP addresses with the next two queries.

The second statement declares a stream on top of the <code>DETECTED_CLICKS</code> table, defining only the value columns we're interested in.

In the third statement you set the key of the <code>DISTINCT_CLICKS</code> stream to just the IP address using the <code>PARTITION BY</code> statement. The <code>WHERE</code> clause is where we filter out duplicates by specifying to only retrieve IP addresses with a <code>IP COUNT</code> of <code>1</code>.

To verify everything is working as expected, run the following query:

```
IP_ADDRESS,
URL,
TIMESTAMP
FROM DISTINCT_CLICKS
EMIT CHANGES
LIMIT 3;
```

Finally, let's see what's available on the underlying Kafka topic for the table. We can print that out easily.

```
PRINT DISTINCT_CLICKS FROM BEGINNING LIMIT 3;
```

The output should look similar to:

```
Key format: JSON or HOPPING(KAFKA_STRING) or TUMBLING(KAFKA_STRING) or KAFKA_STRING
Value format: JSON or KAFKA_STRING
rowtime: 2023/05/31 17:40:03.024 Z, key: "10.0.0.1", value:
{"URL":"https://ernesto.net/","TIMESTAMP":"2023-05-31 17:40:03.024"}, partition: 0
rowtime: 2023/05/31 17:40:03.052 Z, key: "10.0.0.12", value:
{"URL":"https://github.com/fenago/kafka-training","TIMESTAMP":"2023-05-31
17:40:03.052"}, partition: 0
rowtime: 2023/05/31 17:40:03.077 Z, key: "10.0.0.13", value:
{"URL":"https://github.com/fenago/kafka-training","TIMESTAMP":"2023-05-31
17:40:03.077"}, partition: 0
Topic printing ceased
```

Write your statements to a file

Now that you have a series of statements that's doing the right thing, the last step is to put them into a file so that they can be used outside the CLI session. Create a file at src/statements.sql with the following content:

```
CREATE STREAM CLICKS (IP ADDRESS STRING, URL STRING)
   WITH (KAFKA TOPIC = 'CLICKS',
        FORMAT = 'JSON',
         PARTITIONS = 1);
CREATE TABLE DETECTED CLICKS AS
   SELECT
       IP ADDRESS AS KEY1,
       URL AS KEY2,
       AS VALUE(IP ADDRESS) AS IP ADDRESS,
       COUNT(IP ADDRESS) as IP COUNT,
        AS VALUE(URL) AS URL,
        FORMAT TIMESTAMP(FROM UNIXTIME(EARLIEST BY OFFSET(ROWTIME)), 'yyyy-MM-dd
HH:mm:ss.SSS') AS TIMESTAMP
   FROM CLICKS WINDOW TUMBLING (SIZE 2 MINUTES, RETENTION 1000 DAYS)
   GROUP BY IP ADDRESS, URL;
CREATE STREAM RAW VALUES CLICKS (IP ADDRESS STRING, IP COUNT BIGINT, URL STRING,
TIMESTAMP STRING)
   WITH (KAFKA TOPIC = 'DETECTED CLICKS',
         PARTITIONS = 1,
         FORMAT = 'JSON');
CREATE STREAM DISTINCT CLICKS AS
   SELECT
       IP_ADDRESS,
       URL,
       TIMESTAMP
   FROM RAW VALUES CLICKS
   WHERE IP COUNT = 1
   PARTITION BY IP ADDRESS;
```

Test it

Create the test data

Create a file at ${\tt test/input.json}$ with the inputs for testing:

```
"inputs": [
{
   "topic": "CLICKS",
   "timestamp": 1685644010383,
   "value": {
     "IP ADDRESS": "10.0.0.1",
     "URL": "https://ernesto.net/"
  },
   "topic": "CLICKS",
   "timestamp": 1685644295242,
   "value": {
     "IP ADDRESS": "10.0.0.12",
     "URL": "https://github.com/fenago/kafka-training"
  },
   "topic": "CLICKS",
   "timestamp": 1685644521624,
   "value": {
     "IP_ADDRESS": "10.0.0.13",
     "URL": "https://github.com/fenago/kafka-training"
    }
  },
   "topic": "CLICKS",
   "timestamp": 1685644010383,
   "value": {
     "IP ADDRESS": "10.0.0.1",
     "URL": "https://ernesto.net/"
   }
  },
   "topic": "CLICKS",
   "timestamp": 1685644295242,
   "value": {
     "IP ADDRESS": "10.0.0.12",
     "URL": "https://github.com/fenago/kafka-training"
    }
  },
   "topic": "CLICKS",
   "timestamp": 1685644521624,
```

```
"value": {
    "IP_ADDRESS": "10.0.0.13",
    "URL": "https://github.com/fenago/kafka-training"
    }
}
```

Similarly, create a file at test/output.json with the expected outputs.

```
"outputs": [
   "topic": "DISTINCT CLICKS",
   "key": "10.0.0.1",
   "value": {
     "URL": "https://ernesto.net/",
     "TIMESTAMP": "2023-06-01 18:26:50.383"
   },
    "timestamp": 1685644010383
  },
   "topic": "DISTINCT CLICKS",
   "key": "10.0.0.12",
   "value": {
     "URL": "https://github.com/fenago/kafka-training",
     "TIMESTAMP": "2023-06-01 18:31:35.242"
   },
   "timestamp": 1685644295242
  },
   "topic": "DISTINCT CLICKS",
   "key": "10.0.0.13",
     "URL": "https://github.com/fenago/kafka-training",
     "TIMESTAMP": "2023-06-01 18:35:21.624"
   "timestamp": 1685644521624
1
```

Invoke the tests

Lastly, invoke the tests using the test runner and the statements file that you created earlier:

```
docker exec ksql-cli ksql-test-runner -i /opt/app/test/input.json -s
/opt/app/src/statements.sql -o /opt/app/test/output.json
```

Which should pass:

```
>>> Test passed!
```

Cleanup Resources

Delete all the resources by running following command in the docker-compose.yml file directory from the terminal:

```
docker compose down
```

```
ubuntuBip-172-31-28-38:-/split-stream$ docker compose down

[-] Running 4/3

- Container schema-registry Removed

- Container broker Removed
```

Note: If you get above error while running above command. Manually stop the containers and run docker compose down again. **Do not delete kafkanew container**.

```
no container to killubuntu@ip-172-31-28-38:~/split-stream$ docker ps
COMTAINER ID IMAGE COMMAND CREATED STATUS PORTS
NAMES
49455dbiaa89 confluentinc/ksqldb-cli:0.28.2 "/bin/sh" About an hour ago Up About an hour ksqldb-cli
6885qldb-cli
6885pldb-server
6887b23clca confluentinc/ksqldb-server:0.28.2 "/usr/bin/docker/run" About an hour ago Up About an hour 0.0.0.0:8088->8088/tcp, :::8088->8088/tcp
6887b23clca confluentinc/ksqldb-server:0.28.2 "/usr/bin/docker/run" About an hour ago Up About an hour 0.0.0.0:8088->8088/tcp, :::8088->8088/tcp
6887b23clca confluentinc/ksqldb-server:0.28.2 "/usr/bin/docker/run" About an hour ago Up About an hour 0.0.0.0:8088->8088/tcp, :::8088->8088/tcp
6887b23clca confluentinc/ksqldb-server:0.28.2 "/dockerstartup/vnc_..." 8 weeks ago Up 12 hours 0.0.0.0:80->80/tcp, :::80->80/tcp, 5900/tcp, 0.0
6887b23clca confluentinc/ksqldb-server:0.28.2 "/dockerstartup/vnc_..." 8 weeks ago Up 12 hours 0.0.0.0:80->80/tcp, :::80->80/tcp, 5900/tcp, 0.0
6887b23clca confluentinc/ksqldb-server:0.28.2 "/usr/bin/shldb-server:0.28.2 "/usr
```