

# Visual Stethoscopes

Authors:

Juan Carlos Rosito Cuellar - [j.rositocuellar@campus.unimib.it](mailto:j.rositocuellar@campus.unimib.it)

Lida Amalia Follari - [l.follari@campus.unimib.it](mailto:l.follari@campus.unimib.it)

Data Management Final Project

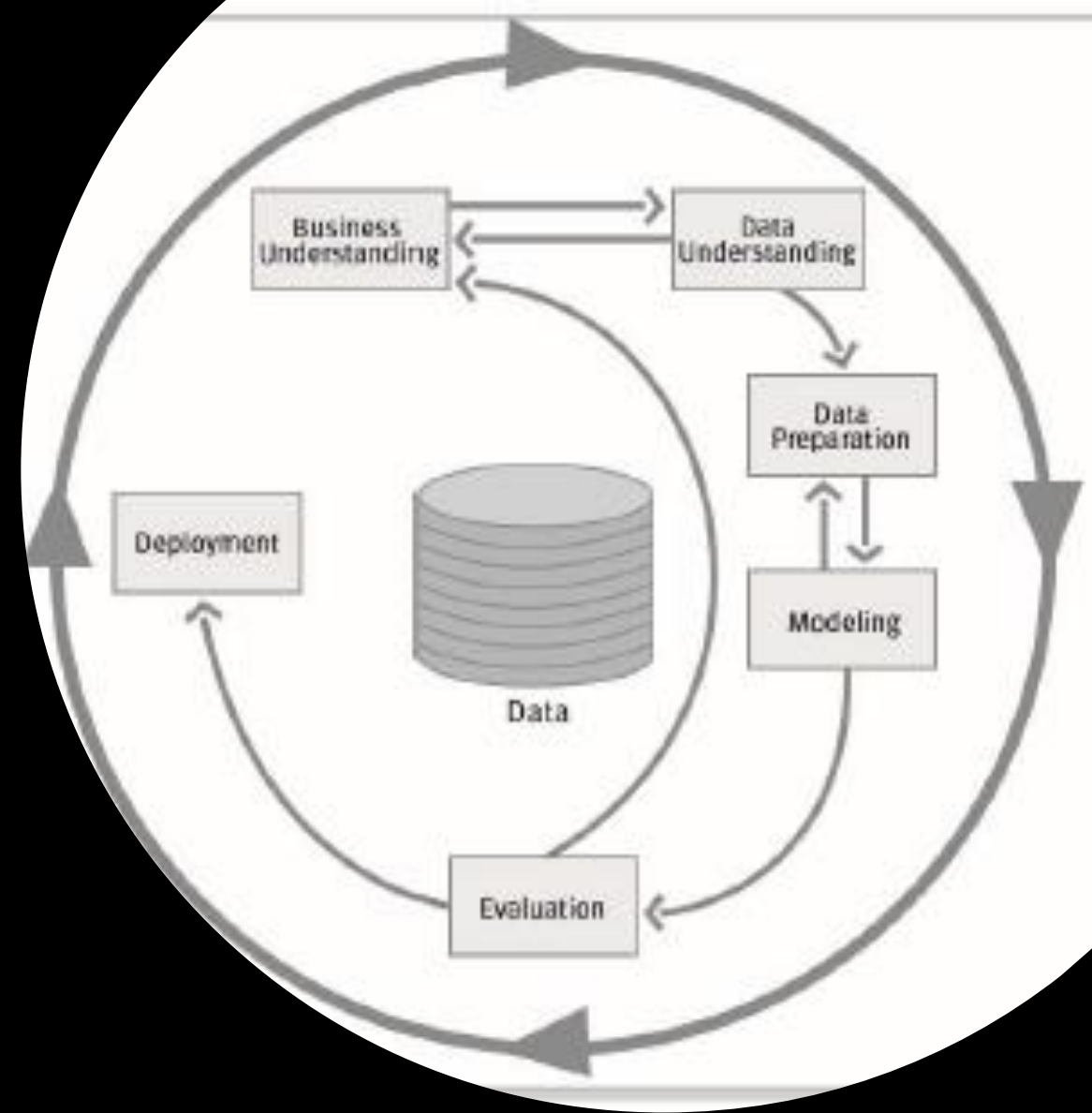
Prof. Maurino

Università Bicocca, Data Science, 2017-2018

# Ciclo di Vita del Dato

## Crisp-DM Reference Model

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment



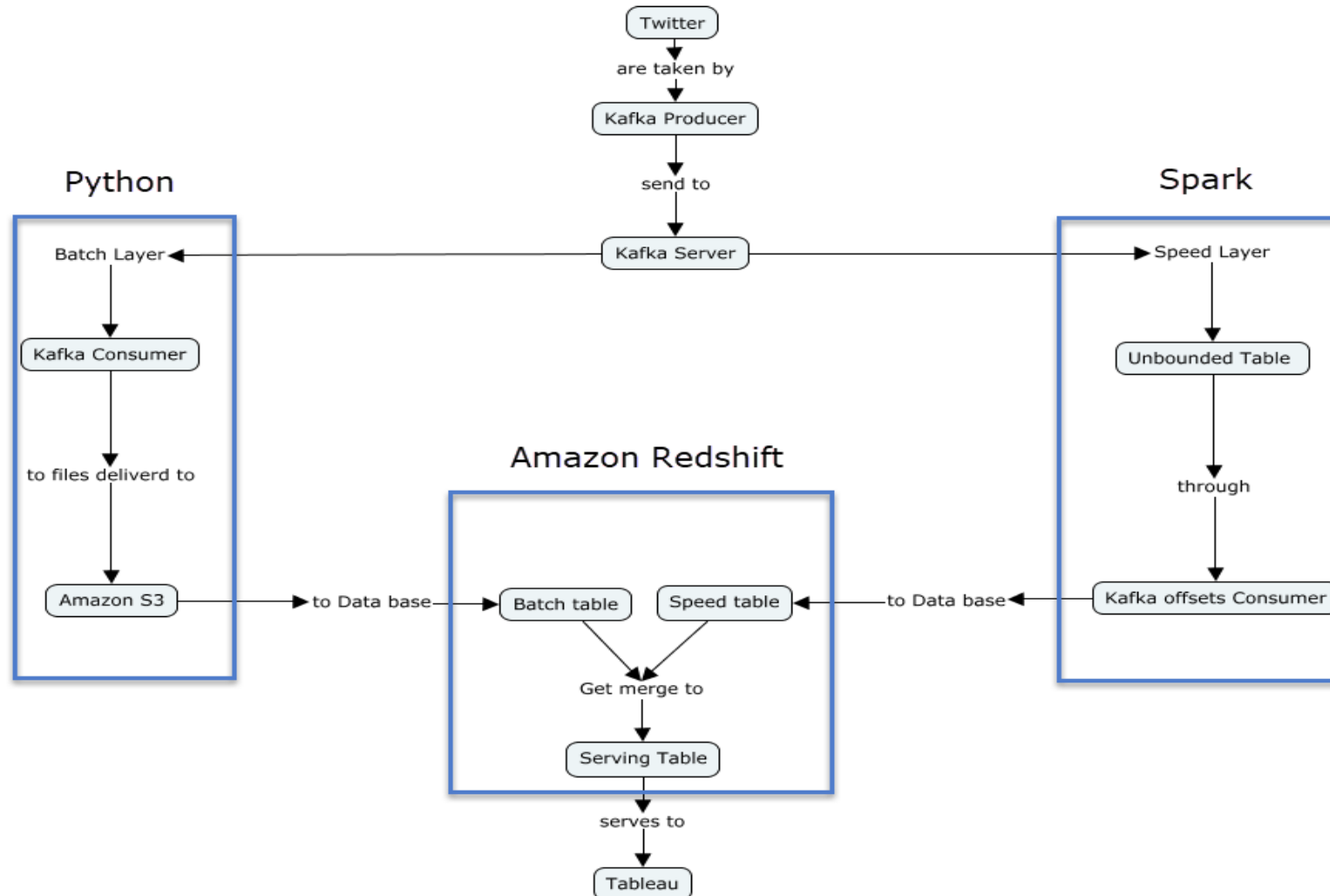
# BUSINESS UNDERSTANDING: Visual Stethoscopes

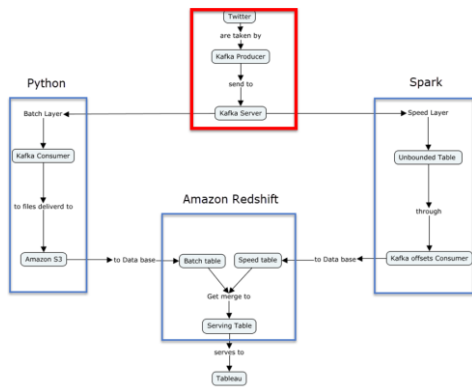
- Listening to online conversations
- In real-time
- Discovering public opinion sensibility about some social indicators



# System Implementation

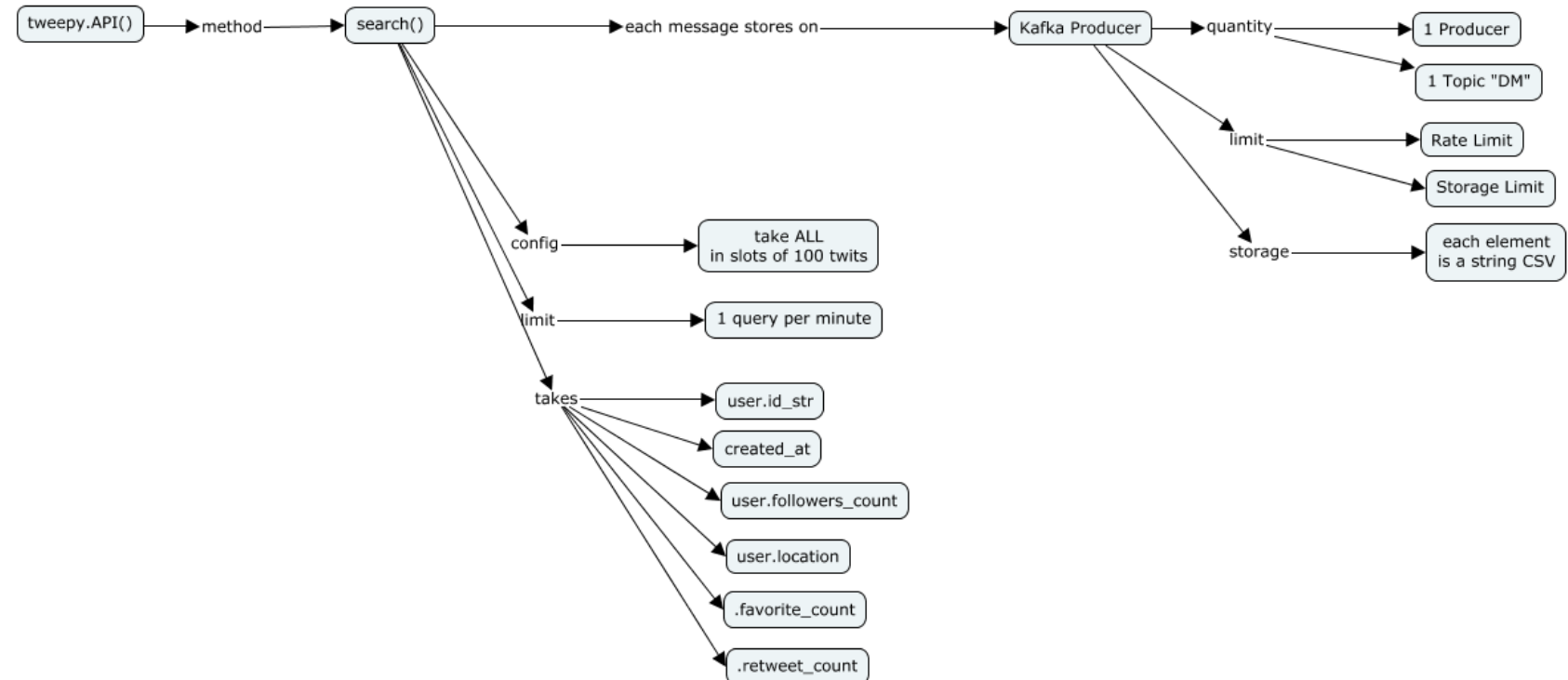
## Lambda Architecture Pipeline

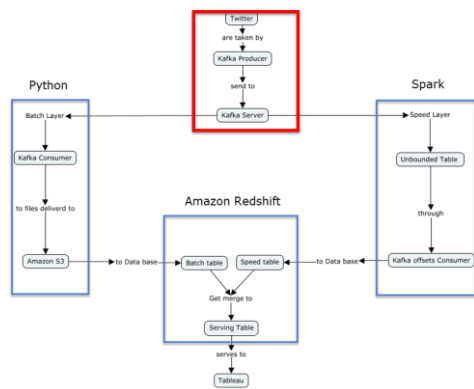




# Data Ingestion

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment





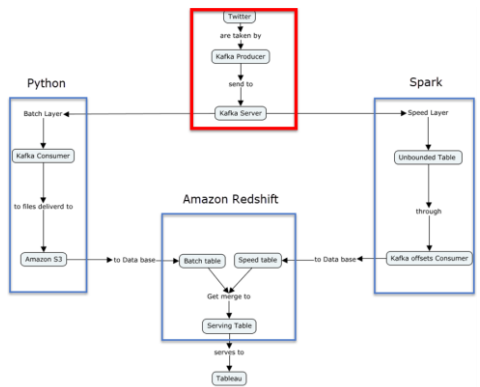
# JSON Tweet

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

```

{
  "created_at" : "Thu May 10 15:24:15 +0000 2018" ,
  "id_str" : "850006245121695744" ,
  "text" : "Here is the Tweet message." ,
  "user" : {
  } ,
  "place" : {
  } ,
  "entities" : {
  } ,
  "extended_entities" : {
  }
}
  
```

# Tweet Table

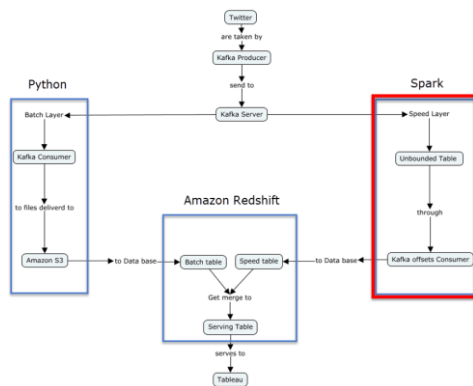


- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

	ABC id	ABC created_at	ABC followers_count	ABC location	ABC favorite_count	ABC retweet_count
1	738276139504963584	2018-09-18 14:13:06	644		0	58
2	2903059609	2018-09-18 14:13:06	302	deep in the heart of texas	0	34302
3	3261609530	2018-09-18 14:13:06	434	Nairobi, Kenya	0	465
4	1034014823594381313	2018-09-18 14:13:05	38		0	0
5	1716299822	2018-09-18 14:13:05	113		0	24592
6	20792010	2018-09-18 14:13:05	11187	Columbus, Ohio	0	0
7	807022147	2018-09-18 14:13:05	1020	Edinburgh, Scotland	0	0



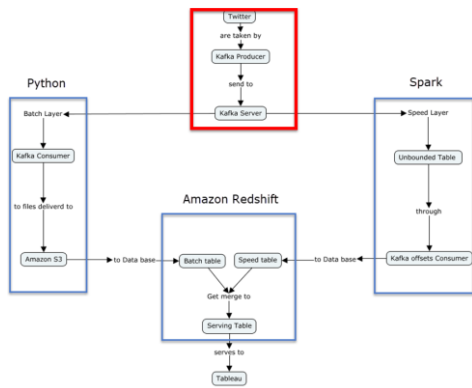




## Reagrouped by location (Speed layer Table)

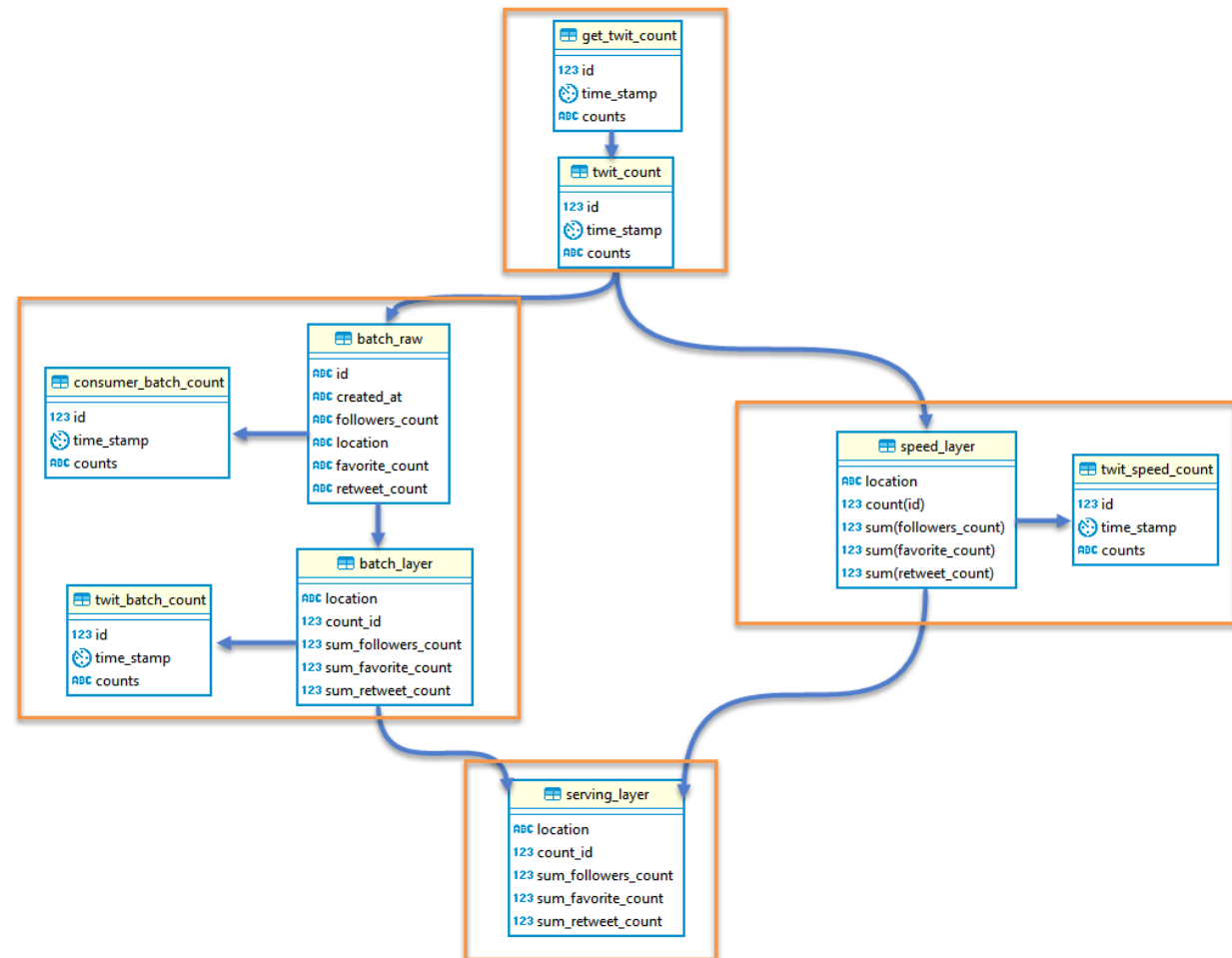
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- **Data Preparation and Modelling**
- Evaluation
- Presentation and Deployment

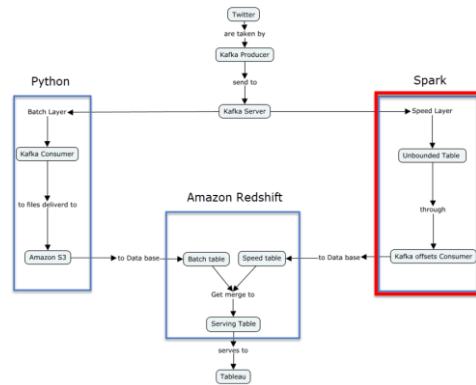
	ABC location	123 count_id	123 sum_followers_count	123 sum_favorite_count	123 sum_retweet_count
1	Norway	1	1,112	0	0
2	FL -- AL	4	2,848	0	141,311
3	황미미	1	230	0	1,794
4	Asgard	4	16,264	0	8,791
5	Hudson, FL	1	154	0	0
6	Malaysia	7	722	0	27,650
7	London	2	7,759	0	3
8	Wichita, KS	3	1,635	0	11,115
9	East Lansing, MI	1	45	0	0
10	Philippines	1	67	0	2
11	Houston, TX	5	1,016	0	2,133



# Data base diagram

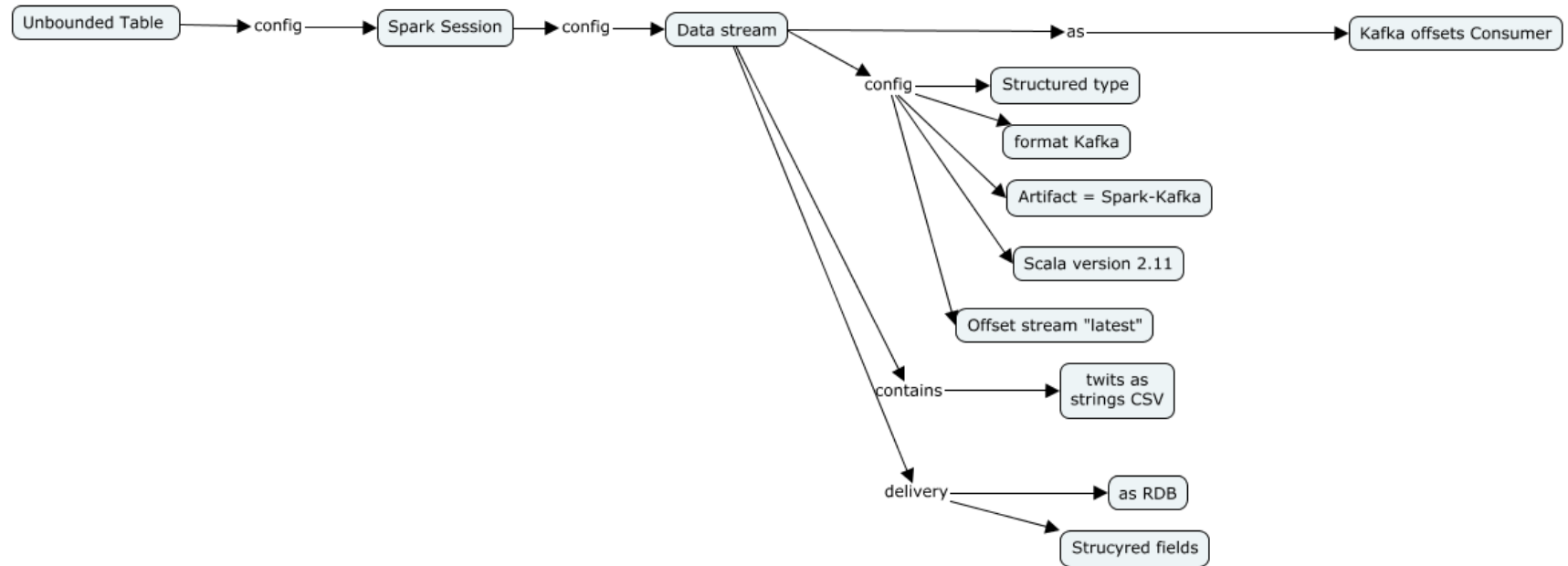
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment



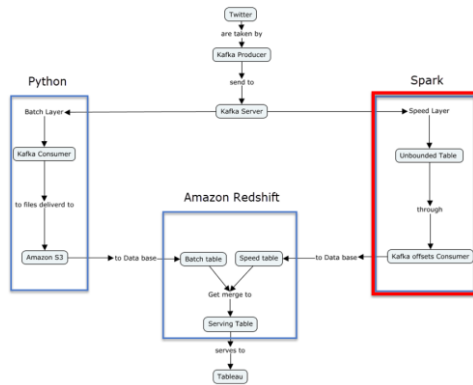


# Speed Layer - Spark streaming framework (at-most-once)

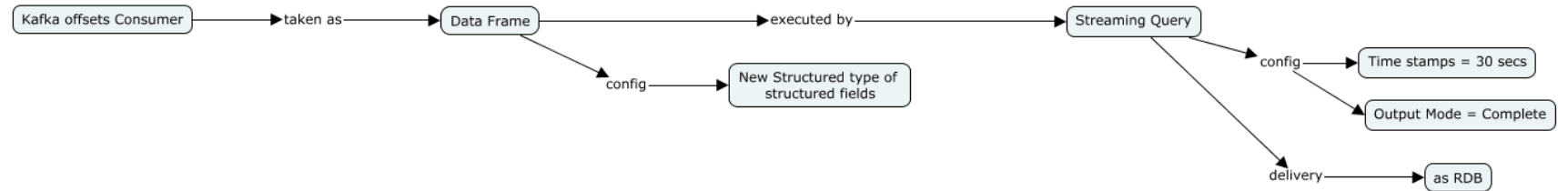
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment



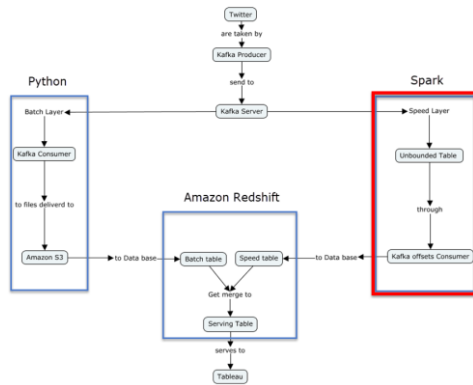
# Incremental Query



- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment



# Incremental Query

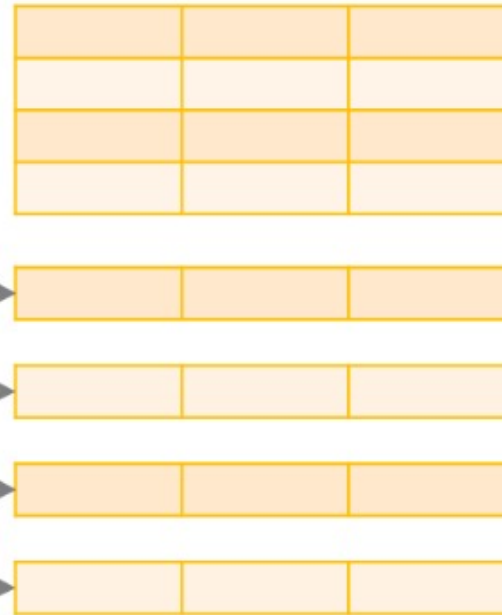


- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- **Data Preparation and Modelling**
- Evaluation
- Presentation and Deployment

Data stream



Unbounded Table



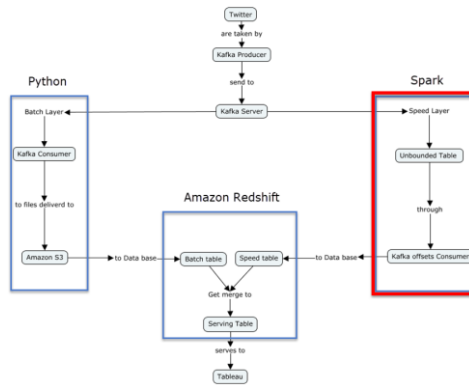
new data in the  
data stream

=

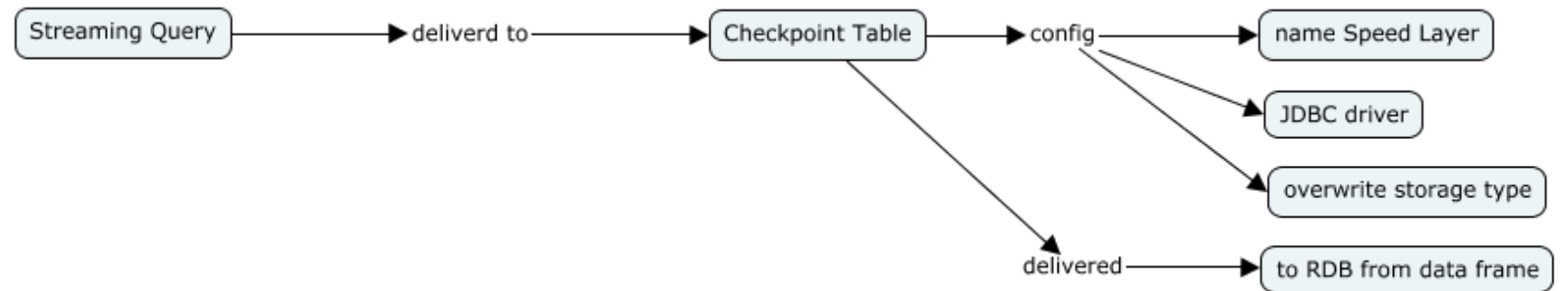
new rows appended  
to a unbounded table

Data stream as an unbounded table

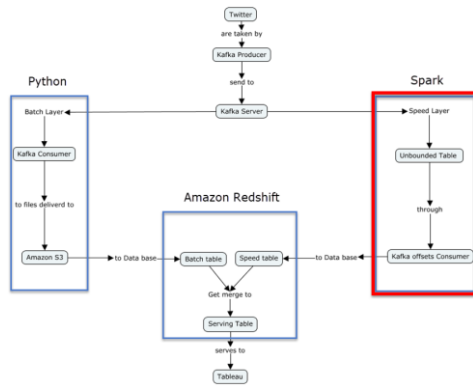
# Speed layer – Checkpoint table



- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment



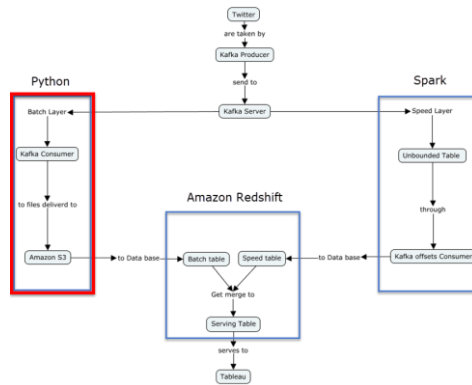
# Speed layer Table



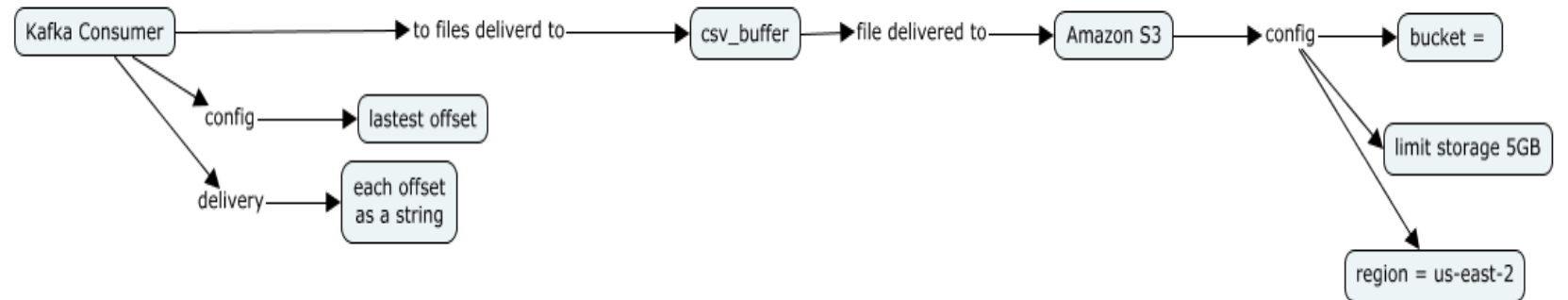
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- **Data Preparation and Modelling**
- Evaluation
- Presentation and Deployment

	ABC location	123 count_id	123 sum_followers_count	123 sum_favorite_count	123 sum_retweet_count
1	Norway	1	1,112	0	0
2	FL -- AL	4	2,848	0	141,311
3	황미미	1	230	0	1,794
4	Asgard	4	16,264	0	8,791
5	Hudson, FL	1	154	0	0
6	Malaysia	7	722	0	27,650
7	London	2	7,759	0	3
8	Wichita, KS	3	1,635	0	11,115
9	East Lansing, MI	1	45	0	0
10	Philippines	1	67	0	2
11	Houston, TX	5	1,016	0	2,133

# Batch layer – file container S3

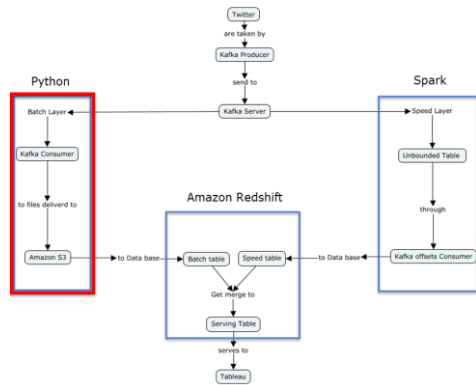


- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- **Data Preparation and Modelling**
- Evaluation
- Presentation and Deployment

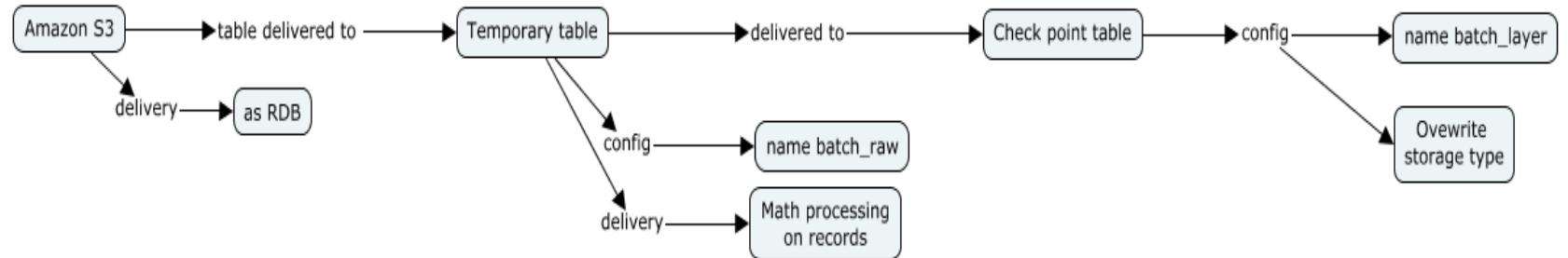




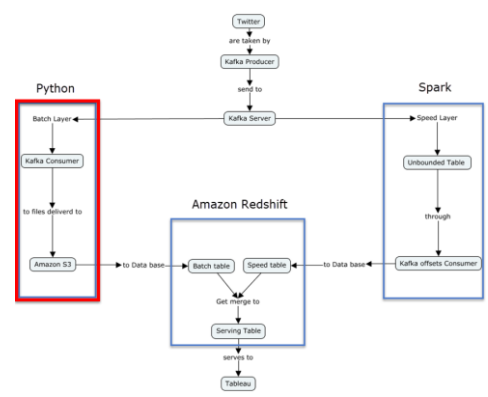
# Batch layer – Temporary and chepoint tables



- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment



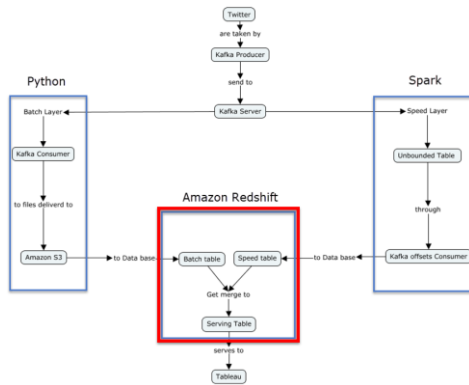
# Batch Layer table



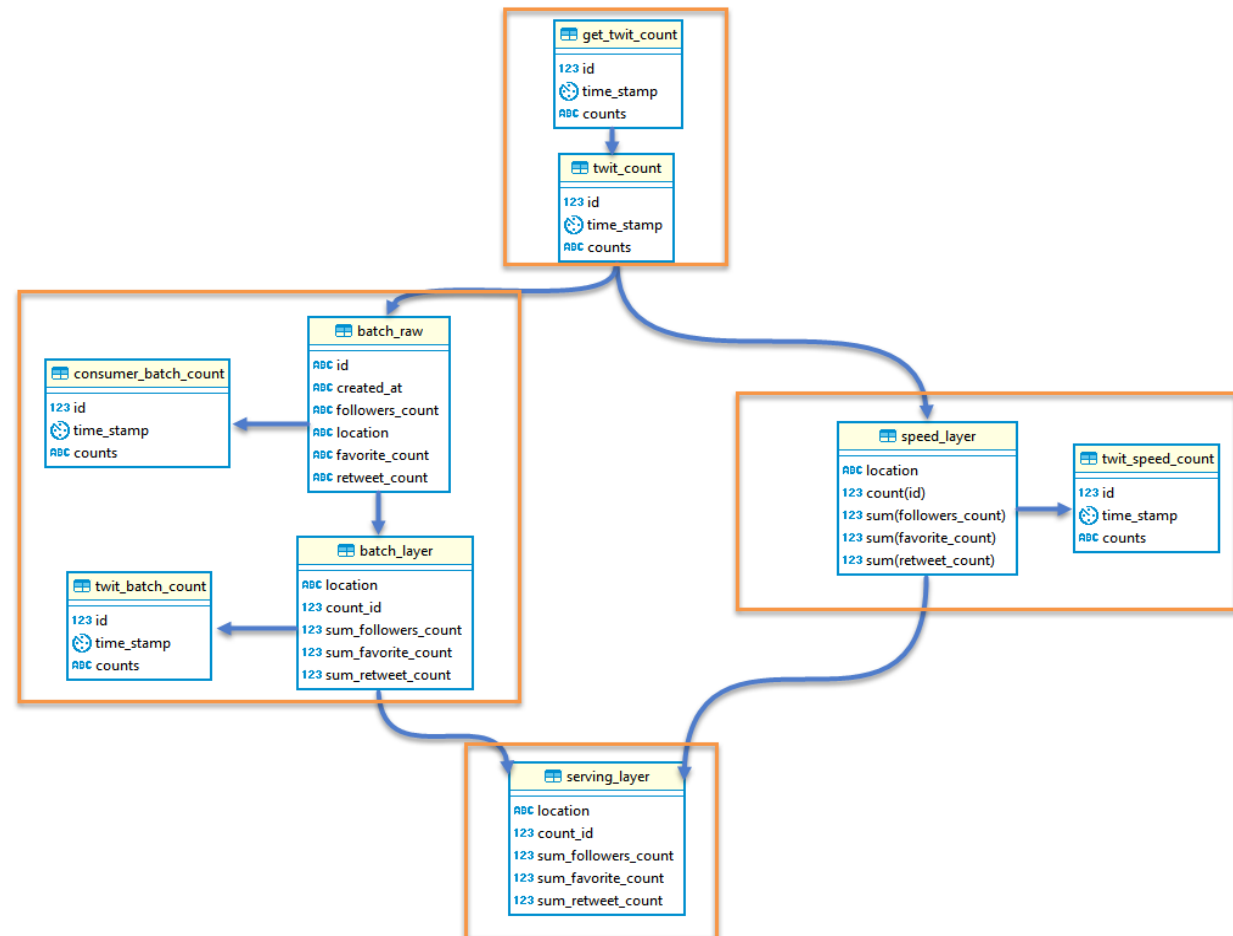
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

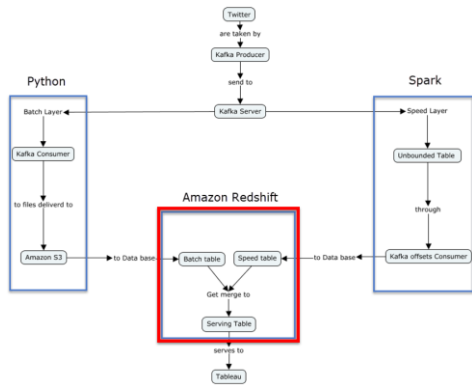
	ABC location	123 count_id	123 sum_followers_count	123 sum_favorite_count	123 sum_retweet_count
1	North Jutland, Denmark	1	18	0	73
2	Worcester, England	1	29	0	0
3		580	413,474	6	6,736,930
4	Pretoria, South Africa	1	273	0	35,312
5	황미미	1	230	0	1,794
6	Hudson, FL	1	154	0	0
7	FL -- AL	4	2,848	0	141,311
8	Asgard	4	16,264	0	8,791
9	Malaysia	10	2,622	0	28,755
10	London	2	7,759	0	3
11	Philippines	2	2,112	0	5
12	Houston, TX	9	3,452	0	15,983

# Serving layer table and system counters to valutate



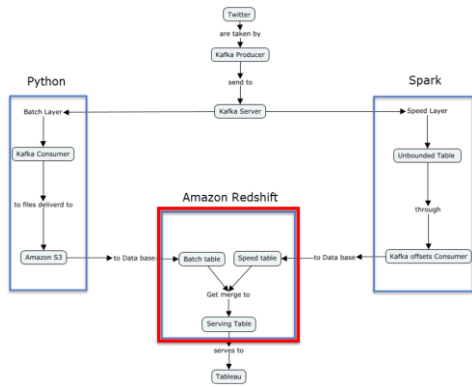
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment





# Tableau «Approval index» Deployment

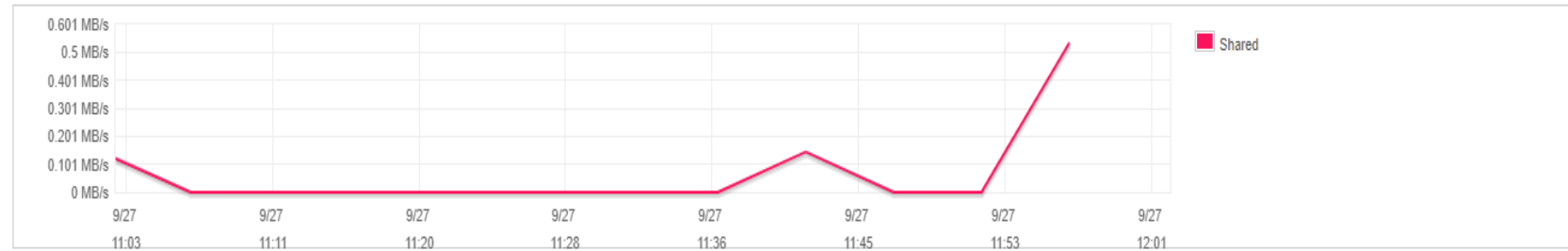
- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

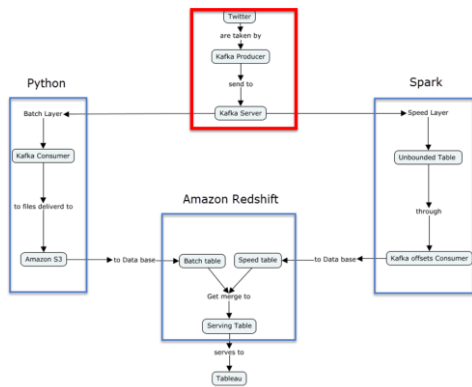


# Redshift Throughput

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

Write throughput





# Tweet count table and evaluation parameters

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

Refreshing of the server period:  $\frac{1}{20} \frac{1}{sec}$

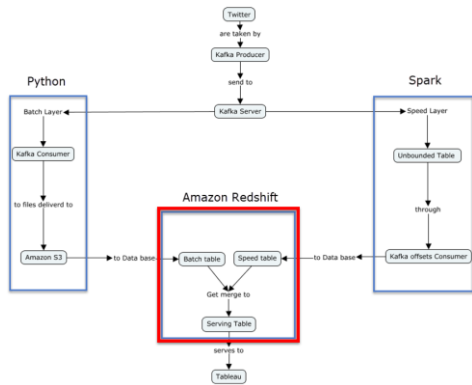
	123 id ↑↓	🕒 time_stamp ↑↓	ABC counts ↑↓
1	46	2018-09-22 21:33:44	15
2	47	2018-09-22 21:33:46	15
3	51	2018-09-22 21:33:54	15
4	55	2018-09-22 21:34:02	15
5	58	2018-09-22 23:04:52	10
6	60	2018-09-23 04:32:22	20

Maximum Quantity of tweets in a request: 100 *tweets*

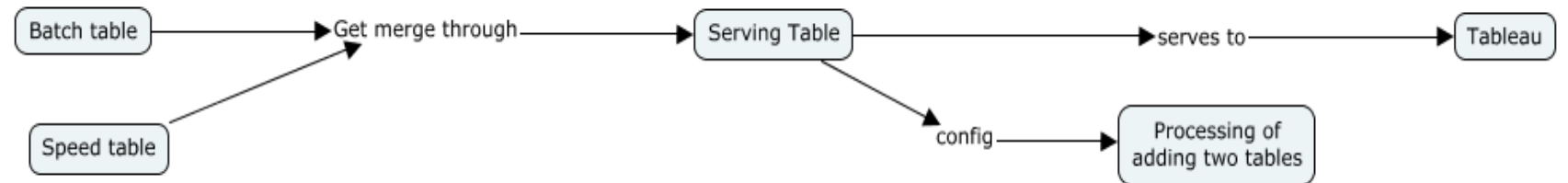
	Tweet Count
*1 Minute (morning)	70
*1 Minute (night)	284

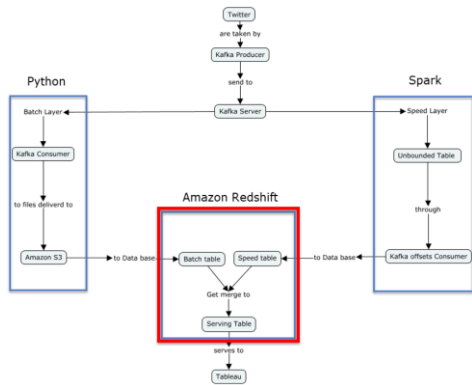
\*average of 5 throughput values

# Batch table and Speed table merged into Serving Table



- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

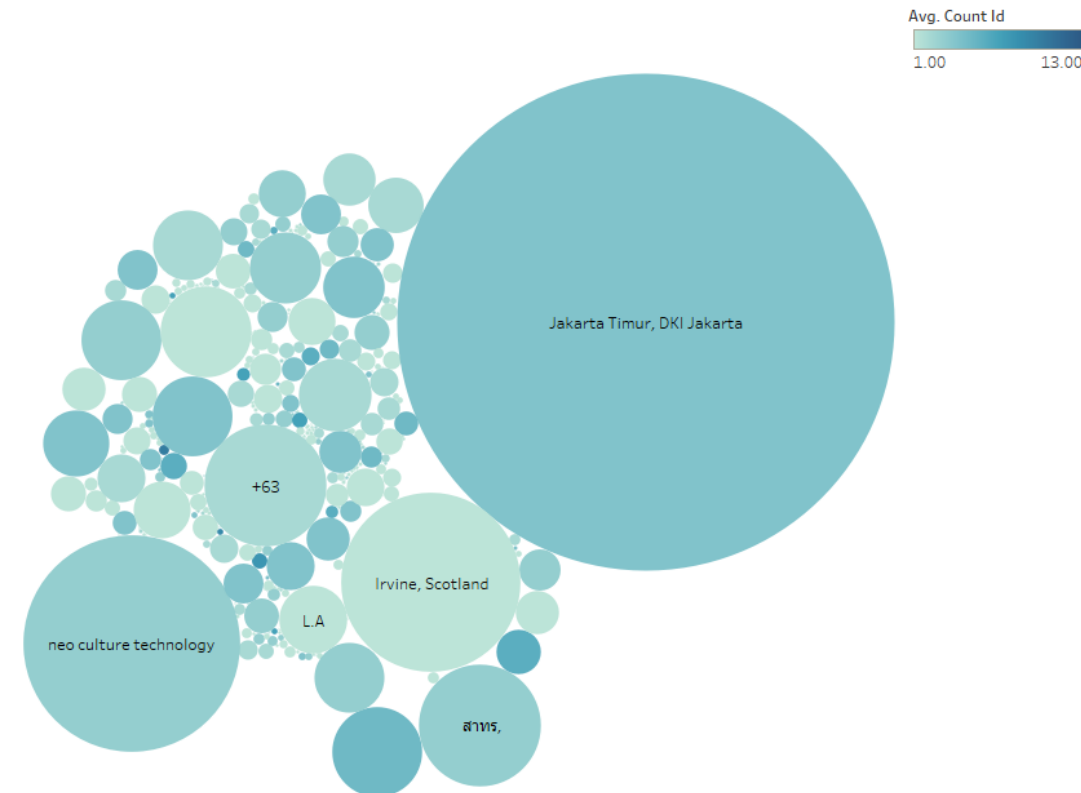




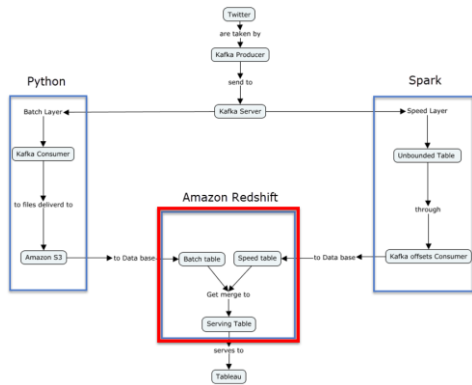
# Tableau «Approval index» Deployment

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

Popularity index Dimention - Count(Id) Color







# Tableau «Approval index» Deployment

- Business Understanding
- Data Understanding: Data Discovery
- Data understanding: Data Acquisition and Data Exploration
- Data Preparation and Modelling
- Evaluation
- Presentation and Deployment

- The implemented system represents a kind of visual stethoscope, thanks to real time visualization, is able to give the public opinion sensibility about a certain topic.
- Is more desirable the search() method than the streaming filtered, due to the capability to search in different languages, if the business hasn't their own data semantics system.
- The lambda architecture pipeline is being wasted, due to the implementation of a system with a throughput of 1KB per minute and with a data acquisition of historical data.
- The Business goal makes that the desired Kafka streaming processing has to be "at-most-once" implementation, making no replication, but with a probability of losing data.
- **Further steps** could be the use of **data wrangling** systems like **Google Fusion Tables**, **OpenRefine** and others, to only keep track of meaningful locations; and the implementation of Twitter streaming filter with a system of data semantics, if the desired word, to look for, exceeds the Rate limit, of request per minute, that the search() method offer.