



# DISCOVERING POPULAR EVENTS FROM TWEETS

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# Outline

- Introduction
- Dataset Description
- NEsper tool
- Association of tweets and events
- Results & Evaluation
- Conclusions





# Goal

- Determining the popularity of social events (i.e. music concerts) based on their presence in social media (i.e. tweets).





# Goal

- Determining the popularity of social events (i.e. music concerts) based on their presence in social media (i.e. tweets).
- The larger the number of tweets associated to an event, the more popular the event is.





# Dataset Description

- 10033 social events
  - Eventful.com
  - event title, start and stop time of event, type of event, location, performers name ,short bio description etc.
- Over 4 milion tweets
  - tweet text, hash tags, time of posting the tweet, geographical coordinates etc.
- London, March 6th to April 11th 2013



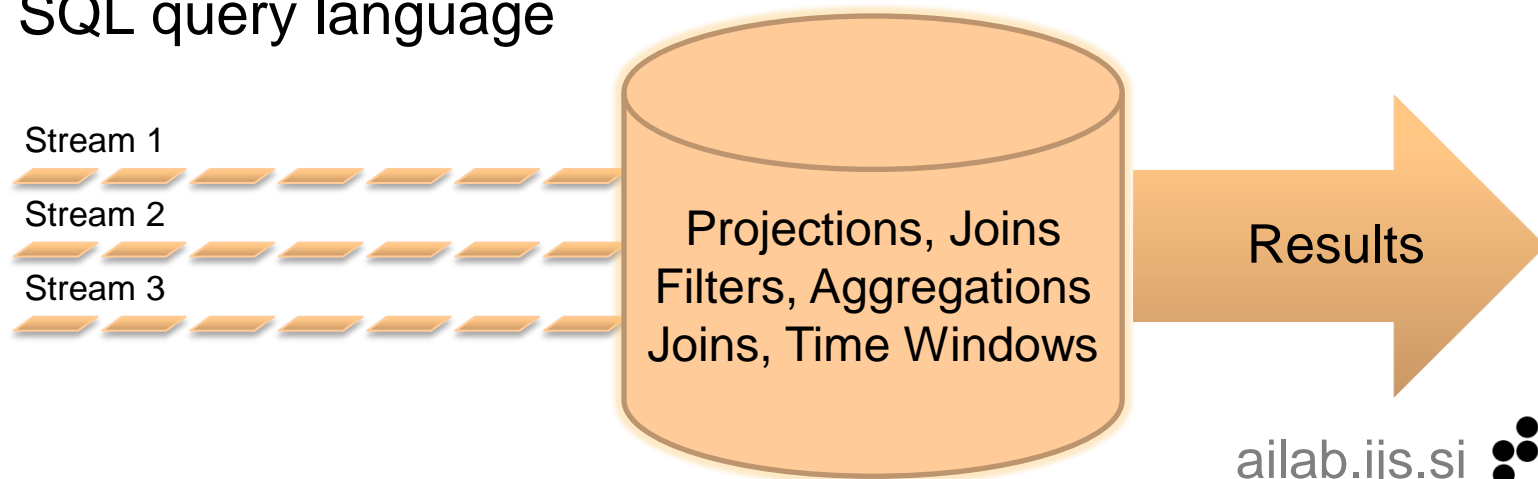
# Dataset Preprocessing

- Parsing JSON format for tweets and XML for events
- Tweet and Event class(C#)
- Missing value: stop time of events
  - We calculate stop time as median value for each type of event



# NEsper

- Event Stream Processing (ESP)
  - Processing streaming data related to events that are happening
- Complex Event Processing (CEP)
  - event processing that combines data from multiple sources
- Event Processing Language (EPL)
  - Contains queries that has been designed for similarity with the SQL query language

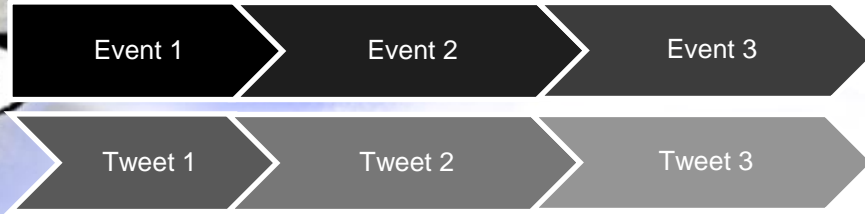




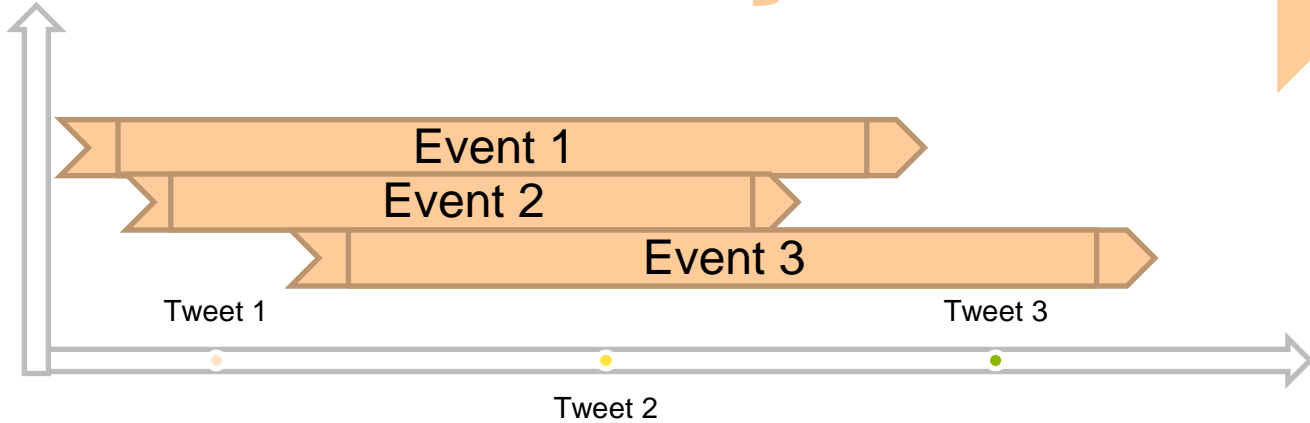


# Preparing Input for NEsper

- Assign to NEsper types of objects it will receive: tweets(Tweet class) and social events(Event class)
- Create a pattern in EPL syntax by using the unary operator “*every*” and the operator *followed-by* “->”



**Pattern**  
every Event -> every Tweet  
(event.Stop\_Time - tweet.Time > 0)



- Time 1**
- Event 1 -> Tweet 1
  - Event 2 -> Tweet 1

- Time 2**
- Event 1 -> Tweet 2
  - Event 2 -> Tweet 2
  - Event 3 -> Tweet 2

- Time 3**
- Event 3 -> Tweet 3



# Association Event->Tweet

- We use an *association coefficient* (AC) defined by the next formula:

$$AC = 0.5 * P + 0.25 * W + 0.125 * L + 0.125 * B,$$

- P = 1 if tweet text contains the event's performer name
- W = the ratio between the tweet's words matching the event's title and the total number of words in the event's title
- L = 1 if location name is found in the tweet's text
- B = 1 if the tweet's text contains short-bio description of the performer



# Results

- 15455 tweets correlated with 572 music events having the AC higher than 0.25

| Event Title                           | Tweet   | AC    | Popularity |
|---------------------------------------|---|-------|------------|
| Olly Murs                             | I'm at O2 Arena - @the_o2 for Olly Murs, Tich and Loveable Rogues (Greenwich, Greater London) w/ 8 others <a href="http://t.co/IDTRyUTCpb">http://t.co/IDTRyUTCpb</a> | 0.75  | 23         |
| Halestorm                             | I'm at @eballroomcamden for Halestorm, In This Moment and Sacred Mother Tongue  | 0.75  | 9          |
| Beyonce                               | #NowWatching @Beyonce #LifeisButADream  | 0.75  | 9          |
| The Script                            | O2 arena the script <a href="http://t.co/nItxTURl88">http://t.co/nItxTURl88</a>   | 0.75  | 54         |
| Bastille                              | Seeing \"Bastille\". I am cool and with it. (@ O2 Shepherd's Bush Empire - @o2sbe w/ 7 others) <a href="http://t.co/BweCOsv4s5">http://t.co/BweCOsv4s5</a>            | 0.75  | 106        |
| Thursday Night                        | "#bigreunion concert on a Thursday night. Loving it!  | 0.25  | 98         |
| Union                                 | tweeting union council agenda avidly from @UKMStudentLive"  | 0.25  | 16         |
| Over The Moon                         | Because of this, ive lost my faith in humanity! I'm done, *disappears to moon*  | 0.25  | 21         |
| Everything on Red! - Columbia - Sabre | No red card will ever too that  | 0.535 | 118        |



# Evaluation methodology

- Manually evaluated a random set of 100 associations of events and tweets with AC higher than 0.25
- Two human annotators have analyzed the tweet and the event title and evaluated them as correct or incorrect
- Calculate inter-annotator agreement for 100 associations (Cohen coefficient), 2 human annotators.



# Evaluation

- Cohen's kappa coefficient is a statistical measure of inter-annotator agreement for qualitative items.

$$k = \frac{\Pr(a) - \Pr(e)}{1 - \Pr(e)},$$

- where  $\Pr(a)$  is the relative observed agreement among annotators, and  $\Pr(e)$  is the hypothetical probability of chance agreement.



# Evaluation

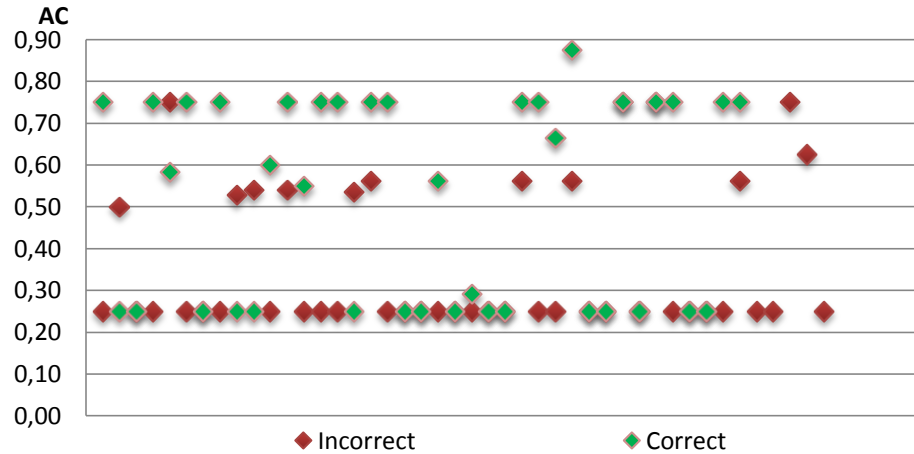
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- where  $\Pr(a)$  is the relative observed agreement among annotators, and  $\Pr(e)$  is the hypothetical probability of chance agreement.
- 0,661 – substantial level of agreement



# Evaluation

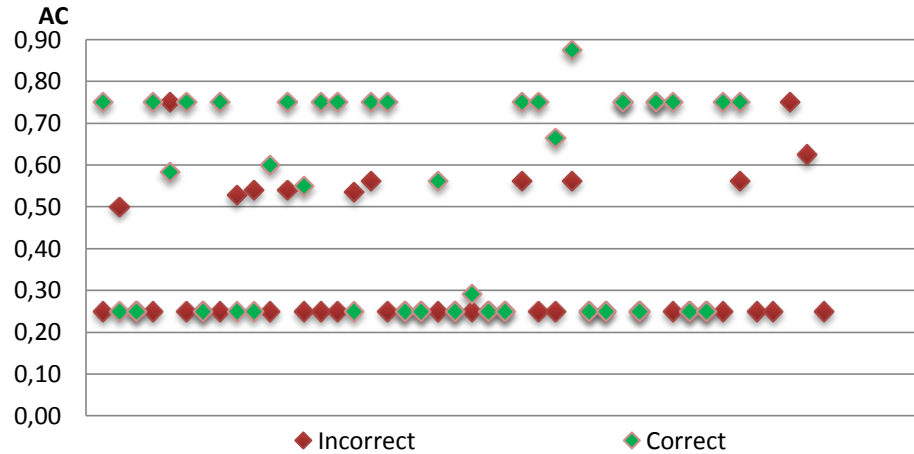


- ***Values of AC for the associations of tweets and events evaluated***

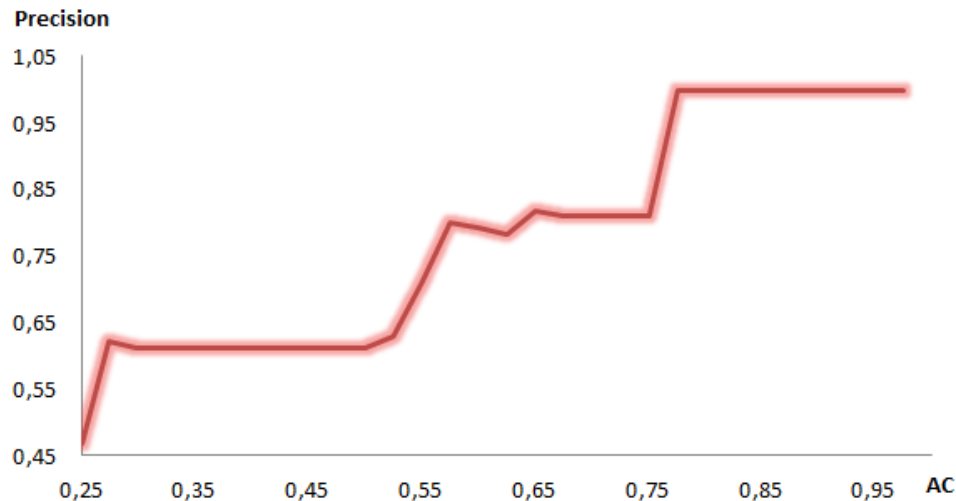




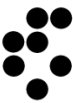
# Evaluation



- **Values of AC for the associations of tweets and events evaluated**



- **Precision performance for different values of AC**






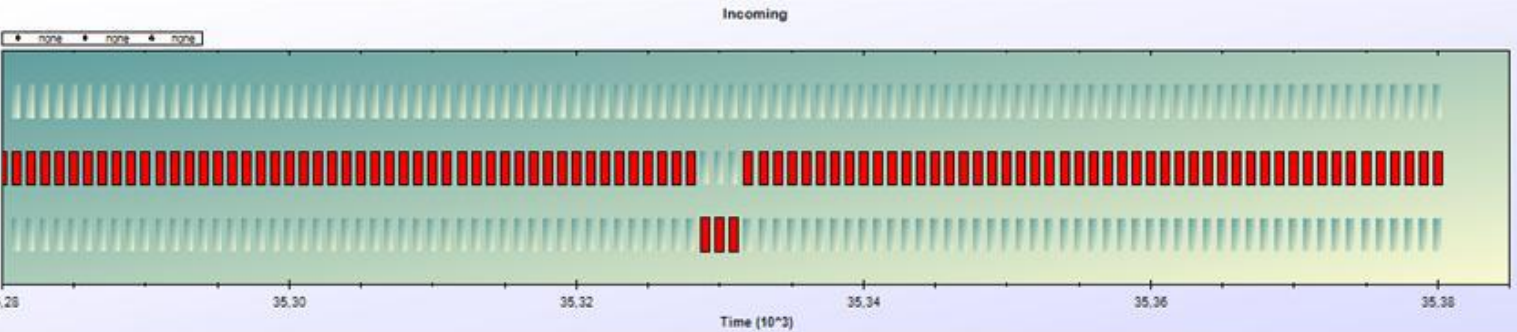
# Application

Form1

File



Incoming



Time (10<sup>3</sup>)

```
Tweet received: 1364997973000
Tweet received: 1364997973000
Tweet received: 1364997974000
Tweet received: 1364997974000
Tweet received: 1364997975000
Tweet received: 1364997975000
Tweet received: 1364997976000
Tweet received: 1364997977000
Tweet received: 1364997977000
Tweet received: 1364997978000
Tweet received: 1364997978000
Tweet received: 1364997979000
Tweet received: 1364997980000
```

```
Event received E0-001-053503657-9
Event received E0-001-053888489-8
Event received E0-001-053893770-1
Event received E0-001-052253589-4
Event received E0-001-053731059-0
Event received E0-001-054377680-3
Event received E0-001-039243794-4
Event received E0-001-052854295-7
Event received E0-001-052327731-3
Event received E0-001-050249831-9
Event received E0-001-054856451-3
Event received E0-001-053917103-8
Event received E0-001-052084891-6
Event received E0-001-053917118-0
```

```
Event E0-001-055279687-2 correlated with Tweet
319516399162765312
Event title: rights blues jam flyer
Tweet Text: sophiemusto rock hard place ireland situation munster
amp leinster d
on improve sharpish

Event E0-001-052084891-6 correlated with Tweet
319516996632993793
Event title: biffy clyro
Tweet Text: arena biffy clyro city colour greenwich greater abakyp
```

Start Processing Write to File



# Application

Param

Tweet source input files

D:\Calin\Proiecte normale\Stagiu 2013\Baze de date\data\tweets6Mar-3Apr.bt  
D:\Calin\Proiecte normale\Stagiu 2013\Baze de date\data\tweets3Apr-11Apr.bt

Add  
Remove

Event source input files

D:\Calin\Proiecte normale\Stagiu 2013\Baze de date\data\events.xml

Add  
Remove

Event Properties to File

- Write Results To File
- Event Id
- Event Title
- Event Description
- Event Coordinates
- Event Start Time
- Event Stop Time
- Event Type

Tweet Properties to File

- Tweet Id
- Tweet Text
- Tweet Coordinates
- Tweet Hashtags
- Tweet Created At

Event Types to Process

- Attractions
- Conference
- Food
- Music
- Performing Arts
- Sales
- Singles Social
- Other

File with Stop Words C:\Users\Calin\Documents\Visual Studio 2010\Projects\WindowsFormsApplication1\W Add

Filename Output Results results\_final2.bt

Save Cancel



# Conclusions

- We have proposed and evaluated a method for discovering popular events based on tweets.
- The results show a positive outcome, validating the proposed solution
  - The precision can be increased by setting a higher threshold for the AC coefficient



# Conclusions

- We have proposed and evaluated a method for discovering popular events based on tweets.
- The results show a positive outcome, validating the proposed solution
  - The precision can be increased by setting a higher threshold for the AC coefficient
- Possible improvements
  - Including geo-location parameters in the AC equation,
  - improving the preprocessing of data (extending the stop-word list or by including NLP techniques)



**Thank you for your attention!  
Questions?**

