

Università Ca' Foscari di Venezia



Corso di Web Intelligence - A.A. 2016-2017

RELAZIONE

SECONDA CONSEGNA WEB INTELLIGENCE

A cura di:

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PREMESSA

I risultati degli algoritmi(FP-Growth e Random Sampling) non sono stati scritti interamente, per la mole dei risultati prodotti.

Gli script sono stati eseguiti sia su file contenenti 10M di Tweets sia su Sample.json entrambi su macchine diverse di cui Notebook personale, Server VPS, Server di dipartimento assegnato, PC di laboratorio e Amazon AWS.

I risultati (frequents itemset e tempi di esecuzione) presi in considerazione sono riguardanti al notebook personale.

PROCESSO PRODUTTIVO

- i. Parsing del file JSon da 30 GB (10M Tweets) su cluster utilizzando SQL Context;
- ii. Semplificazione del file selezionando la colonna "Text", corrispondente al campo tweet: il nuovo file ha dimensione di circa 800MB;
- iii. Ulteriore semplificazione del file attraverso la rimozione delle stopwords inglesi, e la pulizia di altri caratteri come per esempio i trattini, i punti sostituiti da uno spazio. Il file finale da analizzare ha dimensione attorno ai 520MB;
- iv. Applicazione dell'algoritmo FPGrowth sul file di testo finale contenente i tweets;
- v. Applicazione dell'algoritmo "Random Sampling" sul file finale;

I seguenti risultati sono stati ottenuti impostando:

supporto = 0.1 per Random Sampling

supporto = 0.25 per Random Sampling

supporto = 0.01 per FPGrowth

supporto = 0.001 per FPGrowth

OSSERVAZIONE

Eseguendo gli script sulla stessa macchina, si hanno avuti tempi di esecuzione diversi per ogni supporto inserito e per ogni Algoritmo eseguito.

Gli output di FPGrowth sono molto simili all'output di Random Sampling, mentre Random Sampling analizza un campione preso casualmente e quindi non vengono presi in considerazione tutti gli items, ma solo quelli all'interno del campione e FPGrowth prende i valori del FP-Tree al di sopra del supporto prestabilito, questo spiega la leggera diversità tra gli esiti di un algoritmo e l'altro. Mentre come tempi di esecuzione FPGrowth è più efficiente in esecuzione e per avere più risultati occorre impostare valori di supporto molto più bassi rispetto al Random Sampling.


OUTPUT DELL'ALGORITMO “RandomSampling.py” e “fpgrowth.py”

Random Sampling Algorithm, supporto 0.1


Tempo di esecuzione: circa 33 min


Tempo di esecuzione: 1993.18 sec


FREQUENT ITEMSETS =====> OCCORRENZE


 =====> 24


8 =====> 8


 =====> 35


 =====> 7


 =====> 25


 =====> 13

 =====> 9


 =====> 9


 =====> 9

 =====> 13


 =====> 9


: =====> 24


 =====> 8


 =====> 36


/ =====> 23

 =====> 34


 =====> 34


 =====> 47

 =====> 45

 =====> 20

♥ =====> 21

 =====> 60

 =====> 7

♥ =====> 15

 =====> 7

♡ =====> 11
 👑 =====> 15
 💙 =====> 9
 2 =====> 44
 🥰 =====> 11
 4 =====> 27
 ◀ =====> 12
 ▶ =====> 12
 5 =====> 21
 👍 =====> 7
 è =====> 16
 😞 =====> 11
 ✌ =====> 14
 1 =====> 23
 3 =====> 28
 6 =====> 10
 🤔 =====> 8
 ('world', '🌍') =====> 35
 ('happy', 'yourself!') =====> 25
 ('today', 'wind') =====> 18
 ('life', 'queen') =====> 9
 (':)', 'life') =====> 9
 ('song!', 'year,') =====> 25
 :(=====> 9
 ('2015', 'vote') =====> 28
 ('@madisonellebeer', 'follow') =====> 13
 ('http://t.co/1domayesip', 'shop') =====> 14
 😂😂 =====> 27
 ('0.0', 'mph') =====> 7
 ('http://t.co/8tttpr3ag', '👉 abraham') =====> 18
 tv =====> 9
 ('hpa,', 'rain') =====> 9
 ('follow', '◀') =====> 13
 ur =====> 22
 ('idol', 'killing') =====> 19
 si =====> 10
 ('(@alejandradextre)', 'pls') =====> 8
 ('#jobs', '#nursing') =====> 7
 ('know,', 'miles') =====> 13
 ('#viña2015', 'mateo') =====> 18
 ('mateo', '👉 abraham') =====> 18
 ('knowing?', 'me?') =====> 13
 ('hpa,', 'temperature') =====> 7
 ('follow', 'u.')

('idol', 'me♥') =====> 9
('barometer', 'hpa,') =====> 7
('in.', 'today') =====> 7
('#viña2015', '👉abraham') =====> 18
(@ =====> 17
('in.', 'mph') =====> 7
('harassed', 'relentlessly') =====> 8
('#retail', '#tweetmyjobs') =====> 8
('ignore', '👧') =====> 35
('humbly', 'stealing') =====> 19
('jabong,12.5%on', 'myntra.') =====> 14
('babe', 'follow') =====> 8
('(la', 'estar') =====> 18
('#viña2015', 'girls') =====> 18
('good', 'night') =====> 9
('flipkart,12%on', 'upto15%on') =====> 14
('dream?😍', 'mad') =====> 8
('!!', 'feeling:') =====> 14
('#job', '#nursing') =====> 9
('america', 'latin') =====> 8
('@madisonellebeer', 'idol') =====> 9
('**pic', 'heavy**') =====> 12
('dreams,', 'yourself!') =====> 25
('10', 'words') =====> 14
('killing', 'notice') =====> 19
('#jobs', 'manager') =====> 7
('cashback', 'myntra.') =====> 14
('@feriafitur', 'vote') =====> 28
('photo', 'posted') =====> 7
('girls', '👉abraham') =====> 18
('away?', 'knowing?') =====> 13
('mph', 'temperature') =====> 11
('away?', 'me?') =====> 13
('love', 'queen') =====> 9
('@justinbieber', 'know,') =====> 13
('#job', 'manager') =====> 7
('retweet', 'travelblogger') =====> 28
('follow', 'year,') =====> 29
('#3', '#getgarytonoonoswedding') =====> 8
('know,', 'love') =====> 13
('(la', 'mateo') =====> 18
('batman,', 'saved') =====> 13
('birthday', 'happy') =====> 36
('dreams,', 'follow') =====> 25
('http://t.co/8tttpr3ag', 'mateo') =====> 18
('review', 'vendor') =====> 12
('(la):', 'mateo') =====> 18
('idol', 'queen') =====> 9

(:)', 'queen') =====> 9
 ('me?', 'miles') =====> 13
 ('song!', 'yourself!') =====> 25
 ('support', 'year,') =====> 25
 ('away?', 'know,') =====> 13
 😍😍 =====> 8
 ('flipkart,12%on', 'snapdeal.') =====> 14
 ('#getgarytonoonoswedding', 'days') =====> 8
 ('@real_liam_payne', 'stealing') =====> 19
 ('indian', 'vendor') =====> 12
 ('@justinbieber', 'knowing?') =====> 13
 la =====> 40
 ('#viña2015', '(la') =====> 18
 ('love', 'words') =====> 14
 ('en', 'http://t.co/8tttpri3ag') =====> 18
 ('!!', 'hunter".') =====> 14
 ('dreams,', 'support') =====> 25
 ('girls', 'http://t.co/8tttpri3ag') =====> 18
 ('mm.', 'today') =====> 10
 ('10', 'letters') =====> 14
 ('know,', 'u.') =====> 13
 ('miles', '♥♥♥♥how') =====> 13
 (":('(', 'follow') =====> 8
 ("2', 'words') =====> 14
 ('love', 'me♥') =====> 9
 rn =====> 16
 ('@feriafitur', 'nelsoncarvalho') =====> 28
 ('mm.', 'temperature') =====> 9
 ('en', 'la):') =====> 18
 yo =====> 11
 ('realize', 'dream?😍') =====> 8
 (:)', 'follow') =====> 9
 ('away?', 'follow') =====> 13
 ('https://t.co/1bds2lfusd', 'support') =====> 25
 ('me♥', 'queen') =====> 9
 ('killing', 'stealing') =====> 19
 ('mm.', 'wind') =====> 10
 ('#jobs', 'alert:') =====> 7
 ('travelblogger', 'vote') =====> 28
 ('away?', 'miles') =====> 13
 ('happy', 'make') =====> 8
 ('love', 'people') =====> 10
 ('@madisonellebeer', 'queen') =====> 9
 ('la', 'merese') =====> 18
 ('@feriafitur', 'world') =====> 28
 ('@justinbieber', 'person') =====> 13
 ('follow', 'yourself!') =====> 25
 ("2', 'love') =====> 14
 ('@justinbieber', 'miles') =====> 13

('rain', 'temperature') =====> 17
 ('**pic', 'indian') =====> 12
 ('nelsoncarvalho', 'travelblogger') =====> 28
 ('#viña2015', 'en') =====> 18
 ('song!', 'support') =====> 25
 ('#jobs', 'health') =====> 7
 ('flat', 'jabong,12.5%on') =====> 14
 ('@justinbieber', '♥♥♥♥how') =====> 13
 ('barometer', 'today') =====> 17
 ('nelsoncarvalho', 'retweet') =====> 28
 ('harassed', 'make') =====> 8
 ('10', 'love') =====> 15
 ('temperature', 'today') =====> 17
 ('#gaanaapp', '@gaana') =====> 11
 ('@real_liam_payne', 'humbly') =====> 19
 ('fantastically', 'hope') =====> 8
 ('good', 'morning') =====> 12
 ('follow', 'knowing?') =====> 13
 ('@justinbieber', '♡') =====> 8
 ('email', 'remyexporter@gmail.com') =====> 12
 ('2015', 'fitur') =====> 28
 .. =====> 15
 ('https://t.co/1bds2lfusd', 'year,') =====> 25
 ('@feriafitur', 'fitur') =====> 28
 ('happy', 'hope') =====> 7
 ('@real_liam_payne', 'killing') =====> 19
 ('@matthunter123', 'feeling:') =====> 14
 ('love', 'smile') =====> 8
 ('falling', 'rain') =====> 7
 ('humbly', 'killing') =====> 19
 ('in.', 'rain') =====> 7
 ('2015', 'nelsoncarvalho') =====> 28
 ('relentlessly', 'tweeted') =====> 8
 ('love', '♡') =====> 8
 ('@matthunter123', 'letters') =====> 14
 ('know,', 'knowing?') =====> 13
 ('love', 'you.') =====> 8
 🙏 =====> 14
 ('#getgarytonoonoswedding', 'relentlessly') =====> 8
 ('know,', 'person') =====> 13
 ('feeling:', 'love') =====> 14
 ('notice', 'ta') =====> 19
 ('merese', '👉abraham') =====> 18
 ('#getgarytonoonoswedding', 'harassed') =====> 8
 se =====> 10
 ('#job', 'alert:') =====> 10
 "2 =====> 13
 ('@justinbieber', 'follow') =====> 28

('flat', 'myntra.') =====> 14
('know', '♥♥♥♥how') =====> 13
('en', '👉abraham') =====> 18
('follow', 'song!') =====> 25
('10', 'hunter".') =====> 14
('cashback', 'jabong,12.5%on') =====> 14
('dreams', 'https://t.co/1bds2lfusd') =====> 25
🌿💜 =====> 10
('follow', '♥') =====> 8
#3 =====> 7
('@justinbieber', 'me?') =====> 13
❤️ =====> 22
(':', '@madisonellebeer') =====> 9
('cashback', 'flat') =====> 14
('humbly', 'notice') =====> 19
('otrat', 'screams') =====> 8
('follow', 'https://t.co/1bds2lfusd') =====> 25
('feeling:', 'hunter".') =====> 14
('superhuman', '👉') =====> 13
('@garybarlow', 'days') =====> 8
('@matthunter123', 'hunter".') =====> 14
('hpa,', 'today') =====> 7
:) =====> 46
(":'(", 'love') =====> 8
('#3', 'relentlessly') =====> 8
em =====> 10
('letters', 'matt') =====> 14
('follow', 'important') =====> 14
('brazil', '😊') =====> 8
('follow', 'support') =====> 25
('harassed', 'tweeted') =====> 8
('cashback', 'of10.5%on') =====> 14
('@garybarlow', 'harassed') =====> 8
('princess', '👑') =====> 15

Random Sampling Algorithm, supporto 0.25

Tempo di esecuzione: 231 sec
Tempo di esecuzione: circa 4 min

FREQUENT ITEMSETS =====> OCCORRENZE

1 =====> 23

😭 =====> 47

/ =====> 23

2 =====> 44

😬 =====> 20

: =====> 24

🙏 =====> 45

4 =====> 27

3 =====> 28

💜 =====> 36

5 =====> 21

💪 =====> 24

😭 =====> 60

😍 =====> 25

👩 =====> 35

♥ =====> 21

🌍 =====> 34

è =====> 16

👧 =====> 34

('follow', '😭') =====> 35

('@real_liam_payne', 'killing') =====> 19

('follow', 'happy') =====> 26

('la', 'la:') =====> 18

('support', 'yourself!') =====> 25

('nelsoncarvalho', 'world') =====> 28

('humidity', 'today') =====> 17

('idol', 'notice') =====> 19

('@real_liam_payne', 'notice') =====> 19

('#viña2015', 'girls') =====> 18

('fitur', 'world') =====> 28

('#job', '#jobs') =====> 30

😭😭 =====> 27

('dreams,', 'year,') =====> 25

('en', 'merese') =====> 18

('vote', 'world') =====> 28

('fitur', 'retweet') =====> 28

('@real_liam_payne', 'idol') =====> 19

('nelsoncarvalho', 'vote') =====> 28

('@feriafitur', 'retweet') =====> 28

('nelsoncarvalho', 'retweet') =====> 28

('dream', 'realize') =====> 24

('en', 'girls') =====> 18

w/ =====> 17
('travelblogger', 'vote') =====> 28
im =====> 49
('barometer', 'wind') =====> 17
('birthday', 'happy') =====> 36
en =====> 20
('dreams,', 'follow') =====> 25
('girls', 'la') =====> 18
('humidity', 'temperature') =====> 16
('(la', 'http://t.co/8tttpri3ag') =====> 18
('@justinbieber', 'love') =====> 30
('!!', 'love') =====> 16
('(la', 'girls') =====> 18
('happy', 'song!') =====> 25
('humbly', 'notice') =====> 19
('temperature', 'today') =====> 17
('killing', 'ta') =====> 19

('la):', '👉abraham') =====> 18
('estar', 'girls') =====> 18
('idol', 'stealing') =====> 19
('@feriafitur', 'nelsoncarvalho') =====> 28
('https://t.co/1bds2lfusd', 'yourself!') =====> 25
('@feriafitur', 'fitur') =====> 28
rt =====> 23
:) =====> 46

('http://t.co/8tttpri3ag', '👉abraham') =====> 18
('follow', 'song!') =====> 25
('(la', 'merese') =====> 18
('http://t.co/8tttpri3ag', 'merese') =====> 18

❤️ =====> 22
('estar', 'http://t.co/8tttpri3ag') =====> 18
('barometer', 'humidity') =====> 17
('happy', 'support') =====> 26
('@justinbieber', 'follow') =====> 28
('#viña2015', 'merese') =====> 18
('notice', 'stealing') =====> 19
('2015', 'world') =====> 28
('#viña2015', '(la') =====> 18
('en', '👉abraham') =====> 18
('fitur', 'nelsoncarvalho') =====> 28
('ignore', '👩') =====> 35
('en', 'la') =====> 18
('en', 'mateo') =====> 18
('en', 'estar') =====> 18
('#viña2015', 'http://t.co/8tttpri3ag') =====> 18
('#viña2015', 'la') =====> 18
('travelblogger', 'world') =====> 28
('humidity', 'wind') =====> 18
('la):', 'merese') =====> 18
('killing', 'notice') =====> 19
('follow', 'yourself!') =====> 25
('support', 'year,') =====> 25

('happy', 'year,') =====> 25
('rain', 'wind') =====> 19
('barometer', 'today') =====> 17
('2015', 'vote') =====> 28
('http://t.co/8tttpr3ag', 'la:') =====> 18
('estar', 'mateo') =====> 18
('la', 'mateo') =====> 18
('barometer', 'rain') =====> 16
di =====> 27
('@real_liam_payne', 'stealing') =====> 19
rn =====> 16
('follow', 'love') =====> 53
('world', 🌍) =====> 35
('#viña2015', 'mateo') =====> 18
('#viña2015', '👉abraham') =====> 18
('la', 'la') =====> 18
('estar', '👉abraham') =====> 18
('#viña2015', 'en') =====> 18
('fitur', 'travelblogger') =====> 28
('dreams,', 'song!') =====> 25
('la', '👉abraham') =====> 18
('estar', 'merese') =====> 18
('girls', '👉abraham') =====> 18
('rain', 'today') =====> 19
('http://t.co/8tttpr3ag', 'la') =====> 18
(@ =====> 17
('girls', 'merese') =====> 18
('happy', 'yourself!') =====> 25
('#viña2015', 'estar') =====> 18
('stealing', 'ta') =====> 19
ur =====> 22
('humidity', 'rain') =====> 17
('humbly', 'idol') =====> 19
ya =====> 16
('song!', 'support') =====> 25
('killing', 'stealing') =====> 19
('nelsoncarvalho', 'travelblogger') =====> 28
('retweet', 'world') =====> 28
('idol', 'ta') =====> 19
('follow', 'year,') =====> 29
('today', 'wind') =====> 18
('@madisonellebeer', 'quote') =====> 17
('ilysfm', '💜') =====> 35
('la:', 'mateo') =====> 18
('2015', '@feriafitur') =====> 28
ta =====> 21
('la', 'merese') =====> 18
('humbly', 'stealing') =====> 19
('@real_liam_payne', 'humbly') =====> 19
('2015', 'nelsoncarvalho') =====> 28
('@feriafitur', 'world') =====> 28
('dreams,', 'happy') =====> 25

```

ma =====> 16
('2015', 'fitur') =====> 28
('idol', 'killing') =====> 19
('https://t.co/1bds2lfusd', 'song!') =====> 25
('retweet', 'travelblogger') =====> 28
('happy', 'https://t.co/1bds2lfusd') =====> 25
('follow', 'https://t.co/1bds2lfusd') =====> 25
('barometer', 'temperature') =====> 16
('en', 'http://t.co/8tttpri3ag') =====> 18
('@feriafitur', 'vote') =====> 28
('2015', 'retweet') =====> 28
!! =====> 33
('fitur', 'vote') =====> 28
('https://t.co/1bds2lfusd', 'year,') =====> 25
('@feriafitur', 'travelblogger') =====> 28
('dreams,', 'https://t.co/1bds2lfusd') =====> 25
('humbly', 'killing') =====> 19
('@real_liam_payne', 'ta') =====> 19
('year,', 'yourself!') =====> 25
la =====> 40
('2015', 'travelblogger') =====> 28
('en', 'la:') =====> 18
('girls', 'http://t.co/8tttpri3ag') =====> 18
('girls', 'mateo') =====> 18
('follow', 'support') =====> 25
('dreams,', 'support') =====> 25
('estar', 'la:') =====> 18
('rain', 'temperature') =====> 17
('song!', 'year,') =====> 25
('notice', 'ta') =====> 19
('#jobs', '#tweetmyjobs') =====> 28
('follow', 'me?') =====> 59
('song!', 'yourself!') =====> 25
('girls', 'la:') =====> 18
('merese', '👉abraham') =====> 18
('http://t.co/8tttpri3ag', 'mateo') =====> 18
('https://t.co/1bds2lfusd', 'support') =====> 25
('la', 'estar') =====> 18
('#viña2015', 'la:') =====> 18
('dreams,', 'yourself!') =====> 25
('la', '👉abraham') =====> 18
('#job', '#tweetmyjobs') =====> 21
('me?', '😭') =====> 35
('mateo', '👉abraham') =====> 18
('temperature', 'wind') =====> 17
('humbly', 'ta') =====> 19
('estar', 'la') =====> 18
('mateo', 'merese') =====> 18
('retweet', 'vote') =====> 28
('la', 'la:') =====> 18
10 =====> 32
('la', 'en') =====> 18
('love', 'me?') =====> 18

```

('la', 'mateo') =====> 18
 ('@feriafitur', 'retweet', 'vote') =====> 28
 ('2015', 'retweet', 'travelblogger') =====> 28
 ('girls', 'merese', '👉abraham') =====> 18
 ('follow', 'https://t.co/1bds2lfusd', 'year,') =====> 25
 ('2015', 'retweet', 'world') =====> 28
 ('@feriafitur', 'fitur', 'retweet') =====> 28
 ('http://t.co/8tttpri3ag', 'la', '👉abraham') =====> 18
 ('humbly', 'idol', 'notice') =====> 19
 ('http://t.co/8tttpri3ag', 'la', 'mateo') =====> 18
 ('en', 'mateo', 'merese') =====> 18
 ('@real_liam_payne', 'humbly', 'stealing') =====> 19
 ('girls', 'la:', 'merese') =====> 18
 ('fitur', 'travelblogger', 'world') =====> 28
 ('@feriafitur', 'fitur', 'nelsoncarvalho') =====> 28
 ('temperature', 'today', 'wind') =====> 17
 ('dreams,', 'follow', 'support') =====> 25
 ('(la', 'mateo', 'merese') =====> 18
 ('(la', 'http://t.co/8tttpri3ag', 'la:~') =====> 18
 ('retweet', 'travelblogger', 'world') =====> 28
 ('en', 'estar', 'merese') =====> 18
 ('https://t.co/1bds2lfusd', 'song!', 'yourself!') =====> 25
 ('@real_liam_payne', 'humbly', 'notice') =====> 19
 ('fitur', 'vote', 'world') =====> 28
 ('@feriafitur', 'nelsoncarvalho', 'travelblogger') =====> 28
 ('2015', 'fitur', 'travelblogger') =====> 28
 ('(la', 'http://t.co/8tttpri3ag', 'la') =====> 18
 😂😂😂 =====> 16
 ('(la', 'en', 'http://t.co/8tttpri3ag') =====> 18
 ('2015', 'fitur', 'vote') =====> 28
 ('dreams,', 'https://t.co/1bds2lfusd', 'year,') =====> 25
 ('(la', 'en', 'la:~') =====> 18
 ('follow', 'happy', 'year,') =====> 25
 ('la', 'la:~', 'merese') =====> 18
 ('http://t.co/8tttpri3ag', 'la', 'la:~') =====> 18
 ('#viña2015', 'estar', 'mateo') =====> 18
 ('#viña2015', '(la', 'en') =====> 18
 ('en', 'la:~', 'merese') =====> 18
 ('(la', 'en', 'mateo') =====> 18
 ('#viña2015', 'la', 'mateo') =====> 18
 ('#viña2015', 'mateo', 'merese') =====> 18
 ('girls', 'http://t.co/8tttpri3ag', 'mateo') =====> 18
 ('(la', 'girls', 'la') =====> 18
 ('(la', 'girls', 'mateo') =====> 18
 ('killing', 'notice', 'ta') =====> 19
 ('en', 'estar', 'girls') =====> 18
 ('dreams,', 'happy', 'support') =====> 25

FPGrowth Algorithm, supporto 0.01

Tempo di esecuzione: 0:00:03.452330 sec

```
FreqItemset(items=[u'@madisonellebeer'], freq=190)
FreqItemset(items=[u'@madisonellebeer', u''], freq=190)
FreqItemset(items=[u'people'], freq=161)
FreqItemset(items=[u'people', u''], freq=161)
FreqItemset(items=[u'me?'], freq=124)
FreqItemset(items=[u'me?', u''], freq=124)
FreqItemset(items=[u''], freq=12184)
FreqItemset(items=[u'today'], freq=153)
FreqItemset(items=[u'today', u''], freq=153)
FreqItemset(items=[u'love'], freq=507)
FreqItemset(items=[u'love', u''], freq=507)
FreqItemset(items=[u'lol'], freq=176)
FreqItemset(items=[u'lol', u''], freq=176)
FreqItemset(items=[u'follow'], freq=465)
FreqItemset(items=[u'follow', u''], freq=465)
FreqItemset(items=[u'world'], freq=175)
FreqItemset(items=[u'world', u''], freq=175)
FreqItemset(items=[u'time'], freq=146)
FreqItemset(items=[u'time', u''], freq=146)
FreqItemset(items=[u'make'], freq=170)
FreqItemset(items=[u'make', u''], freq=170)
FreqItemset(items=[u'back'], freq=146)
FreqItemset(items=[u'back', u''], freq=146)
FreqItemset(items=[u'happy'], freq=217)
FreqItemset(items=[u'happy', u''], freq=217)
FreqItemset(items=[u'birthday'], freq=127)
FreqItemset(items=[u'birthday', u''], freq=127)
FreqItemset(items=[u'good'], freq=215)
FreqItemset(items=[u'good', u''], freq=215)
FreqItemset(items=[u'day'], freq=163)
FreqItemset(items=[u'day', u''], freq=163)
```

FPGrowth Algorithm, supporto 0.001

Tempo di esecuzione: 0:00:03.523217 sec

Duration: 0:00:03.523217

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FreqItemset(items=[u'0.0'], freq=14)
FreqItemset(items=[u'0.0', u''], freq=14)
FreqItemset(items=[u'send'], freq=29)
FreqItemset(items=[u'send', u''], freq=29)
FreqItemset(items=[u'lot'], freq=34)
FreqItemset(items=[u'lot', u''], freq=34)
FreqItemset(items=[u'save'], freq=15)
FreqItemset(items=[u'save', u''], freq=15)
FreqItemset(items=[u'hey'], freq=25)
FreqItemset(items=[u'hey', u''], freq=25)
FreqItemset(items=[u'ready'], freq=43)
FreqItemset(items=[u'ready', u''], freq=43)
FreqItemset(items=[u'body'], freq=16)
FreqItemset(items=[u'body', u''], freq=16)
FreqItemset(items=[u'da'], freq=18)
FreqItemset(items=[u'da', u''], freq=18)
FreqItemset(items=[u'show'], freq=47)
FreqItemset(items=[u'show', u''], freq=47)
FreqItemset(items=[u'paris'], freq=17)
FreqItemset(items=[u'paris', u''], freq=17)
FreqItemset(items=[u'waking'], freq=15)
FreqItemset(items=[u'waking', u''], freq=15)
FreqItemset(items=[u'part'], freq=31)
FreqItemset(items=[u'part', u''], freq=31)
FreqItemset(items=[u'nice'], freq=67)
FreqItemset(items=[u'nice', u''], freq=67)
FreqItemset(items=[u'college'], freq=18)
FreqItemset(items=[u'college', u''], freq=18)
FreqItemset(items=[u'talk'], freq=37)
FreqItemset(items=[u'talk', u''], freq=37)
FreqItemset(items=[u'app'], freq=20)
FreqItemset(items=[u'app', u''], freq=20)
FreqItemset(items=[u'giving'], freq=13)
FreqItemset(items=[u'giving', u''], freq=13)
FreqItemset(items=[u'#jobs'], freq=83)
FreqItemset(items=[u'#jobs', u''], freq=83)
FreqItemset(items=[u'\U0001f60f'], freq=18)
FreqItemset(items=[u'\U0001f60f', u''], freq=18)
FreqItemset(items=[u'\u2764\ufe0f'], freq=40)
FreqItemset(items=[u'\u2764\ufe0f', u'love'], freq=21)
FreqItemset(items=[u'\u2764\ufe0f', u'love', u''], freq=21)
FreqItemset(items=[u'\u2764\ufe0f', u''], freq=40)
FreqItemset(items=[u'understand'], freq=21)
FreqItemset(items=[u'understand', u''], freq=21)
FreqItemset(items=[u'https://t.co/1bds2lfusd'], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year'], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support'], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u'follow'], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u'follow', u''], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u'happy'], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u'happy', u'follow'], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u'happy', u'follow', u''], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u'happy', u''], freq=52)
FreqItemset(items=[u'https://t.co/1bds2lfusd', u'year', u'support', u''], freq=52)
```

[illegible]

FreqItemset(items=[u'posted', u'photo'], freq=14)
FreqItemset(items=[u'posted', u'photo', u''], freq=14)
FreqItemset(items=[u'posted', u''], freq=20)
FreqItemset(items=[u'ride'], freq=13)
FreqItemset(items=[u'ride', u''], freq=13)
FreqItemset(items=[u'jabong,12.5%on'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'myntra.'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'myntra.', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'myntra.', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'myntra.', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u'myntra.'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u'myntra.', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u'myntra.', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u'myntra.', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'cashback', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'myntra.'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'myntra.', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'myntra.', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'myntra.', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u'myntra.'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u'myntra.', u'flat'], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u'myntra.', u'flat', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u'myntra.', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u'cashback', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u'of10.5%on', u''], freq=22)
FreqItemset(items=[u'jabong,12.5%on', u''], freq=22)
FreqItemset(items=[u'2015'], freq=94)
FreqItemset(items=[u'2015', u'world'], freq=59)
FreqItemset(items=[u'2015', u'world', u''], freq=59)
FreqItemset(items=[u'2015', u''], freq=94)
FreqItemset(items=[u'screams'], freq=14)
FreqItemset(items=[u'screams', u'latin'], freq=13)
FreqItemset(items=[u'screams', u'latin', u'america'], freq=13)
FreqItemset(items=[u'screams', u'latin', u'america', u''], freq=13)
FreqItemset(items=[u'screams', u'latin', u''], freq=13)
FreqItemset(items=[u'screams', u'america'], freq=13)
FreqItemset(items=[u'screams', u'america', u''], freq=13)
FreqItemset(items=[u'screams', u''], freq=14)
FreqItemset(items=[u'head'], freq=26)
FreqItemset(items=[u'head', u''], freq=26)
FreqItemset(items=[u'nelsoncarvalho'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'2015'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'2015', u'world'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'2015', u'world', u''], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'2015', u''], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'world'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'world', u''], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'vote'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'vote', u'2015'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'vote', u'2015', u'world'], freq=58)
FreqItemset(items=[u'nelsoncarvalho', u'retweet', u'vote', u'2015', u'world', u''], freq=58)

[illegible]

FreqItemset(items=[u'@madisonellebeer', u''], freq=190)
FreqItemset(items=[u'blue'], freq=15)
FreqItemset(items=[u'blue', u''], freq=15)
FreqItemset(items=[u'text'], freq=24)
FreqItemset(items=[u'text', u''], freq=24)
FreqItemset(items=[u'tickets'], freq=13)
FreqItemset(items=[u'tickets', u''], freq=13)
FreqItemset(items=[u'join'], freq=16)
FreqItemset(items=[u'join', u''], freq=16)
FreqItemset(items=[u'job'], freq=31)