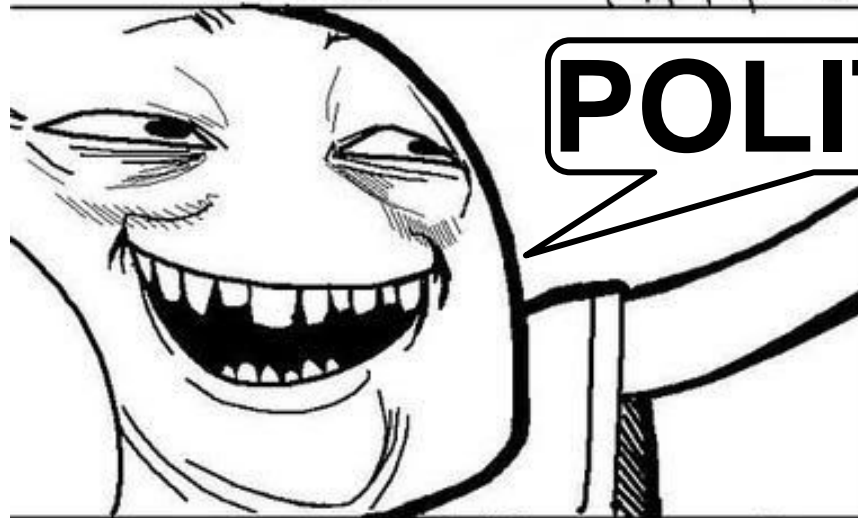
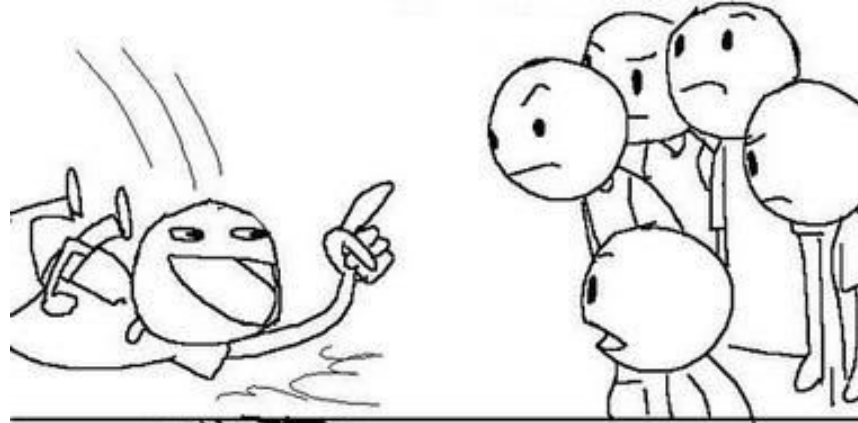


The People Have Spoken

Conflicting Brazilian Protests on Twitter

Cássia de Souza Carvalho, **Fabício Olivetti de França**, Denisa Hideko
Goya, Claudio Luis de Camargo Penteado

Universidade Federal do ABC
NUVEM Research Strategic Unit



Presidential Election Results - 2014



Discussion and Protests revolving the results

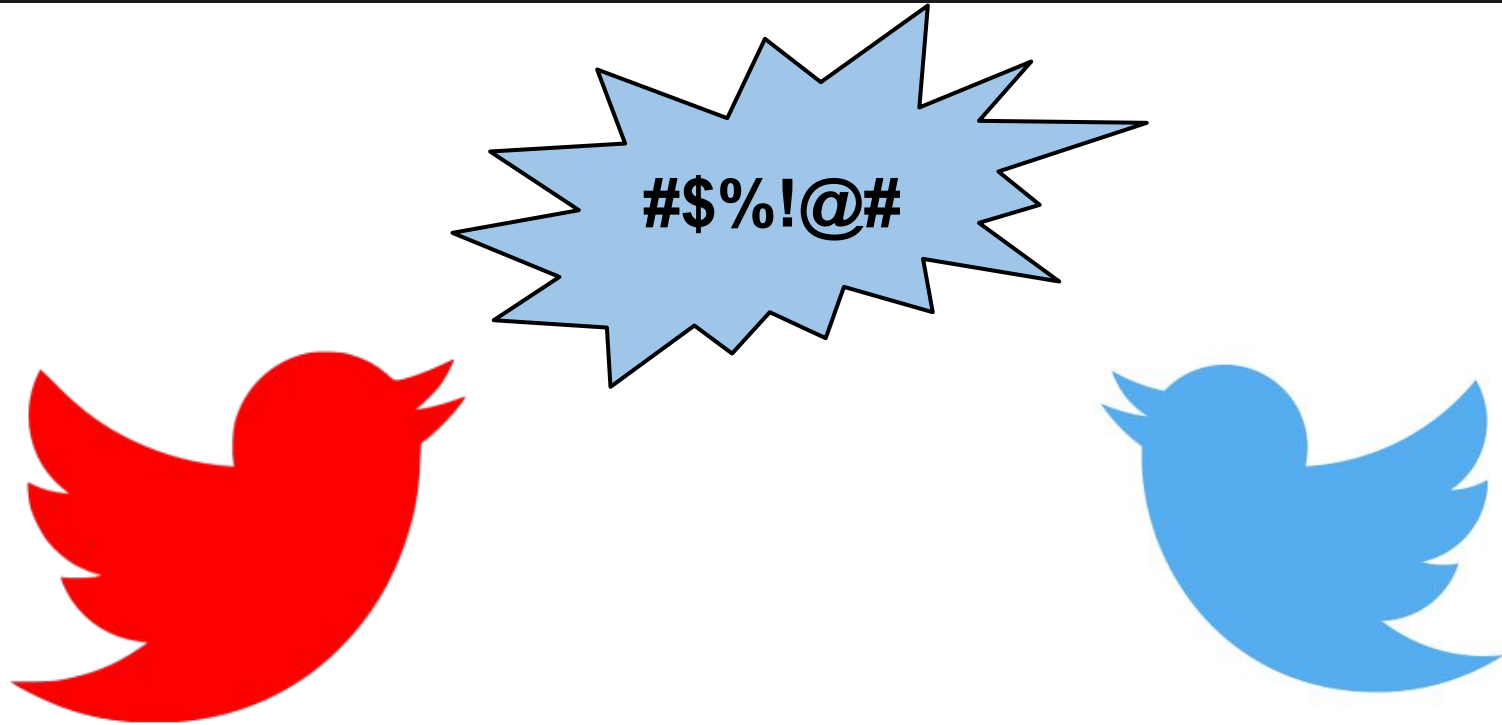


13 March
Pro-govern

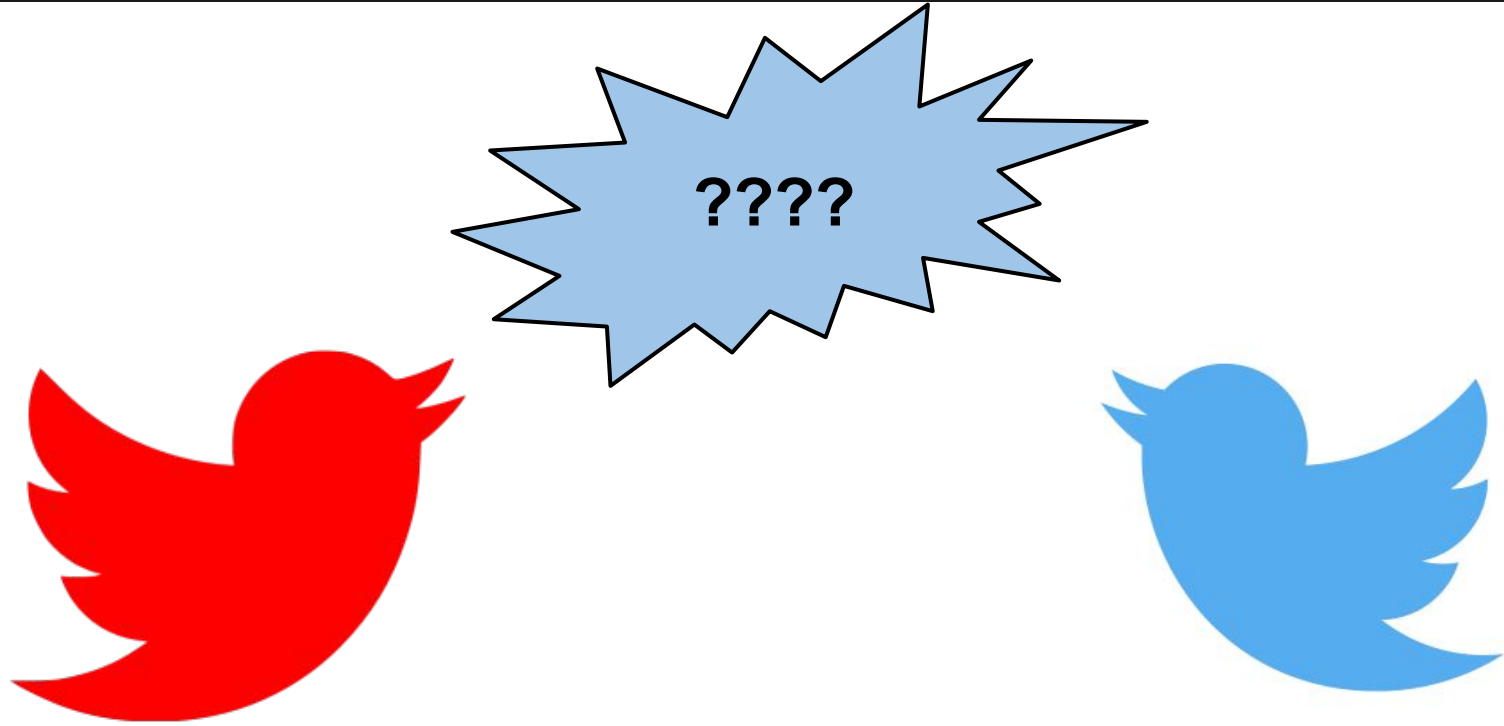


15 March
Con-govern

The protests were also online...

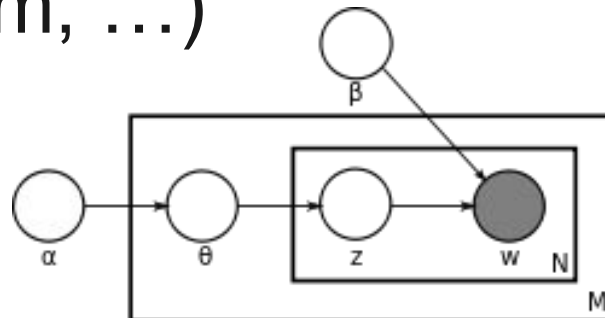


But what did the people say?



Topic Modelling

- Extract the topic of a text document based on a corpus
- Topics are represented as a set of tokens (word, n-gram, ...)



Methodology

1. Collect tweets during the day of protests:

**#13Marco, #PetrobrasEhBrasil13,
#SouPetrobras, #TodosContraOGolpe,
#br45ilnocorrupt, #globogolpista**

**#AcordaBrasil, #DilmaNaoMeRepresenta,
#DilmaVaiada, #ForaDilma, #ForaPT,
#ImpeachmentDilma, #VamosVaiaDilmaNaTV,
#VemPraRua15DeMarco**

#PronunciamentoDaDilma, #protestos

Methodology

2. Apply Topic Modelling Algorithms:

- pLSI
- LDA

Methodology

3. Exploratory Analysis:

- Frequency of Topics
- Hourly activity analysis
- Top Users
- and some others...

Tweet Collection

TABLE II. SUMMARY OF STUDIED DATASETS.

Dataset	# of Tweets	Unique words
PROGOV	84, 821	36, 070
CONGOV	189, 824	60, 684

Topics

PROGOV

- 1 globogolpista (0.293)
- 2 dia13diadeluta (0.246)
- 3 domingoeunaovouporque (0.184)
- 4 dilma (0.171)
- 5 foradilma (0.144)
- 6 povo (0.138)
- 7 vemprarua15demarco (0.138)
- 8 pt (0.136)
- 9 globoquergolpe (0.135)
- 10 vamos (0.129)



CONGOV

- foradilma (0.366)
 - dilma (0.295)
 - vemprarua (0.241)
 - globogolpista (0.224)
 - tchau (0.219)
 - povo (0.218)
 - forapt (0.188)
 - pt (0.181)
 - impeachmentdilma (0.177)
 - menosodiomaismocracia (0.15)
-

Topics

PROGOV

CONGOV

1	globogolpista (0.293)		foradilma (0.366)
2	dia13diadeluta (0.246)		dilma (0.295)
3	domingoeunaovouporque (0.184)		vemprarua (0.241)
4	dilma (0.171)		globogolpista (0.224)
5	foradilma (0.144)		tchau (0.219)
6	povo (0.138)		povo (0.218)
7	vemprarua15demarco (0.138)		forapt (0.188)
8	pt (0.136)		pt (0.181)
9	globoquergolpe (0.135)		impeachmentdilma (0.177)
10	vamos (0.129)		menosodiomaismocracia (0.15)

Topics

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Topics

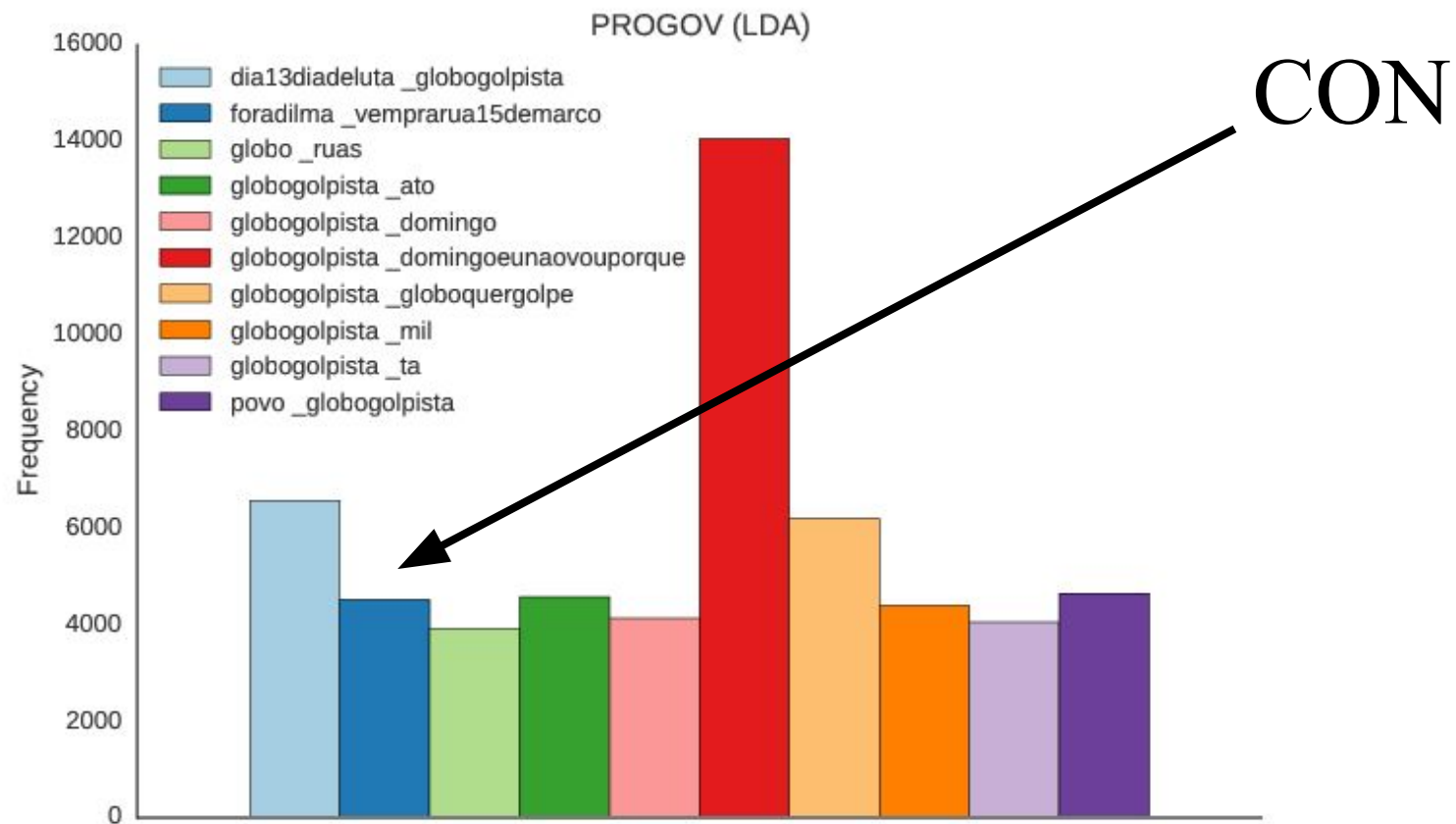
PROGOV

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- 2 dia13diadeluta (0.246)
- 3 domingoeunaovouporque (0.184)
- 4 Dilma (0.171)
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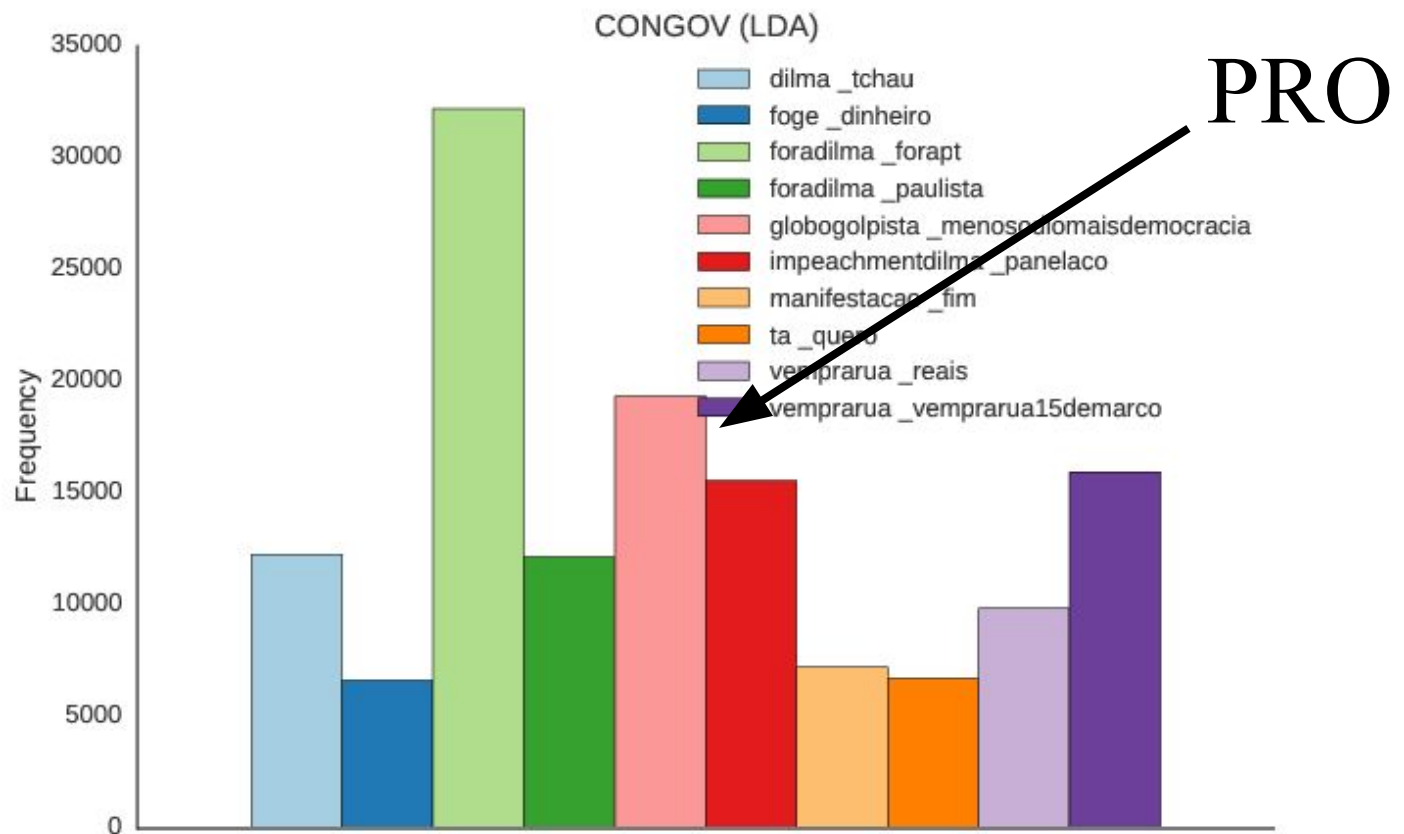
CONGOV

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- dilma (0.295)
- vemprarua (0.241)
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- tchau (0.219)
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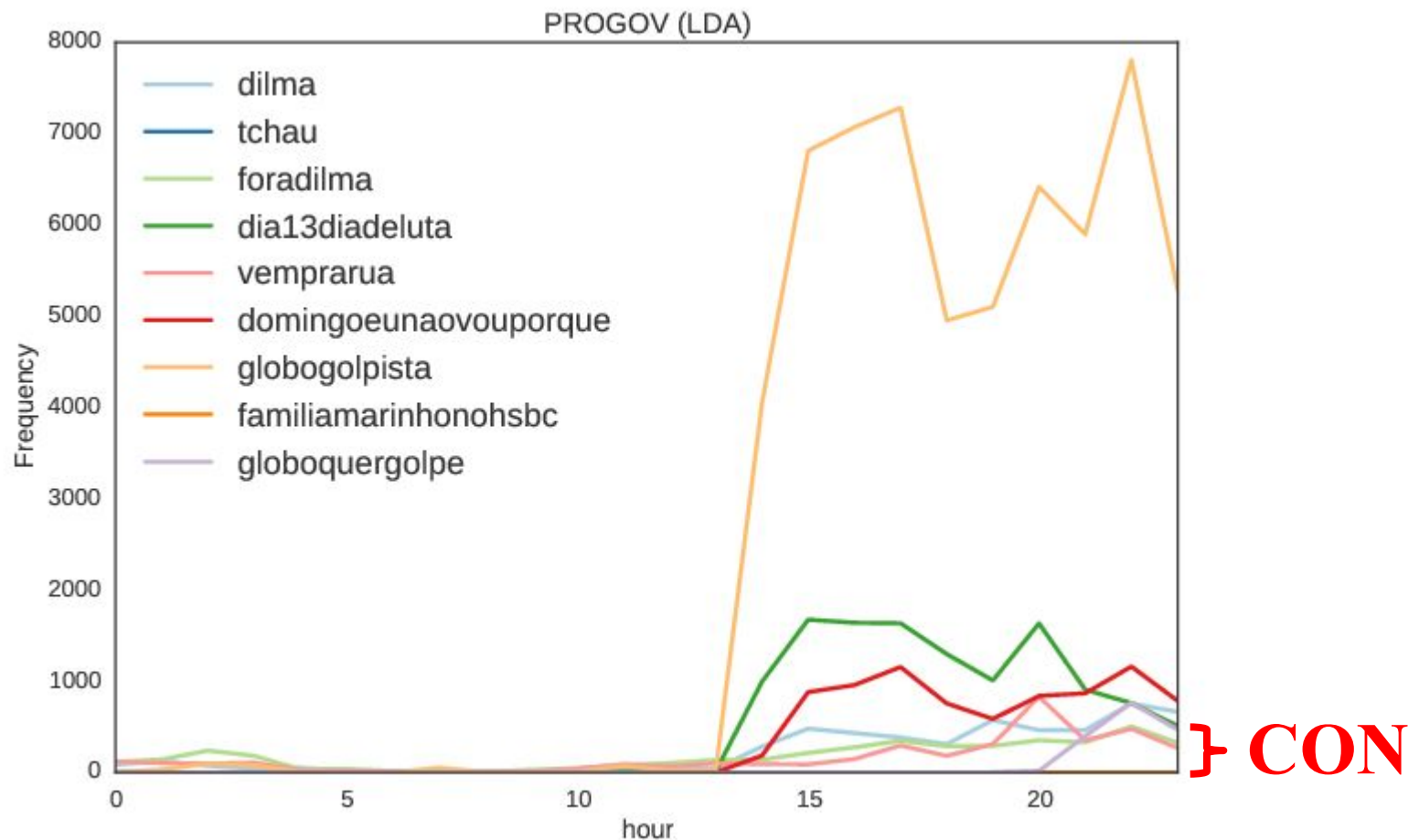
Topic Frequency



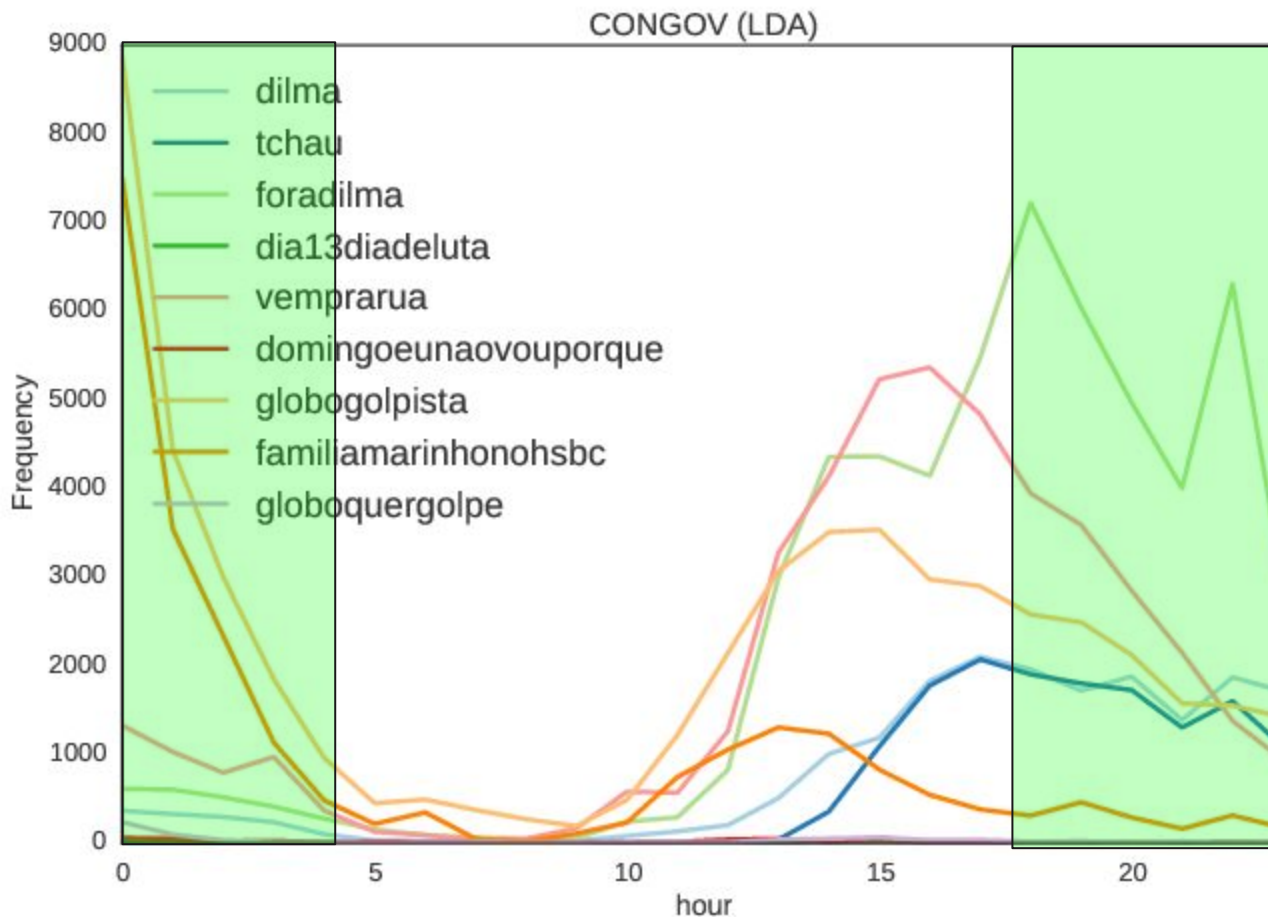
Topic Frequency



Hourly Activity



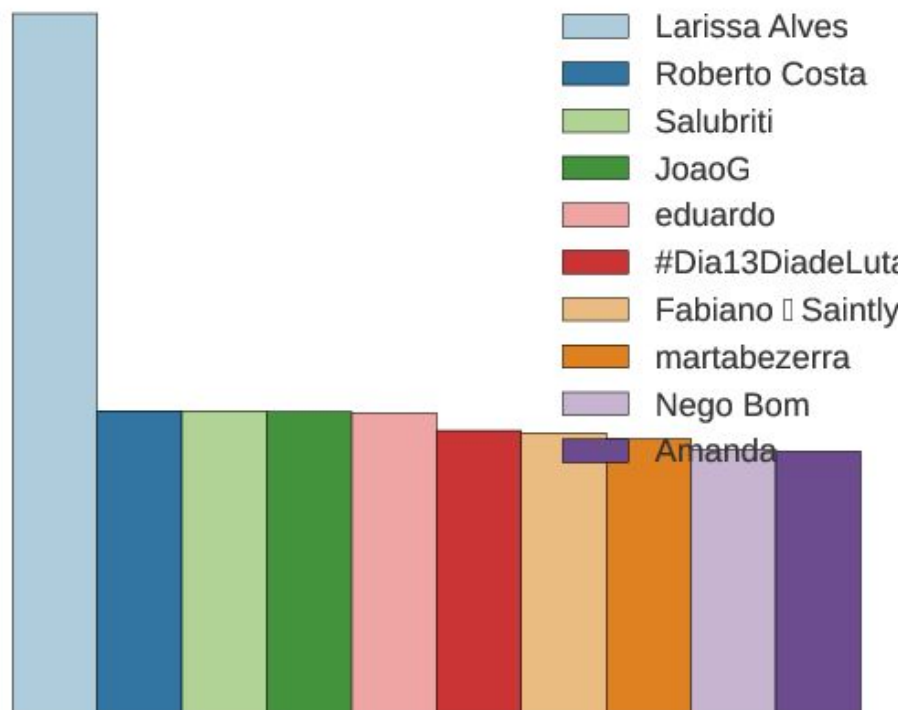
Hourly Activity



PRO

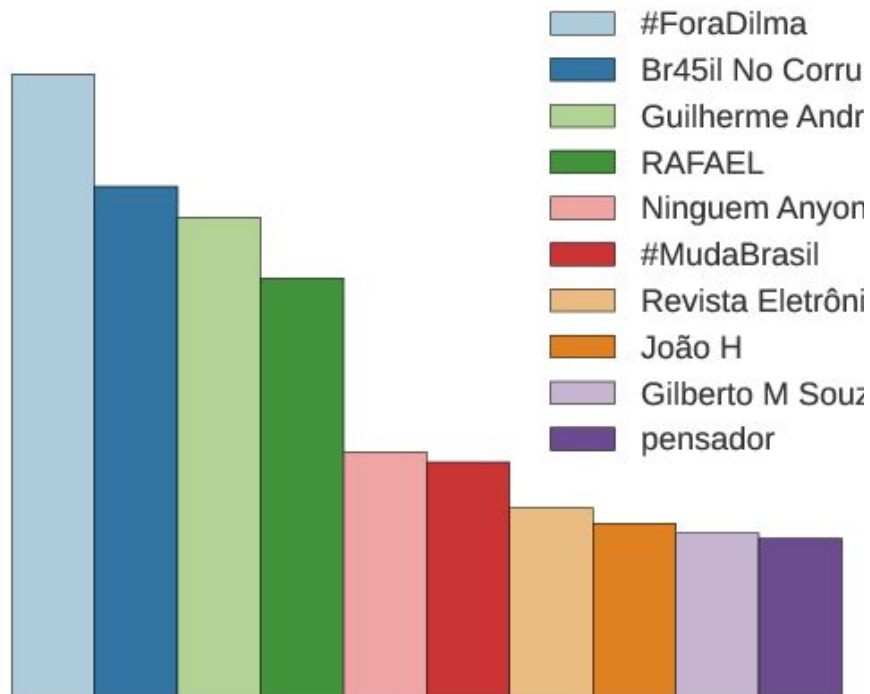
Top Users - PROGOV

PROGOV (Pro)



PRO

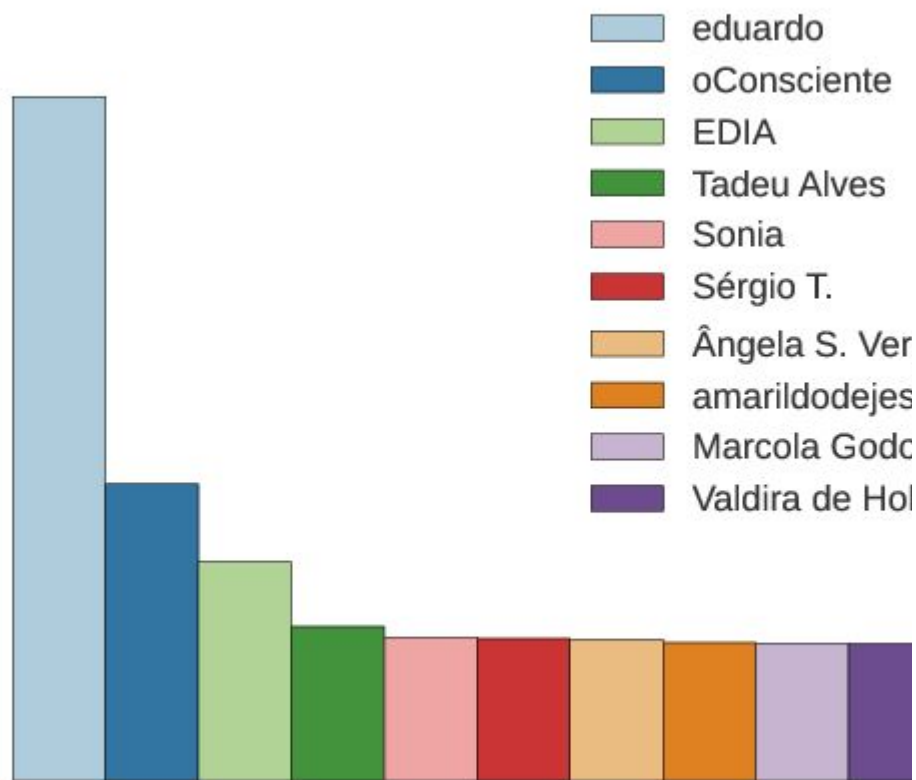
PROGOV (Con)



CON

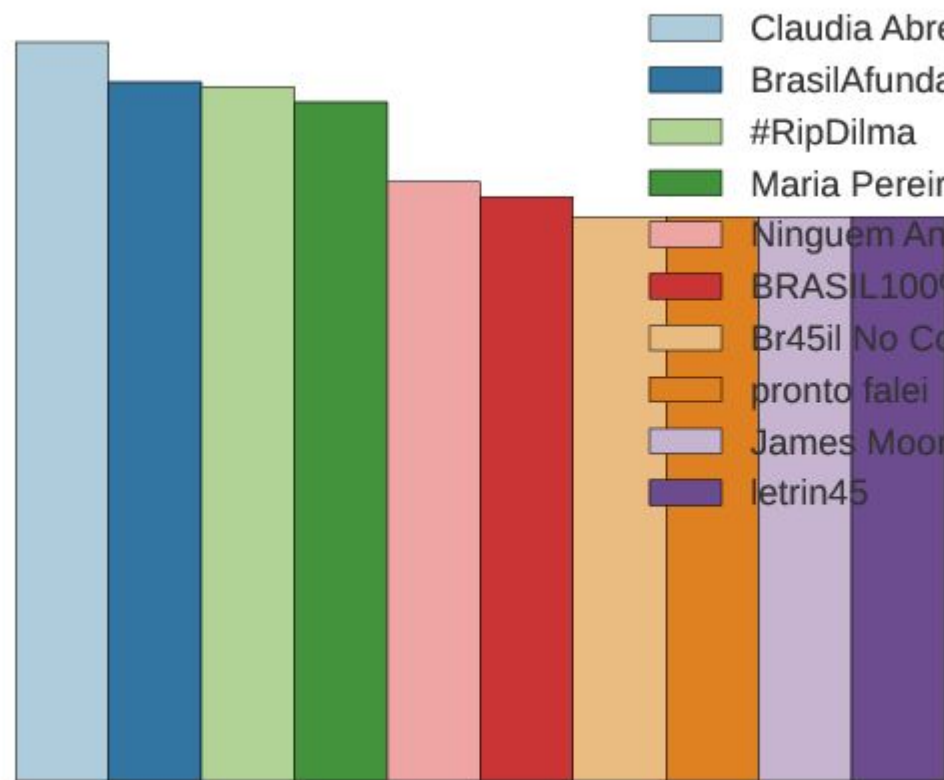
Top Users - CONGOV

CONGOV (Pro)



PRO

CONGOV (Con)



CON

Final Remarks

- The central theme was the winner party (PT) and the will of the people
- The opposing party wants the president to step down
- Motivated by crisis and corruption reports
- The people in favor of the govern was more active and organized...
- ...evidences of involving less of the "real people"

Questions

The data sets and source code are available at:

github.com/folivetti/POLITICS

