Data Mining



## Who are Tweeting in the 2014 Indonesia's Legislative Elections?

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#### Outline

Problem/Intro Approach Experiment & Result Conclusion

#### Need to know little bit about politics

#### **Additional Information**

Party	Number of Seats in the National Assembly	Leader	Comments
<b>Saenuri Party</b> (NFP - New Frontier Party) 새누리당 / 새누리黨 Saenuridang	156	Hwang Woo-yea	Conservative; formerly called the Grand National Party.
New Politics Alliance for Democracy (NPAD) 새정치민주연합/ 새政治民主聯合 Saejeongchi Minju Yeonhap	130	Ahn Cheol-soo Kim Han-gill	Liberal; merged from the Democratic Party and the minor New Political Vision Party.
<mark>Unified Progressive Party</mark> (UPP) 통합진보당 / 統合進步黨 <i>Tonghap Jinbodang</i>	6	lee leona-hee	Progressive; merged from the Democratic Labor Party, People's Participation Party, and a faction of the New Progressive Party.
J <b>ustice Party</b> 정의당 / 正義黨 <i>Jeongeuidang</i>	5	Cheon Ho-sun	Progressive; splintered from the Unified Progressive Party.

Vietnam is a single-party state. This means that only one political party, the Communist Party of Vietnam (Đảng Cộng Sản Việt Nam) is legally allowed to hold effective power.

#### **Additional Information**

Party	Leader	Status
Democratic Party (Indonesia) (Demokrat) Partai Demokrat	Susilo Bambang Yudhoyono	Governing Coalition
Party of the Functional Groups (Golkar) Partai Golongan Karya	Aburizal Bakrie	Governing Coalition
Indonesian Democratic Party – Struggle (PDI-P) Partai Demokrasi Indonesia Perjuangan	Megawati Sukarnoputri	Opposition
National Awakening Party (PKB) Partai Kebangkitan Bangsa	Muhaimin Iskandar	Governing Coalition
United Development Party (PPP) Partai Persatuan Pembangunan	Suryadharma Ali	Governing Coalition
Prosperous Justice Party (PKS) Partai Keadilan Sejahtera	Anis Matta	Governing Coalition
National Mandate Party (PAN) Partai Amanat Nasional	Hatta Rajasa	Governing Coalition
People's Conscience Party (Hanura) Partai Hati Nurani Rakyat	Wiranto	Opposition
Great Indonesia Movement Party (Gerindra) Partai Gerakan Indonesia Raya	Suhardi	Opposition

### **Project Description**

- 1. Indonesia President Election 2014, now still legislative election.
- 2. All of political parties **campaign** and tell about the programs
- 3. The legislative election will held at 9 April 2014
- 4. Time for legislative campaign March 16 April 5 2014
- 5. Two types of campaign :
- Physical campaign
- Media campaign (TV,Newspaper,Banner, Online campaign)





#### **Twitter Campaign**

#### (PKS) Partai Keadilan Sejahtera

(Prosperous Justice Party)

#### #TolakPartaiPoligami (-)

(Became Worldwide trending topic at 9:30 PM - 20 Mar 2014 GMT+7)

#### #SayaPilihPKS (+)

(Became Indonesia trending topic at 8:36 AM - 22 Mar 2014 GMT+7)

#### Problem

# Just to Know, who they are, Who are Tweeting it.

## Approach

- 1. Gathered the dataset from twitter.
- 2. Picking username and then get all features.
- 3. Hand Labeling for ground truth creation.
- 4. Using Naive Bayes for classifier
- 5. Features Evaluation
- 6. Testing to real dataset
- 7. Show the result. (How many campaign and real accounts)

#### **Experiment & Result**

#### **Tweet Distribution**

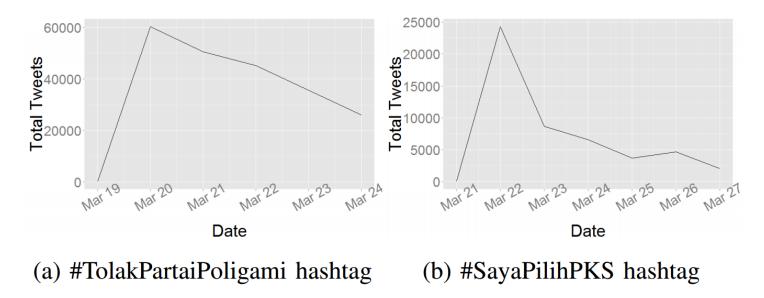


Fig. 1: Tweets distribution

#### > head(tw\_tolak,2)

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orited\":false,\"filter\_level\":\"medium\",\"lang\":\"in\"}"

#### **Picking username from dataset**

Why we need to doing this?

We want to know how many accounts (in total) from the all of tweets.

#### **Total Number of Tweets**

[1] #TolakPartaiPoligami : 222,444 tweets[2] #SayaPilihPKS :48,135 tweets

Dataset I : 7,000 from [1] + 3,000 from [2] Dataset II : All tweets - Dataset I

### **Ground Truth Creation**

From 10,000 tweets (dataset I) are only came from 1,680 twitter accounts, And the result of hand labeling =>

real	campaign	total
1,479	201	1,680

TABLE I: Labeled dataset I overview

#### **Classifier Performance for dataset I**

		Predicted			real	campaign
		real	campaign	precision	0.99	0.92
True	real	1467	12	recall	0.98	0.94
	campaign	15	186	accuracy	0.98	0.98

(a) Confusion Matrix

(b) Classifier Performance

TABLE III: Confusion matrix and classifier performance

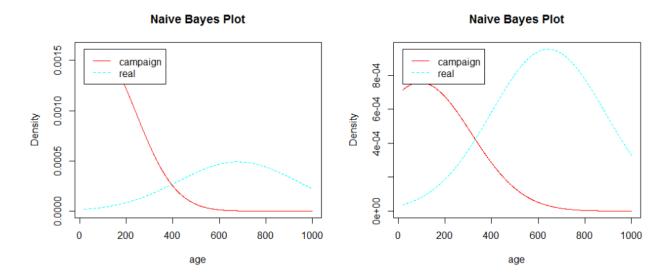
#### **Features Evaluation**

Value	Rank	Value	Rank	Value	Rank
1538.0	age	0.45	age	0.50	age
1433.8	followings	0.41	followings	0.25	mention ratio
1321.3	followers	0.40	num tweets	0.23	num tweets
1238.5	mention ratio	0.38	mention ratio	0.13	API ratio
1214.8	num tweets	0.37	followers	0.12	hashtag ratio
1206.5	hashtag ratio	0.35	hashtag ratio	0.11	tweet rate
1150.8	tweetrate	0.33	tweet rate	0.09	URL ratio
481.7	reputation	0.18	reputation	0.08	followings
84.6	API ratio	0.06	API ratio	0.01	reputation
0	URL ratio	0	URL ratio	0.008	followers

(a) Chi Squared (b) Information Gain (c) ReliefF

TABLE II: Features Evaluation

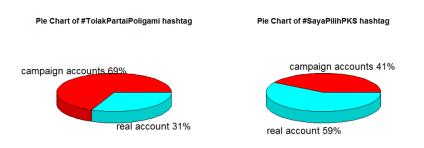
#### **Features Plot**



(a) Age of twitter accounts from(b) Age of twitter accounts from#TolakPartaiPoligami hashtag#SayaPilihPKS hashtag

Fig. 2: One of the features : the age of twitter accounts

#### **Final Result**



(a) #TolakPartaiPoligami hashtag(b) #SayaPilihPKS hashtagFig. 3: Percentage of campaign and real accounts

From dataset II, **#TolakPartaiPoligami** total tweets are 215,444 only came from 9,651 twitter accounts. **#SayaPilihPKS**, total tweets are 45,135 came from 5,639 twitter

accounts.

**#TolakPartaiPoligami** hashtag has been classified to 6,621 (**69%**) campaign accounts and 3,030 (**31%**) real accounts.

**#SayaPilihPKS** hashtag has 2,334 (**41%**) campaign accounts and 3,305 (**59%**) real accounts.

#### Conclusion

In this research we did not consider about the number of retweets.

From the result we know that #TolakPartaiPoligami hashtag has almost 70% campaign accounts, and the second #SayaPilihPKS has more than 40% campaign accounts.

When there are many newspapers or online media were reported that there are many people who hate or love with one of party because many people tweeting about it, It could not be used as a basis of truth.

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