Marriage Equality as a polarizing driver? The Costa Rican case

Data Driven Modeling of Complex Systems (DDMCS)

Professor Walter Quattrociocchi

Braulio Villalobos Quirós 1999250

Why this topic?

Why is this so important? Why am I so interested and motivated on this topic, even though I might have not gotten the results I wanted?

- Studied economics
- Trend in the way politics is done
- Mix of religion with politics
- Rise of Pentecostalism: from "garage churches" to megachurches.

- Biggest limitation we had is not enough data from one candidate. This
 is crucial and we should expand the amount of data we have from the
 other side (FAM)
- Bring attention to the target electorate of each candidate (CAQ young, FAM older conservative) and how this might have affected the activity on twitter.

Timeline of Events





Carlos Alvarado Quesada (CAQ)

Partido Acción Ciudadana

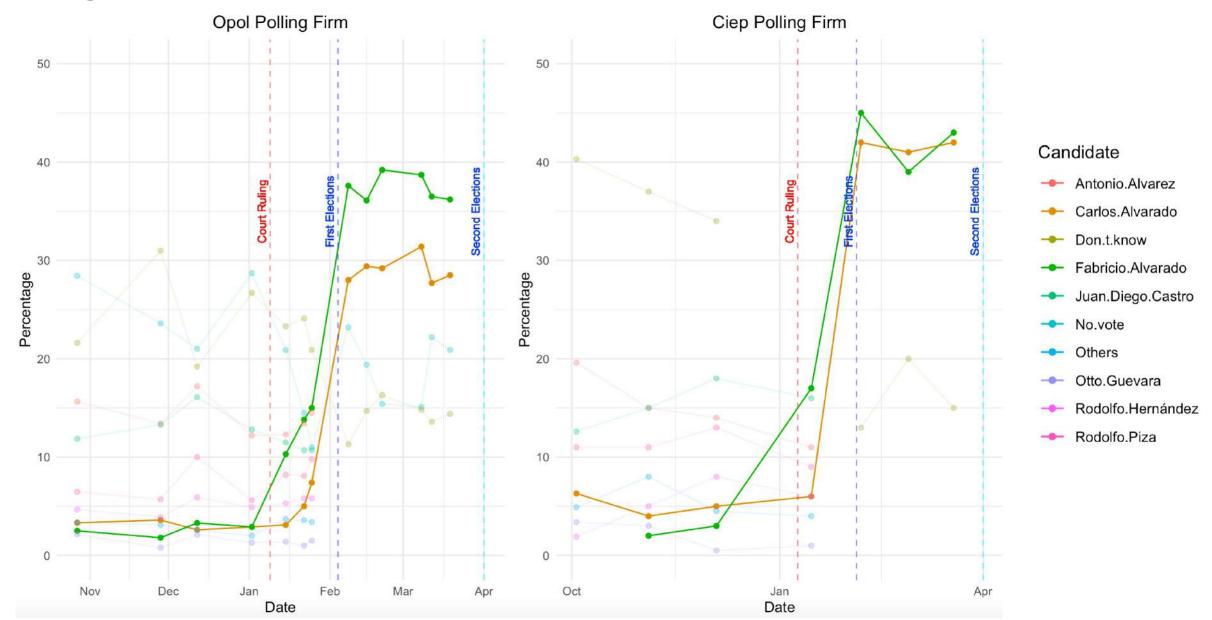


Fabricio Alvarado Monge (FAM)

Partido Restauración Nacional



Progression of Vote Intention



UNA CAMPAGNA INCENTRATA SUL MATRIMONIO

EGUALITARIO

"El matrimonio no parece ser un derecho para homosexuales" MUNDO

B B C NEWS MUNDO

Hay Festival Economía Ciencia Salud Centroamérica Cuenta BBC Extra

El "shock religioso" que puso a Fabricio Alvarado, predicador de una iglesia evangélica, como favorito para las elecciones presidenciales de Costa Rica

Matrimonio homosexual domina debate electoral en Costa Rica

En Profundidad > Agenda

Costa Rica vote halts march of religious

conservatism

Voto evangélico crece en América Latina

El matrimonio gay polariza las elecciones de Costa Rica

Fabricio Alvarado y el factor religioso en las pre-

sidenciales de Costa Rica

La respuesta de la CIDH sobre el acatamiento del matrimonio igualitario en sus países miembros ha movilizado a electorado religioso y ha forzado la intervención de Tribunal Supremo de Elecciones para mitigar el impacto de la **programas opuestos: el**

Fabricio Alvarado: "Abortar no es un para Costa Rica

derecho" Costa Rica: big election surprises, increased polarisation and eroding governability?

"Nunca más se metan con la familia, con la vida y nuestros hijos"

Empresas podrían negarse a dar servicios a parejas del mismo sexo

Fabricio Alvarado impulsará "objeción de conciencia" para pymes opuestas a matrimonio igualitario

Mismo apellido, matrimonio gay, la clave

Fabricio Alvarado, líder evangélico del Partido Restauración Nacional (PRN), y Carlos Alvarado, del gobernante Partido Acción Ciudadana (PAC), pasan a la segunda vuelta de los comicios

The evangelical wave hits

Fabricio Alvarado: la fe de la mano de la política

Abandonó sus orígenes católicos para abrazar la vida como cristiano evangélico. Presentador de televisión y cantante de música religiosa, ha repartido biblias en e

Matrimonio gay trastoca elecciones presidenciales en Quién es Fabricio Alvarado, el pastor que Costa Rica

aspira al poder en Costa Rica

rangelista, necconservador en temas sociales y nepliberal en cuestiones económicas, habia ganado. Imera vuelta de las presidenciales de 2018. Sólo en el balotaje se vio derrotado por el actual preside

Religion vs rights splits Costa Rica in presidentia

Gay marriage ruling boosts evangelical in Costa Rica vote

Costa Rica steuert auf Stichwahl zu

Costa Rica: ¿polarización social como estrategia electoral?

Oposición a matrimonio gay catapulta a Fabricio Alvarado

Indecisos siguen liderando las encuestas

Ataques religiosos contra la Virgen impulsaron el triunfo de Carlos Alvarado

Costa Rica's Rollercoaster Election Was About More Than Gay Marriage

democracy in Costa Rica

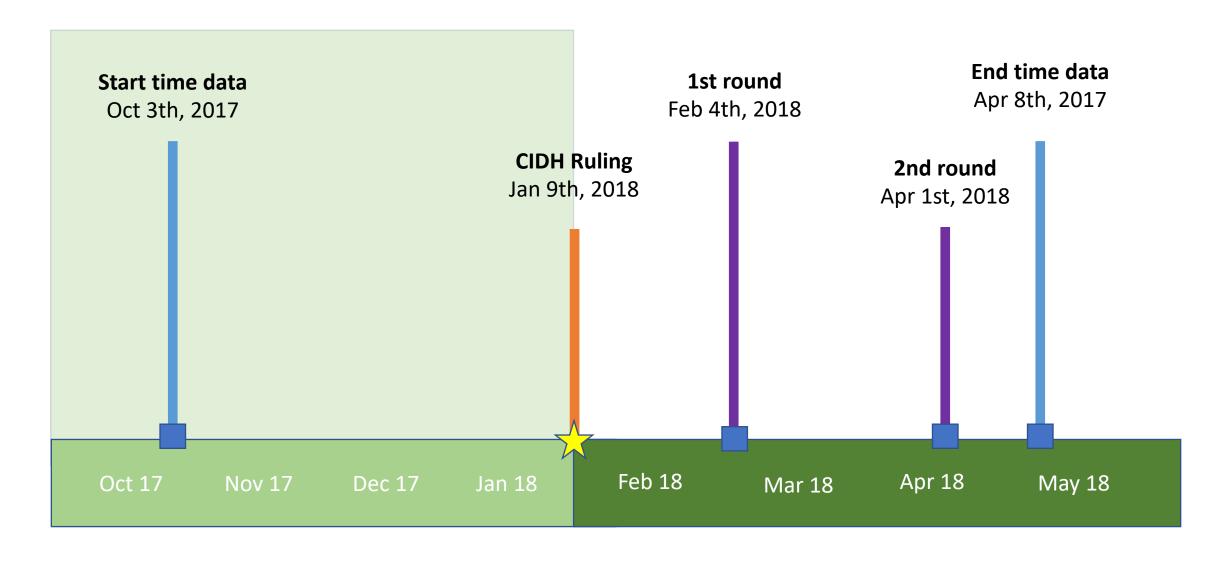
Il Costa Rica preferisce il rock di Carlos al gospel di **Fabricio**

politica-per-media, star politics \$\delta\$ Star Politics

IN COSTA RICA I DIRITTI LGBT BATTONO FONDAMENTALISMO

COSTA RICA'S 2018 ELECTIONS: THE TWO ALVARADOS, BETWEEN DEEPENING DIVISION AND DEMOCRATIC DEPENDABILITY

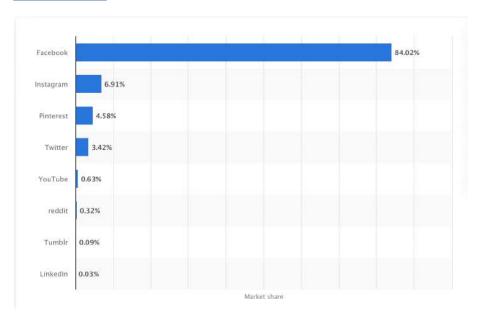
Timeline of Events



Challenges

1

Twitter's popularity



Twitter's access & extraction quota



Challenges

Dissimilar amounts of data between candidates

FAM
CAQ

341 tweets
3601 tweets
3195 likes
30.586 likes

Data Extraction - Tweets





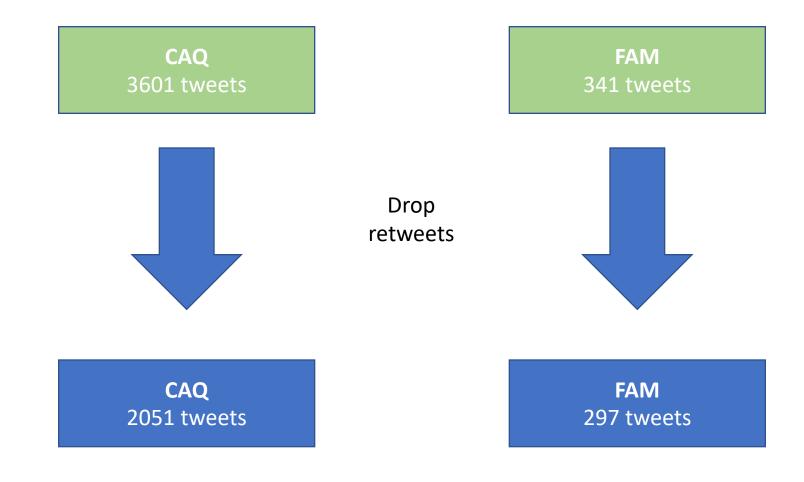
 We extracted tweets made by both candidates by means of the commands:

```
twarc2 timeline --use-search --start-time "2017-10-03T12:31:04"
--end-time "2018-04-08T12:31:04" 'fabrialvarado7' FabriAlvarado_filtered.jsonl

twarc2 timeline --use-search --start-time "2017-10-03T12:31:04"
--end-time "2018-04-08T12:31:04" 'CarlosAlvQ' CarlosAlvQ_filtered.jsonl
```

Dropped retweeted tweets

Data Extraction - Tweets



Data Extraction – Liking users



```
#!/bin/bash

# loop through the list of user ids
while read tweet_id; do
    # replacing user_id and output filename
    twarc2 liking-users "$tweet_id" "${tweet_id}_liking_users.jsonl"
done < user_ids.txt</pre>
```

30.586 users
liked CAQ
tweets

3.195 users
liked FAM
tweets

Data Extraction — Network of users

We extract the network of users that liked tweets from the candidates. Define network as the accounts that are followed by those users

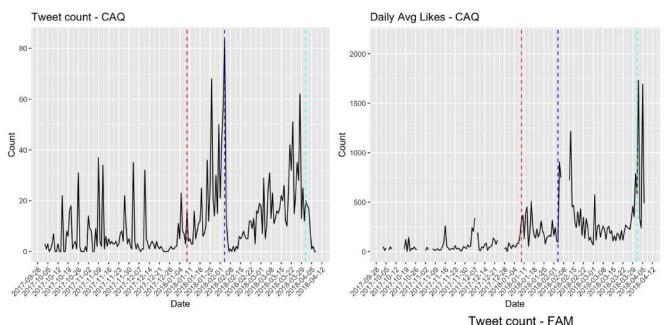
```
#!/bin/bash

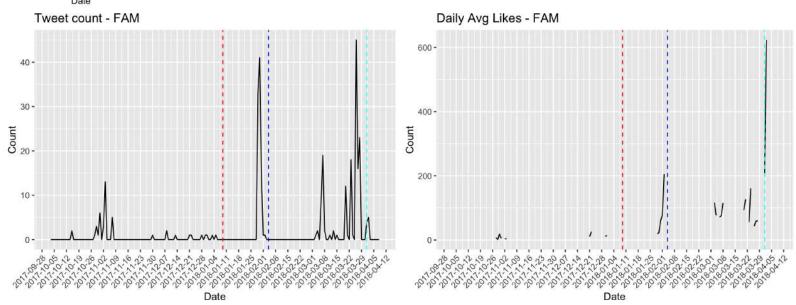
# loop through the list of user ids
while read user_id; do
    # replacing user_id and output filename
    twarc2 following "$user_id" "${user_id}_user_following.jsonl"
done < user_ids.txt</pre>
```

Users followed by those who liked CAQ tweets
450.563 unique users

Users followed by those who liked FAM tweets 32.321

Activity time series





Polarization of Users

$$\rho(u) = \frac{x - y}{x + y}$$

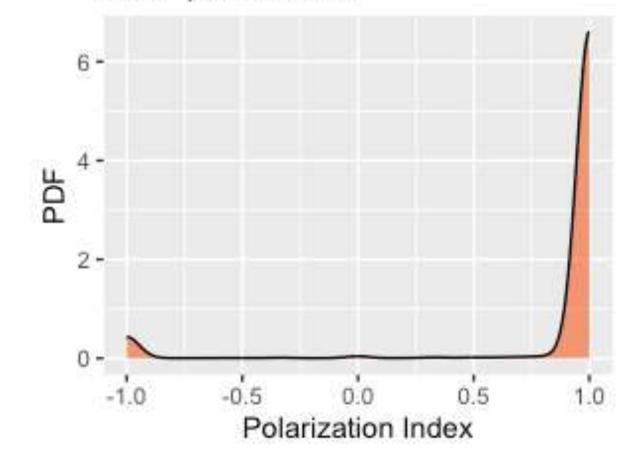
$$\rho(u) = 1$$

User u is totally polarized towards CAQ

$$\rho(u) = -1$$

User u is totally polarized towards FAM

User polarization



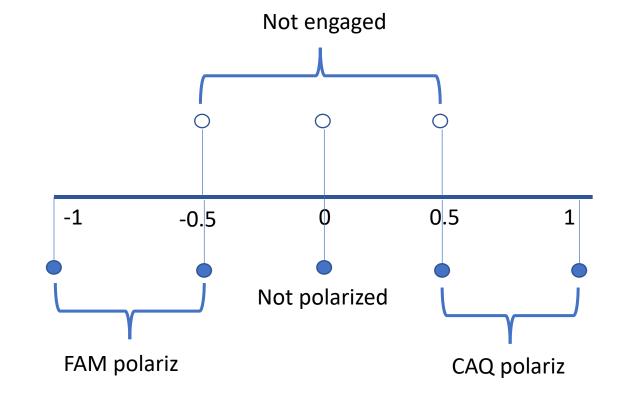
Network of Users

Analyzed only network of 20% of users that liked FAM 24 users

Analyzed only network of 10% of users that liked CAQ 85 users

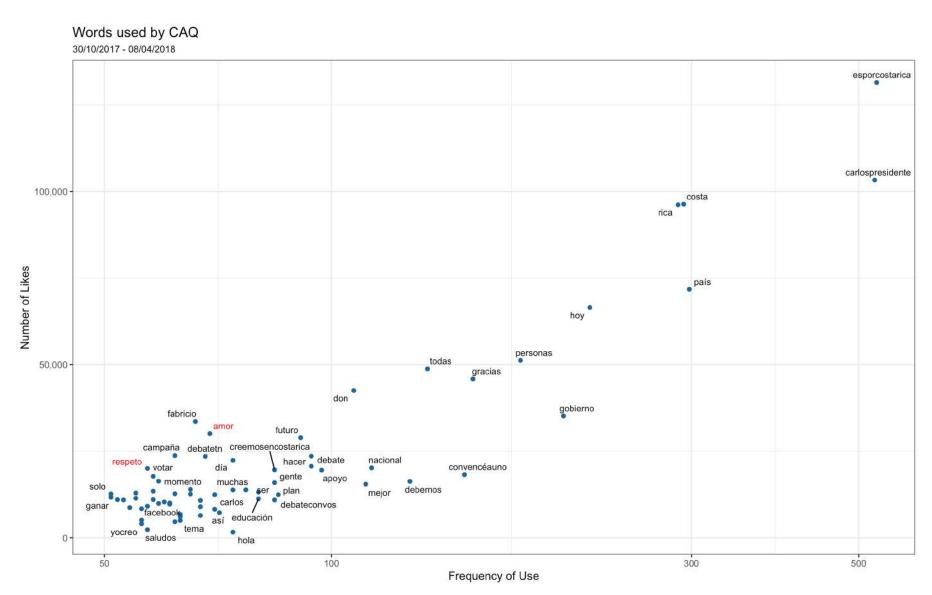
Engagement

$$\psi = \frac{\theta(u)u}{v\left(\max(v)\right)}$$

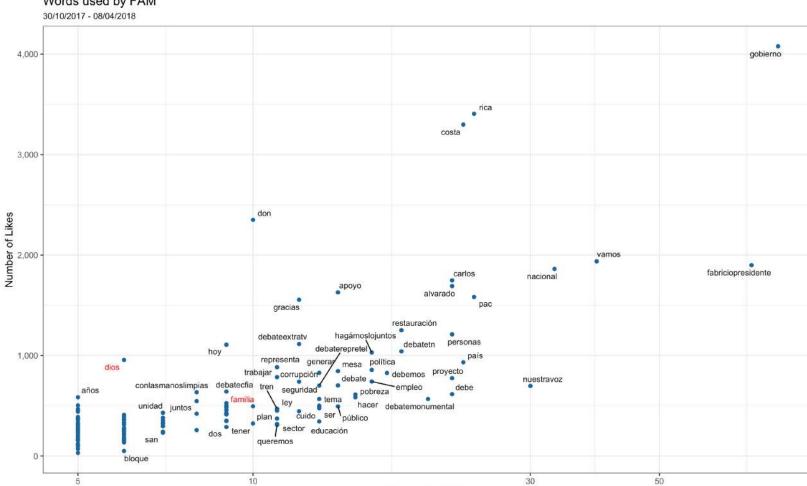


CAQ - Engagement vs Polarization FAM - Engagement vs Polarization 100 -100 -Percentage of Network Percentage of Network 75 -75 not_engaged not_engaged 50 not_polarized not_polarized fam_polarized caq_polarized fam_polarized caq_polarized 25 -0 -0 -0.8 0.2 0.4 0.6 1.0 0.5 0.6 0,9 0.7 0.8 1.0 Engagement Index Engagement Index

Change of speech?



Words used by FAM



Frequency of Use

Table 1: Used words - CAQ

word	Freq Before	Freq After	Likes Before	Likes After
aborto	0	2	0	375
amor	3	66	316	29.763
familia	27	12	1.637	5.760
respeto	11	46	1.324	18.704
valores	1	7	1	1.678

Note: The word "dios" (God) was not mentioned by the candidate in any tweet.

Table 2: Used words - FAM

word	Freq Before	Freq After	Likes Before	Likes After
aborto	2	4	4	131
dios	3	3	39	917
familia	2	8	12	483
respeto	0	1	0	98
valores	1	4	4	288

Note: The word "amor" (love) was not mentioned by the candidate in any tweet.

Table 3: Used words relative to total tweets - CAQ Freq Before (%) Freq After (%) word 0.0aborto 0.10.64.3amor familia 5.00.8 respeto 2.03.0valores 0.20.5

Table 4: Used words relative to total tweets - FAM					
word	Freq Before (%)	Freq After (%)			
aborto	4.4	1.6			
dios	6.7	1.2			
familia	4.4	3.2			
respeto	0.0	0.4			
valores	2.2	1.6			

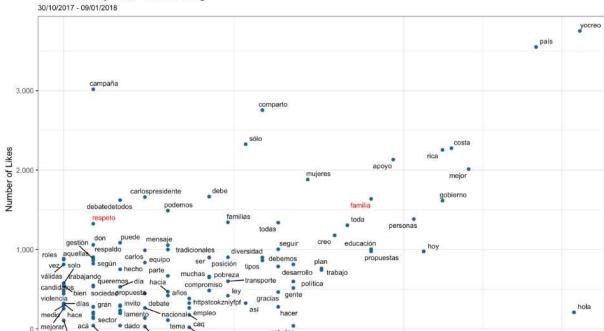
Note: The word "amor" (love) was not mentioned by the candidate in any tweet.

2 Total tweets before and after, 45 and 252, respectively.

¹ The word "dios" (God) was not mentioned by the candidate in any tweet.
² Total tweets before and after, 542 and 1509, respectively.

Words used by CAQ - Before ruling

pregunta entender isaludos



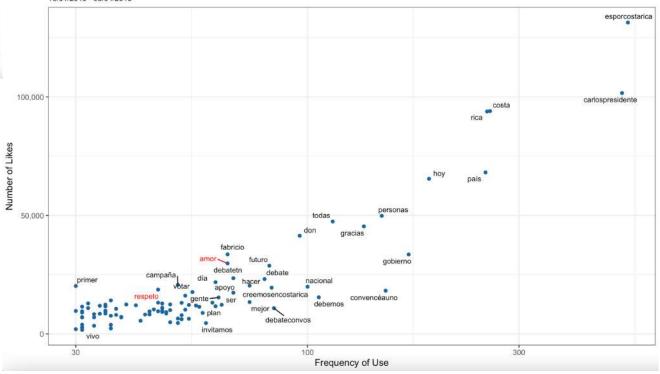
saludos

Frequency of Use

Words used by CAQ - After ruling

10/01/2018 - 08/04/2018

50

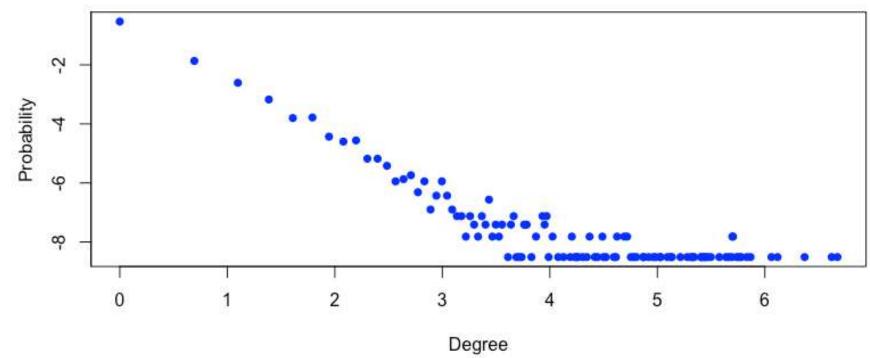


Analyzing the Following Network

Clustering Coefficient 0.019

Average degree 5.58

Degree Distribution of Following Network



Limitations & problems faced

- Liking-users doesn't retrieve users that liked a retweeted tweet (several attempts with GET, academictwitterR, twarc and tweepy
- Numerical precision must be expanded to manage tweets ids.
- Following relationship doesn't have timestamps. Therefore, we couldn't analyze how the following relationships developed through the study period.

Recommendations

- Analyze the other candidates and their tweet activity, to better compare the effect of the polarizing event.
- Analyze not only candidates but political parties, media, etc. More data!!
- Extract "followed"instead of "following" relationship.