### VISIT THE DOME – WEEK 3

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- Task 1: Identify political party as Government or Opposition for each record
- Task 2: Sentiment analysis for controversial data
- Task 3: General overview about entire dataset

- Identify political party as government or opposition
- Method:
  - Using python wikipedia library to get list of parties and their member

Duration	Government
Sep. 24, 1867-Jul. 8, 1872	Conservative Party Sir John A. Macdonald-1st Ministry
Sep. 3, 1872-Jan. 2, 1874	Conservative Party (1872å1873) Sir John A. Macdonald-1st Ministry
Sep. 3, 1872-Jan. 2, 1874	Liberal Party (1873â1874)[nb 4] • Alexander Mackenzie-2nd Ministry
Feb. 21, 1874-Aug. 16, 1878	Liberal Party_ Alexander Mackenzie-2nd Ministry
Nov. 21, 1878-May 18, 1882	Conservative Party Sir John A. Macdonald-3rd Ministry
Aug. 7, 1882-Jan. 15, 1887	Conservative Party Sir John A. Macdonald-3rd Ministry
Apr. 13, 1887-Feb. 3, 1891	Conservative Party Sir John A. Macdonald-3rd Ministry
Apr. 7, 1891-Apr. 24, 1896	Conservative Party Sir John A. Macdonald-3rd Ministry (1891) Sir John Abbott-4th Ministry

• List of the governing and the opposition parties for each parliamentary period

From	То	Government
07/12/1925	02/07/1926	Liberal
07/12/1925	02/07/1926	Conservative
02/11/1926	30/05/1930	Liberal
18/08/1930	14/08/1935	Conservative
09/11/1935	25/01/1940	Liberal
17/04/1940	16/04/1945	Liberal
09/08/1945	30/04/1949	Liberal
29/08/1949	13/06/1953	Liberal
08/10/1953	12/04/1957	Liberal
119711971957	04 100 14050	Progressive Lonconvative

- Speechdate: The time for each speech
- Speakerparty: The party for each speech

				-	-						i.
П	speechdate	pid	opid	speakeroldr	speakerposi	maintopic	subtopic	subsubtopic	speechtext	speakerparty	ŀ
	2017-12-13	317606&f-62ee-4b2f-aacd-1131201c6db1	214707	The Spea					It being Wednesday, we will now have the singing of O Canada led by the hon. member for Edmonton Centre.	Liberal	ŀ
	2017-12-13	e915cec9-7164-4846-aeb5-d5bf2e4f3598	214562	Mr. Xavie		Statemen	Holiday G		Mr. Speaker, all the snow we just got is a sure sign that the holidays are just around the comer. On behalf of the Bloc Québécois, I would like to express our	Bloc Québécois	F
	2017-12-13	2f8fed89-2dde-4683-b 1f0-03d 1f782d96a	229706	Mr. Natha		Statemen	Beaches		Mr. Speaker, the holidays are a time to spend with family and with our community.  We have been lucky to celebrate the holidays in Beaches-East York with many	Liberal	E
	2017-12-13	c4b4aef5-eca1-416d-b2b0-ad4a1a2b5fc9	218055	Mr. Keny		Statemen	Christmas		Mr. Speaker, I have a little Christmas song to sing, even though I am losing my voice:	Conservative	E
	2017-12-13	63894f25-ef7f-45a2-bac2-1a4ceb85b7ad	219363	Ms. Yasm		Statemen	Aga Khan		Mr. Speaker, December 13 marks the 81st birthday of His Highness Prince Karim Aga Khan.	Liberal	[
	00474040	FF4400 0 000 141 00000 0 1404 (00400	040005						Mr. Speaker, I would like to join with my wife, Catherine and our family in wishing		

- Solution
  - > Step 1: Look at the "speechdate" of each speech and find out the corresponding duration in list of party for each parliamentary period
  - > Step 2: Check whether the "speakerparty" of this row is the party in corresponding duration in list of party
  - > Step 3: Assign label for each row based on the result on Step 2
    - ✓ Label 1: Government
    - ✓ Label 2: Opposite
    - ✓ Label 3: Unknown

• Step 1.1: Look at "speechdate" of a row

						9	-						51
b	asepk	hid	speechdate	pid	opid	speakeroldr	speakerposi	maintopic	subtopic	subsubtopic	speechtext	speakerparty	1
	4732512	ca.proc.d	2017-12-13	e63101b2-e7b2-4890-9b4c-be9cf366866f	229559	Mr. Yves		Statemen	Marc-Aur		Mr. Speaker, here we are in December, the last month of this magnificent year during which we celebrated Canada's 150th anniversary.	Liberal	Ν
Ī	4732513	ca.proc.d	2017-12-13	ff7a7f13-0558-4282-8cfc-9bfdfcbf6a1a	216774	Mr. Micha		Statemen	Anti-Semit		Mr. Speaker, last Saturday in Vancouver, pro-Palestinian demonstrators, in a disgusting display of hate, burned Israeli flags, made anti-Semitic slurs, and called	Conservative	ē
	4732514	ca.proc.d	2017-12-13	fa57da4d-d6e1-44ed-9449-b5b1f6361a5c	219935	Ms. Sonia		Statemen	Health		Mr. Speaker, we have some of the best and brightest health researchers and health care professionals in Canada. One such visionary is Dr. Arjun Sahgal, a	Liberal	Е
	4732515	ca.proc.d	2017-12-13	897d99d9-377d-43a8-81be-27a22174136e	234515	Mr. Jean		Statemen	The Chris		Mr. Speaker, the Christmas season is a special time for many people, but a difficult one for some.	Liberal	S
	4732516	ca.proc.d	2017-12-13	96924c12-efff-4de2-9f9e-578fe5434342	234765	Hon. Erin		Statemen	National		Mr. Speaker, 40 years ago, Prime Minister Pierre Trudeau launched a modernization project for the Canadian Armed Forces to acquire a new fighter jet,	Conservative	С

• Step 1.2: Find out the corresponding duration in list of

p	23/05/2011	02/08/2015	Conservative	
	03/12/2015	11/05/2019	Liberal	

• Step 1.3: Compare the "speakerparty" in Step 1.1 with "conservative" in Step 1.2

#### • Case 1: Government

pk	hid	speechdate	pid	opid	speakeroldr	speakerpos	maintopic	subtopic	subsubtopic	speechtext	speakerparty
940244	ca.proc.d	1993-04-19	4e3a9e6	ca.m.4873	Hon. Her		ORAL Q	THE ECO		Mr. Speaker, I have a question for the Prime Minister.  His Minister of National Defence has said she can eliminate the deficit in five years. His Minister of the Environment has said	Liberal
940245	ca.proc.d	1993-04-19	e2215b8	ca.m.2460	Mr. Edwa	Chief Gov	ORAL Q	THE ECO		Herbie, you are leading with your chin again.	Progressive Conservative
940246	ca.proc.d	1993-04-19	1335c5d	ca.m.8721	Right Ho	Prime Min	ORAL Q	THE ECO		Mr. Speaker, I do not know if it is entirely accurate that it can be done in five years as the Minister of National Defence says, or in four years as the Minister of the Environment says. I do know that after 25 years of Liberal government it cannot be done by	Progressive Conservative
940247	ca.proc.d	1993-04-19	4e3a3e6	са.т.4873	Hon. Her		ORAL Q	THE ECO		Mr. Speaker, I am surprised that the Prime Minister, in boasting about his record, did not boast about how in only nine years he doubled the public debt to \$450 billion, more than happened in all the years since Confederation.	Liberal

	24/09/1984	01/10/1988	Progressive Conservative	
	12/12/1988	08/09/1993	Progressive Conservative	
•	15/11/1993	27/04/1997	Liberal	

# • Progressive Conservative match to Progressive Conservative

#### • Case 2: Opposite

į.	hid	speechdate	pid	opid	speakeroldr	speakerpos	maintopic	subtopic	subsubtopic	speechtext	speakerparty	spe
2537	ca.proc.d	2017-12-13	b0c04ccaf237-40a0-0975-374ccd40d1a9	214115	Right Ho		Oral Ques	Governm		Mr. Speaker, Lunderstand that everything is always about partisanship for the	Liberal	Pap
2538	ca.proc.d	2017-12-13	031462db-8f61-48ed-bf9f-b033eb8312bb	233016	Mr. Natha		Oral Ques	Ethics		Mr. Speaker, let us try to sum up the Liberal ethical violations of just this past year	New Democratic Party	Ske
25 <del>39</del>	ca.proc.d	2017-12-13	b0c04ccaf237-40a0-0375-374ccd40d1a9	214115	Right Ho		Oral Ques	Ethics		Mr. Speaker, as we come to the end of this year, one cannot help but feel had for	Liberal	Pap
2540		2017 12 12	CE10-E- 0000 4101 b0 0C-EC1033	222040	Ham And		0-10	Tourism		Mr. Speaker, the Prime Minister said he would lower taxes for the middle class, but	C	D.

į	23/05/2011	02/08/2015	Conservative	
l	03/12/2015	11/05/2019	Liberal	
ŀ				

New Democratic Party not match to Liberal

• Case 3: Unknown

speechtext	speakerparty	SD
	- предоставления	+
given, they are not accorded any power beyond that which the ordinary citizen of Canada has.		1
House again in Committee on Bill No. 45, Mr. McKENZIE: What struck me as unto incorporate the National Wholesale usual was that a roving committee of that Grocers' Association, and recommending kind should have the right to put people on that the title of said Bill be changed to "An oath and then examine them. But if this Act to incorporate the Canadian Wholesale does		
not give them any power to swear a Grocers* Association."-(Mr. Sheard)-Mr. witness, I suppose they could send a eom-Boivin in the Chair mittee around and get statutory evidence		
On section 12-Committees of Inquiry:without any power at all.		-
Tunderstand that when the Bill was last before the Committee, the leader of the Opposition called attention to clause 11 as being undesirable, and suggested it should not have been allowed to pass by the Department of Justice. He also objected to certain features of clause 12 Upon inquiry. T find that clause 11 was struck out before the Private Bills Committee, and clause 12 was	Unionist	₩

No information about speackerparty

#### • Before adding label

basepk	hid	speechdate	pid
4758737	ca.proc.d.2018-1	2018-10-30	07cf5767-80
4758738	ca.proc.d.2018-1	2018-10-30	1a1a9dee-c2
4758739	ca.proc.d.2018-1	2018-10-30	1a1a9dee-c2
4758740	ca.proc.d.2018-1	2018-10-30	07cf5767-80
4758741	ca.proc.d.2018-1	2018-10-30	661a3062-86

#### • After adding label

Role	basepk	hid	speechdate	pid
Government	4758737	ca.proc.d.2018-10-30.10337444	2018-10-30	07cf57
Government	4758738	ca.proc.d.2018-10-30.10336878	2018-10-30	1a1a9d
Government	4758739	ca.proc.d.2018-10-30.10337508	2018-10-30	1a1a9d
Government	4758740	ca.proc.d.2018-10-30.10336888	2018-10-30	07cf57
Opposite	4758741	ca.proc.d.2018-10-30.10336896	2018-10-30	661a30

#### Task 2: Finding controversial topics

- Method 1: Using Wikipedia
  - Check if subcat belongs to wikipedia controversial list
  - If controversial topic is mentioned in speechtext at least twice

Oral Questions	Statement by Members
4927 / 126318 <b>(3.9%)</b>	5370 / 43251 ( <b>2.41 %)</b>

# METHOD 2: NLTK VADER FOR SENTIMENT ANALYSIS

- Sentiment Metric Positive, Neutral, Negative and Compound.
- How to analyze sentiment based on compound score?
  - 1. Positive sentiment: compound score >= 0.05
  - 2. Neutral sentiment : (compound score > -0.05) and (compound score < 0.05)
  - 3. Negative sentiment : compound score <= -0.05

Oral Questions	Statement by Members
119546 / 126318 <b>(94.63 %)</b>	42068 / 43251 <b>(97.26 %)</b>

#### METHOD 3: COMBINING BOTH APPROACH

- Apply wikipedia method
- Further confirm with Sentiment analysis

Oral questions	Statement by members
4772 / 126318 (3.77 %)	5327/ 43251 <b>(12.31 %)</b>
(wikipedia-155)	(wikipedia - 43)

## SUMMARY

Method	Oral Questions	Statement by Membes
Wikipedia	4927 / 126318 (3.9%)	5370 / 43251 (2.41 %)
Sentiment analysis	119546 / 126318 (94.63 %)	42068 / 43251 (97.26 %)
Combine	4772 / 126318 (3.77 %)	5327/ 43251 (12.31 %)

#### ISSUES IN CONTROVERSIAL TOPICS

- Wrong classification by sentiment score
- Controversial data but score is 0.02
- "the prime ministers meeting with the president must not turn into an episode of the apprentice one fifth of our workers depend on canadaus trade for their jobs donald trump wants to move those jobs south the liberals are working hard to help him new liberal carbon taxes, payroll taxes, and taxes on small businesses are driving out of our country when will the stop taxing out of canada?"
- Wrong classification by wikipedia
- Not controversial data but score is 0

"that is not true once again, i am sorry that my comments were misinterpreted i know quebeckers love their environment that is why they should be part of our plan, but we do need a national for all quebeckers and "

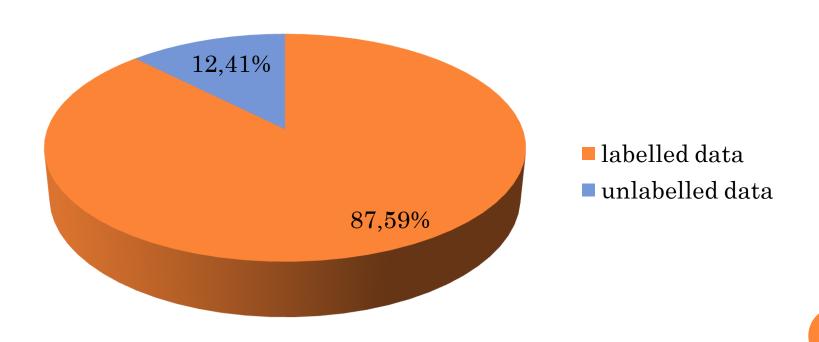
#### • Remove duplicated data in entire dataset

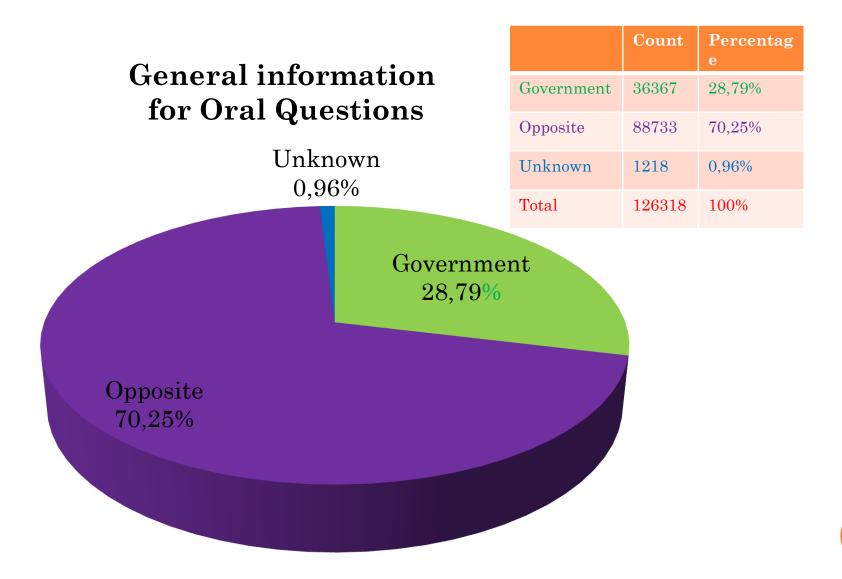
	Count	Percentage
Before removing	4749330	100%
After removing	3796847	79.94%

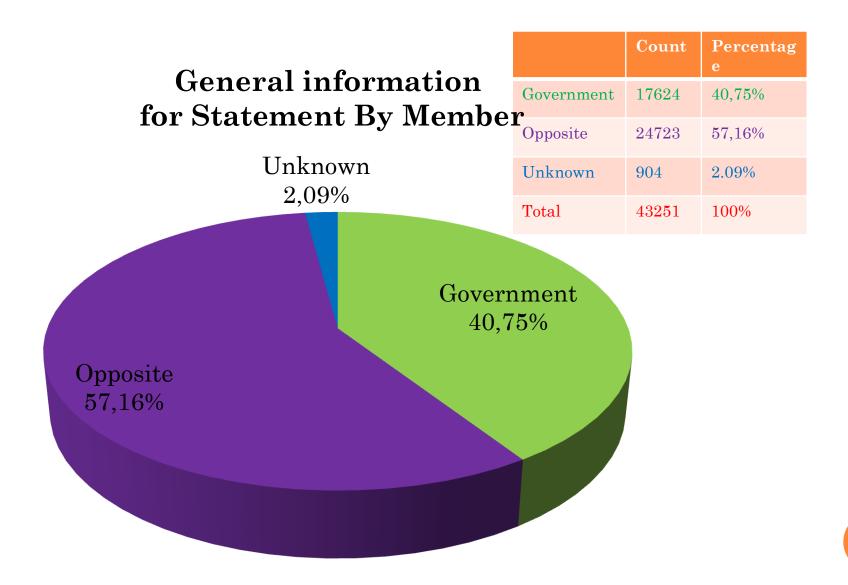
#### • The final statistic

	Count	Percentage
Government	1434816	37.79%
Opposite	1890925	49.80%
Unknown	471106	12.41%
Total	3796847	100%

#### Compare labelled data vs unlabelled data







#### • Top 10 parties based on these speakerparty

	Count	Percentage
Liberal	1.347.861	35,50%
Progressive Conservative	655.773	17,27%
Conservative (1867-1942)	352.607	9,29%
New Democratic	274.843	7,24%
Conservative	167.829	4,42%
Co-operative commonwealth federation (c.c.f.)	103.316	2,72%
Bloc Québécois	65.447	1,72%
Social Credit	48.819	1,29%
National Government	41.811	1,10%
Reform	38.092	1,00%
others	700.449	18,45%
total	3.796.847	100%

#### • Top 10 main topic in entire dataset

	Count	Percentage
government orders	605206	15,94%
oral question period	397990	10,48%
routine proceedings	182673	4,81%
questions	166741	4,39%
supply	128928	3,40%
oral questions	126318	3,33%
ways and means	67823	1,79%
statements by members	43251	1,14%
external affairs	40814	1,07%
private members' business	37850	1,00%
other	1.999.253	52,66%
total	3.796.847	100%

### QUESTION

## What we should do with

unlabelled data?

#### SOLUTION

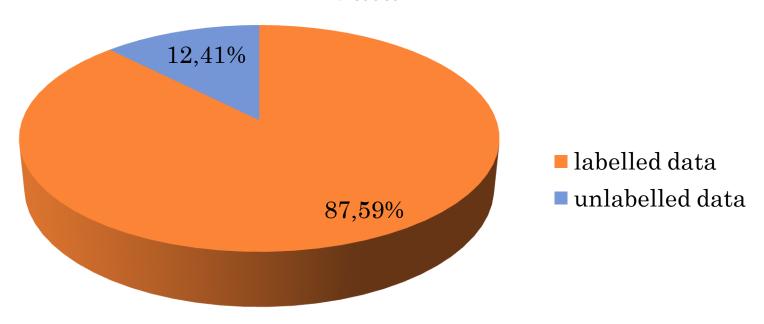
• Collection information from other corresponding cell (main topic, sub topic, speakername) to define the label

#### Issue

speakeroldr	speakerpos	maintopic	subtopic	subsubtopic	speechtext	speakerparty	speakemidin	speakemame
nan	nan	SUPPLY-AUDIT	nan	nan	My hon, friend (Mr. Wallace) will find no cause of complaint on that score.	nan	nan	The MINISTER OF FINANCE.
nan	subtopic	WAYS AND ME	nan	nan	["The hon. gentleman is just as well aware as I am that Mr. FIELDING. In the report of the Auditor General is not at all under the control of the government. The government is not at all answerable for the delay of the Auditor General's Report. With regard to the report of the Minister of Customs, the House I am sure will learn with regret that the Minister of Customs has been called away from Ottawa by sickness in his family. But he will be here to morrow, I hope. In Minister, the House adjourned at 5.15 p.m.", Tuesday, February 12, 1901."]	nan	nan	nan
nan	nan	WAYS AND ME	nan	nan	rnat this house will, to morrow, resolve itself into a committee to consider of the Ways and Means for	nan	nan	The MINISTER OF FINANCE (Ho
nan	stagedire	nan	nan	nan	The MINISTER OF FINANCE (Hon. Mr. Fielding) presented a Message from His Excellency the	nan	nan	nan

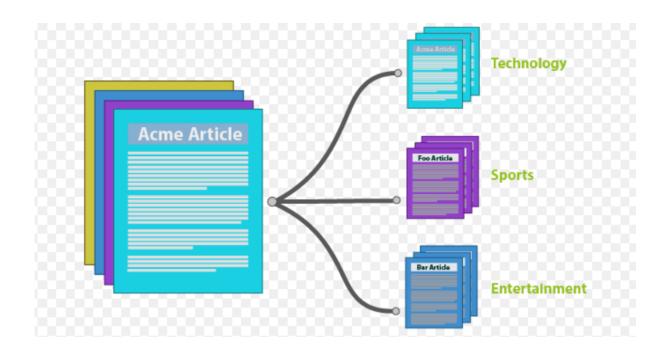
#### RECALL TO OVERVIEW OF ENTIRE DATASET

# Compare labelled data vs unlabelled data



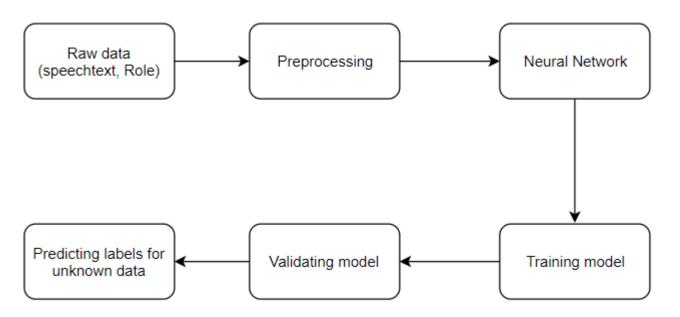
# DEEP LEARNING FOR TEXT/DOCUMENT CLASSIFICATION

Overview for Text/Document/Label classification



# DEEP LEARNING FOR TEXT/DOCUMENT CLASSIFICATION

#### • General Process



### RAW DATA

#### • Training & validation set

Role	basepk	hid	speechdate	pid
Opposite	01/03/1900	ca.proc.d.1901-0	11/02/1901	57ed8b95-0f38-4
Government	06/03/1900	ca.proc.d.1901-0	11/02/1901	83c162c1-32ed
Government	10/03/1900	ca.proc.d.1901-0	11/02/1901	a8b2b613-dd5c
Government	12/03/1900	ca.proc.d.1901-0	11/02/1901	a8b2b613-dd5c
Government	17/03/1900	ca.proc.d.1901-0	11/02/1901	a8b2b613-dd5c
Government	18/03/1900	ca.proc.d.1901-0	11/02/1901	a8b2b613-dd5c

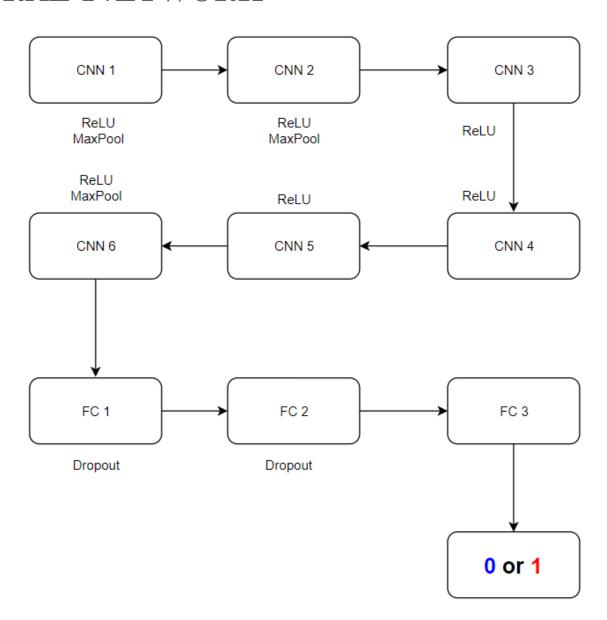
#### Testing set

Role		basepk	hid	speechdate	F
Unknov	wn	55	ca.proc.d.1901-02-11.1	11/02/1901	n
Unknov	wn	56	ca.proc.d.1901-02-11.1.1	11/02/1901	in
Unknov	wn	57	ca.proc.d.1901-02-11.1.2.1	11/02/1901	n
Unknov	wn	59	ca.proc.d.1901-02-11.2.1	11/02/1901	u
Unknov	wn	60	ca.proc.d.1901-02-11.2.2	11/02/1901	in
Unknov	wn	62	ca.proc.d.1901-02-11.2.4.1	11/02/1901	n

#### Preprocessing

- Remove cliches
- Remove stopwords
- Remove punctuation
- Tokenization
- Vectorization
- Embedding

#### NEURAL NETWORK



#### CONFIGURATION

- Training set: 18000 rows (9000 for Government, 9000 for Opposite)
- Validation set: 2000 rows (1000 for Government, 1000 for Opposite)
- Test set: all of unknown rows (471106 rows)
- Batch size: 32
- Epoch: 1
- Learning rate: 0.001
- Optimization function: Adam
- Loss function: Cross Entropy

#### VISUALIZATION

Accuracy

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Epoch 1/1. Loss: 0.6972806453704834, Accuracy: 0.5211693644523621
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Prediction

- 0: Government
- 1: Opposite