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Computing Society of the Philippines
Special Interest Group - Natural Language Processing (SIG-NLP)

A Primer to Natural Language Processing Research

Joseph Marvin Imperial

Department of Computer Science
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National University

Background



Faculty Member

Department of Computer Science, National University

Lab Coordinator

NU Human Language Technology Lab

MS Computer Science at De La Salle University

BS Computer Science at Bicol University



www.josephimperial.com

My research interests are in NLP for education, specifically on **readability assessment and text complexity** of children's books. I have also worked with NLP for understanding social media texts.

A Primer to Natural Language Processing Research

Goals



1. To understand the basics and purpose of NLP.
2. To be informed of the interesting research problems and opportunities in NLP research using PH languages.

Natural Language Processing

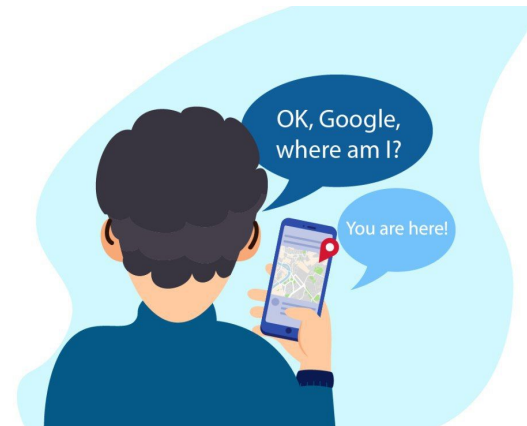


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Natural Language Processing (NLP) is a subfield of computer science concerned with the **interactions** between computers and human (natural) languages.

We want enable computers to **process human language** in the form of text or voice data and to understand its full meaning, complete with the speaker or writer's intent and sentiment.

Computers + language = magic?



Natural Language Processing



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“We want to build models that enable people to **read news** that was not written in their language, or **ask questions** about their health when they don't have access to a doctor, and many more.”

- **Sebastian Ruder**, NLP Researcher at DeepMind

NLP Applications



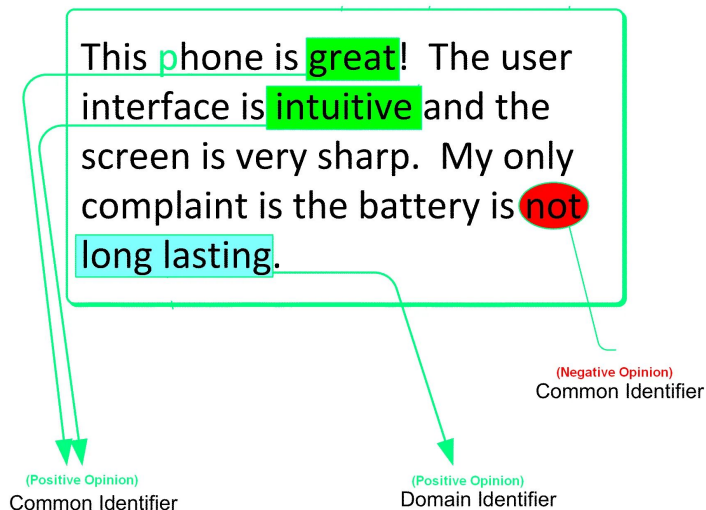
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1. Sentiment analysis of product reviews.
2. Question answering / chatbot systems for customer help
3. Machine translation for travelers
4. Topic modelling for thematic extraction
5. ...

Sentiment Analysis



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GreyB Research

Restaurant Review

✓ Pros
good food
amazing desserts

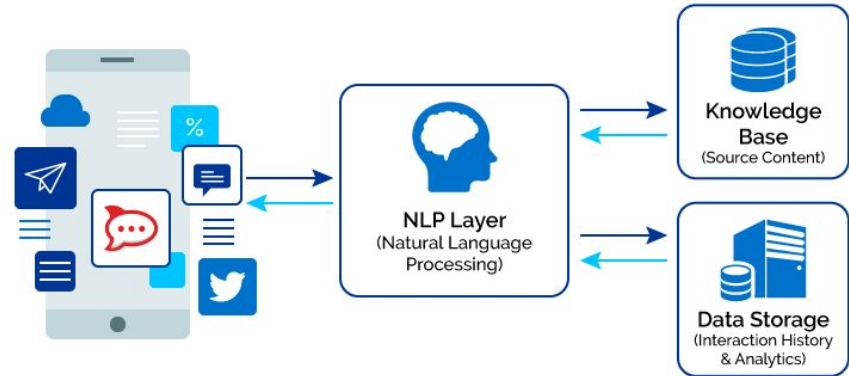
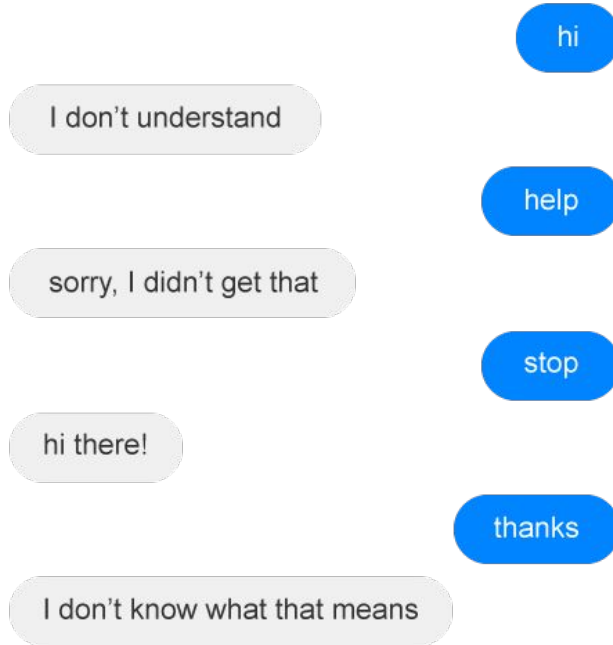
✗ Cons
little pricy
not many options

This place has good food. I like how different this place is and they have amazing desserts. They're a little pricy and not many options.

Chatbots



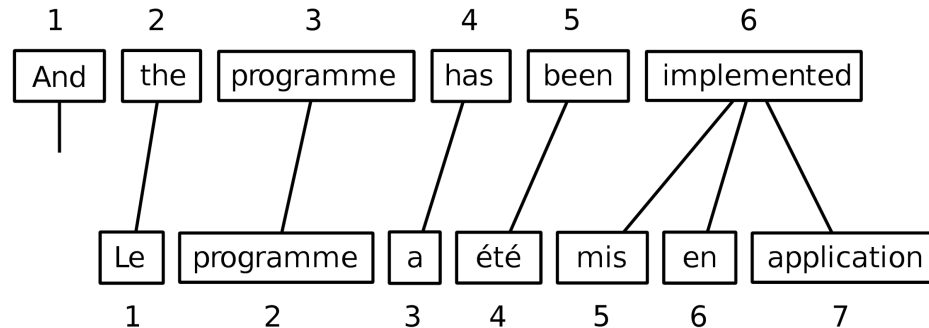
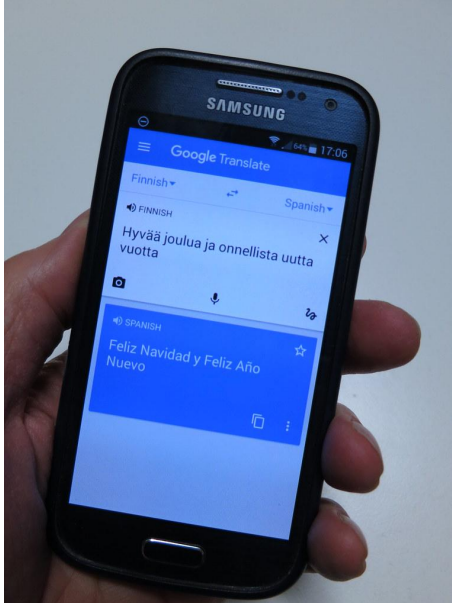
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Translator Systems



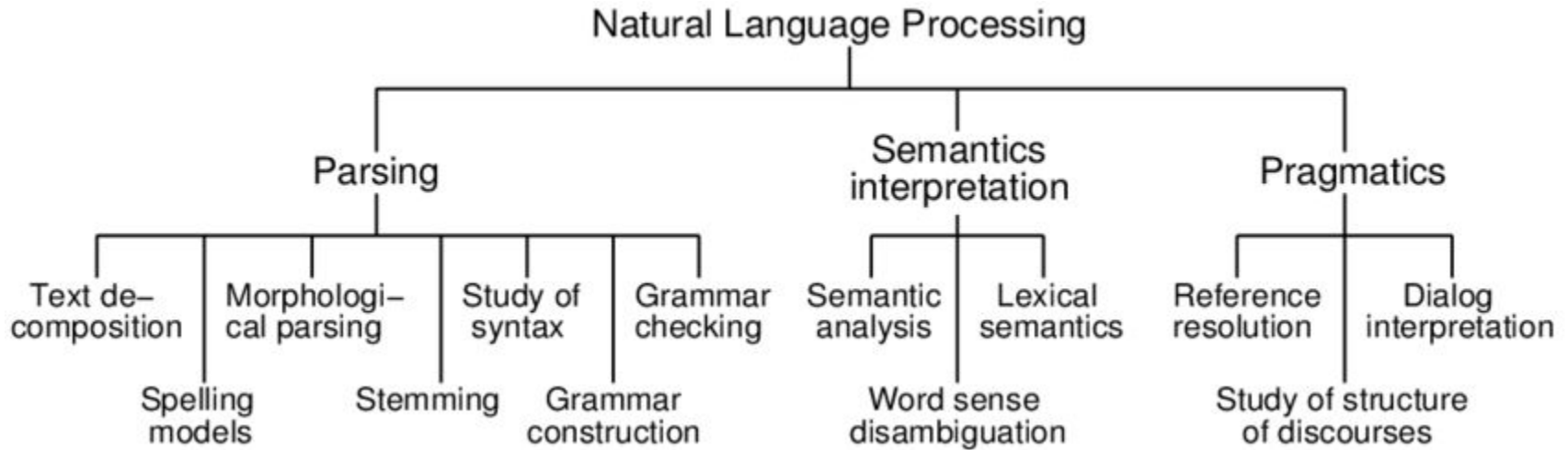
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Natural Language Processing



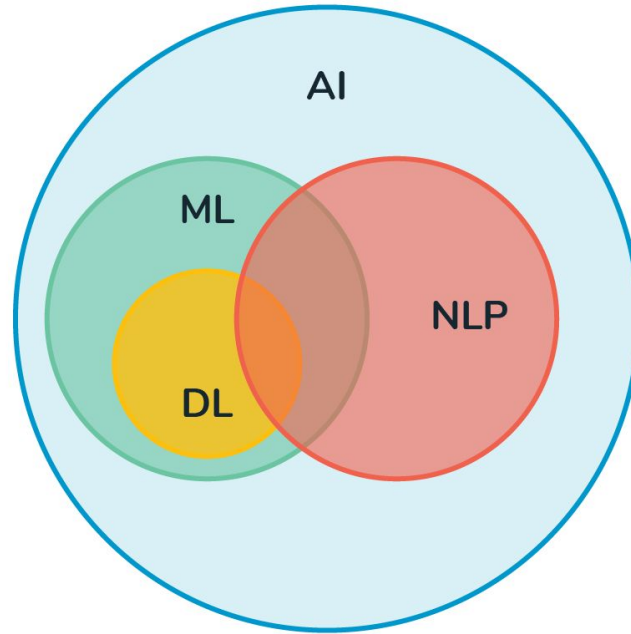
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Natural Language Processing



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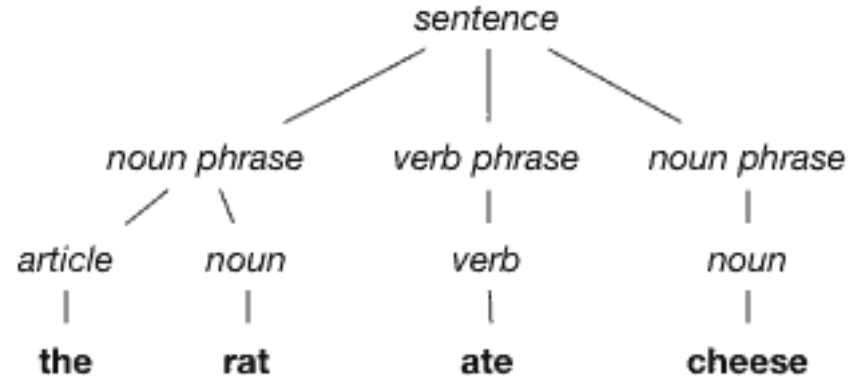
- Artificial intelligence
- Machine learning
- Language Processing
- Deep learning

Rule-Based NLP



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- One of the oldest approaches in NLP.
- Tried and true, proved to work well.
- Often rely and focus on pattern-matching or parsing.

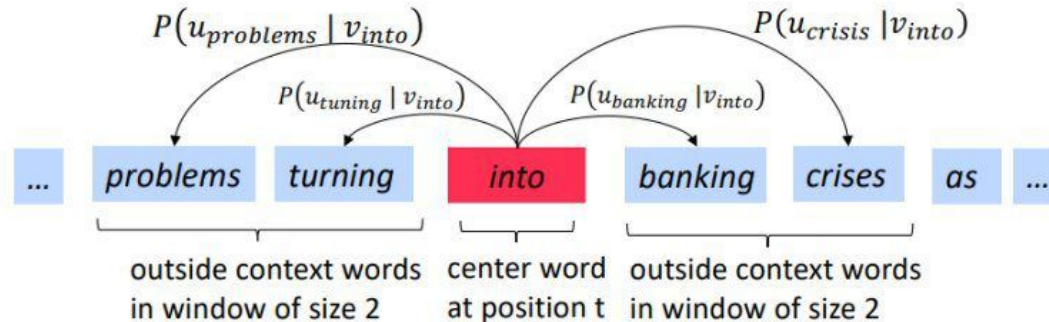


Machine Learning + NLP



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- Makes use of statistical learning algorithms such as probabilistic modelling, likelihood maximization, and linear classifiers to recognize patterns from features of texts.
- Involves training a model on parameters followed by fitting on test data (typical of machine learning systems in general).



Deep Learning + NLP

- Makes use of neural network-based methods where feature extraction is skipped as the networks are powerful enough learn important features.
- High demand for data when using complex networks.

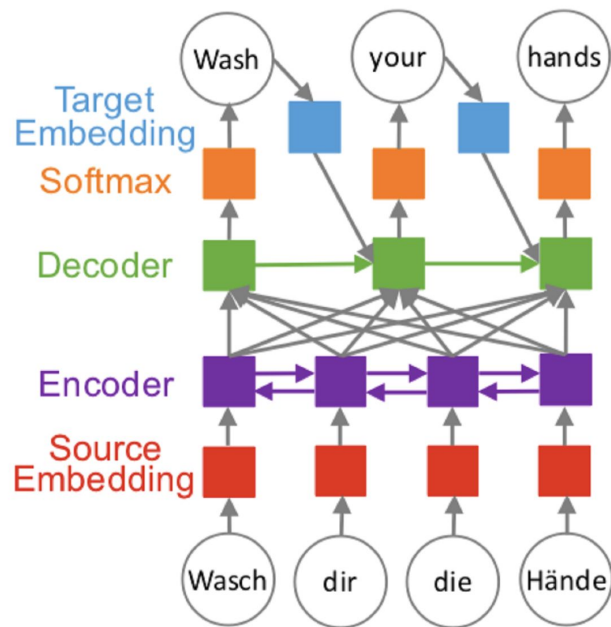
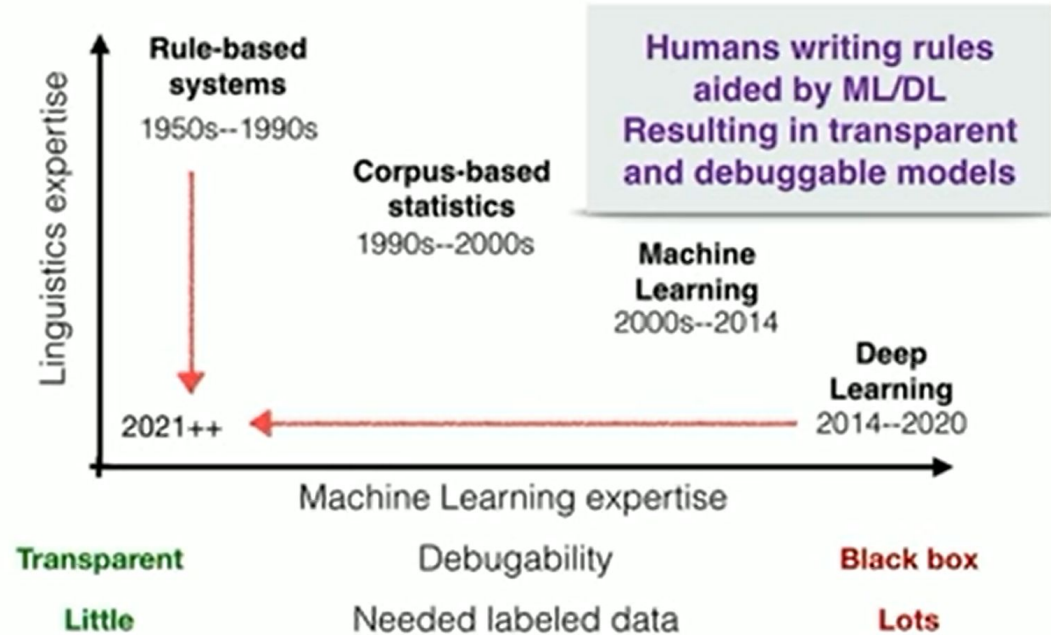


Figure 1: Visualization of an NMT system segmented into components.

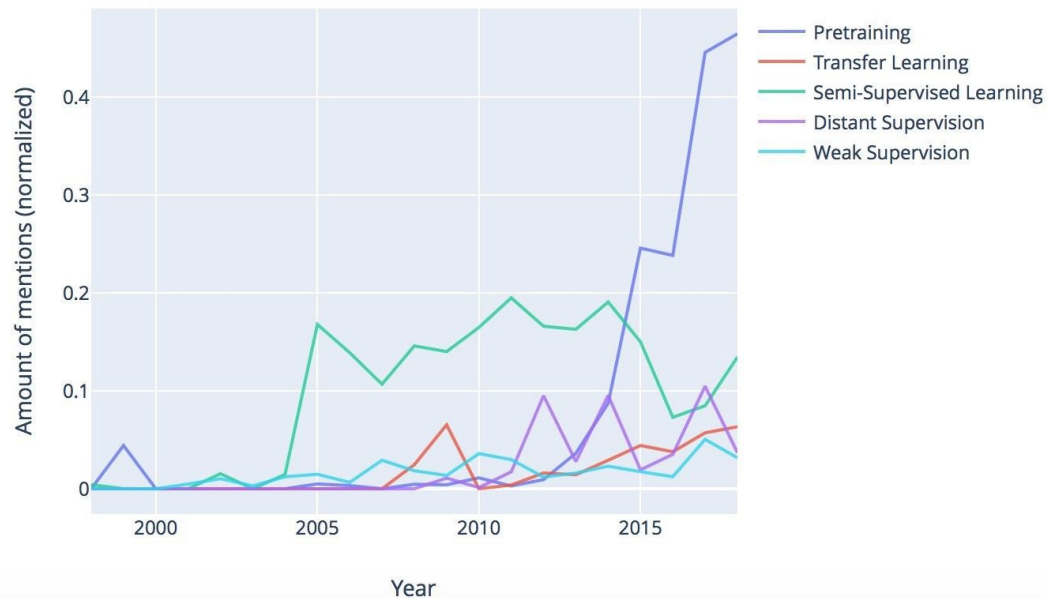
Growth of NLP Research



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Growth of NLP Research

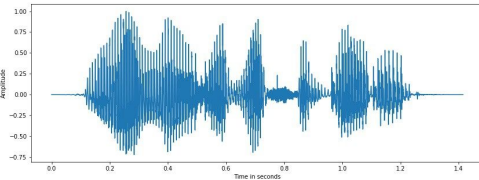


With the introduction of the Internet, NLP became even more important with the flood of textual information becoming machine accessible.

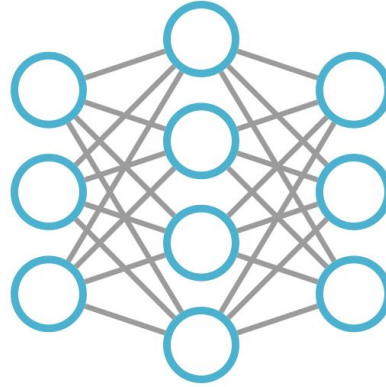
The NLP Research Framework



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Text or speech data (audio files, tweets, articles, etc)



**Algorithms
(rule-based, ML, DL)**

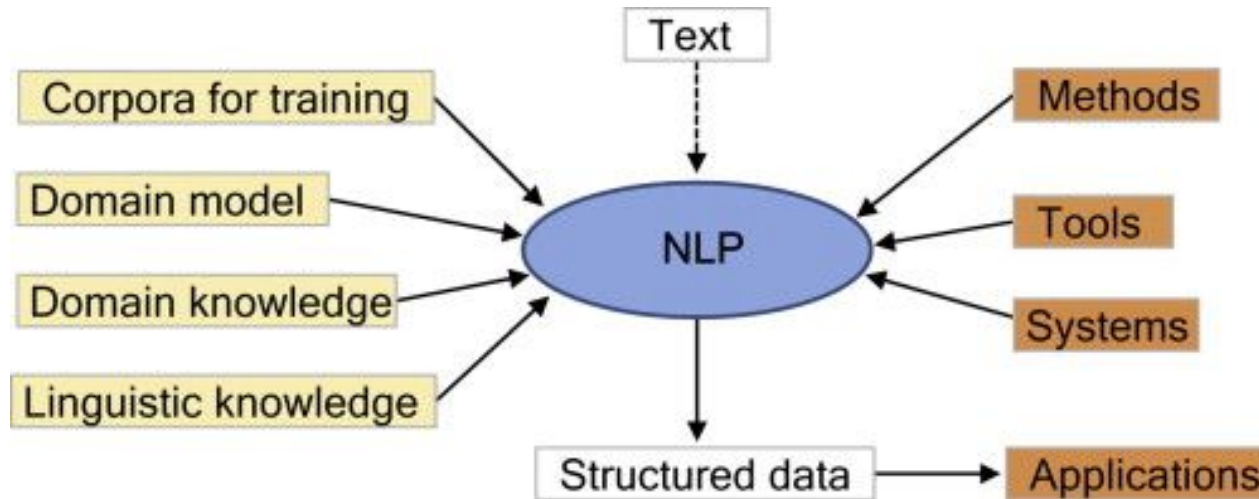


Trained model

The NLP Research Framework



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Understanding Sentiments of Filipinos During Typhoons

An undergraduate thesis by Joseph Marvin Imperial, Shiela Mae Mazon, Jerome Orozco at Bicol University. Advised by Dr. Lany Maceda.

A Primer to Natural Language Processing Research

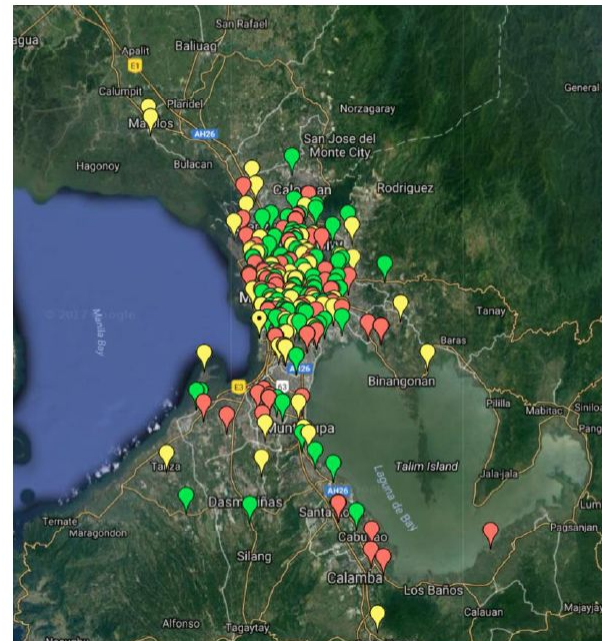
Understanding Sentiments of Filipinos During Typhoons



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We analyzed over 92,040 tweets using hashtags **#YolandaPH**, **#BangonPH**, and **#BangonPilipinas** starting from November 1, 2013 to January 1, 2014.

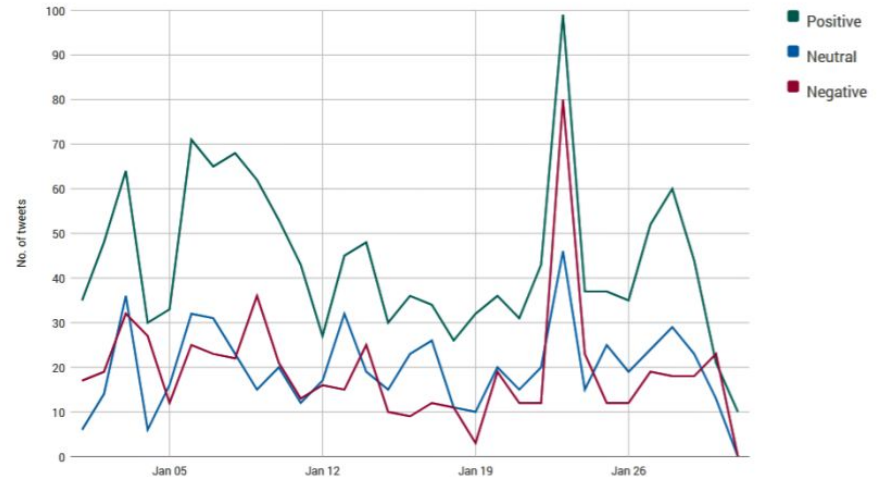
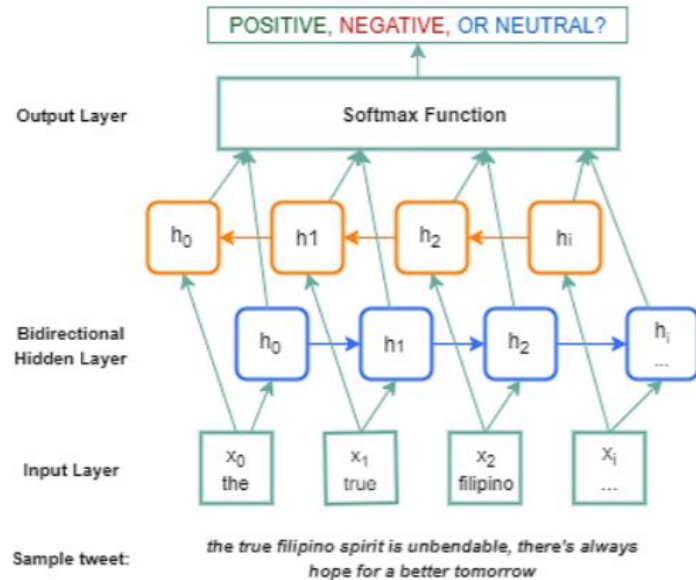
We used deep learning technique (RNN) to understand the semantics behind each tweet, classifying it into three emotional categories: **positive**, **negative**, or **neutral**.



Understanding Sentiments of Filipinos During Typhoons



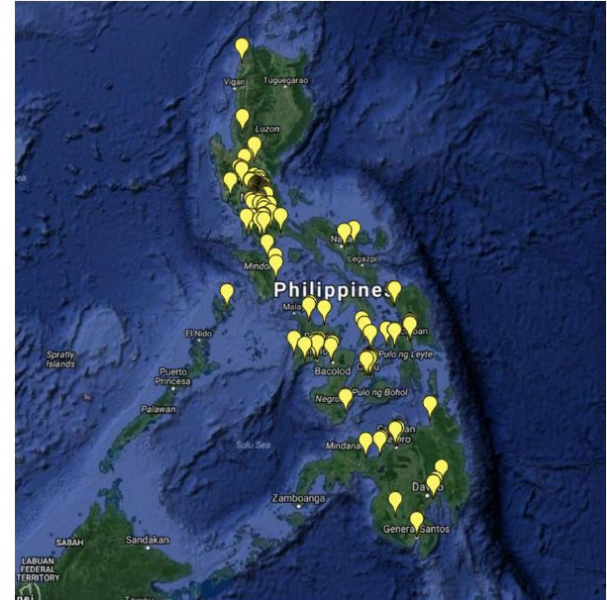
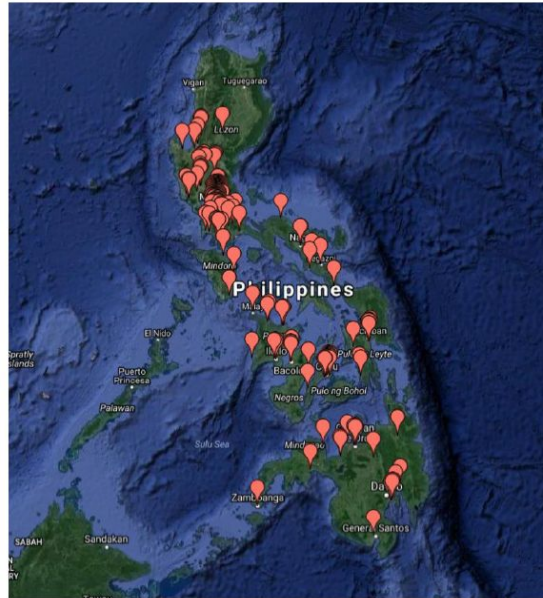
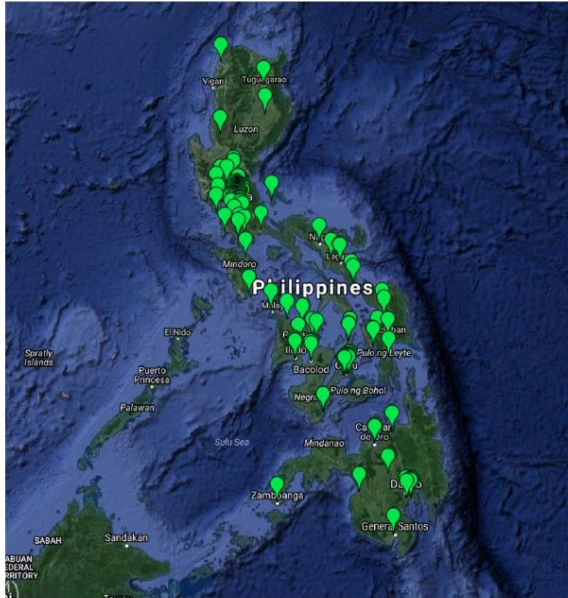
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Understanding Sentiments of Filipinos During Typhoons



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Modeling Themes from COVID-19 Public Reports

A research article written by Joseph Marvin Imperial. Published in Medium and DLSU's COVID Research Portal.

Modeling Themes from COVID-19 Public Reports



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Isko Moreno Domagosa
@IskoMoreno

As promised, simula na po ngayong araw na ito ang distribution ng P1,000 per family (Manila City Amelioration Crisis Assistance Fund) sa bawat Barangay, 568,000 families sa buong Maynila.

[Translate Tweet](#)



12:57 PM · Apr 7, 2020 · [Twitter for iPhone](#)

600 Retweets 5.2K Likes



Manila Public Information Office
@ManilaPIO

BREAKING: Umabot na sa 221 ang mga residente ng Lungsod ng Maynila na nagpositibo sa COVID-19, ayon sa datos ng Manila Health Department (MHD). 17 dito ang nagrekober na at 30 naman ang namatay.

[#AlertoManileno](#) [#COVID19PH](#)

[Translate Tweet](#)



10:05 PM · Apr 6, 2020 · [Twitter for iPad](#)

156 Retweets 492 Likes

Modeling Themes from COVID-19 Public Reports



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██████████ · Mar 16
Replying to @IskoMoreno
Yorme yung barangay po namen walang pakielam yung chairman walang curfew kaya lahat ng bata nasa labas pa at may mga nag iinuman pa

1 20

██████████ · Mar 17
Replying to @IskoMoreno
Napakabuti po ng puso nyo yorme. Sana po mapagsabihan nyo ang mga brgy officials nyo na kumilos na para sa nasasakupan nila, hindi yung nakatunganga lang. Ayaw maglabas ng budget para mag sanitize ng brgy. Pero madalas ang inuman sa harap pa mismo ng bahay ng chairman.

██████████ · Mar 27
Replying to @IskoMoreno
Yorme pls check this Racist Police! This picture posted March 23, 2020. Ang tanong san ang Social Distancing dito Gago Col. Rey Magdaluyo? You are not wearing Facemask! Ikaw ang lumalabag sa kautosan mismo ni Pres Duterte, Mayor Yorme at ng PNP ABUSADO KA! Pls investigate po.

██████████ · Mar 30
Replying to @ManilaPIO
Sana po ipag utos din sa mga kapulisan patin ang pag likot sa mga Barangay... d2 po sa amin mismong mga Barangay Officials pa ang nangunguna sa inuman malapit pa sa Barangay Hall mismo... nakakadismaya lang :(

1 3

██████████ · Mar 30
Ginagamit pa ang mga barikada ng Barangay para maitimbre agad sa Barangay Hall kung may parating na Pulis para mailigpit nila ang inuman nila... mismong Barangay Officials pa ho ang nangunguna sa paglalasing.

1

██████████
@IskoMoreno sana mayor may nagiikot talaga na mga tauhan niyo sana mapuntahan niyo ang dist3 brgy 274 parang may piyesta eh tuod naman talaga lahat ng official ng barangay at tanod duon e!!!

Translate Tweet

2:00 PM · Mar 19, 2020 · Twitter for Android

Modeling Themes from COVID-19 Public Reports



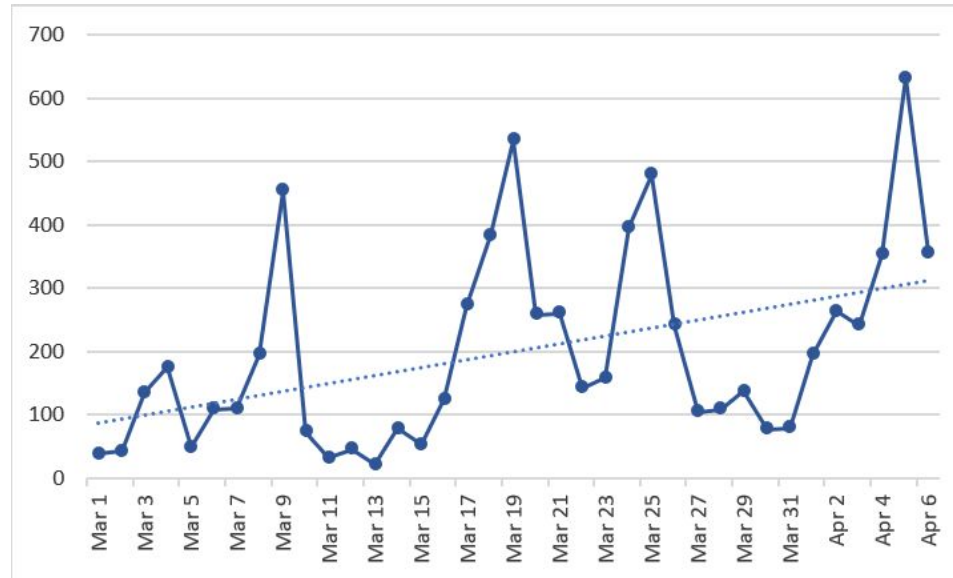
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	A	B	C	D	E	F	G	H	I	J	K
1	id	conversati	created_a	date	time	timezone	user_id	username	name	place	tweet
2	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	22:09:50	Malay Pen	4.15E+09				Very good project, Yorme!
3	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	21:58:15	Malay Pen	1.10E+18				@IskoMoreno Yorme, Manila Post Office @Ppostofficial. Tulong po. Paki bantayan sana ang mga sulat naming mga OFW. Nagpadala
4	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	21:37:55	Malay Pen	1.72E+08				@IskoMoreno GOOD MORNING YORME. WHY THE VENDORS, ILLEGAL PARKINGS, LINIS MO HARAP MO, HOMELESS PROGRAMS AR
5	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	20:13:43	Malay Pen	1.18E+18				@IskoMoreno nag-quit na po siya, he's already resting yorme. Thank you sa pagnotice mo hehe. https://twitter.com/potatogani/st
6	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	20:10:27	Malay Pen	1.08E+18				Tinapos nya na journal nya yorme, pero tinapos nya na rin buhay nya.
7	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	20:00:48	Malay Pen	1.18E+18				@IskoMoreno yorme thank you for this, isa sa mga kagustuhang niya ay nangyari. Now he can rest in peace. we love u @potatogani
8	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	18:34:24	Malay Pen	1.04E+18				@IskoMoreno ay oh ngaun k Lang nakita!!!! Meron p Lang ganto s Idol yormeðŸ~Š pic.twitter.com/T5reKoVKGp
9	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	16:38:14	Malay Pen	1.10E+18				Yorme paano kung mag lagay ng mga halaman sa bangketa ang barangay... Baka ma-obstruction na naman at hakutin ng DPS.
10	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	15:39:43	Malay Pen	1.10E+18				mas mainam po Yorme at magiging inspired ang bawat tao kung ang mabebenipisyo ng reward na yan ay ang mismong taong-barang
11	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	15:09:28	Malay Pen	1.01E+18				* Ajumma Yorme, dami na naman pong mga nakapark sa gedli baka naman po pede mamompyang ng baranggay Chairman.
12	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	14:58:33	Malay Pen	1.31E+09				Talo na ang Pacheco at bandang Madrid, puro kasi tae ng aso't pusa ang nasa kalsada nila, walang kusa. Doon pa naman ako banda t
13	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	13:21:47	Malay Pen	8.87E+17				Yorme, you may have good intentions but this feels inappropriate and open to corruption. Public funds must be used by all, not won
14	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	22:09:50	Malay Pen	4.15E+09				Very good project, Yorme!
15	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	21:58:15	Malay Pen	1.10E+18				@IskoMoreno Yorme, Manila Post Office @Ppostofficial. Tulong po. Paki bantayan sana ang mga sulat naming mga OFW. Nagpadala
16	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	21:37:55	Malay Pen	1.72E+08				@IskoMoreno GOOD MORNING YORME. WHY THE VENDORS, ILLEGAL PARKINGS, LINIS MO HARAP MO, HOMELESS PROGRAMS AR
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18	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	20:10:27	Malay Pen	1.08E+18				Tinapos nya na journal nya yorme, pero tinapos nya na rin buhay nya.
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23	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	15:09:28	Malay Pen	1.01E+18				* Ajumma Yorme, dami na naman pong mga nakapark sa gedli baka naman po pede mamompyang ng baranggay Chairman.
24	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	14:58:33	Malay Pen	1.31E+09				Talo na ang Pacheco at bandang Madrid, puro kasi tae ng aso't pusa ang nasa kalsada nila, walang kusa. Doon pa naman ako banda t
25	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	13:21:47	Malay Pen	8.87E+17				Yorme, you may have good intentions but this feels inappropriate and open to corruption. Public funds must be used by all, not won
26	1.23E+18	1.23E+18	1.58E+12	01-Mar-20	16:23:18	Malay Pen	1.22E+18				pwede nyo po ba turuan mayor ng paranaque? traffic, illegal parking, pasaway ma triccycle especially sa better living po. madumi kal

Modeling Themes from COVID-19 Public Reports



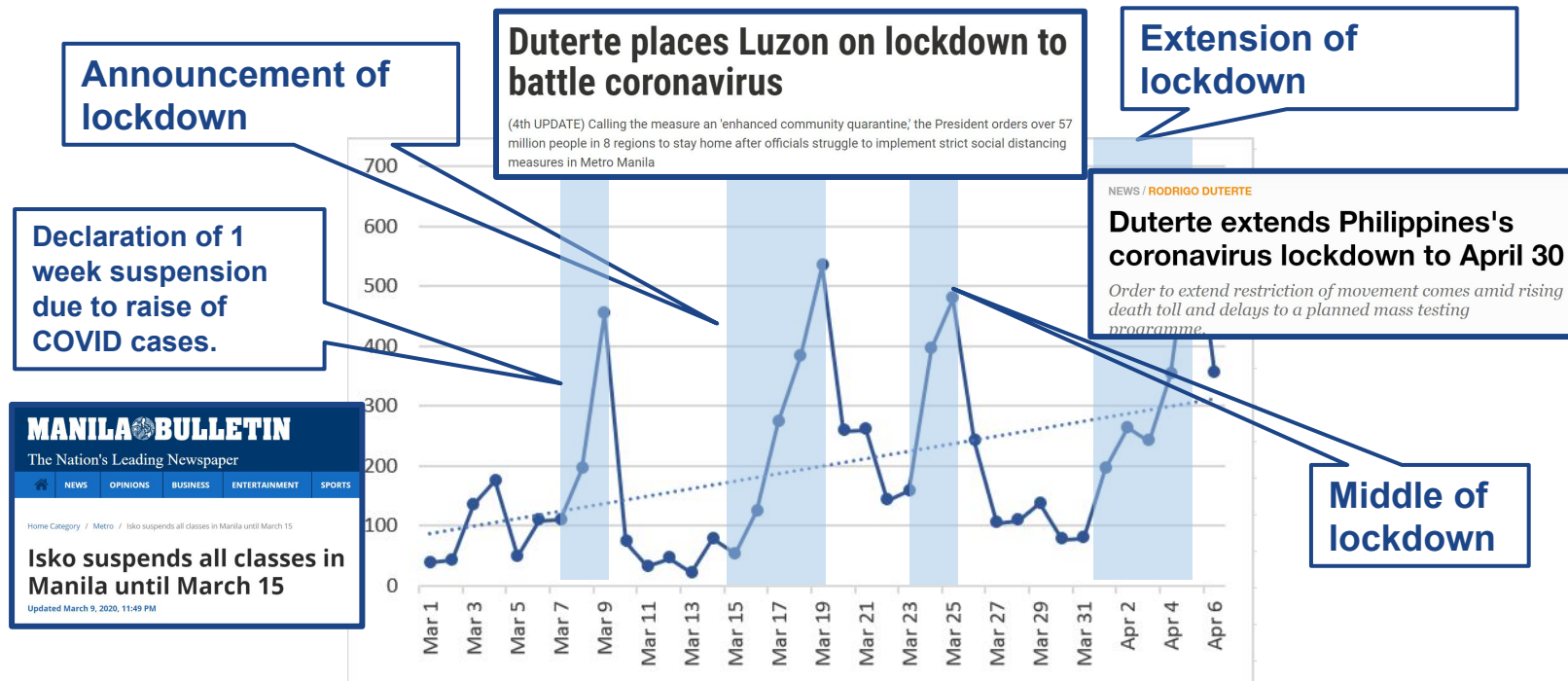
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Modeling Themes from COVID-19 Public Reports



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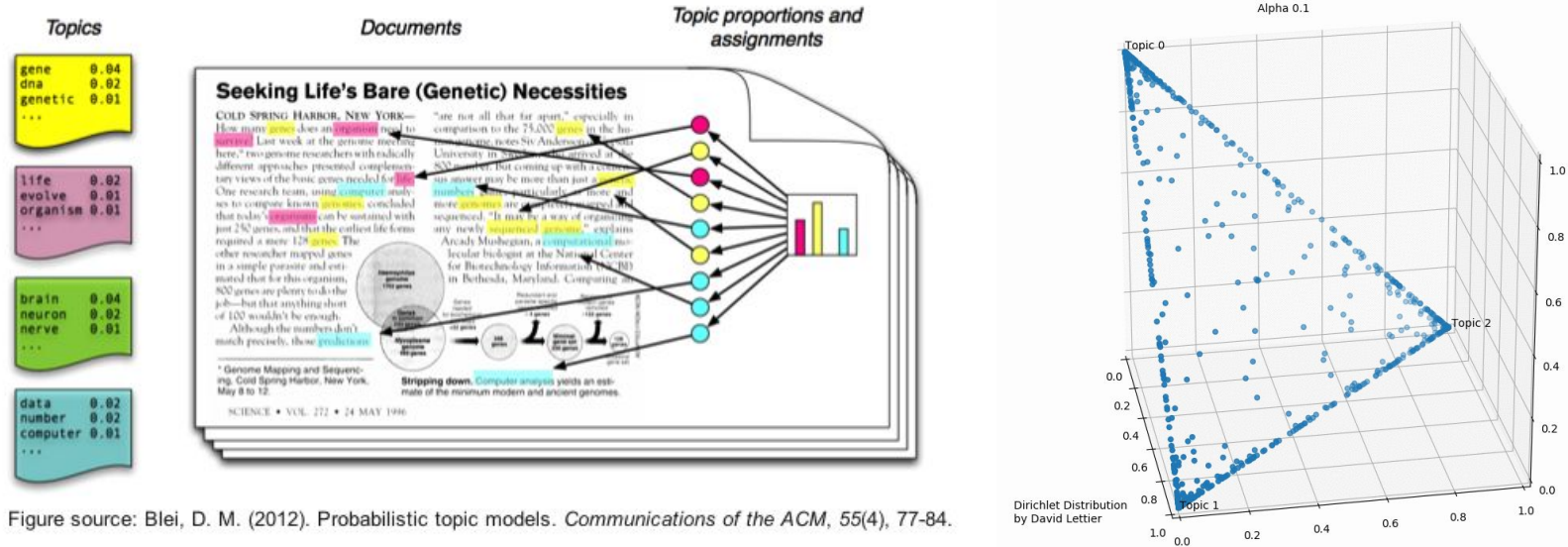


Figure source: Blei, D. M. (2012). Probabilistic topic models. *Communications of the ACM*, 55(4), 77-84.

Modeling Themes from COVID-19 Public Reports



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Using **BTM topic modelling** revealed four central themes from the public reports:

1. Continuous declaration of needs (relief goods, cash).
2. Abuse and negligence of barangay captains and police.
3. Use of tricycles for ferrying COVID patients.
4. Petition to suspend classes in NCR indefinitely.



Modeling Themes from COVID-19 Public Reports



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BRGY #	COMPLAINT
33	brgy 33 pasuyo po dito maayos. madami pa din pong tambay sa labas regardless anung oras
83	brgy 83 zone 7 po is p500 lang binigay instead of 1k . sabi po ng asawa ng chairman, city hall daw po nag-utos na pagkasyahin na lang and pinipilit po nila na 460 daw po ang number ng families dun, iba po sa pinost niyo po
96	brgy. 96, zone 8, district 1, tondo, manila. indi daw kasama nanay ko though senior sya at wala sa listahan nila.
101	barangay 101 lng ata walang balak sa ganyan yorme hahahaah hanggang pirma lng tapos walang dararing hahahah
174	brgy 174 never pa kami nabbgyan dito simula nung lockdown po
182	brgy 182 simula ng ecq inerereklamo ko na . until now, walang aksyon . pyesta araw araw. may darating na pulis, tago lahat ng tao. di pa nakakaliko ng kanto labasan uli. may bingo, inuman, bukas na computer shop, tong-its . takot ang barangay kasi baka di na sila iboto...
342	brgy 342, 4 senior citizen wala pang natatanggap mg gates o php1,500 na sinabi
500	brgy 500 po god bless dps



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Investigating Child Pornography and Exploitation on Twitter During Lockdown

A data science project by Michael Ibañez, Ranz Sapinit, Lloyd Reyes, and Mohammed Hussien. Advised by Joseph Marvin Imperial.

Investigating Child Pornography and Exploitation on Twitter During Lockdown



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Unsafe in Lockdown: Double Threats to Children During COVID-19 Crisis

by Samson Inocencio Jr., National Director of IJM Philippines

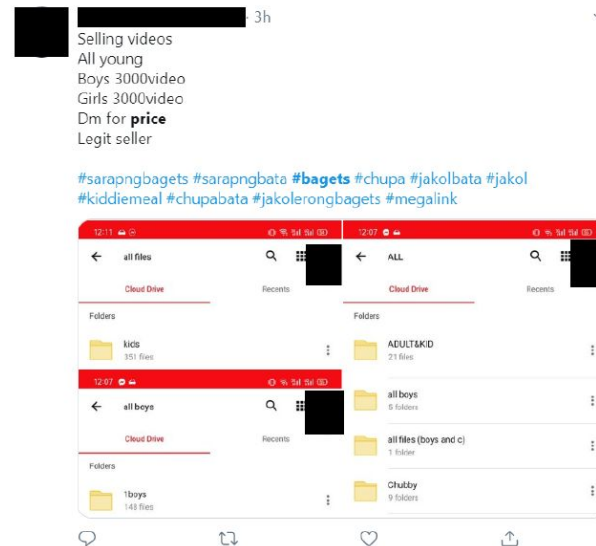
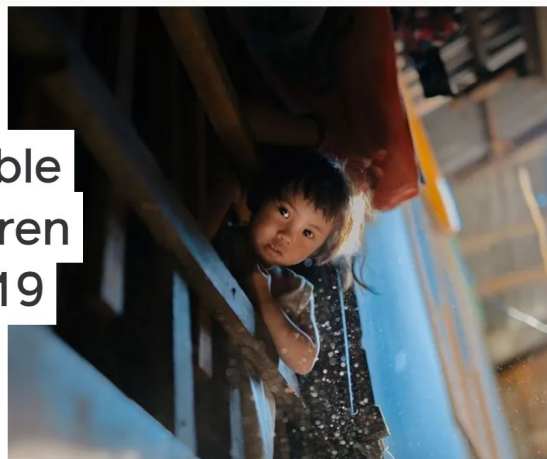


Fig. 1. Example tweet showing a peddler marketing child pornographic material on Twitter.

Investigating Child Pornography and Exploitation on Twitter During Lockdown



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Fig. 2. Word cloud visualization of top-occurring / high-frequency words from the data.

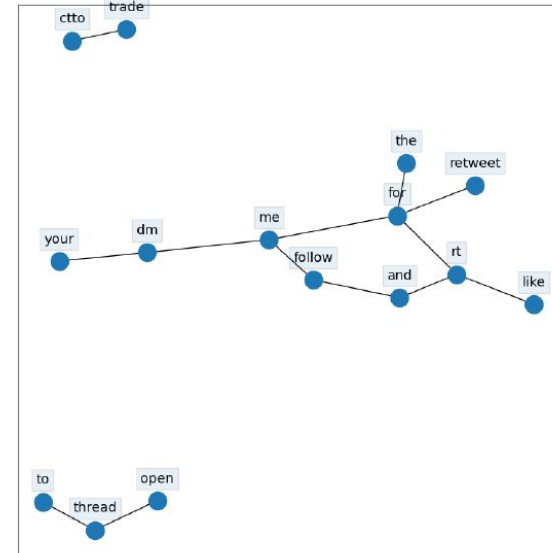


Fig. 3. Trigram network indicating terms that frequently co-occur in child pornographic tweets.

Investigating Child Pornography and Exploitation on Twitter During Lockdown



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TABLE I
ROLES OF SEXUAL PREDATORS BASED ON THEMATIC WORD USAGE.

Persona	Vocabulary
The Propagator	rt, follow, vid, retweet, videos, like, link, jakol, post, comment
The Peddler	bagets, dm, price, pic, area, php, avail, looking, pls, willing
The Social	tara, face, pogi, pm, jakol, jan, pwede, want, sino tayo
The Voyeur	boso, face, tara, pic, dm, bagets, baby, sarap, cr, boys

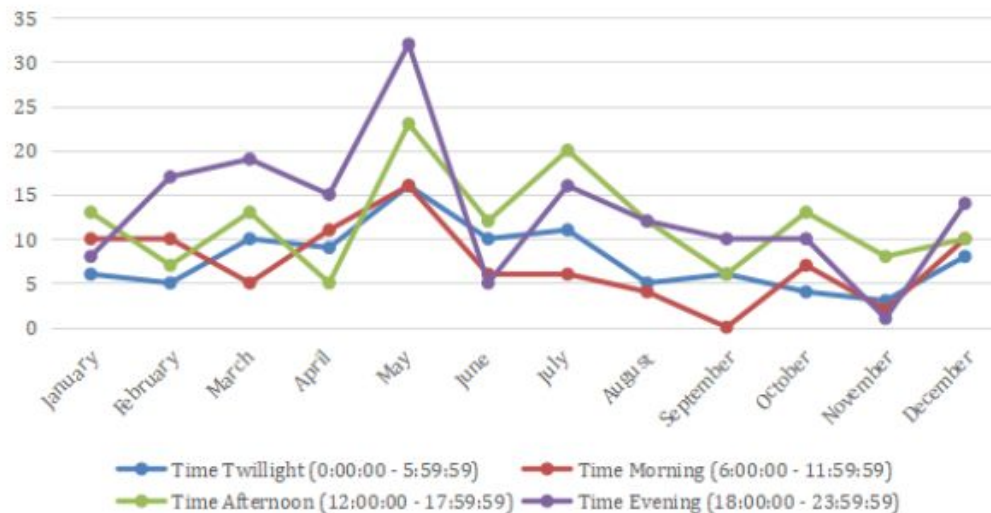
Investigating Child Pornography and Exploitation on Twitter During Lockdown



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Online Sexual Abuse



The NLP Research Primer



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The primer contains short discussions on basic NLP processes, example published NLP papers by Filipino students and researchers, open-source codes and repositories, and links to online tools to help you kickstart your own NLP project.

bit.ly/nlp-primer-ph

NLP Mini Projects



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1. **Hate speech classifier** - what words make a text convey hate speech or not?
2. **Next word prediction using language models** - if you train a language model from a large text, it can probabilistically guess the next word.
3. **Spell checker with edit-distance formulas** - edit distance formulas calculate changes in texts such as alterations, deletions, and insertions.
4. **Sentiment analyzer using emotion dictionaries** - what words make a text convey strong emotions?
5. **Static string-based chatbots** - use string matching and similarity algorithms to intelligently match answers to queries.

NLP “Thesis-Worthy” Projects



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1. **A readability assessment model for X language** - can we develop an automated machine-learning based model for identifying readability of text in other PH languages? Cebuano, Bikolano, Ibanag, Chavacano, etc.
2. **An automated essay scoring tool for X language** - given an essay written by a student, how can we teach machines to automatically grade based on factors that make a good essay such as being cohesive, well organized, contains relevant topics, and grammatically correct?
3. **Suicide ideation detection from social media posts** - can we teach a machine to identify signals that a person is forming / about to form suicidal thoughts based from their public social media posts? Note that this is not a prescriptive approach.

Advice



1. Assess your skill set and domain knowledge.
2. Have a clear goal and well-defined problem.
3. Ensure resources are available.
4. Research how you will represent your data as features.
5. Inspect your model and evaluate correctly with existing baselines.



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Computing Society of the Philippines
Special Interest Group - Natural Language Processing (SIG-NLP)

A Primer to Natural Language Processing Research

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