











#### PolEval 2019 Task 6: First Open Shared Task for Automatic Cyberbullying Detection in Polish Twitter

(Pierwsze Zadanie dot. Automatycznego Wykrywania Cyberagresji w Polskim Twitterze)

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#### **Outline**

- Why this task today?
- Task description
  - Task 6-1: harmful vs. non-harmful
  - Task 6-2: cyberbullying vs. hate-speech vs. non-harmful
- Cyberbullying: a working definition
- Participants
- Winners
- Future Plans

### Thanks to our sponsor



SamuraiLabs

https://www.samurailabs.ai/

- Since 2007
  - Awareness in Japan: Takikawa suicide incident
- Since 2015/2016
  - Post-truth reality: USA, UK, Hungary, etc.
- Increase of abuse on Internet
  - Harassment
  - Cyberbullying
  - Fake-news
  - Large-scale manipulations (Cambridge Analytica, etc.)

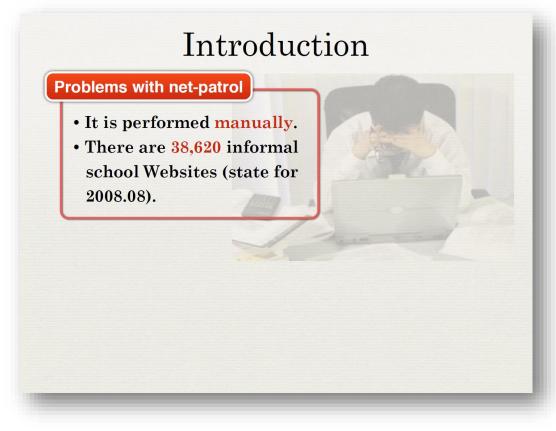


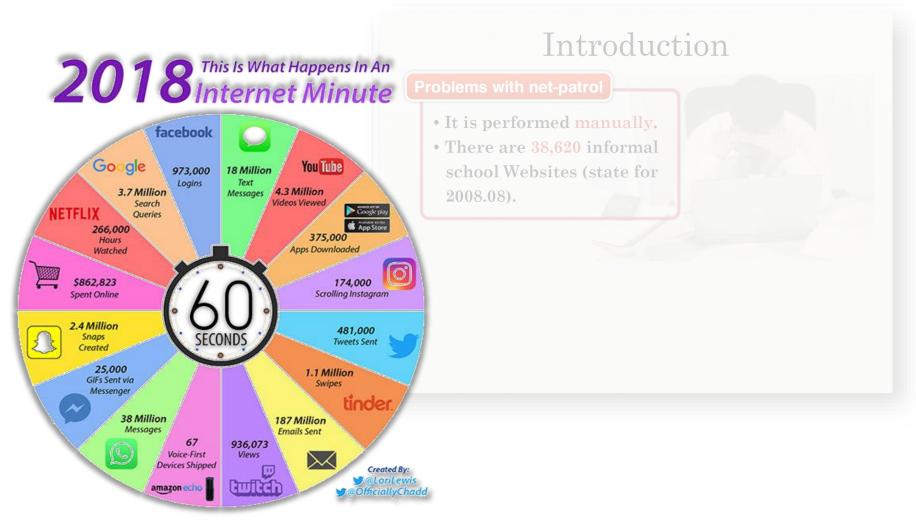






#### In 2008:





- World 10 years ago:
- Twitter, Facebook, Youtube just started
- No Instagram
- Cyberbullying / cyber-bullying / cyber bullying ?

- First studies in social sciences:
  - Hinduja, S., & Patchin, J. W. (2008). Cyberbullying: An exploratory analysis of factors related to offending and victimization. *Deviant behavior*, 29(2), 129-156.
  - Olweus, D. (2012). Cyberbullying: An overrated phenomenon?. *European Journal of Developmental Psychology*, *9*(5), 520-538.
  - **Pyżalski, J.** (2012). From cyberbullying to electronic aggression: Typology of the phenomenon. *Emotional and behavioural difficulties*, *17*(3-4), 305-317.

- 2008: First studies in <u>Automatic Cyberbullying Detection</u>
- 2009: First application-ready methods
- Nobody interested in global solution

- 2008: First studies in <u>Automatic Cyberbullying Detection</u>
- 2009: First application-ready methods
- Nobody interested in global solution
- 2018: Problem too large
- 2019: Companies, authorities in Japan asking from help:
  - Japanese Police
  - Several companies
- One person/lab/company cannot solve all problems
- Foundation of the field
- Need army of people → This is why this task today!

# **Automatic Cyberbullying Detection: Emerging Research and Opportunities**

Michal E. Ptaszynski (Kitami Institute of Technology, Japan) and Fumito Masui (Kitami Institute of Technology, Japan)

#### **Description:**

Due to the prevalence of social network service and social media, the problem of cyberbullying has risen to the forefront as a major social issue over the last decade. Internet hate, harassment, cyberstalking, cyberbullying—these terms, which were almost unknown 10 years ago—are in the everyday lexicon of all internet users. Unfortunately, it is becoming increasingly difficult to undertake continuous surveillance of websites as new ones are appearing daily. Methods for automatic detection and mitigation for online bullying have become necessary in order to protect the online user experience.

Automatic
Cyberbullying
Detection
Emerging Research and Opportunities

Af STU,
Af STUPID UGLY WEIRD FAT STUPID

Automatic Cyberbullying Detection: Emerging Research and Opportunities provides innovative insights into online bullying and methods of early identification, mitigation, and prevention of harassing speech and activity. Explanations and reasoning for each of these applied methods are provided as well as their pros and cons when applied to the language of online bullying. Also included are some generalizations of cyberbullying as a phenomenon and how to approach the problem from a practical technology-backed point of view. The content within this publication represents the work of deep learning, language modeling, and web mining. It is designed for academicians, social media moderators, IT consultants, programmers, education administrators, researchers, and professionals and covers topics centered on identification methods and mitigation of internet hate and online harassment.

**ISBN:** 9781522552499 **Release Date:** November, 2018 **Copyright:** 2019 **Pages:** 190



# Task Descriptions

#### Task 6-1: harmful vs. non-harmful

Goal:

Distinguish between

- normal (non-harmful) tweets (class: 0)
- any kind of harmful information (class: 1).

# Task 6-2: cyberbullying vs. hate-speech vs. non-harmful

Goal:

Distinguish between

- Non-harmful (0)
- Cyberbullying: addressed to a private person/s (1)
- Hate-speech: public person/entity/larger group (2)

## Task/dataset preparation:

- Data acquisition:
   Agata Pieciukiewicz, Polish-Japanese Academy of Information Technology,
- Tweet tagging: Students of Jagiellonian University, employed by Kotoken Language Laboratory under the supervision of dr. Pawel Dybala
- General oversight and data check:
   Michal Ptaszynski, Kitami Institute of Technology, Japan

#### Cyberbullying: a working definition (1)

#### **General characteristics:**

- Power imbalance (Nierównowaga sił) \*
- Repetitiveness (Powtarzalność) \*
- Peer group (Grupa rówieśnicza) \*

\* Difficult to grasp on the Internet

#### Cyberbullying: a working definition (2)

#### Content (what to look for when annotating)

- Disclosure of <u>private information</u> (Tel. Number, e-mail, address, school name / number, class, PESEL/Private ID, credit card no.)
- Personal attack ("Hang yourself, bitch!")
- Threats ("I will find you and I will kill you")
- Blackmail ("I will tell everyone where you live if you do not pay me")
- Ridiculing ("Look at that fat guy")
- Gossip / insinuations ("Hey, did you know he's gay?")
- Accumulation of profanity (longer "bundle" of profanity)
- Various combinations of all of the above

# Examples

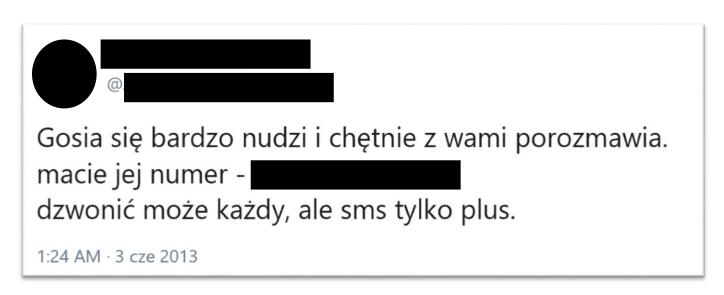
### Example 1



Ja mam dla ciebie lepszą propozycję 😊: powieś się gdzieś pod lasem UB-ecka gnido 👍.

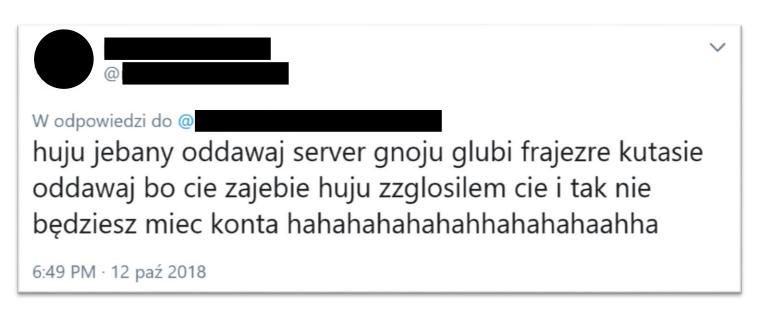
- Aggressive vocabulary
- Personal attack

# Example 2



- Disclosure of personal information:
  - Phone number

# Example 3



- Accumulation of profanity
- Threats
- Ridiculing

#### **Dataset**



https://github.com/ptaszynski/cyberbullying-Polish

Michal Ptaszynski, Agata Pieciukiewicz, Pawel Dybala. (2019). **Results of the PolEval 2019 Shared Task 6: First Dataset and Open Shared Task for Automatic Cyberbullying Detection in Polish Twitter**, In *Proceedings of the PolEval 2019 Workshop*, Warsaw. Institute of Computer Science, Polish Academy of Sciences

• 16 submissions

- 16 submissions
- 14 valid submissions
  - One double submission (uploading accident)
  - One troll



- 16 submissions
- 14 valid submissions
  - One double submission (uploading accident)
  - One troll
- 9 unique teams
- Task 6-1: 14 submissions
- Task 6-2: 8 submissions

- Application of widely available solutions
  - Fast.Al NLP
  - BERT
  - FastText
  - Flair
  - SentencePiece
  - SVM
- Original solutions
  - Przetak

#### Task 6-1 Results

Submission author(s)	Affiliation	Submitted system	Precision	Recall	F-score	Accuracy
Piotr Czapla, Marcin Kardas	n-waves	n-waves ULMFiT	66.67%	52.24%	58.58%	90.10%
Marcin Ciura	independent	Przetak	66.35%	51.49%	57.98%	90.00%
Tomasz Pietruszka	Warsaw University of Technology	ULMFiT + SentencePiece + BranchingAtten- tion	52.90%	54.48%	53.68%	87.40%
Sigmoidal Team (Renard Korzeniowski, Przemysław Sadowski, Rafał Rolczyński, Tomasz Korbak, Marcin Możejko, Krystyna Gajczyk)	Sigmoidal	ensamble spacy + tpot + BERT	52.71%	50.75%	51.71%	87.30%
Sigmoidal Team	Sigmoidal	ensamble + fastai	52.71%	50.75%	51.71%	87.30%
Sigmoidal Team	Sigmoidal	ensenble spacy + tpot	43.09%	58.21%	49.52%	84.10%
Rafał Prońko	CVTimeline	Rafal	41.08%	56.72%	47.65%	83.30%
Rafał Prońko	CVTimeline	Rafal	41.38%	53.73%	46.75%	83.60%
Maciej Biesek	independent	model1-svm	60.49%	36.57%	45.58%	88.30%
Krzysztof Wróbel	AGH, UJ	fasttext	58.11%	32.09%	41.35%	87.80%
Katarzyna Krasnowska-Kieraś, Alina Wróblewska	IPI PAN	SCWAD-CB	51.90%	30.60%	38.50%	86.90%
Maciej Biesek	independent	model2-gru	63.83%	22.39%	33.15%	87.90%
Maciej Biesek	independent	model3-flair	81.82%	13.43%	23.08%	88.00%
Jakub Kuczkowiak	UWr	Task 6: Automatic cyberbullying detection	17.41%	32.09%	22.57%	70.50%

#### Task 6-2 Results

Submission author(s)	Affiliation	Name of the submitted system	Micro-Average F-score	Macro-Average F-score
Maciej Biesek	independent	model1-svm	87.60%	51.75%
Sigmoidal Team (Renard Korzeniowski, Przemysław Sadowski, Rafał Rolczynski, Tomasz Korbak, Marcin Możejko, Krystyna Gajczyk)	Sigmoidal	ensamble spacy + tpot + BERT	87.10%	46.45%
Krzysztof Wróbel	AGH, UJ	fasttext	86.80%	47.22%
Maciej Biesek		model3-flair	86.80%	45.05%
Katarzyna Krasnowska-Kieraś, Alina Wróblewska	IPI PAN	SCWAD-CB	83.70%	49.47%
Maciej Biesek	independent	model2-gru	78.80%	49.15%
Jakub Kuczkowiak	UWr	Task 6: Automatic cyberbullying detection	70.40%	37.59%
Sigmoidal Team	Sigmoidal	ensamble + fastai	61.60%	39.64%

#### Winners

- Task 6-1:
  - 1. n-waves (based on fast.AI)
  - 2. (runner-up) Przetak (original solution)
- Task 6-2:
  - 1. Maciej Biesek (SVM)
  - 2. (runner-up) Sigmoidal

#### Winners

- All participants are winners
- Contributed to the creation of the field

#### but

- Do not feel satisfied
- Go and use your solutions in practice

# Future plans

- Dataset
  - ~10x larger
  - Twitter conversation threads
  - More expert annotations
- Solutions
  - More feature engineering
  - More error analysis
- Implementations
  - Most released on GitHub
  - More practical implementations = less cyberbullying











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#### Let's stay in touch!

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agata.niescieruk@pjwstk.edu.pl

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#### **Our Private Troll**



- 100% Accuracy, 100% F-score
- Submitted pre-released test set answers

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czw., 11 kwi 2019 o 21:31 Michal Ptaszynski <<u>michal.ptaszynski@gmail.com</u>> napisał(a): Szanowny Panie,

Z tej strony kłania się Michal Ptaszynski, organizator zadania 6 na PolEval 2019.

Właśnie podsumowuje wyniki tego zadania i widzę, ze osiągnął pan niezwykle wysoki wynik 100% wszystkiego...

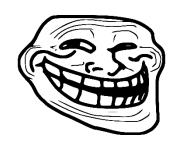
Niestety, w przeciwieństwie do wszystkich innych uczestników nie udostępnił pan kodu swojego systemu, wiec nie jesteśmy w stanie obiektywnie ocenić czy rzeczywiście wykonał pan zadanie.

Jeśli chciałby pan, aby pana system był wzięty pod uwagę przy podliczaniu wyników, prosiłbym o udostępnienie kodu.

Pozdrawiam,

Michal Ptaszynski

#### **Our Private Troll**



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Właśnie podsumowuje wyniki tego zadania i widzę, ze osiągnął pan niezwykle wysoki wynik 100% wszystkiego...

Niestety, w prz udostępnił pan obiektywnie oc

Jeśli chciałby

Do:

wyników, prosił

Pozdrawiam,

Michal Ptaszyr

Od: Jan Złoty <janzlotyk@gmail.com>
Data: Sat, 13 Apr 2019 05:55:43 +0900
Temat: Re: Zgloszenie na PolEval

"Michal Ptaszynski" <michal.ptaszynski@gmail.com>

Do I have to release the source code of my system to participate in PolEval? No, but you are strongly encouraged to do so. Releasing the source code is a strict condition for receiving the award.