First ACL Workshop on Ethics in Natural Language Processing, 2017

# Ethical by Design: Ethics Best Practices for NLP

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Teaching machines how to process and understand human language



Siri





#### Google Translate

ChatGPT

# ABSTRACT



Ethical **issues** in natural language processing



How ethical is the work, in terms of both, **process** and **outcome**?



**Guidelines** for best practices introducing *ethics review board* 



**First** published work on NLP and ethics from a principled process perspective



# INTRODUCTION



#### **TARGET POPULATION**

Software developers, practitioners



#### GOALS

Addressing ethical issues in NLP



## **RESEARCH QUESTIONS**

What ethical concerns exist in the realm of NLP?

What specifically is different in NLP with respect to ethics?

01

02

03

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Issues arising from human interaction

Issues arising from machine processing

How should these ethical issues be addressed?

### **LITERATURE REVIEW**

02

03

01

04

#### MORAL PHILOSOPHY

Outlines three schools of moral philosophy

#### PROFESSIONAL ETHICS

Outlines guidelines established by various professional bodies

#### ML & BIG DATA ETHICS

Outlines efforts addressing issues in Big data and ML, primary focused on privacy and bias

#### **NLP ETHICS**

Outlines NLP Application and Methodology ethics

# **MORAL PHILOSOPHY**



02

#### **NICOMACHEAN ETHICS**

Happiness is the highest attainable and ultimate goal for humans (Aristotle)



Decision criterion to decide whether an action is morally right (Kant)



#### UTILITARIANISM

Maximize happiness for the largest number of people (Mill)



# **ML & BIG DATA ETHICS**



#### **INFORMATION & BIG DATA ETHICS**

The Black Box Society, Pasquale (2015): analyzes societal impact of

- data collection
- user profiling
- data vendors and buyers

#### **MACHINE LEARNING AND BIAS**

Fairness, Accountability, and Transparency in Machine Learning (FATML) discusses *technical solutions* for

- accountability
- transparency
- fairness

in machine learning models



# **NLP APPLICATION ETHICS**



02

03

#### **SOCIAL IMPACT OF NLP**

Outlines and initiates the discussion on social impact of NLP (Hovy and Spruit (2016))

#### **DEVIL'S TRIANGLE**

Ethical considerations for chatbot detection methods (Thieltges, Schmidt and Hegelich (2016))

#### **IMPACT OF NLP ON JOURNALISM**

Big data and NLP creates a shift in compliance cost (Fairfield and Shtein (2014))



# **NLP METHODOLOGY ETHICS**



#### CROWDSOURCING

- Ethical implications of scaling up simple tasks using anonymous human subjects
- Tasks may include
  - Image captioning
  - Question answering
  - Sentiment analysis
- Popular platform for crowdsourcing: Amazon Mechanical Turk
- Encourages NLP community to seek alternative options (Fort, Adda and Cohen (2011))

# **PROFESSIONAL ETHICS**



#### **ACM CODE OF ETHICS**

- Detailed set of 22 values, insufficient detail on certain moral boundaries, compliance voluntary
- 7 principles to promote *transparency* and *accountability* of algorithms: (ACM, 2017)
  1. Awareness
  - 2. Access and redress
  - 3. Accountability
  - 4. Explanation
  - 5. Data Provenance
  - 6. Auditability
  - 7. Validation and Testing

# **PRIVACY BY DESIGN**

Principles for privacy devised by Ann Cavoukian, generalized





# ETHICAL ISSUES OF NLP

# **UNETHICAL NLP APPLICATIONS**



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#### UNIX spell(1) COMMAND

Emailed words that are not found in its lexicon to its implementer, without author's consent, for lexicon improvements



#### **AUTOMATED PSYCHOMETRICS**

Predictions based on *Facebook Likes* are more accurate than those made by their friends (Youyou, Kosinski and Stillwell (2015))



#### **MALICIOUS CHATBOTS**

Influencing a discussion or destroying it by injecting noise. *Malicious chatbots built for testing purposes must be sandboxed*.



# PRIVACY



#### **PERSONAL INFORMATION IN CORPORA**

Some corpora contain personal information about individuals along with their identity



#### **SENSITIVE PSYCHIATRIC MATERIAL**

- Corpora of suicide notes compiled to study causes for terminating one's life
- building a classifier to determine how "serious" a suicide note is



#### **EXCESSIVE SURVEILLANCE**

Leads to self-censoring and can undermine democracy



# **FAIRNESS, BIAS & DISCRIMINATION**



#### **INCOMPLETE TRAINING DATA**

System may not exhibit similar performance across all groups of users



#### **TRANSPARENCY AND ACCOUNTABILITY**

Developers may not communicate all limitations of a system

RTP

#### **ABSTRACTION & COMPARTMENTALIZATION**



#### **ABSTRACTION IN CROWDSOURCING**

Example: Work farmed out to API can easily ignore humans behind it



#### COMPARTMENTALIZATION

Example: Building an Information extraction system without looking at the political context in which it is likely being deployed leads to ethical ignorance

### COMPLEXITY



#### **NLP API**

- Big data systems today have complex pipelines that are hosted on the cloud and have *blackbox processes*
- Companies do not have much control over how their API may be used externally
- Leads to the creation of complex macrosystems beyond individual organizational boundaries



# **UNETHICAL RESEARCH METHODS**



#### CONSENT

Performing experiments without briefing and getting consent from participants (and guardians, if participant is a minor)



#### **WORK CONDITIONS**

If the experiment involves efforts of helpers, they must be provided with ethical work conditions

# PROPOSED PROCESS FOR BEST PRACTICES

### **ETHICS REVIEW BOARD**

A Process Proposal for "Ethics by Design" in an Organization.



# REMEDIES FOR ETHICAL DILEMMAS



DISCLOSURE

PERSUASION

# HANDLING ETHICAL DILEMMAS

to document/to reveal injustice to regulators, the police, investigative journalists ("Look what they do!", "Stop what they do!")

**RESIGNATION** to distance oneself III ("I should not/cannot be part of this.")

to influence in order to halt non-ethical activity ("Our organization should not do this.")



# HANDLING ETHICAL DILEMMAS

REJECTION	to distance oneself II; to deny participation; conscientious objection ("I can't do this.")
ESCALATION	raise with senior management/ethics boards ("You may not know what is going on here.")
VOICING DISSENT	to distance oneself I ("This project is wrong.")
DOCUMENTATION	ensure all the facts, plans and potential and actual issues are preserved.

## **DISCUSSION POINTS**

#### **ERB INTEGRATION**

• ERB could slow down the workflow at organizations. Can we integrate "ethics review" more efficiently? What does the tradeoff look like?



# ERB ADOPTION

- If compliance to professional codes of conduct is voluntary, how do we encourage practitioners to adopt ethical frameworks?
- Would its adoption vary across geographic regions?

# REFLECTIONS

- Given the exponential growth of NLP since 2017, we should consider doing an updated survey on its social implications. *Is it getting better? Is it getting worse?*
- Can we establish an "ethics review board" for open source projects? *How do we regulate them better*?



# THANK YOU





