



# Ethics in AI (NLP, in particular): Beyond Biases

Karën Fort

karen.fort@loria.fr / <https://members.loria.fr/KFort>

ITI HealthTech summer school – June 10th, 2026

## Toward a systemic approach

Advertising vs publishing

Environmental impact (in a nutshell)

Conflicts of interests

"All your data are belong to us"

Back to Consent

What about guidelines?

To finish

## Very few systemic approaches to the problem

- ▶ [Lefevre et al., 2015] (in French): a **consequentialist** grid for an ethical assessment of researches and applications
- ▶ [Fort and Amblard, 2018] (in French): a **deontological**, systemic view on ethics in NLP
- ▶ [Bender et al., 2021]: the dangers of **large language models** (impact on people a posteriori)

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# "Overselling" research results



The image shows a screenshot of a press invitation for a conference. On the left is a teal and blue graphic with the text: "JOURNÉE GRAND PUBLIC / MARDI 12 JANVIER 2021 / CERS, Michelangelo, 3 rue Méliès-Boyer, Paris", "Intelligence artificielle et technologies des langues : l'ordinateur passe la barrière de la langue", and the logos for "CERS" and "GDR Groupement de recherche TAL, Département de Linguistique". To the right, the text reads: "Accueil > Espace presse", "Invitation à la journée « Intelligence artificielle : l'ordinateur passe la barrière de la langue »", "04 janvier 2021", and "NUMÉRIQUE".

vs [Bender and Koller, 2020]

## **Climbing towards NLU: On Meaning, Form, and Understanding in the Age of Data**

**Emily M. Bender**  
University of Washington  
Department of Linguistics  
ebender@uw.edu

**Alexander Koller**  
Saarland University  
Dept. of Language Science and Technology  
koller@coli.uni-saarland.de

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## Carbon footprint

<b>Consumption</b>	<b>CO<sub>2</sub>e (lbs)</b>
Air travel, 1 passenger, NY↔SF	1984
Human life, avg, 1 year	11,023
American life, avg, 1 year	36,156
Car, avg incl. fuel, 1 lifetime	126,000
<b>Training one model (GPU)</b>	
NLP pipeline (parsing, SRL)	39
w/ tuning & experimentation	78,468
Transformer (big)	192
w/ neural architecture search	626,155

Table 1: Estimated CO<sub>2</sub> emissions from training common NLP models, compared to familiar consumption.<sup>1</sup>

[Strubell et al., 2019]

Note: this concerns only 1 source out of four [Bannour et al., 2021] ⇒ largely under-estimated

# About water consumption

RESEARCH-ARTICLE | OPEN ACCESS | 



## Making AI Less 'Thirsty'

Uncovering and addressing the secret water footprint of AI models

**Authors:**  [Pengfei Li](#),  [Jianyi Yang](#),  [Mohammad A. Islam](#),  [Shaolei Ren](#) | [Authors Info & Claims](#)

[Communications of the ACM, Volume 68, Issue 7](#) • Pages 54 - 61 • <https://doi.org/10.1145/3724499>

**Published:** 17 June 2025 [Publication History](#)



same periods, respectively.<sup>18</sup> Furthermore, according to the recent U.S. datacenter energy report, the total annual onsite water consumption by U.S. datacenters in 2028 could double or even quadruple the 2023 level, reaching approximately 150–280 billion liters and further stressing the water infrastructures.<sup>25</sup>

[Li et al., 2025]

# Water consumption: it's, in fact, much worse than expected!

**Writing a 100-word email using ChatGPT  
(GPT-4, latest model) consumes**



**1 x 500ml bottle  
of water**

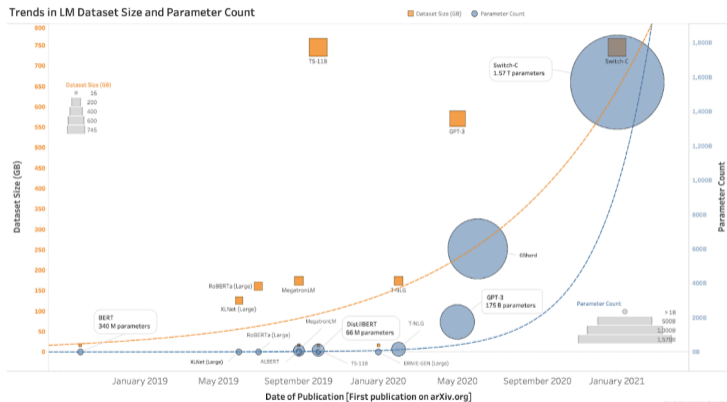


**It uses 140Wh of energy,  
enough for 7 full charges  
of an iPhone Pro Max**

<https://www.thetimes.com/article/9167a8a8-96d1-4a68-9a13-824d862f627a>

# Models trained once and for all?

from a presentation of [Bender et al., 2021]



[Bender et al., 2021]

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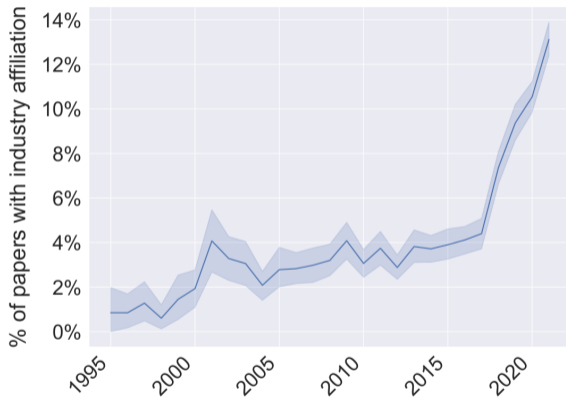
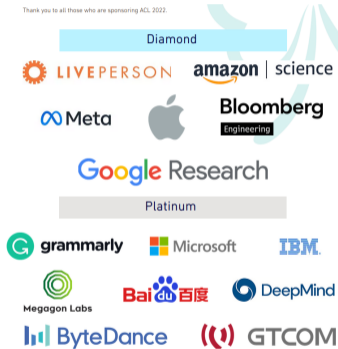
"All your data are belong to us"

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# BigTech's presence in NLP [Abdalla et al., 2023]



Toward a systemic approach

"All your data are belong to us"

Data in NLP

Definition

Data production: real humans behind the curtain

Back to Consent

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Toward a systemic approach

**"All your data are belong to us"**

Data in NLP

Definition

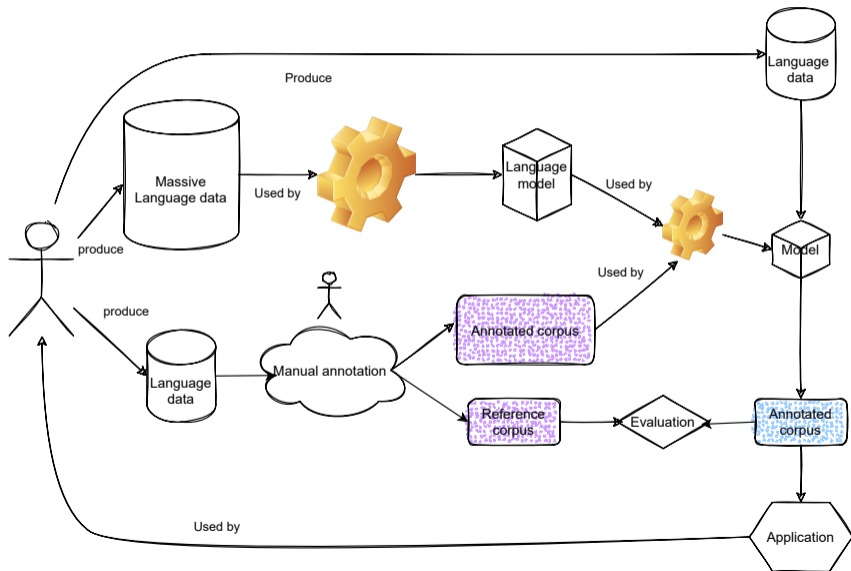
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To finish

# Today's NLP



## Why it's important!



**Ben Hamner**  @benhamner · Oct 9



Programming: 10% writing code. 90% figuring out why it doesn't work

Analyzing data and ML: 1% writing code. 9% figuring out why code doesn't work. 90% figuring out what's wrong with the data



89



1.9K



8.7K



Toward a systemic approach

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**Definition**

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To finish



SINCE 1828

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data

DICTIONARY

THESAURUS

# data

noun, plural in form but singular or plural in construction, often attributive

da·ta | \ 'dā-tə,  'da- *also* 'dä-  \

## Definition of *data*

- 1** : factual information (such as measurements or statistics) used as a basis for reasoning, discussion, or calculation  
*// the data is plentiful and easily available*  
— H. A. Gleason, Jr.  
*// comprehensive data on economic growth have been published*  
— N. H. Jacoby
- 2** : information in digital form that can be transmitted or processed
- 3** : information output by a sensing device or organ that includes both useful and irrelevant or redundant information and must be processed to be meaningful

## Art. 4 GDPR

# Definitions

---

For the purposes of this Regulation:

- (1) 'personal data' means any information relating to an identified or identifiable natural person ('data subject'); an identifiable natural person is one who can be identified, directly or indirectly, in particular by reference to an identifier such as a name, an identification number, location data, an online identifier or to one or more factors specific to the physical, physiological, genetic, mental, economic, cultural or social identity of that natural person;

<https://gdpr-info.eu/art-4-gdpr/>

# Sensitive Data

specifically protected ?

Art. 9 GDPR

## Processing of special categories of personal data

---

1. Processing of personal data revealing racial or ethnic origin, political opinions, religious or philosophical beliefs, or trade union membership, and the processing of genetic data, biometric data for the purpose of uniquely identifying a natural person, data concerning health or data concerning a natural person's sex life or sexual orientation shall be prohibited.

<https://gdpr-info.eu/art-9-gdpr/>

## Sensitive Data: exceptions

2. Paragraph 1 shall not apply if one of the following applies:
  - (a) the data subject has given explicit consent to the processing of those personal data for one or more specified purposes, except where Union or Member State law provide that the prohibition referred to in paragraph 1 may not be lifted by the data subject;
  - (b) processing is necessary for the purposes of carrying out the obligations and exercising specific rights of the controller or of the data subject in the field of employment and social security and social protection law in so far as it is authorised by Union or Member State law or a collective agreement pursuant to Member State law providing for appropriate safeguards for the fundamental rights and the interests of the data subject;
  - (c) processing is necessary to protect the vital interests of the data subject or of another natural person where the data subject is physically or legally incapable of giving consent;

<https://gdpr-info.eu/art-9-gdpr/>

## Sensitive Data: exceptions again

- (d) processing is carried out in the course of its legitimate activities with appropriate safeguards by a foundation, association or any other not-for-profit body with a political, philosophical, religious or trade union aim and on condition that the processing relates solely to the members or to former members of the body or to persons who have regular contact with it in connection with its purposes and that the personal data are not disclosed outside that body without the consent of the data subjects;
- (e) processing relates to personal data which are manifestly made public by the data subject;
- (f) processing is necessary for the establishment, exercise or defence of legal claims or whenever courts are acting in their judicial capacity;
- (g) processing is necessary for reasons of substantial public interest, on the basis of Union or Member State law which shall be proportionate to the aim pursued, respect the essence of the right to data protection and provide for suitable and specific measures to safeguard the fundamental rights and the interests of the data subject;

## Sensitive Data: exceptions again again

- (h) processing is necessary for the purposes of preventive or occupational medicine, for the assessment of the working capacity of the employee, medical diagnosis, the provision of health or social care or treatment or the management of health or social care systems and services on the basis of Union or Member State law or pursuant to contract with a health professional and subject to the conditions and safeguards referred to in paragraph 3;
- (i) processing is necessary for reasons of public interest in the area of public health, such as protecting against serious cross-border threats to health or ensuring high standards of quality and safety of health care and of medicinal products or medical devices, on the basis of Union or Member State law which provides for suitable and specific measures to safeguard the rights and freedoms of the data subject, in particular professional secrecy;

<https://gdpr-info.eu/art-9-gdpr/>

## Sensitive Data: exceptions again again again

- (j) processing is necessary for archiving purposes in the public interest, scientific or historical research purposes or statistical purposes in accordance with [Article 89\(1\)](#) based on Union or Member State law which shall be proportionate to the aim pursued, respect the essence of the right to data protection and provide for suitable and specific measures to safeguard the fundamental rights and the interests of the data subject.

<https://gdpr-info.eu/art-9-gdpr/>

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# Human reinforcement learning: artificial intelligence



TIME

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## Exclusive: OpenAI Used Kenyan Workers on Less Than \$2 Per Hour to Make ChatGPT Less Toxic



<https://time.com/6247678/openai-chatgpt-kenya-workers/>

# (Sometimes, it's not even AI)

Bloomberg

Live TV Markets Economics Industries Tech Politics Businessweek Opinion More

## Opinion

Parmy Olson,  
Columnist

### Amazon's AI Stores Seemed Too Magical. And They Were.

The 1,000 contractors in India working on the company's Just Walk Out technology offer a stark reminder that AI isn't always what it seems.

3 avril 2024 at 18:10 UTC+2  
Corrected 3 avril 2024 at 20:21 UTC+2



By Parmy Olson

Parmy Olson is a Bloomberg Opinion columnist covering technology. A former reporter for the Wall Street Journal and Forbes, she is author of "Supremacy: AI, ChatGPT and the Race That Will Change the World."



Great tech? Photographer Leon Neal/Getty Images Europe

### Tesla Is Looking to Hire a Team to Remotely Control Its 'Self-Driving' Robotaxis

Elon Musk's "fully autonomous" cars will, like other robotaxi vehicles, rely on remote human pilots.

By Lucas Rodek Published November 27, 2024 | Comments (89)



© Robyn Beck / AP

LATEST NEWS

RIP Val Kilmer, Our Batman, Hackberry, and Pacey More  
4/3/2025, 12:44 pm

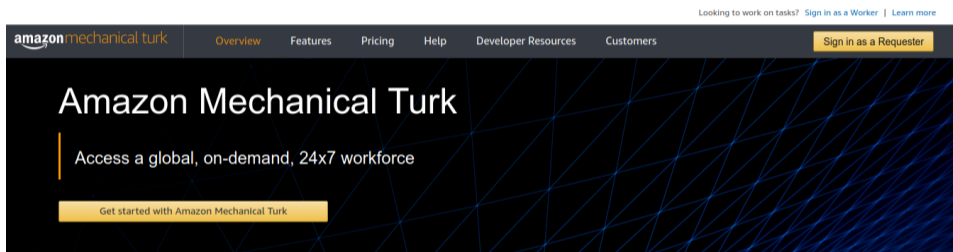
Kryste Shines in Brand New Footage From James Gunn's Superman  
4/1/2025, 10:09 pm

We Tasted the Star Wars Foodie Fun at Disneylands' Season of the Force  
4/1/2025, 7:43 pm

Meta's \$1,800 Smartglasses Will Likely Have a Tiny Display and a Potential Problem with...  
4/1/2025, 5:15 pm

# Where it all started: Amazon Mechanical Turk

## MTurk

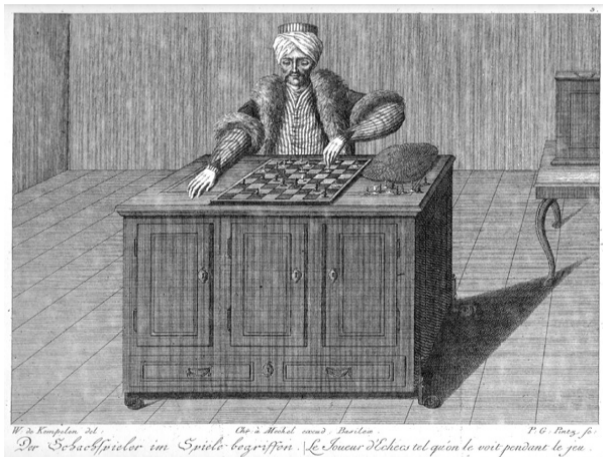


The screenshot shows the top portion of the Amazon Mechanical Turk website. At the top right, there is a link: "Looking to work on tasks? [Sign in as a Worker](#) | [Learn more](#)". Below this is a dark navigation bar with the Amazon Mechanical Turk logo on the left and menu items: "Overview", "Features", "Pricing", "Help", "Developer Resources", and "Customers". On the far right of the navigation bar is a yellow button that says "Sign in as a Requester". The main content area has a dark background with a blue geometric pattern of lines. The text "Amazon Mechanical Turk" is displayed in large white font. Below it, a vertical yellow line is followed by the text "Access a global, on-demand, 24x7 workforce". At the bottom of this section is a yellow button that says "Get started with Amazon Mechanical Turk".

Amazon Mechanical Turk (MTurk) is a crowdsourcing marketplace that makes it easier for individuals and businesses to outsource their processes and jobs to a distributed workforce who can perform these tasks virtually. This could include anything from conducting simple data validation and research to more subjective tasks like survey participation, content moderation, and more. MTurk enables companies to harness the collective intelligence, skills, and insights from a global workforce to streamline business processes, augment data collection and analysis, and accelerate machine learning development.

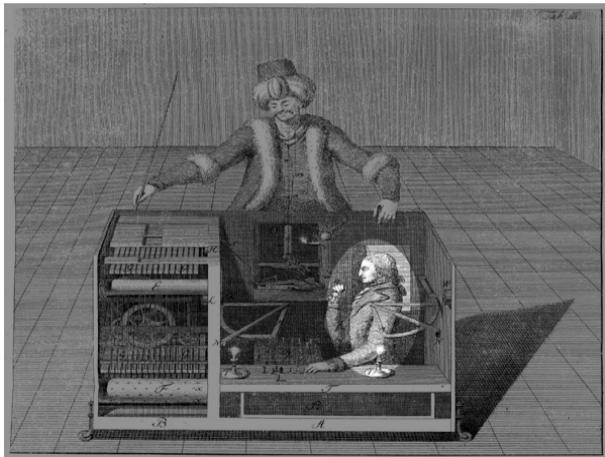
## von Kempelen's "Mechanical Turc"

A mechanical chess player created by J. W. von Kempelen in 1770:



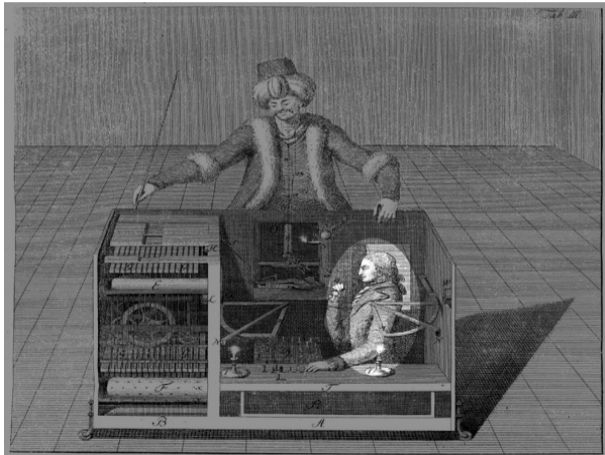
## von Kempelen's "Mechanical Turc"

In fact, a chess master was hidden in the machine:



# von Kempelen's "Mechanical Turc"

it's artificial **artificial** intelligence!

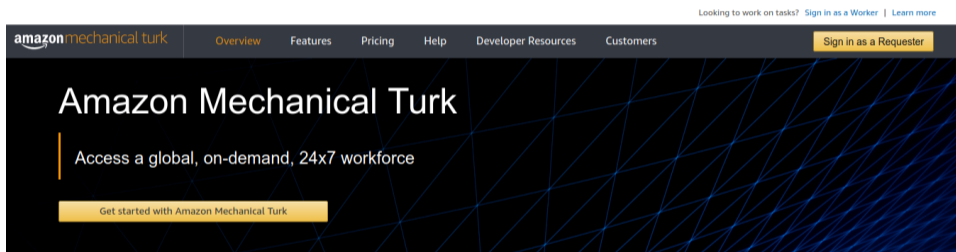


## Amazon Mechanical Turk

Amazon created for its own needs a  
**microworking crowdsourcing platform**  
and opens it to all in 2005 (taking X% of the transactions)

# Amazon Mechanical Turk

## MTurk



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# Amazon Mechanical Turk

MTurk is a [crowdsourcing](#) platform: the work is *outsourced* via the Web and done by numerous persons (the *crowd*), here the ~~Turkers~~ **workers**

Looking to work on tasks? [Sign in as a Worker](#) | [Learn more](#)

amazon **mechanical turk**

[Overview](#)

[Features](#)

[Pricing](#)

[Help](#)

[Developer Resources](#)

[Customers](#)

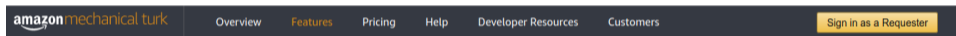
[Sign in as a Requester](#)

## Features

Amazon Mechanical Turk (MTurk) is a crowdsourcing marketplace enabling individuals and businesses (known as Requesters) to engage a 24/7, global distributed workforce (known as Workers) to perform tasks. A Human Intelligence Task (HIT) is a single, self-contained task a Requester creates on MTurk, an example of a task would be "Identify the red apple in this image of a fruit basket". Workers use the [MTurk website](#) to find assignments to work on, submit responses, and manage their account.

# Amazon Mechanical Turk

MTurk is a **crowdsourcing** platform allowing to perform **microwork**: tasks are split into subtasks (HITs) and their execution is paid for by the **Requesters**



## Features

Amazon Mechanical Turk (MTurk) is a crowdsourcing marketplace enabling individuals and businesses (known as Requesters) to engage a 24/7, global distributed workforce (known as Workers) to perform tasks. A Human Intelligence Task (HIT) is a single, self-contained task a Requester creates on MTurk, an example of a task would be "Identify the red apple in this image of a fruit basket". Workers use the [MTurk website](#) to find assignments to work on, submit responses, and manage their account.

# Amazon Mechanical Turk

MTurk is a **crowdsourcing** platform allowing to perform **microwork**: **payed for**.

amazon mechanical turk

Get Started with Amazon Mechanical Turk

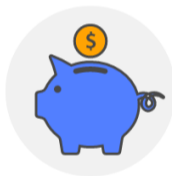


## Create Tasks

Human intelligence through an API. Access a global, on-demand, 24/7 workforce.

Create a Requester account

or



## Make Money

Make money in your spare time. Get paid for completing simple tasks.

Create a Worker account

# Amazon Mechanical Turk

MTurk is a **crowdsourcing** platform allowing to perform **microwork**: **payed for**.

## **How are Workers paid?**

Workers will be paid and Amazon Mechanical Turk (MTurk) fees will be charged when you approve submitted work. If you reject the work, the Worker is not paid and you are not charged the MTurk fees. MTurk Prepaid HITs are subject to [Participation Agreement](#). You can review MTurk pricing [here](#).

## Some characteristics of AMT

### Remuneration:

- ▶ by the task (*illegal* in France except some (rare) exceptions): less than \$2/h
- ▶ no explicit relationship between the *workers* and the *Requesters*

### Tasks:

- ▶ traditionally performed by salaried employees: transcription, translation (LDC, ELDA), etc

# Typical HITs on AMT

## Data Processing

Workers help companies understand and respond to different types of data by:



Editing and transcribing audio content



Translating content from one language to another



Rating the accuracy of search results



Categorizing information based on instructions

## Data Verification and Clean-up

Companies with large online directories or catalogs use MTurk to identify duplicate entries and verify item details. Workers help clean and verify data by:



Removing duplicate content from business listings



Identifying incomplete or duplicate product listings in a catalog



Verifying restaurant details such as phone numbers or hours of operation



Converting unstructured data about locations into well-formed addresses

<https://www.mturk.com/worker>

# AMT: a dream come true?

## **Cheap and Fast — But is it Good?** **Evaluating Non-Expert Annotations for Natural Language Tasks**

**Rion Snow<sup>†</sup>   Brendan O'Connor<sup>‡</sup>   Daniel Jurafsky<sup>§</sup>   Andrew Y. Ng<sup>†</sup>**

<sup>†</sup>Computer Science Dept.  
Stanford University  
Stanford, CA 94305

{rion,ang}@cs.stanford.edu

<sup>‡</sup>Dolores Labs, Inc.  
832 Capp St.  
San Francisco, CA 94110

brendano@doloreslabs.com

<sup>§</sup>Linguistics Dept.  
Stanford University  
Stanford, CA 94305

jurafsky@stanford.edu

[Snow et al., 2008]

# AMT: a dream come true?

## Cheap and Fast — But is it Good? Evaluating Non-Expert Annotations for Natural Language Tasks

Rion Snow<sup>†</sup>   Brendan O'Connor<sup>‡</sup>   Daniel Jurafsky<sup>§</sup>   Andrew Y. Ng<sup>†</sup>

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Stanford University  
Stanford, CA 94305  
{rion,ang}@cs.stanford.edu

<sup>‡</sup>Dolores Labs, Inc.  
832 Capp St.  
San Francisco, CA 94110  
brendano@doloreslabs.com

<sup>§</sup>Linguistics Dept.  
Stanford University  
Stanford, CA 94305  
jurafsky@stanford.edu

[Snow et al., 2008]

It's **cheap**, **fast**, **good**  
and it's a **hobby** for the *workers!*

# AMT allows to reduce the annotation costs

Very (very) low remuneration  $\Rightarrow$  low costs? Yes, but. . .

- ▶ costs of putting in place the **interface**
- ▶ costs of creating protections against **spammers**
- ▶ costs of **validating** and **post-processing** data

+ some tasks (for ex, translation from Pashto to English) generate costs which are similar to the usual translation costs, because of the lack of **qualified workers** [Novotney and Callison-Burch, 2010].

## When Amazon takes its toll...

Amazon is doubling the fee it collects from "requesters," those seeking laborers to perform online tasks, to 20% beginning July 21. And for tasks requiring at least 10 people, Amazon will charge an additional 20%, a new fee.

[Wall Street Journal blog, June 23, 2015]

## AMT allows to produce quality resources?

- ▶ allows to produce quality resources in some specific cases (for example, simple transcription)
- ▶ but:
  - ▶ the quality is insufficient when the task is **complex** (for example, summarization [Gillick and Liu, 2010])
  - ▶ the **interface** can generate some problems [Tratz and Hovy, 2010]
  - ▶ the *workers* can generate problems (cheaters, **spammers**)
  - ▶ **by the task** remuneration in itself generate problems [Kochhar et al., 2010]
- ▶ for some tasks, NLP tools now produce **better results**

## HITs (*Human Intelligence Task*): simplified tasks

Impossible to train oneself on a task on AMT:

⇒ **Simplification** of tasks:

- ▶ a real textual entailment task (entailment, neutral, contradiction) gets reduced to 2 sentences and a question:  
"Would most people say that if the first sentence is true, then the second sentence must be true?" [Bowman et al., 2015]

## AMT: a hobby for the *workers*?

[Ross et al., 2010, Ipeirotis, 2010] show that:

- ▶ *workers* are mostly motivated by **money** (91%):
  - ▶ 20% consider AMT as their primary source of income
  - ▶ 50% as their secondary source of income
  - ▶ the hobby aspect is important only for a (US) minority (30%)
- ▶ 20% of the *workers* spend more than 15h per week on AMT, and contribute to 80% of the tasks
- ▶ the average observed hourly wage is below \$2 [Hara et al., 2019]

[Gupta et al., 2014]: due to the impossibility to train, an important amount of **hidden work** is performed by the *workers*

## Who are the AMT workers?

<https://demographics.mturk-tracker.com> [Difallah et al., 2018]

# Is AMT ethical or even legal? [Fort et al., 2011]

## Ethics:

- ▶ no **identification**: no official link between the *Requesters* and the *workers* or among *workers*
- ▶ (almost) no possibility to **unionize**, to protest against the wrongdoings of *Requesters* or to take legal action against them
- ▶ no **minimum wage** ( $\$ < 2/h$  on average [Hara et al., 2019])
- ▶ possibility to **refuse to pay** the *workers*

# Is AMT ethical or even legal? [Fort et al., 2011]

## **How are Workers paid?**

Workers will be paid and Amazon Mechanical Turk (MTurk) fees will be charged when you approve submitted work. If you reject the work, the Worker is not paid and you are not charged the MTurk fees. MTurk Prepaid HITs are subject to [Participation Agreement](#). You can review MTurk pricing [here](#).

## Is AMT ethical or even legal? [Fort et al., 2011]

Law:

- ▶ Amazon licence agreement: the *workers* are considered as independent workers ⇒ they are supposed to declare themselves as such and pay taxes and social benefit charges accordingly
  - ▶ illusory, considering the level of remuneration
- ⇒ states **lose** a legitimate source of income

# Depending on an external platform

Impossibility to control:

- ▶ costs
- ▶ working conditions
- ▶ selection of workers
- ▶ conditions of experiment

Toward a systemic approach

"All your data are belong to us"

**Back to Consent**

What about guidelines?

To finish

# What Consent Means (or not), by ©Boulet



# Informed Consent

The Nuremberg Code (1947) states that consent can be voluntary **only if**:

- ▶ participants are **able** to consent
- ▶ they are **free from coercion**
- ▶ they **comprehend** the risks and benefits involved

# Art. 7 GDPR: Conditions for consent (1/2)

## Art. 7 GDPR Conditions for consent

---

1. Where processing is based on consent, the controller shall be able to demonstrate that the data subject has consented to processing of his or her personal data.
2. <sup>1</sup> If the data subject's consent is given in the context of a written declaration which also concerns other matters, the request for consent shall be presented in a manner which is clearly distinguishable from the other matters, in an intelligible and easily accessible form, using clear and plain language. <sup>2</sup> Any part of such a declaration which constitutes an infringement of this Regulation shall not be binding.

<https://gdpr-info.eu/art-7-gdpr/>

## Art. 7 GDPR: Conditions for consent (2/2)

3. <sup>1</sup> The data subject shall have the right to withdraw his or her consent at any time. <sup>2</sup> The withdrawal of consent shall not affect the lawfulness of processing based on consent before its withdrawal. <sup>3</sup> Prior to giving consent, the data subject shall be informed thereof. <sup>4</sup> It shall be as easy to withdraw as to give consent.
  
4. When assessing whether consent is freely given, utmost account shall be taken of whether, *inter alia*, the performance of a contract, including the provision of a service, is conditional on consent to the processing of personal data that is not necessary for the performance of that contract.

<https://gdpr-info.eu/art-7-gdpr/>

# Consequences in Practice

There is **no** consent if no decision is made:

- ▶ opt in vs opt out
- ▶ importance of the default settings
- ▶ possibility to withdraw one's consent at anytime



The image shows the top navigation bar of the website Grosbill.com. On the left, there is a hamburger menu icon labeled 'MENU' and the logo 'Grosbill.com' with the tagline 'Le meilleur de l'High-Tech'. In the center is a search bar with the placeholder text 'Produit, marque, référence...' and a green search button. On the right is a location pin icon labeled 'MAGASIN'. Below the navigation bar is a cookie consent banner with the title 'Accepter ou refuser les cookies'. It contains a toggle switch for 'Désactiver les cookies à vocation commerciale :', which is currently turned off.

<https://www.grosbill.com/>

# Data and "informed" consent

The image shows a screenshot of the Common Crawl website. The background is a solid yellow color with a faint, abstract pattern of white dots and lines. In the top left corner, the text "Common Crawl" is written in a bold, dark blue font. To the right of this, a navigation menu is displayed in a dark grey box. The menu items are "BIG PICTURE -", "THE DATA -", "ABOUT -", "BLOG", "CONNECT -", and "Donate". The "BIG PICTURE -" item is highlighted with a dark grey background, and a dropdown menu is visible below it, containing the items "What We Do", "What You Can Do", and "FAQs". The "Donate" button is a red rectangle with white text. On the left side of the page, the word "Us" is written in a large, white, rounded font inside a white rounded rectangle. In the center of the page, there is a white rounded rectangle containing the text: "We build and maintain an open repository of **web crawl data** that can be **accessed and analyzed** by **anyone**." In the bottom right corner, the word "You" is written in a large, white, rounded font inside a white rounded rectangle.

**Common Crawl**

**Us**

We build and maintain an open repository of **web crawl data** that can be **accessed and analyzed** by **anyone**.

**You**

**BIG PICTURE -** THE DATA - ABOUT - BLOG CONNECT - **Donate**

**Big Picture**

What We Do

What You Can Do

FAQs

Toward a systemic approach

"All your data are belong to us"

Back to Consent

**What about guidelines?**

Beware of guidelines

To finish

Toward a systemic approach

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**What about guidelines?**

Beware of guidelines

To finish



## Guidelines and checklists are great, but won't fix this

*"Currently, AI ethics is failing in many cases. Ethics lacks a reinforcement mechanism. Deviations from the various codes of ethics have no consequences. And in cases where ethics is integrated into institutions, it mainly serves as a marketing strategy. Furthermore, empirical experiments show that reading ethics guidelines has no significant influence on the decision-making of software developers." [Hagendorff, 2020]*

# Beyond Guidelines

Guidelines and checklists are attractive:

- ▶ simple
- ▶ illusion of exhaustiveness

But they are far from enough:

*" Neither the risk analysis informed by engineering practice, nor the socially informed engineering practice can be replaced by the other." [Gurses et al., 2011]*

# Making the Most of Guidelines

1. start thinking/discussing *without* them
2. use them as a complement
3. do not limit your thinking because you checked all the list in the grid

## Some guidelines I recommend

1. AI HLEG [Ethics guidelines for trustworthy AI](#) (EN or FR or ...)
2. The consequentialist [grid of analysis](#) [Lefeuvre et al., 2015] (FR)
3. CERNA [Machine learning ethics report](#) (FR and EN)
4. CCNE [Chatbots ethics report](#) (FR)

Toward a systemic approach

"All your data are belong to us"

Back to Consent

What about guidelines?

**To finish**

WYHTR: What You Have To Remember



- ▶ data is everywhere in NLP
- ▶ data lifecycle and ethical hotspots
- ▶ consent, consent, consent

## Some interesting papers for you to read!

- ▶ Medical IImS are vulnerable to data-poisoning attacks
- ▶ Susceptibility in deployment of clinical decision-aids
- ▶ Endoscopist deskilling risk after exposure to artificial intelligence in colonoscopy
- ▶ Automation Bias in Mammography
- ▶ Automation bias: a systematic review of frequency, effect mediators, and mitigators
- ▶ AI chatbots provide less-accurate information to vulnerable users
- ▶ Covert Racism in AI

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