꽂꽂하게 앉아서 무언가를 바라 보고 있는 여자의 얼굴이 만족스러워 Translation. The face of a woman sitting upright looking at

something is satisfying

Morris wa mosetsana yo ga wa nna sentle, ka mokgwa o o ntseng ka teng o a tshegisa, e kete o ne a fofa

Translation: the hair is not well organized the manner in which it's organized is funny, as if the girl was flying

Setswana

nentokazi enhle enamehlo aggamile izinwele ezilungiswe kahle futhi igooke kahle inika umuzwa wokwaneliseka Translation: This is a beautiful picture, with a dark background, the beautiful lady with bright eyes, has well-groomed hair and is well-dressed, this gives me a sense of

isithombe sihle ingemuva limnyama





ဆံပင်တိုတိုနှင့် မျတ်နှာအမူအရာ တို့မှာ တင့်တယ်သော်လည်း ရင်ဘက်ကြီးကို ဖော်ထားသော အဝတ်အစားက သရုပ်ပျတ်

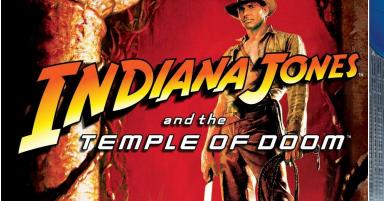
beautiful, but the clothes that reveal the big chest are

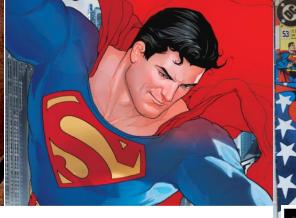
gaun yang dipakai terlalu terdedah menampakkan bahagian lurahnya

Translation: The dress worn too exposed showing her cleavage













Including these slides (and video)

Kenneth Church

https://kwchurch.github.io/

Northeastern University Jan 20, 2025







# Agenda

- ▶ Part 1: Current Status & Opportunities
- Part 2: History
- Part 3: Suggestions for future

# $\frac{Parallel\ Corpora}{Comparable\ Corpora} \sim \frac{Alignment}{Gestalt}$

- Simplifying Assumptions
  - Distributional Hypothesis
  - Compositionality
  - Associationism (not Gestalt)
    - Word Associations (PMI)
  - Alignment
    - Aligned parallel corpora
      - Translation
    - Aligned speech corpora
    - Bounding Boxes (Vision)

### Current Status: Where are we now?

- The success of chat bots in many languages demonstrates
  - the power of comparable corpora (CC)
  - and pivoting via English

### https://www.chronicle.com/article/im-a-student-you-have-no-idea-how-much-were-using-chatgpt



I'm a Student. You Have No Idea How Much We're Using ChatGPT.

No professor or software could ever pick up on it.



EV WILL LANGON FOR THE CHRONICLE

### Current Status: Where are we now?

- The success of chat bots in many languages demonstrates
  - √ the power of comparable corpora (CC)
  - >and pivoting via English

What's wrong with pivoting via English?

# Criticism: ACL is too focused on English

https://thegradient.pub/the-benderrule-on-naming-the-languages-we-study-and-why-it-matters/

The #BenderRule: On Naming the Languages We Study and Why It Matters

14.SEP.2019 . 15 MIN READ



Emily M. Bender



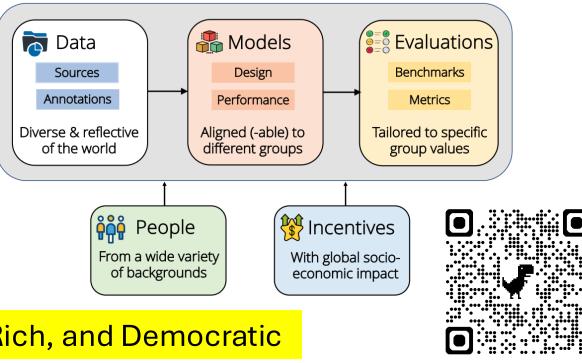
### Why AI Is WEIRD and Should Not Be This Way: Towards AI For Everyone, With Everyone, By Everyone

Rada Mihalcea<sup>1\*</sup>, Oana Ignat<sup>2\*</sup>, Longju Bai<sup>1</sup>, Angana Borah<sup>1</sup>, Luis Chiruzzo<sup>3</sup>, Zhijing Jin<sup>4</sup>, Claude Kwizera<sup>5</sup>, Joan Nwatu<sup>1</sup>, Soujanya Poria<sup>6</sup>, Thamar Solorio<sup>7</sup>

<sup>1</sup>University of Michigan USA, <sup>2</sup>University of Santa Clara USA, <sup>3</sup>Universidad de la Republica Uruguay, <sup>4</sup>Max Plank Institute Germany, <sup>5</sup>CMU Africa, <sup>6</sup>SUTD Singapore, <sup>6</sup>MBZUAI United Arab Emirates

#### **Abstract**

This paper presents a vision for creating AI systems that are inclusive at every stage of development, from data collection to model design and evaluation. We address key limitations in the current AI pipeline and its WEIRD<sup>1</sup> representation, such as lack of data diversity, biases in model performance, and narrow evaluation metrics. We also focus on the need for diverse representation among the developers of these systems, as well as incentives that are not skewed toward certain groups. We highlight opportunities to develop AI systems that are for everyone (with diverse stakeholders in mind), with everyone (inclusive of diverse data and annotators), and by everyone (designed and developed by a globally diverse workforce).

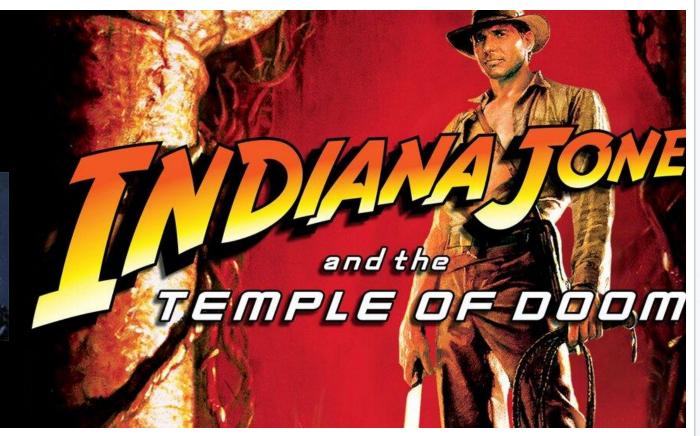


Weird = Western, Educated, Industrialized, Rich, and Democratic

# Filter Bubbles (Colonialism) Move Fast and Break Things

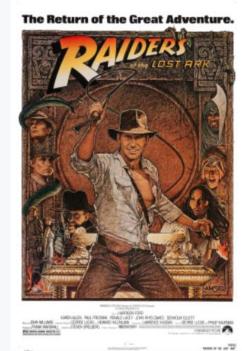






Irresponsible Al

### Raiders of the Lost Ark



1982 theatrical reissue poster by Richard
Amsel

Directed by

Screenplay by

Story by

Produced by Starring

Steven Spielberg

Lawrence Kasdan

George Lucas

Philip Kaufman

Frank Marshall
Harrison Ford

Karen Allen Paul Freeman

Ronald Lacey

John Rhys-Davies

Denholm Elliott

# Truth, Justice and <fill-mask>

https://www.nytimes.com/2006/06/30/opinion/30iht-ederik.2093103.html?\_r=0

### **WWII**



2021

Got a Tip? Newsletters U.S. Edition ✓



Oct 16, 2021 11:16am PT

Superman Changes Motto to 'Truth, Justice and a Better Tomorrow,' Says DC Chief

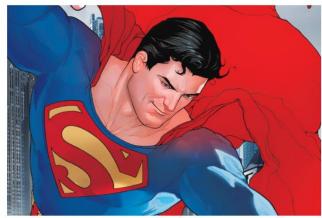
By Adam B. Vary ~











# Better to Engage Local Expertise

Google Scholar

**NLLB** 



#### Ibrahim Said Ahmad

Northeastern University

FOLLOW

Verified email at buk.edu.ng - <u>Homepage</u>

Natural Language Processing Big Data Data mining Artificial Intelligence

#### **Correcting FLORES Evaluation Dataset for Four African Languages**

Idris Abdulmumin<sup>1\*+</sup>, Sthembiso Michaela Modoi<sup>2</sup>, Mahlata S. Mbooi<sup>2</sup>, Shamsuddeen Hassan Muhammad<sup>3\*+</sup> Ibrahim Said Ahmad<sup>4\*+</sup> Neo Putini<sup>5</sup>, Miehleketo Mathebula<sup>1</sup>, Matimba Shingange<sup>1</sup>, Tajuddeen Gwadabe<sup>\*+</sup>, Vukosi Marivate<sup>1,6</sup>

<sup>1</sup>Data Science for Social Impact, University of Pretoria, <sup>2</sup>Council for Scientific and Industrial Research, South Africa,

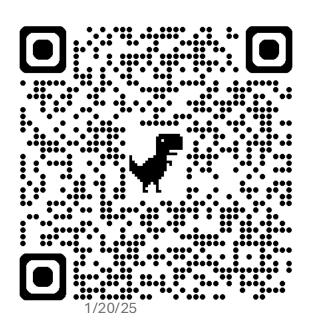
<sup>3</sup>Imperial College, Londor

<sup>4</sup>Northeastern University, University of KwaZulu-Natal, <sup>6</sup>Lelapa AI, \*HausaNLP, <sup>+</sup>MasakhaneNLP correspondence: idris.abdulmumin@up.ac.za

- Quality control is relatively weak in 4 African Languages
  - "A significant part of the translations were suspected"
  - to have been automatically generated"
- "Unnatural" natural language
  - Not even grammatical

TITLE	CITED BY	YEAR
Adaption of distance learning to continue the academic year amid COVID-19 lockdown A Qazi, J Qazi, K Naseer, M Zeeshan, S Qazi, O Abayomi-Alli, IS Ahmad, Children and Youth Services Review 126, 106038	82	2021
Naijasenti: A nigerian twitter sentiment corpus for multilingual sentiment analysis SH Muhammad, DI Adelani, S Ruder, IS Ahmad, I Abdulmumin, BS Bello, arXiv preprint arXiv:2201.08277	74	2022
A hybrid metaheuristic method in training artificial neural network for bankruptcy prediction A Ansari, IS Ahmad, AA Bakar, MR Yaakub IEEE access 8, 176640-176650	65	2020
Movie revenue prediction based on purchase intention mining using YouTube trailer reviews IS Ahmad, AA Bakar, MR Yaakub Information Processing & Management 57 (5), 102278	58	2020
Afrisenti: A twitter sentiment analysis benchmark for african languages SH Muhammad, I Abdulmumin, AA Ayele, N Ousidhoum, DI Adelani, arXiv preprint arXiv:2302.08956	56	2023
The role of information & communication technology in elearning environments: a systematic review A Qazi, G Hardaker, IS Ahmad, M Darwich, JZ Maitama, A Dayani leee Access 9, 45539-45551	55	2021
SemEval-2023 task 12: sentiment analysis for african languages (AfriSenti-SemEval) SH Muhammad, I Abdulmumin, SM Yimam, DI Adelani, IS Ahmad,	45	2023
arXiv preprint arXiv:2304.06845	10	

# Deadly Consequences





War on Gaza

US Elections

Opinion

Sport

News | Science and Technology

### Sri Lanka: Facebook apologises for role in 2018 anti-Muslim riots

An investigation found that incendiary content on the social media platform may have led to the deadly violence.



A Sri Lankan army soldier guards a mosque in Sri Lanka's capital Colombo in the wake of the 2018 violence [File: Ishara S. Kodikara/AFP]

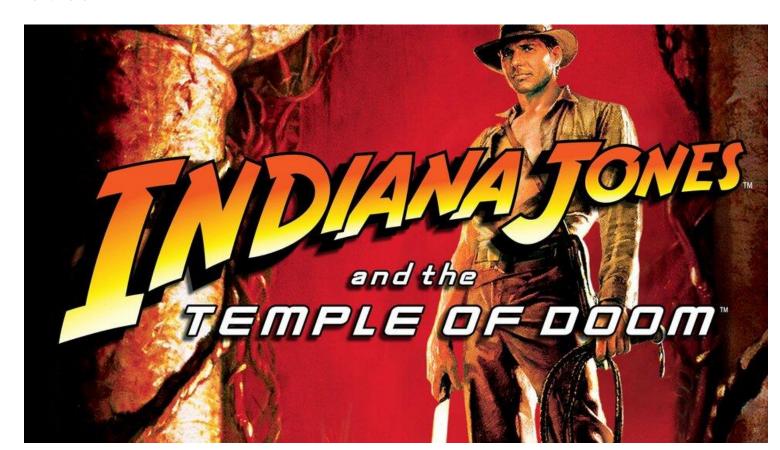






# Filter Bubble Hypothesis: Anglophones don't know how bad it is elsewhere

- In Nigeria
  - Tweets are more toxic in Hausa
  - than in English



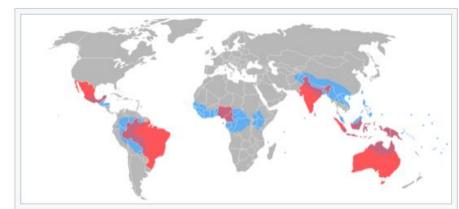
# Growth Languages

# Low Resources & Growth Opportunities



https://en.wikipedia.org/wiki/List of languages by total number of speakers

### **Endangered Languages**



More than 50% of the world's endangered languages are located in just eight countries (denoted in red on the map): India, Brazil, Mexico, Australia, Indonesia, Nigeria, Papua New Guinea and Cameroon. In such countries and around them are the areas that are the most linguistically diverse in the world (denoted in blue on the map).

### 40 Million Speakers or more

English, Chinese, Hindi, Spanish, Arabic, French, Bengali, Portuguese, Russian, Urdu, Indonesian, German, Japanese, Nigerian Pidgin, Marathi, Telugu, Turkish, Hausa, Tamil, Swahili, Tagalog, Punjabi, Korean, Persian, Javanese, Italian, Gujarati, Thai, Amharic, Kannada, Bhojpuri

https://en.wikipedia.org/wiki/Endangered\_language

Better Business Case

ISO	Wikipedia	Joshi	S2 Abs	ACL	HF Data	HF Model	Speakers
en	6,937,535	5	8,348,938	103,000	10,749	50,717	1456M
${f zh}$	1,458,192	5	3,061,847	71,800	1202	4495	1138M
hi	163,787	4	2,848	8,740	421	1388	610M
es	2,001,667	5	2,742,468	28,600	945	3245	559M
$\operatorname{fr}$	2,657,599	5	2,772,266	$35,\!500$	1064	4033	310M
id/ms	716,053	3	2,234,953	4,230	395	1317	290M
ar	1,249,698	5	149,043	17,900	558	1681	274M
$\operatorname{bn}$	161,529	3	445	$3,\!270$	298	788	273M
$\operatorname{pt}$	1,141,578	4	1,937.959	9,660	596	1935	264M
ru	2,018,503	4	509,503	13,300	799	2307	255M
ur	216,348	3	454	$3,\!220$	204	658	232M
$\mathrm{d}\mathrm{e}$	2,976,338	5	1,227,473	42,900	789	348	133M
${f ja}$	1,443,913	1	317,394	38,200	596	2887	123M
$\mathbf{mr}$	99,001	2	275	$1,\!480$	193	642	99M
te	102,536	1	13	$2,\!120$	223	589	96M
${f tr}$	626,326	4	370,727	8,490	398	1389	90M
ta	170,797	3	728	3,980	263	1030	87M
vi	1,294,281	4	44,477	3,010	474	1188	86M
tl	48,111	3	933	1,100	116	451	83M
ko	694,229	4	793,921	16,900	534	2741	82M
ha	53,491	2	?	823	98	441	79M
jv	74,359	1		535	76	342	68M
it	1,899,019	4	$184,\!535$	$14,\!400$	516	2129	68M
gu	30,489	1	23	263	174	581	62M
h	$170,\!421$	3	41,628	12,700	326	900	61M
$\mathrm{kn}$	33,262	1	143	1540	178	534	59M
am	15,373	2	96	1110	117	493	58M
yo	35,037	2	18	799	123	458	46M

# Good News: More resources than we had for English when we started EMNLP

- Wikipedia
- Joshi Classification
- Semantic Scholar (S2)
- ACL Anthology
- HuggingFace (HF)
- Speakers

# A Translation-Free Benchmark (To avoid Anglo-Centric Biases)

No Bounding Boxes

No Culture Left Behind: ArtELingo-28, a Benchmark of WikiArt with Captions in 28 Languages

Youssef Mohamed<sup>1\*</sup> Runjia Li <sup>2</sup> Ibrahim Said Ahmad<sup>3</sup> Kilichbek Haydarov <sup>1</sup>

Philip Torr<sup>2</sup> Kenneth Ward Church <sup>3</sup> Mohamed Elhoseiny<sup>1\*</sup>

<sup>1</sup>KAUST <sup>2</sup> University of Oxford <sup>3</sup> Northeastern University

https://www.artelingo.org/



Figure 1: **ArtElingo-28 Benchmark:** 9 emotion labels with captions in 28 languages. The  $\sim$ 140 annotations per WikiArt image embrace diversity over languages and cultures.

### Input:

- Picture from WikiArt
- Language (one of 28 languages)
- Output Annotations:
  - 9 Emotion Labels
    - 4 Positive:
      - Contentment, Awe, Excitement, Amusement
    - 4 Negative:
      - Sadness, Anger, Fear, Disgust
    - 1 Neutral
  - Caption (in your language)

# **Embrace Diversity & Multiple Perspectives**

꽂꽂하게 앉아서 무언가를 바라 보고 있는 여자의 얼굴이 만족스러워 Translation. The face of a woman sitting upright looking at something is satisfying Korean Morris wa mosetsana yo ga wa nna sentle, ka mokgwa o o ntseng ka teng o a tshegisa, e kete o ne a fofa

Translation: the hair is not well organized, the manner in which it's organized is funny, as if the girl was flying

isithombe sihle ingemuva limnyama nentokazi enhle enamehlo aggamile izinwele ezilungiswe kahle futhi igqoke kahle inika umuzwa wokwaneliseka Translation: This is a beautiful picture, with a dark background, the beautiful lady with bright eyes, has well-groomed hair and is well-dressed, this gives me a sense of satisfaction.



ဆံပင်တိုတိုနှင် မျတ်နှာအမူအရာ တို့မှာ တင့်တယ်သော်လည်း ရင်ဘက်ကြီးကို ဖော်ထားသော အဝိတ်အစားက သရပ်ပျတ် နေသည်။

Translation: The short hair and facial expression are beautiful, but the clothes that reveal the big chest are decadent

gaun yang dipakai terlalu terdedah menampakkan bahagian lurahnya

Setswana

Translation: The dress worn too exposed showing her cleavage







- emotion labels:
  - disgust (Burmese)
  - awe (Malay)
- captions focus
  - on chest
    - Burmese & Malay
  - on face and hair
    - Korean & Setswana

**Ethics Review** 

Hypothesis: Predictable

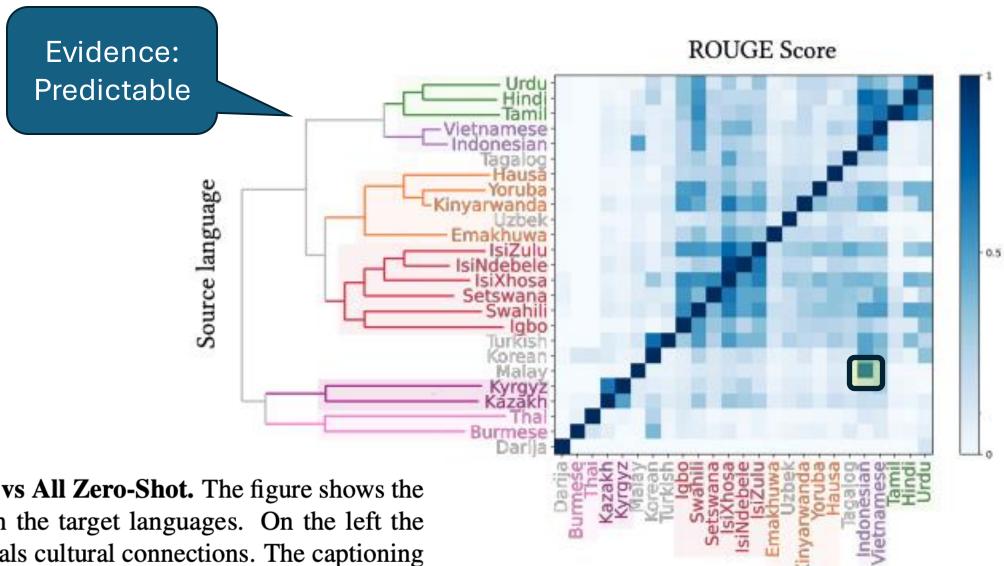
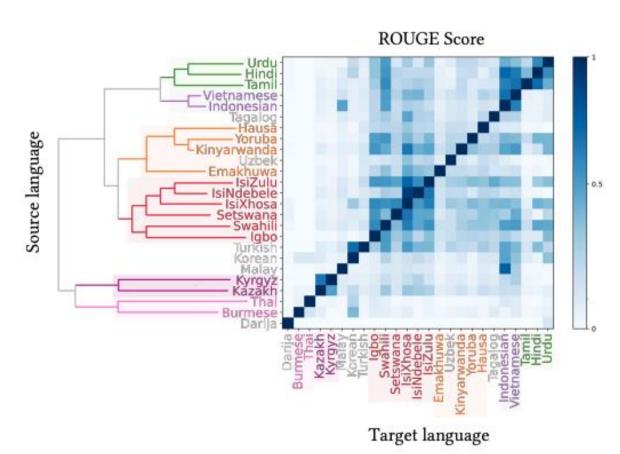


Figure 6: **One vs All Zero-Shot.** The figure shows the rouge score on the target languages. On the left the clustering reveals cultural connections. The captioning scores reveal groups that align with real world cultural connections. This clustering suggests that our trained models can capture the cultural signal.

Target language

# Vision: More than Pixels Communication (Shannon): Audience Matters



- Art is a form of communication
  - between artist and audience
- Background matters
  - Language
  - Culture
- Task: Art, Lang → Caption
  - English pivot baseline:
    - Translate caption from English
  - Can we beat that?

# Website: Benchmark, Code, Paper & Video



### No Culture Left Behind: ArtELingo-28, a Benchmark of WikiArt with Captions in 28 Languages

Youssef Mohamed Runjia Li Ibrahim Said Ahmad Kilichbek Haydarov

Philip Torr Kenneth Ward Church Mohamed Elhoseiny

King Abdullah University of Science and Technology (KAUST), University of Oxford, Northeastern University

#### Resources



**BUCC** 

# Emerging trends: When can users trust GPT, and when should they intervene?

- Usage of LLMs and chat bots will continue to grow,
  - since they are so easy to use,
  - and so (incredibly) credible.
- This article describes a homework assignment,
  - where I asked my students to use bots to write essays.

- Student essays
  - should have been fact-checked.
- But fact-checking is
  - too much trouble.



1/20/25

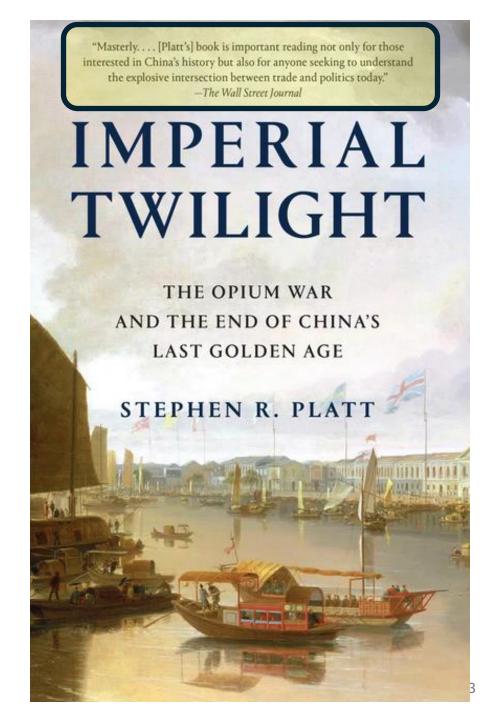
# Amazingly Bad: Anglo-Centric Biases

- Homework assignment
  - Write essays on Opium Wars
    - from six perspectives
    - including East and West
- Chatbots view everything
  - from a single (American) perspective
- Hope: international students would rewrite output from bots
  - But that was too much work
  - All essays reflect Western perspective

- Bots made in America
  - do not mention
  - "Century of Humiliation"
  - A view that is motivating efforts
    - to compete with West in AI
- When bots over-simplify the truth,
  - and take our side of a conflict,
- that could be dangerous
  - and could lead to a trade war,
  - or worse

### **Ambitious Goal for Bots**

- Bots should be
  - competitive with historians
- Appreciate history from multiple perspectives
  - as well as implications for contemporary audience
- Blurb:
  - "but also for anyone
    - seeking to understand the explosive intersection
    - between trade and politics today"



1/20/25 BUCC

### Conclusions

- Too much English
  - Too much pivoting via English
  - Too much translation
- Consequences
  - Anglocentric biases/WEIRD
  - Filter Bubbles



- Do not impose our views on the rest of the world
  - Bots made in America
    - Live in an American Filter Bubble
  - Embracing diversity is better than de-biasing

