# **RMI Diversity Summit**

Blaise Agüera y Arcas Cerebra



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phys·i·cist /'fizəsəst/

noun

an expert in or student of physics.

Translations, word origin, and more definitions

Feedback

### Physicist - Wikipedia, the free encyclopedia

https://en.wikipedia.org/wiki/Physicist - Wikipedia -

A physicist is a scientist trained to understand the interactions of matter and energy across the physical universe.

List of physicists · Category: Physicists · Professional physicist · Physicist (album)

### So You Want to Become a Physicist? : Explorations in Science ...















stock photo. Not real physics. Not a real physicist. Only female in the top 100 image search results.

#### How to Think Like a Physicist (and Win ...

www.fiatphysica.com - 662 × 372 - Search by image

Did you know that physics teaches you how to think? More than complex equations and mountains of data, physics is really a workout for your brain.

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Why does this matter?

Let's look at our own workplace.

## level distribution at cerebra



level

(Cerebra stats are from end of 2015)

## women and men



level

(Cerebra stats are from end of 2015)

# 40.00% 30.00% fraction women 20.00% 10.00% 0.00% TVC 3 4 5 6 7 8

gender and level at cerebra

level



level

## Global Female Headcount by Level

SEAKIR eng



The problem is massive and industrywide.

#### What Happened To Women In Computer Science?



Source: National Science Foundation, American Bar Association, American Association of Medical Colleges Credit: Quoctrung Bui/NPR

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# Kids saw these ads on TV. And parents buying their kids computers saw these ads.





Not to oversimplify, but—

there is probably a causal chain connecting TRS80 ads, Weird Science and Revenge of the Nerds to our dismal SWE gender numbers and GamerGate. Portrayal matters.

In CS, representation in mainstream media mattered. Nowadays Google = mainstream media. Things have gotten a lot more complicated since the 80s...

Training data are harvested

# Training data are harvested (Big Data)

Training data are harvested Algorithms are programmed















"Generalized filter bubble"



So many unintended consequences! The system can be evil even when no single part is...



... and this diagram will need to be revised again when We achieve A61. Wondering about your own programming?

Wondering about your own programming?



https://implicit.harvard.edu/implicit/takeatest.html








#### Wondering about your own programming?



**Important disclaimer**: In reporting to you results of any IAT test that you take, we will mention possible interpretations that have a basis in research done (at the University of Washington, University of Virginia, Harvard University, and Yale University) with these tests. However, these Universities, as well as the individual researchers who have contributed to this site, make no claim for the validity of these suggested interpretations. If you are unprepared to encounter interpretations that you might find objectionable, please do not proceed further. You may prefer to examine general information about the IAT before deciding whether or not to proceed.

I am aware of the possibility of encountering interpretations of my IAT test performance with which I may not agree. Knowing this, I wish to proceed

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> I.e.: If you are a good and decent person, you probably won't like what you learn.

### unconscious Implicit bias

# conscious 1. Explicit biasunconscious 2. Implicit bias

"But you have people coming in and I'm not just saying Mexicans, I'm talking about people that are from all over that are killers and rapists and they're coming into this country."



Type 1: explicit bias. Something (I think) we should take a stand on. Does exist in our industry (see 4chan). But probably not the main problem for us within 600gle.



#### Type 2: implicit bias.



Type 2: implicit bias. Important, worth interrogating.



#### Type 2: implicit bias. Without mindfulness it <u>will</u> affect your behavior.



Type 2: implicit bias. But :

We need to acknowledge we all have it.

The thought is not the crime.

As much a symptom as a cause.



Type 2: implicit bias. But :

We need to acknowledge we all have it.

The thought is not the crime.

As much a symptom as a cause.

Doing "guilty mental yoga for the privileged" to try to "pass" the test won't fix the world's problems.

And implicit bias is probably not even our biggest issue...

# conscious 1. Explicit biasunconscious 2. Implicit bias

# conscious1.Explicit biasunconscious2.Implicit bias

3. Latent bias

# conscious1.Explicit biasunconscious2.Implicit biassystemic3.Latent bias

Type 3: latent bias. (It must have an official name-?)

Suppose google.com favors pages most linked to / clicked on?

Suppose Googlers pay closer attention to more senior Googlers?

Suppose Android bugs are prioritized based on Nexus product feedback?

Suppose FaceNet is trained mostly on white people?

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#### **Report: Security robot at Stanford Shopping Center runs over toddler**

By Jason Green, jason.green@bayareanewsgroup.com

The robot, which stands 5 feet tall and weighs 300 pounds, was introduced last year and is designed to alert authorities of abnormal noises, sudden environmental changes and known criminals.



link

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There are fewer Pokemon Go locations in black neighborhoods, but why?

<u>link</u>

Bonus question: Tay. Explicit, implicit or latent?

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## **TL;DR** Twitter taught Microsoft's AI chatbot to be a racist asshole in less than a day

By James Vincent on March 24, 2016 06:43 am 🎽 @jjvincent





Bonus question: Tay. Explicit, implicit or latent?

Latent bias in the training loop  $\rightarrow$  a (crappy) AI with "explicit bias".

Tay may be patient zero— one for the textbooks.



Taxonomy of Pathways to Dangerous AI

Roman V. Yampolskiy

link

In each case there is a latent variable... and Bayes' Rule.

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Huge effects, not deriving from either explicit or implicit bias on the part of the designers. Gnarly.

But possibly our biggest levers.

Pretty much any product using crowdsourcing, distribution estimation, clustering, ranking, collaborative filtering, sequence synthesis, or any other kind of MI needs to think through its latent variables.

<u>Link</u>: arxiv paper from 2013, Discrimination in Google Ad delivery. <u>Link</u>: 2016 paper on latent bias in word embeddings.

#### <u>Conjecture</u>

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#### <u>Proposal</u>

Let's develop practices and techniques for addressing latent bias in our products, and let's do this in a way that's publicly visible.

## (End of main talk)



No. PageRank and friends do not embody sexist (etc.) beliefs or implicit biases on the part of the engineers who coded it.

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\*Though can optimize for "iconicity", which is a short step from stereotype.

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\*relative to what?— why we need deontology. For physicists we can argue "what should be" based on iconicity (1%?), actual percent female today (20%), or an assumption of gender neutrality (~50%).

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Values statements are not always data justifiable. Disabled can use Gmail? Links camera works for people wearing hijab? We can look at numbers, but ultimately we may have to decide based on "what is Googley". So explicit values needed. E.g., commit:

To **science** (objectivity, measurement, transparency)

To **wellbeing** (individual benefit, societal benefit, nonzero sum) To **equity** (diversity, economic empowerment, sharing of gains) To **freedom** (optionality, privacy, connectivity, data migration) To **progress** (betterment of society over time, tech-enabled)
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Just a proposal.

Can we focus on making our values clear and on fixing systemic and measurable disconnects between our values and our effects on the world?

## Work items and big questions

**Deontology** (deciding what Googley really means) **Research** (what questions need asking)

Policy (changing our own rules, + legal and international)
Comms (how to talk about it, internally and externally)
Priorities (can't do everything, and not all at once)
Process (how to scale thinking across products / launches)
Products (how to seed / inform new product thinking)

## **Example: solution sketch for Links**

Fix face labeling policies; ground truth, train, and test for recognition of variables like race.

Do "unit tests" for face and body recognition, conditioned on variables like race.

Pick 2-3 sociological contexts (e.g. Muslim American users) and analyze longitudinally from end to end and over a period of time, including usability, latent biases and loops; guide product and model development accordingly (and don't brush shortcomings under the rug).

By EOY 2016 draft and publish "statement of MI ethics", with focus on smart devices.

At Links product launch Q1 2017, release longitudinals as "Wait But Why?" style, rigorous, data-rich posts, with humor and quotability.

Plan to knock out further longitudinals over time.

Figure out how to use Federated Learning (and volunteer collection) to allow Links data to supply bias-reducing training to models in wider use.

Check back in; use learnings as input for V2.