

# *Critical* Computing Education

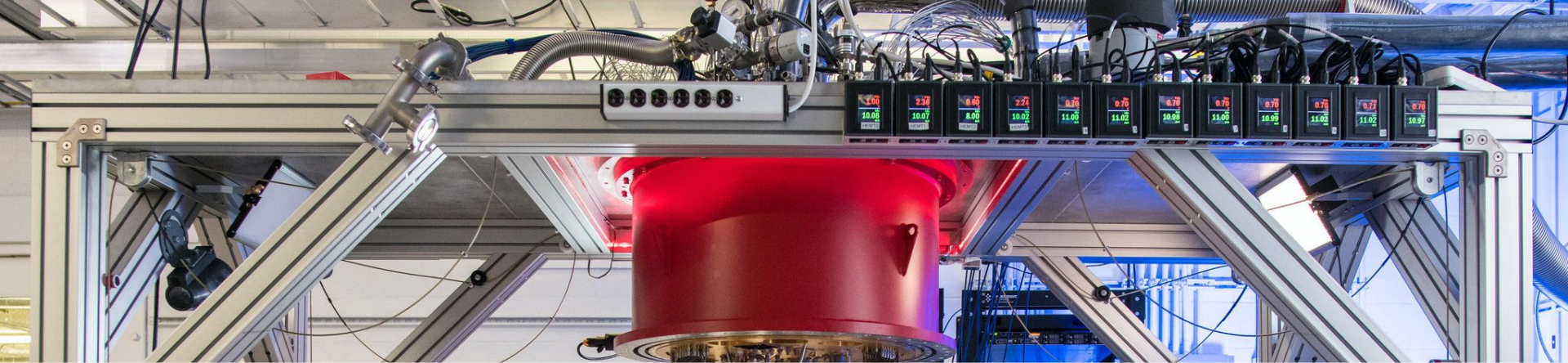
Amy J. Ko, Ph.D.

Professor

The Information School

University of Washington, Seattle





Computing can be magical





I fell in love with this  
magic early in life

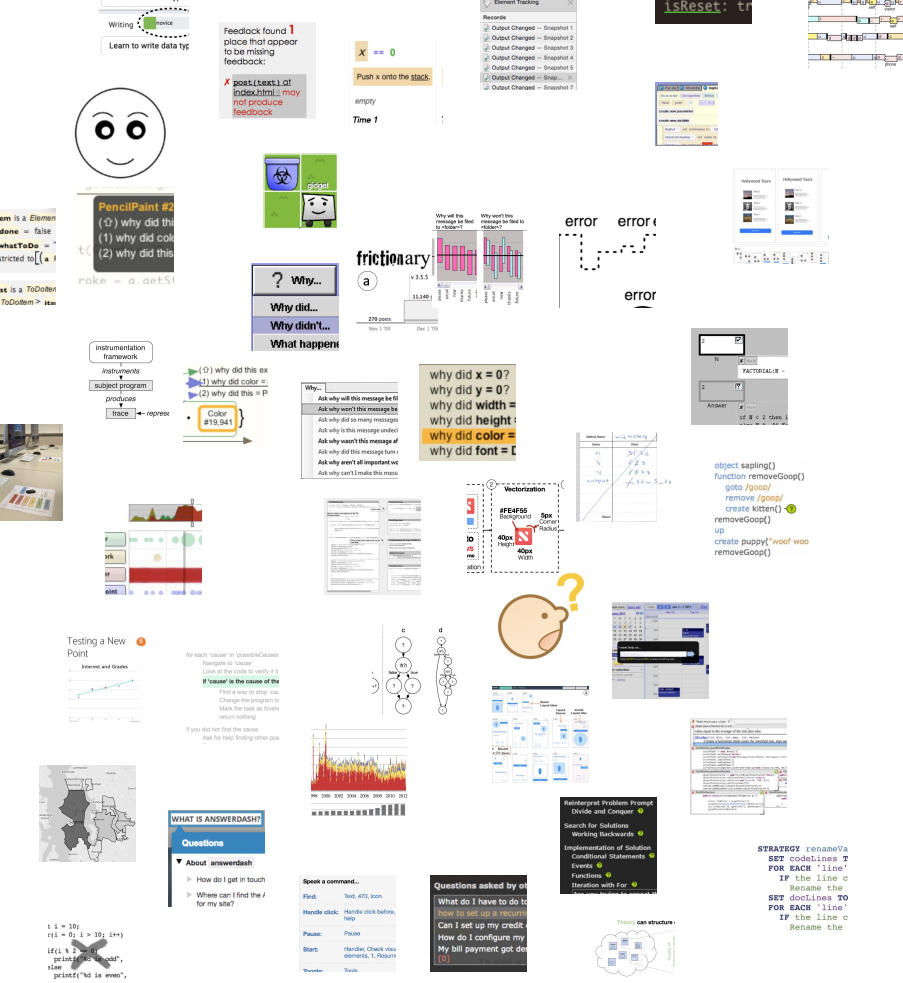
As a closeted trans teen, code  
was my escape

I created virtual worlds where I  
could be myself, flee my body,  
avoid my gender plight

I used the internet to learn  
about others like me.

Critical Computing Education — Amy J. Ko





Captivated, I've spent the past 20 years lowering barriers to programming.

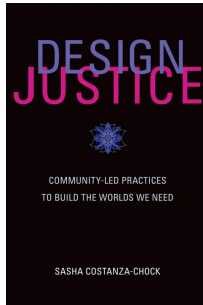
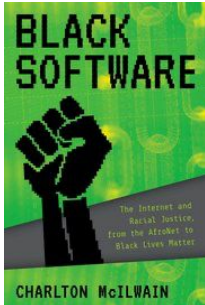
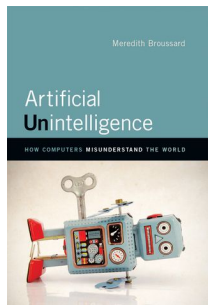
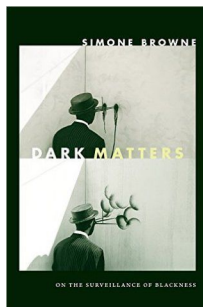
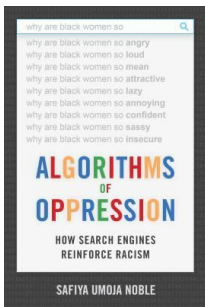
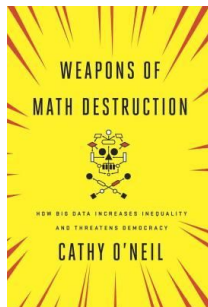
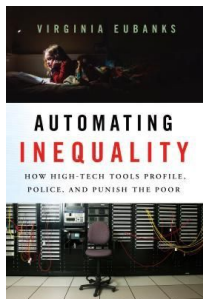
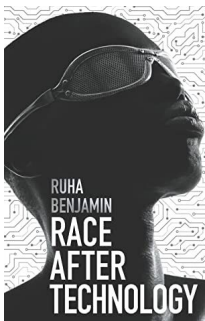
I studied why programming is hard, and how to make it easier

I invented new ways of making, breaking, and fixing software.

Criti... mputing Educati... my J...

All of this followed from  
two particular notions  
of justice...

1. *Computing should be useful  
and **usable** to everyone*
2. *Everyone should be  
**empowered** to harness  
computing*



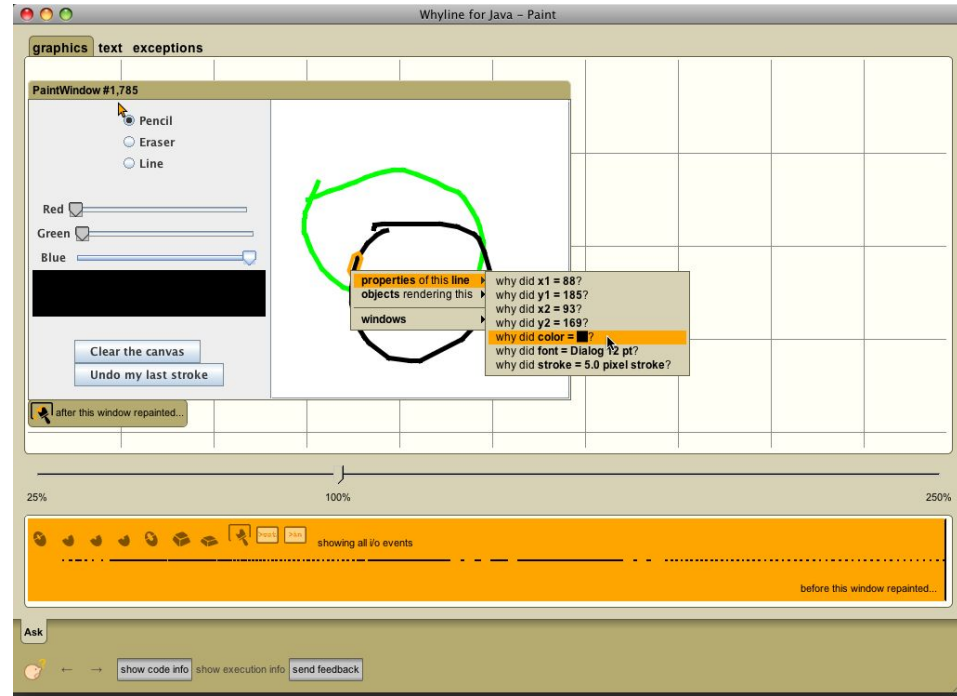
Then I started reading...

Over the past five years, I learned how software is being used to **oppress**, marginalize voices, erode discourse, dissolve safety nets, surveil communities, shrink the middle class, and encode anti-Black racism.

Programming, my lifelong professional and personal interest, was both a tool of **empowerment** and **injustice**.

# My research amplified algorithmic bias

My research on **debugging tools** made software faster and cheaper to make, helping developers write biased algorithms faster and more correctly than ever before.



*Faster fixes, more disruption (Ko and Myers, 2008).*

# My research centralized and privatized power

My inventions largely served powerful platforms owned by Amazon, Google, Facebook, Microsoft, and Apple, disempowering smaller organizations and the public.



*Microsoft replicated our developer tool ideas and restructured teams based on my productivity research increasing its power.*



*Google built upon our research on ML development, streamlining data debugging.*



*Apple replicated our learning technologies to attract learners to its walled garden through Swift Playgrounds.*



*Facebook leveraged our work on help systems to lower usability friction, keeping people on its platform.*



# My research replaced people with machines

Our research on help systems, and the startup that grew out of it (AnswerDash), created two dozen jobs replaced tens of thousands of customer service agents with information retrieval algorithms, while enriching investors (a little).

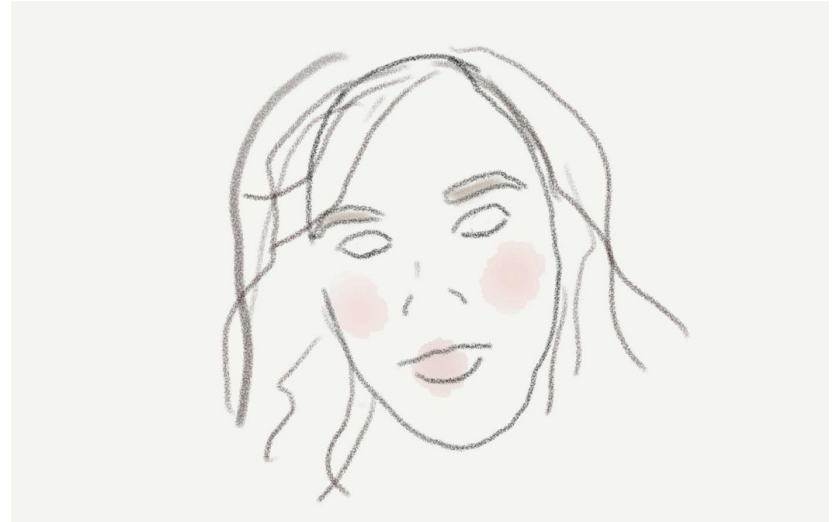


The image shows a screenshot of the AnswerDash website. At the top left is the AnswerDash logo with the tagline "Contextual help for sales and support". To the right are social media icons for Facebook, Twitter, and LinkedIn, followed by "Create free account" and "Log in" buttons. Below these are navigation links: "PRICING", "DEMOS", "CUSTOMER SUCCESS", "INTEGRATIONS", "ANALYTICS", and "BLOG". The main content area features a woman in a blue shirt and glasses looking at a tablet. The tablet displays a green graphic with the text "ALL CUSTOMERS HAVE QUESTIONS" and an illustration of a person with a question mark. To the right of the woman is a vertical "Q&A" button.

*We eagerly found ways to replace human effort with machine effort.*

# Coming out, I faced oppression first-hand

- TSA body scanning led to invasive body searches
- ACM/IEEE digital libraries continue to deadname me
- Trans-exclusive health IT has led to medical errors
- Twitter has facilitated bullying
- News aggregators give me daily reminders of violence against trans people



*Being trans is in a transphobic world is hard.  
Software makes it harder.*

# A moral quandary...

I love computing as a medium and want other people to love it too!

I've spent my whole career trying to share that love.

*Computing is harming me and others, and few in CS seem to care or do anything about it.*

*How can I continue advocating for something that is doing such harm?*

I had to  
revise my  
notions of  
justice...

1. Computing should ~~be useful and usable~~ **respect everyone**
2. Everyone should be empowered to harness computing **to dismantle systems of oppression, rather than reinforce them**



I had to  
reconsider  
my research

1. *How can we educate the public to ensure that computing respects everyone?*
2. *How can we educate developers to ensure they make choices that dismantle systems of oppression, rather than reinforce them?*

Today, I want to share my lab's nascent efforts to explore these notions of justice in our research, teaching, and service, and entice you to join us.

# I'll discuss three ways that computing reinforces systems of oppression

For each, I'll share research by my Ph.D. students that explores how to teach these reinforcing patterns, and empower students to disrupt them.

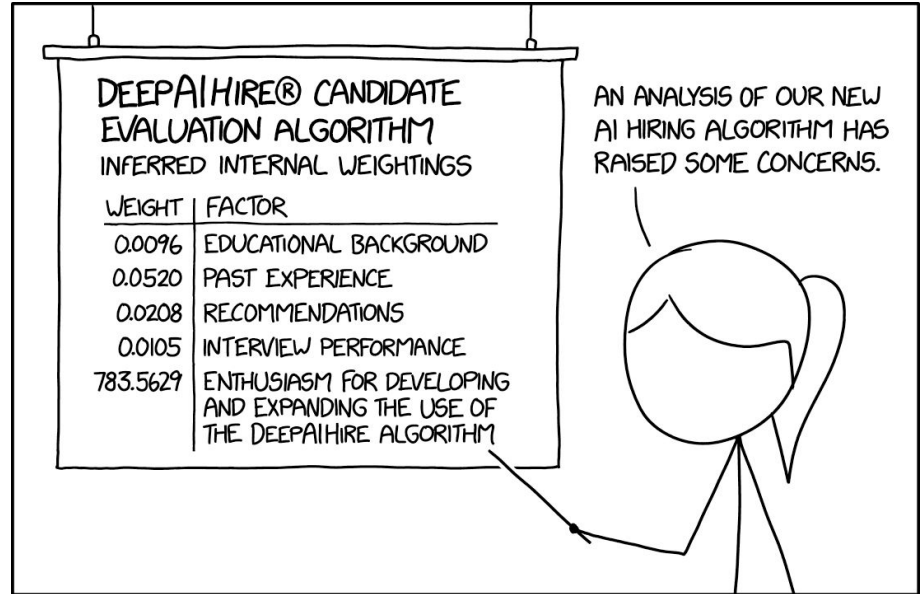
# *Warning*

This is an unconventional talk. There will be research, but there will also be *teaching, service, and... politics.*

Feel free to ask questions in the chat and I may answer during the talk.



# Computing has limits



<https://xkcd.com/2237/>

Many of us think of computing as endlessly powerful.

The world is using it to simplify retail and transportation, but also poverty, crime, hunger, climate, health, wellness, and more.



*Young, white male doctors helping young white women through the power of computing.*



*Computing is not neutral.*

But this neophylic myth has ignored real harm.

Judges are delegating sentencing decisions to racially-biased predictions.

States are delegating food stamp eligibility judgements to inhumane algorithms.

Filter bubbles are dividing our discourse.

*etc.*

# What everyone should know about *computing*

- Code is often *wrong* (O'Neil, 2016)
- Code embodies its creator's *values* and *biases* (Costanza-Chock, 2020)
- Code can't solve *every* problem; it often *causes* new ones (Toyama, 2015)

The public doesn't know these facts because **we're not teaching them.** In fact, many in CS are saying the opposite, that software is neutral, that it is infinitely powerful.



# How can we teach these limits?

Three examples from my lab.

# Greg Nelson has invented tutors that teach **limits** of programming languages

His tutor teaches the mechanics of program execution and reflects on its limits. Students learn that what little intelligence programs have is bestowed by people.



– I'm on the job market this year, and do HCI and Computing Education!

The screenshot shows a programming tutor interface with three main panels: Lesson, Program, and State.

- Lesson Panel:**
  - Learning step 1 of 180
  - Navigation: Back (grey), Next (red)
  - If statements**
  - Text: "Now it's time to use what you learned about boolean values and operators! Before this, the computer would execute all instructions created from the code. If statements allow computers to do some set of instructions if a **condition** is true or not. They look like this"
  - Code example: 

```
if ( condition )
{
  code goes inside the {}'s
}
```
  - Text: "Let's step through one to see how it works."
- Program Panel:**
  - Code: 

```
var x = 0;
if ( 10 > 0 ){
  /* the computer will execute inside here
  because the condition is true
  and that leaves true on the stack

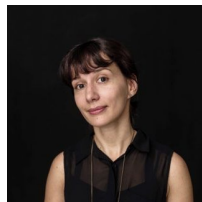
  we put x = 100000; here
  just so you can see some code
  execute inside the if */
  x = 1000000;
}
x;
var x = 0;
if ( 0 > 10 ){
  /* the computer will NOT execute inside here
  because the condition is false
  and that leaves false on the stack */
  x = 1000000;
}
x;

var x = 0;
if ( 10 != 0 ){
  /* the computer will execute inside here
  because 10 is not equal to 0
  and that leaves true on the stack */
  x = 1000000;
}
x;

var x = 0;
if ( 0 == 10 ){
  /* the computer will NOT execute inside here
  because 0 is equal to 10
```
- State Panel:**
  - first frame()
  - instruction: "This is a **variable declaration** statement. It declares one or more names and can optionally assign them values."
  - stack: empty
  - namespace: {}

# Stefania Druga has shown youth the **limits** of AI.

When children begin to create with machine learning embodied in robots, they begin to debate the capabilities with peers, and come to see the power of AI skeptically.



– I study AI literacy, HCI, and Computing Education

The screenshot displays a Scratch script on the left and the stage on the right. The script consists of the following blocks:

- when green flag clicked
- Take photo from webcam
- say What do you see in the photo? (with an eye icon)
- switch costume to paper
- ask Did I guess right? and wait

The stage shows a hand being photographed. A small window displays the original photo of a hand, and another shows a black silhouette of a hand, representing the AI's guess. Below the stage, the sprite 'you' is visible with a size of 100 and a direction of 30. An inset photo in the bottom right corner shows two children in a classroom setting, one holding a camera and the other looking at a screen.

# Alannah Oleson has invented methods for uncovering designers' **assumptions**.

Over a period of weeks, students come to realize the narrow ways in which they understand human diversity and the complexity of designing for it.

Critical Computing Education — Amy J. Ko



– I study HCI and Design Education from a social justice lens.

"I feel slightly less confident in my inclusive design skills [now]... the result of **a reality check the [method] gave me.**"

"... helped us understand the **assumptions that we had but didn't notice** while we were creating the design."

"... taught us to think about **all kinds of users** rather than just a generic one"

"My biggest takeaways from [class] were that **I had prejudices... that I didn't even realize**, that I actively needed to change those biases."



*President Obama participates in the Hour of Code, which frames computing as a form of empowerment without questioning its limits.*

These are just a few questions of many, e.g.,

How can we develop views of CS that balance skepticism with optimism?

How well do shifts in beliefs about CS persist long-term?

How do new conceptions of diversity influence algorithm design choices?

# Data has limits



<https://xkcd.com/1838>

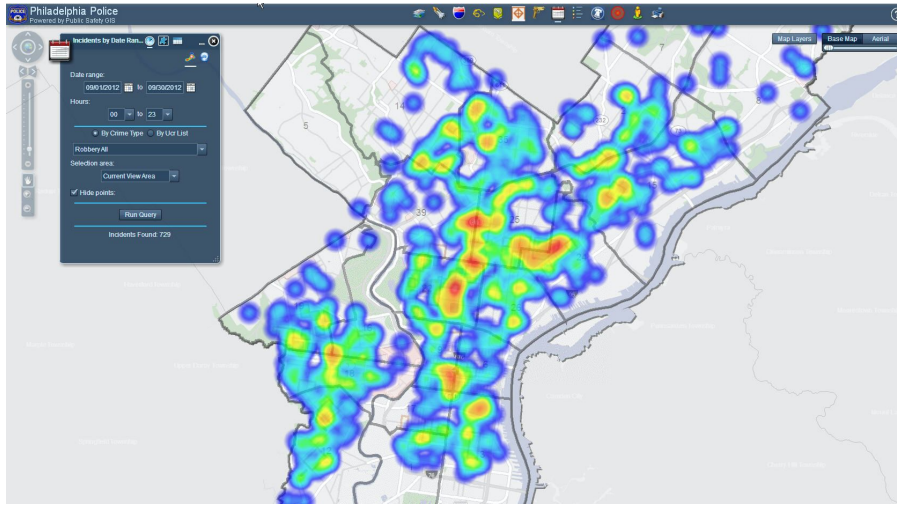
Many think of data as being *inert* and *abundant*.

Computing makes it easy to capture, easy to store, easy to process. Therefore, computing is the powerful thing, data is just input, right?

	A	B	C	D	E	F	G
1	ID	Age	Gender	District	SATV	SATM	GPA
2	54419	18 M		38	368	253	3.52
3	62516	22 M		5	670	496	1.11
4	55509	21 F		54	639	439	2.68
5	36489	19 M		49	368	465	3.11
6	36387	21 F		36	620	306	2.16
7	95507	20 F		13	512	593	2.83
8	16360	20 M		52	621	377	2.79
9	12838	18 F		44	571	544	2.13
10	73450	20 F		59	647	746	2.08
11	26869	18 F		28	337	371	2.28
12	48552	22 M		63	260	498	3.24
13	23416	19 M		51	476	294	2.31
14	42635	19 F		35	677	241	3.19
15	67448	19 F		55	335	533	1.81
16	34689	21 F		42	585	708	1.80
17	32763	22 F		20	556	787	1.18

*Data is just bits, right?*





*Philadelphia crime data is used to predict where crimes will happen, perpetuating the oppressive past of Black surveillance in the city.*

But data is a dominant force behind unjust code

It's *biased* crime data that has bolstered the carceral state.

It's *cisnormative* data on that cause gender nonconforming people be harrassed by the TSA.

It's our *desire* for data that's driving increases in carbon output.

# What everyone should know about *data*

- Data is a record of the *past*, not the future (Boyd, 2011)
- Data encodes values, assumptions, and goals (Garcia, 2018)
- Uses of data harm people in *unequal* ways (Costanza-Chock, 2020)

The public doesn't know these limits because we talk about data in **abstract, static** terms. But developers, harnessing data for computational ends, can do **concrete, dynamic** harm.

# How can we teach these limits?

Two examples from my lab.

# Yim Register is teaching the limits of data with tutors.

Their tutor teaches prediction concepts with **personal data**, which their recent study shows is superior at helping people learn a model's semantics, and frame self-advocacy arguments in terms of those semantics.



– I'm interested in creative ways to develop machine learning literacy!

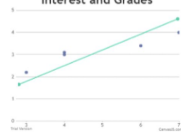
## Collect Data 1

Interest Rating	Grade	Course
9	2.2	CS2
6	3.4	INF3
7	4.0	AI
4	3.0	IST
4	3.1	CS

Next

## Draw a Line 2

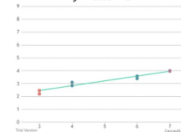
Interest and Grades



Next

## Residuals on the 'True Best' Line 3

$y = mx + b$



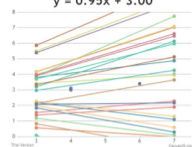
## Pieces of the Equation 4

$h_a(x) = \theta_0 + \theta_1 x$

$y = mx + b$

## Guess and Check? 5

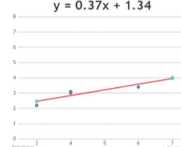
$y = 0.95x + 3.00$



Next

## A Better Way 6

$y = 0.37x + 1.34$



Next

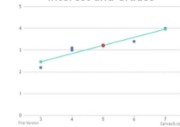
## Generalization 7

Interest rating

Next

## Testing a New Point 8

Interest and Grades

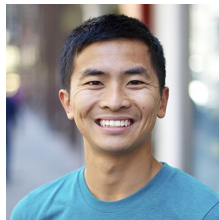


Next

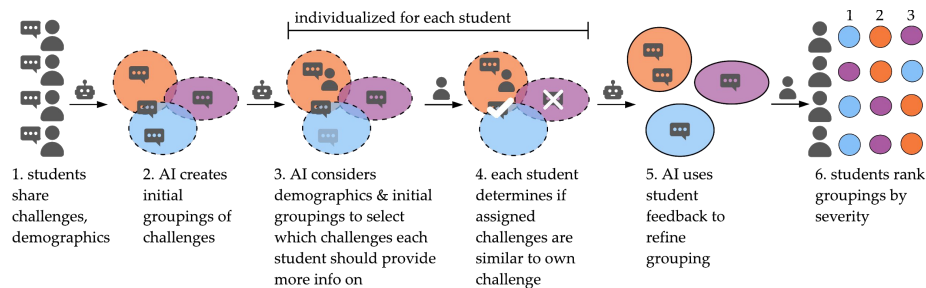
Yim Register, Amy J. Ko (2020). **Learning Machine Learning with Personal Data Helps Stakeholders Ground Advocacy Arguments in Model Mechanics.** *ACM International Computing Education Research Conference (ICER)*, 67–78

# Benji Xie is modeling inequity in learning contexts.

His latest project is investigating a new ways for teachers to gain insights about inequities in their classrooms, amplifying minoritized voices while preserving their privacy.



– I'm interested in equitable human-AI interaction in learning contexts!





*Google surveils Paris without consent.*

# These are just a few questions of many.

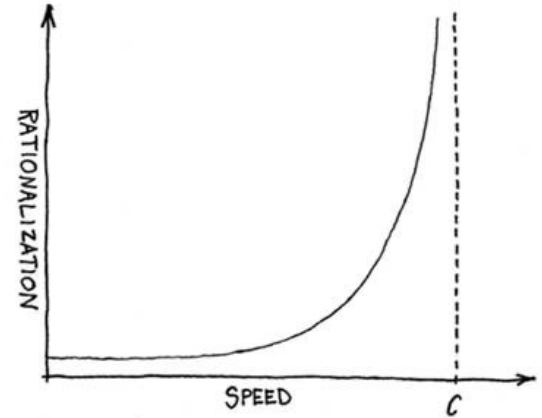
How can we develop learners' understanding of data harm?

How should we reframe algorithm design in a way that embraces the limits of data?

How should we reframe data structure education to highlight the role of structure in erasing diversity?

# Computing has *responsibility*

## MORAL RELATIVITY



RELATED TO MORAL RELATIVISM, IT STATES THAT ETHICS BECOME SUBJECTIVE ONLY WHEN YOU APPROACH THE SPEED OF LIGHT. THAT IS, IT'S OK TO BE SELF-SERVING, STEAL, AND MURDER AS LONG AS YOU'RE GOING REALLY, REALLY FAST.

(NOTE: THIS IS WHY RAP SOUNDS BETTER ON THE HIGHWAY AT 90 MPH)

<https://xkcd.com/103/>



# CS values innovation, disruption, power, and speed

We celebrate students who secure powerful roles, companies that restructure markets, and innovations that reshape society.



*For some companies, breaking things is the goal.*



Many CS departments are structured as bootcamps for big tech—including ours at UW.

But CS often leaves the moral choices about *what* to create to investors.

But *what* graduates make is not an individual choice, but a social one. It's our responsibility to center these individual and collective value tensions and impacts in student learning.

# What everyone should know about the responsibility of CS

- Software design choices are *collective* choices (Vakil, 2018)
- Developers' *values* and *politics* are infused in their choices (Vakil, 2018)
- Developers are *responsible* for what they make (Friedman, 1992)

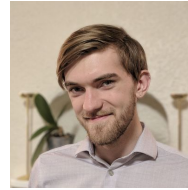
Too few people—including CS faculty—understand these responsibilities. It's our job as teachers to develop awareness of these them, creating a global sense of accountability amongst people who amplify social forces with computing.

# How can we teach these responsibilities?

Two examples from my lab.

# Neil Ryan is understanding career choices.

Their latest project has found that most undergraduate CS majors rapidly absorb the dominant narratives about careers from their departments and shape career trajectories accordingly.



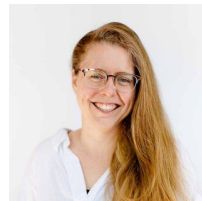
– *I want to change the narrative of what's standard, acceptable practice in computing to better serve humanity!*

“it really normalizes going into big tech just after undergrad. Which I think implicitly normalizes not going down other paths, and not asking questions of these big tech companies. I mean, this is what makes (CS) money, right? When they can have recruiters and big tech companies come recruit successfully, and get, like, tech workers into their capitalist agendas, then (CS) gets more money.”

– *CS-P1, reflecting on the large gifts given to CS departments by tech philanthropists.*

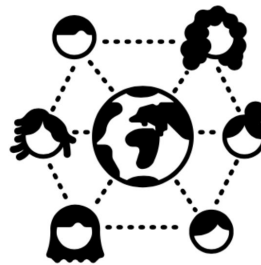
Jayne Everson is studying how to prepare justice-focused K-12 CS teachers.

She's just starting to observe how critical reflection CS and society changes the how they see computing and how they frame computing to youth, across STEM learning contexts.



– *I'm interested in tools and teaching methods for supporting project-based learning about CS and social justice.*

#### CRITICAL CS ED



An NSF-funded project investigating how to prepare justice-focused middle and high school CS teachers.

#### PREPARING JUSTICE-FOCUSED CS EDUCATORS

We are researcher-practitioner partnership at the [University of Washington](#), [Shoreline School District](#), and [Highline School District](#) investigating innovative ways to integrate CS education and social justice. Our team combines diverse perspectives and expertise in secondary teacher education, CS education research, administration, and social justice perspectives on computing and society. Our goal is to prepare a new generation of secondary CS educators who center social justice in their teaching, developing students critical consciousness about their relationship to computing in the world.

For my lab, this is just  
the beginning.



# Justice-Focused Secondary CS Education

A new NSF grant with my College of Education that will:

- Launch a unique **masters in teaching** that teaches foundations of CS *in terms of* justice, graduating hundreds in the next 10 years
- Produce a new book on teaching methods for critical computing education
- Investigate shifts in CS teacher identity as they engage sociopolitical issues in their **teaching**

Critical Computing Education — Amy J. Ko

The screenshot shows the NSF website interface. At the top, the NSF logo and tagline 'WHERE DISCOVERIES BEGIN' are visible. Below the navigation bar, the 'Awards' section is highlighted. The main content area displays the details for Award Abstract #2031265, titled 'Justice-Focused Secondary CS Teacher Education'. The details include the NSF Org (CNS Division Of Computer and Network Systems), Initial Amendment Date (August 28, 2020), Latest Amendment Date (August 28, 2020), Award Number (2031265), Award Instrument (Standard Grant), Program Manager (Jeffrey Forbes, CNS Division Of Computer and Network Systems, CSE Direct For Computer & Info Scie & Enginr), Start Date (October 1, 2020), End Date (September 30, 2023 (Estimated)), Awarded Amount to Date (\$999,723.00), Investigator(s) (Amy Ko ajko@uw.edu (Principal Investigator), Anne Beilers (Co-Principal Investigator)), Sponsor (University of Washington, 4333 Brooklyn Ave NE, Seattle, WA 98195-0001 (206)543-4043), NSF Program(s) (CSforAll-Computer Sci for All), Program Reference Code(s) (023Z), and Program Element Code(s) (134Y). Below the details, there is an 'ABSTRACT' section with text describing the project's goals and objectives.

**ABSTRACT**

The University of Washington will lead a researcher-practitioner partnership that leverages the team's joint expertise in computer science (CS) education research, justice-focused secondary teacher education, high school CS teaching, RPP leadership, academic program administration, and community organizing to design, launch, and sustain a new justice-focused secondary CS teacher education program to serve the Puget Sound region's high schools. All youth need to understand both the amazing power of computing, but also its potential for harm in their lives. They also deserve the education to harness this power, to amplify their voices and bend computing toward justice. To achieve this vision, this project will design, launch, and evaluate a sustainable, pre-service, justice-focused secondary CS endorsement program.

University of Washington proposes to design, launch, and sustain a new justice-focused secondary CS teacher education program to serve the region's high schools. The RPP has the shared goal of preparing secondary CS teachers who can empower all youth to bend computing toward justice. This goal is achieved through deeper engagement in two forms.

*Can't make progress without \$.*

# Justice-Focused Undergraduate Teaching

This summer, I revised all of my online books to center issues of justice. Dozens of faculty, including me, use these to teach HCI, design, and software engineering.

How will students respond to discussions of race + software architecture? Stay tuned to my **Twitter**.



[Design Methods](#). This book covers interaction design, design methods, and HCI fundamentals. I have my students read it in the first five weeks of class, then launch into a five week design project.



[Cooperative Software Development](#). This book covers software engineering fundamentals, but from a human, social, collaborative, and organizational perspective, rather than from a technical perspective.



[User Interface Software and Technology](#). This book covers the history, theory, and innovations in user interface software and technology.

*Can't make progress without \$.*

# CS for All Washington

I lead a coalition of 300+ teachers, researchers, district leaders, industry advocates, not-for-profits.

We've passed legislation that 1) requires CS electives in all schools, 2) legally defines CS in justice terms, and 3) secures a \$3 million in annual state funding to support teacher professional development.



Across our state, **too few students learning about computing**, whether it's a lesson in a K-5 class that integrates computer science ideas, a computer science elective in a middle school or high school, or an after school or summer coding camp. Why should our state's youth learn CS?

- **Diversity.** Participation in CS by women, people of color, and people with disabilities is among the lowest of all STEM fields.
- **Skills.** Learning CS promotes 21st-century skills such as *creativity, collaboration, and communication*.
- **Citizenship.** Being a good citizen in the 21st century include literacy about how computing shapes our lives and society.
- **Community.** Our communities need people empowered to use computing to address local problems.
- **Workforce.** There is a global shortage of skilled software engineers. CS education can fill that gap.
- **School reform.** Teaching CS is a compelling, creative space where pedagogy is rich, experimental, and innovative.
- **Empowerment.** Computing provides youth with the ability to express themselves creatively and have voice.
- **Justice.** Computing can be a powerful tool for enacting justice; everyone should be able to harness it.

Washington state needs pathways for all youth from across the state to develop interest and confidence in computing skills, including understanding about how technology shapes society, learning how to data and algorithms can be used to solve problems in any domain, and learning how to use these ideas to create software for themselves, for their communities, and for their careers.

Want to learn more?

- **Parents and students,** see our [growing list of resources](#).
- **Current teachers,** learn [how to teach CS](#).
- **Future teachers,** learn [how to become a CS teacher](#).
- **Administrators,** learn [how to bring CS to your school or district](#).
- **Policymakers,** learn [about the state of state law on CS education](#).

Broadening K-12 participation in CS across Washington state.

# Research in the Code & Cognition Lab

Many more justice-focused CS literacy projects on:

- Learning at home
- Learning in school
- Learning in communities
- Learning at work
- Self-advocacy



*Students of the Code & Cognition Lab, eating donuts without me.*

What can *you* do?

# Augment your research with BPC plans

NSF CISE now requires  
broadening participation in  
computing plans

Use them to seriously address  
not only issues of equity and  
inclusion, but also justice.

See *bpcnet.org* for guidance.



*NSF wants us to focus on broadening participation.*

# Interrogate your teaching

What values are you supporting?

How are your explanations, examples, and assessments reinforcing these values?

How can you be more explicit about your values?



*Students are looking to us for moral guidance.*



Recognize your power and the responsibility that comes with it.

You have far more than you think, and unless you carefully reflect on the consequences of your choices, you won't see them.

Being *apolitical* is just another kind of political.



Students at the University of Washington protesting a Suzzallo library with faculty.

# Questions?

The gist:

1. Computing has limits
2. Data has limits
3. CS has responsibility

We need research, teaching, and service that seriously engage these facts; I'm trying to figure out how to do that in CS education.

Critical Computing Education — Amy J. Ko



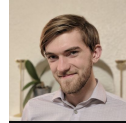
Greg Nelson he/him  
[gregnelson.info](mailto:gregnelson.info)  
HCI+CS Ed



Benji Xie he/him  
[benjixie.com](http://benjixie.com)  
HCI+CS Ed



Alannah Oleson they/them  
[alannaholeson.com](http://alannaholeson.com)  
HCI+CS Ed



Neil Ryan they/them  
[neildryan.com](http://neildryan.com)  
CS Ed



Stefania Druga she/her  
[cognimates.me](http://cognimates.me)  
AI + CS Ed



Yim Register they/them  
[students.washington.edu/yreg](http://students.washington.edu/yreg)  
CS Ed + Data Science



Jayne Everson she/her  
<http://jayneeverson.com>  
HCI+CS Ed

The many wonderful doctoral students with which I collaborate.