

## Devices & Apps



Sun exposure



Baby





iBGStar blood #glucose meter for #diabetes management. Can be used on its own or connected directly to an iPhone or iPod touch to display, manage and communicate information. The FDA cleared device is manufactured by AgaMatrix and available through Sanoft.



The Gluco(M) Wristband. [concept from 2009] "Medical device that offers 3 major functions to diabetics: non-invasive and instant glucose reading, storing previous readings history with averages, and an extremely useful insulin chamber with loaded syringe cartridge." #dlabetes



GreenGoose — Toothbrush Sensor. A pliable ring that slides onto a toothbrush. Once connected to a GreenGoose base station (little green egg), it measures when your kids start brushing and communicates to apps on your mobile phone. See cartoon video at www.greengoose.co...



/eBand, Wristband that monitors :posure to the sun's UVA and UVB ys (it doesn't just detect sunlight) brat



Fitness



Fertility Calendar & Period Tracker

Plan better by knowing ovulation ahead of time

Daily Health Log

The more data you enter, the more refined your predictions reating a digital signal detected by a

Health Insights

Your personal data translated into well-researched insights

Partner Connected

Get your partner involved, because it's a shared journey



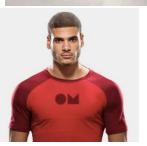
ite, activity, and respiratory rate.

Download on the









Mental health









Withings blood pressure monitor www.withings.com



Sensor tattoos (Epidermal Electronics) lelectrophysiological, temperature, and strain sensors; transistors, lightentiting diodes, photodetectors, radio frequency inductors, capacitors, oscillators, and rectifying diodes. From the journal Science, work done by John Rodgers. See also mettlinic.com



PiliCam - ESO (esophagus) and SB (Small Dowley). The video capsule contains an imaging device and light source and transmits images at a red (2 (SB) to 16 (ESO) images per second. The capsule endoscopy is used to visualize and detect disorders of the GI tract. #crohns www.givenimaging.com

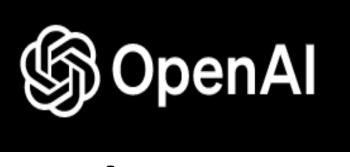












**ChatGPT** 



# Digital Technologies Threaten Privacy!

GPS, mobile, implantable devices, RFID, CCTV, Sensors, networked

sensors, image, video and audio, Web cookies,

flash cookies

"Big

Collect, Track, Surveil, Monitor,

My privacy has been violated!

northine learning, data science, data analytics,

AI, biometrics, facial recognition, recommendation

Profile, predict, target, manipulate

Internet, Web, IoT, social computing, social networks, Email, mobile tech, "gig" work

Distribute, communicate, network, platforms

redictive modeling,

# Privacy

What do we mean? Why do we care?

# Privacy

Right to control [private] No access [to private]

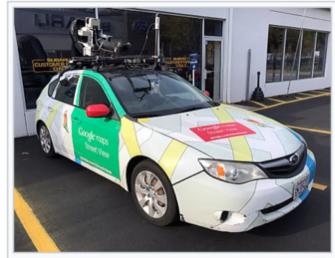
What do we mean? A Why do we care? Dignity Autonomy Right to withhold [private]

## Why do we need ANOTHER definition of privacy?

- 1. Threats from digital tech that cannot be handled
- 2. A regulatory approach "notice & choice" -- that is broken
- 3. Allowing "anything goes" for data that is unsecured (think scraping; think taking stuff from an unlocked house)
- 4. Suggesting the "privacy paradox" is real

### Google Maps Street View, launched 2007

#### Privacy concerns



A Street View car parked at a

**New Jersey** 

Subaru Service Center in Jersey City,

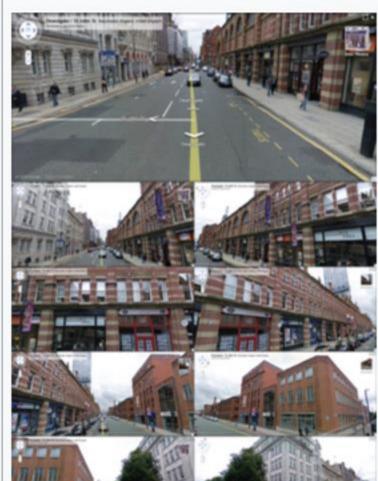
Main article: Google Street View privacy concerns

Google Street View will blur houses for any user who make to the automatic blurring of faces and licence plates. [42] Priv objected to the Google Street View, pointing to views found strip clubs, protesters at an abortion clinic, sunbathers in bil engaging in activities visible from public property in which the seen publicly. [43] Another concern is the height of the came countries, Japan<sup>[44]</sup> and Switzerland,<sup>[45]</sup> Google has had to cameras so as to not peer over fences and hedges. The se themselves to flag inappropriate or sensitive imagery for Gc remove.[46] Police Scotland received an apology for wasting from a local business owner in Edinburgh who in 2012 had

for the Google camera car by lying in the road "while his colleague stood over him with a pickaxe ha it was revealed that Google had collected and stored payload data from unencrypted Wi-Fi connection View.<sup>[48][49]</sup>

#### Google Street View





# **©** Clearview Al

Scraped over **30 billion** photos from social media & other public websites.

Used over 1 million times by 2,400 U.S. law enforcement agencies "Publicly available photos and information derived from them: As part of Clearview's normal business operations, it collects photos that are publicly available on the internet. The photos may contain metadata which may be collected by Clearview due to it being contained in the photos, and information derived from the facial appearance of individuals in the photos." From Privacy Policy

# Only "public!"

# Large Language Models

#### 2.7 Privacy



GPT-4 has learned from a variety of licensed, created, and publicly available data sources, which may include publicly available personal information. [58, 59] As a result, our models may have knowledge about people who have a significant presence on the public internet, such as celebrities and public figures. GPT-4 can also synthesize multiple, distinct information types and perform multiple steps of reasoning within a given completion.



#### **Privacy Policy**

What is the Privacy Policy and what does it cover?

 $\wedge$ 

What information do we collect?

How do we use your information?

How is your information shared on Meta Products or with integrated partners?

How do we share information with third parties?

How do the Meta Companies work together?

How can you manage or delete your information and exercise your rights?

How long do we keep your information?

How do we transfer information?

How do we respond to legal requests, comply with applicable law and prevent harm?

#### How do we share information with third parties?



**Highlights** 

We share certain information with:

- Advertisers who show ads on our Products
- · Businesses we hire to market our Products for us
- · Businesses we hire to do things like offer customer service or conduct surveys
- Researchers who use it to do things like innovate, advance technology, or improve people's safety

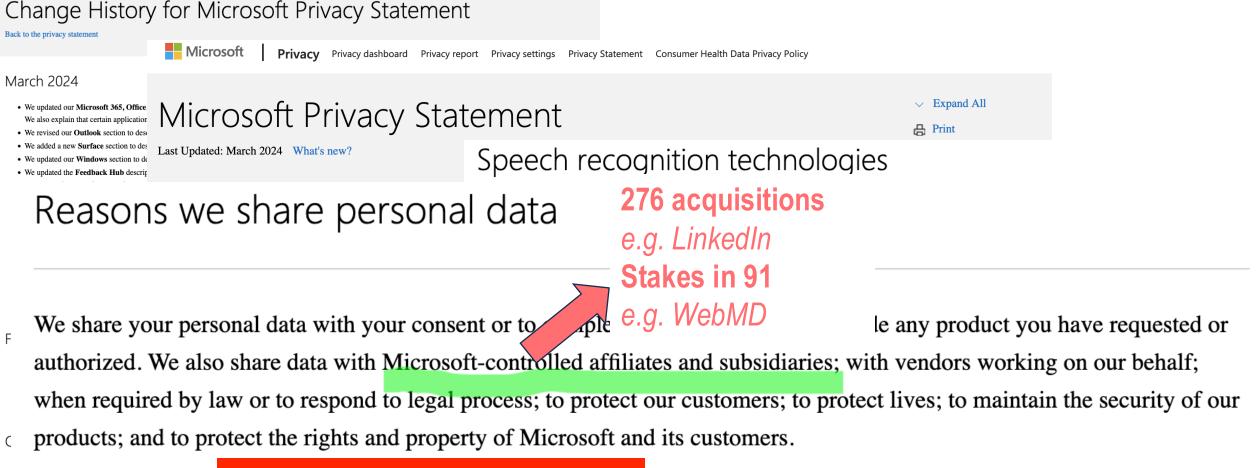
We don't sell your information, and we never will.



We don't sell any of your information to anyone, and we never will. We also require partners



October 9, 2024



Please note that, as third parties for per But we consented

laws, "sharing" also relates to providing personal data to ne U.S. State Data Privacy section below and our U.S. State

Data Privacy Laws Notice for more information.

#### August 2023

- We made updates throughout the Privacy Statement and added a new Artificial Intelligence section to enhance our disclosures around our development and use of Artificial Intelligence ("AI").
- We updated the Bing section to provide you information on Bing Chat, an AI-enhanced web search functionality, including how you can view and manage your Recent activity
  with Bing Chat.
- We supplemented the Reasons we share personal data section to explain how we may share receipts of purchases from Microsoft with Microsoft account holders who use the same payment method.

Benchmarks for a meaningful conception of privacy Faithful to common use Clear and rigorous Reveals privacy's ethical significance (why care?) &

Solid grounding for technology and regulation

## Contextual Integrity (CI): The one-liner

privacy is

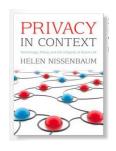
Appropriate information flow

Not control over information about yourself

Not secrecy

# Key ideas

# **Privacy as Contextual Integrity**

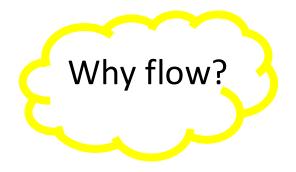


... a different way of thinking about privacy

## Contextual Integrity (CI): The one-liner

privacy is

appropriate information flow



## Contextual Integrity (CI) Definition

appropriate information flow

= conforms with legitimate contextual norms/rules



- Social Contexts
- Contextual informational norms
- Contextual values ends purpose









# Contexts

- Differentiated social spheres
  - > E.g. health, education, family, politics, commerce
- Defined by purposes, goals, values
- Associated functions; practices; ontologies of roles and information types
- Governed by contextual norms & rules
  - Specifically, data flow <u>norms</u>, <u>rules</u>

# \*\*Structure of CI Norms\*\*

The CI-tuple: Five parameters

<actors\*: subject, sender, recipient>, <attributes\*>, <transmission principle>

**Actors:** Physician, bank, merchant, police, Verizon, shopper, reader, advertiser, voter, insurance company, mother, spouse, teacher, friend, student, FBI, CIA, neighbor

**Information type:** Age, gender, books you've read, movies you've seen, purchases, whether you voted in previous election, salary, address, medical diagnosis, SSN, facial image, what you paid for your house, GPA, spoons of sugar in your coffee, sexual orientation

**Transmission Principle:** Consent, coerce, compel, steal, buy, sell, in confidence, surreptitiously, with notice, with a warrant, with authorization, reciprocity

\*acting in capacities

\*contextual ontologies

## Capacities, ontologies, Transmission Principles

Ontologies of roles: student, physician, policeman.

Ontologies of attributes: consider forms such as IRS, Census, bank loan, medical insurance, admissions applications, job applications

Transmission principles: With consent ("control"), With notice, With payment, With authorization of <xyz>, By law

<subject><sender><recipient><information type> <transmission principle>

See cultural differences?

Schools must provide parents with information about their children's academic progress.

Universities must provide parents with information about their children's academic progress (with children's permission?)

Universities must provide companies with information about students' academic progress (with students' permission?)

Friends do not ask each other how much they paid for their apartments.

An interviewer is forbidden from asking a job candidate his/her religion

Travelers are compelled to show contents of their luggage to the TSA agents upon request.

# All the parameters matter! A rule must specify values for all parameters!

<subject> • <sender> • <recipient> • <attributes> • <TPs>

What difference does this make?

# Privacy as Contextual Integrity Defined (First approximation)

CI Is satisfied iff information flows conform with entrenched informational norms. (We may say, "meets privacy expectations.") Benchmarks for a meaningful conception of privacy Faithful to common use Clear and rigorous Reveals privacy's ethical significance (why care?) &

Solid grounding for technology and regulation

# Empirical studies (with K. Martin)\*

- I. CI Reveals Confounding Variables in "sensitive" data flows
- II. CI Exposes Privacy Expectations in Public Records
- III. CI Reveals Privacy Expectations in Location Data collected in public

- \*K. Martin and H. Nissenbaum (2017) "Measuring Privacy: An Empirical Test Using Context to Expose Confounding Variables," Columbia Science and Technology Law Review 18, 176-218.
- K. Martin and H. Nissenbaum (2017) "Privacy Interests in Public Records: An Empirical Investigation," Harvard Journal of Law and Technology 31:1, 111-143.
- K. Martin and H. Nissenbaum (2020) "What is it about Location?" Berkeley Technology Law Journal

### Discovering Norms: Factorial Vignette Questions template

- Is it acceptable for the <sender> to share the <subject>'s
   <attribute> with <recipient> <transmission principle>?
- E.G. Is it acceptable for a <u>professor</u> to share a <u>student's poor</u> <u>record of attendance</u> with <u>the department chair without</u> <u>student's consent</u>?

## Contextual Integrity (CI) Definition

appropriate information flow

= conforms with legitimate contextual norms/rules

### CI Heuristic to evaluate tech or to inform tech design

- Describe data flows in terms of all 5 parameters
  - Note: in practice, parameters are often overlooked
- Relevant norm? [rule expressed in terms of 5 parameters]
  - Existence of norms can be discovered a variety of ways
- Check conformance
  - Yes +
  - No X
  - Other ?



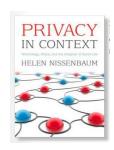
Benchmarks for a meaningful conception of privacy Faithful to common use Clear and rigorous Reveals privacy's ethical significance (why care?) &

Solid grounding for technology and regulation

# Seeking ethical legitimacy

When tech practices challenge norms, norms are unclear, contested, or don't exist

Appropriateness? Alignment?



# Consider the consequences

- 1. Interests & preferences of affected parties (stakeholders)
- 2. Ethical and political principles and values (societal)
- 3. Contextual functions, purposes, and values (societal)



# Consider the consequences

- 1. Interests & preferences of affected parties (stakeholders)
- 2. Ethical and political principles and values (societal)
- 3. Contextual functions, purposes, and values (societal)

## CI Parameters + Purposes and Values

Actors: Subject, Sender, Recipient

Acting in contextual capacities

**Attribute:** Types of information

Per contextual ontologies

Transmission Principle: Constraints on flow

Contextual ends, purposes, values: Ethical Justification

## Contextual functions, purposes and values

healthcare: cure disease, alleviate pain and suffering, equity ...
politics: democracy, autonomy, accountability, justice
home and social: trust, autonomy, stability
education: knowledge, intellect, creativity, fair distribution
commercial marketplace: sell, buy, compete, profit, trust, honesty
(and more)

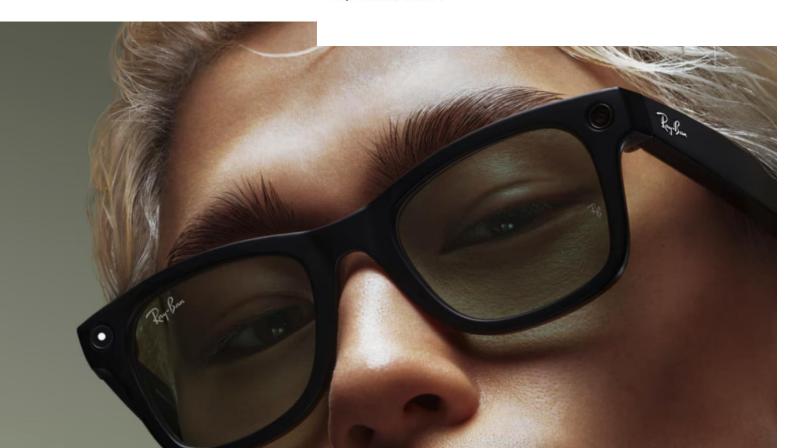
#### Meta

#### New Ray-Ban | Meta Smart Glasses Styles and Meta Al Updates

We're adding new styles, video calling with WhatsApp and Messenger, and Meta AI with Vision, so you can ask your glasses about what you're seeing and get helpful information.

April 23, 2024

#### **RAY-BAN META SMART GLASSES**







# **TAKEAWAYS**

- Cl offers positive conception of privacy
- Societies and individuals benefit
- Serves societal and contextual ends and values: fairness, justice, autonomy, security, health, liberty, utility
- Appropriate flow IS NOT a privacy tradeoff

Benchmarks for a meaningful conception of privacy Faithful to common use
Clear and rigorous
Reveals privacy's ethical
significance (why care?)

Solid grounding for technology and regulation

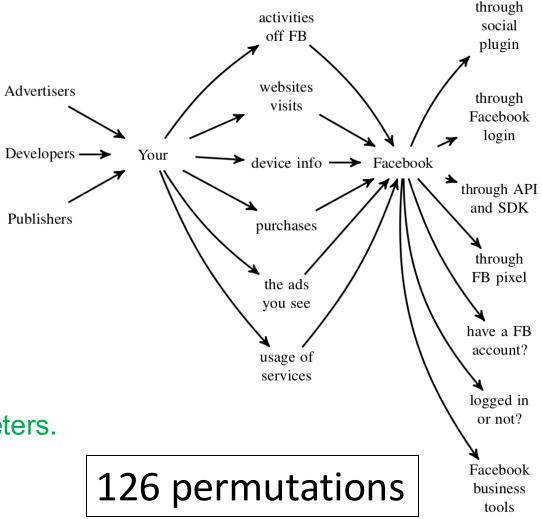
The Seventh AAAI Conference on Human Computation and Crowdsourcing (HCOMP-19)

### Going against the (Appropriate) Flow: A Contextual Integrity Approach to Privacy Policy Analysis

Yan Shvartzshnaider,\* 1,2 Noah Apthorpe,\* 2 Nick Feamster, 3 Helen Nissenbaum 4 New York University, 2 Princeton University, 3 University of Chicago, 4 Cornell Tech yansh@nyu.edu, apthorpe@cs.princeton.edu, feamster@uchicago.edu, helen.nissenbaum@cornell.edu

### Analysis: CI Parameter Bloating

Advertisers, app developers and publishers senders can send us recipient information through Facebook Business Tools that they use, including our social plug-ins (such as the Like button), Facebook Login, our APIs and SDKs or the Facebook pixel TP. These partners provide information about your subject activities off Facebook including information about your device, websites you visit, purchases you make, the ads you see and how you use their services attributes whether or not you have a Facebook account or are logged in to Facebook.



New work automates tagging operation for parameters.

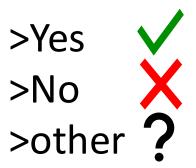
### Reject!

Privacy puts the brakes on good things

# HEURISTIC (1<sup>st</sup> approximation)

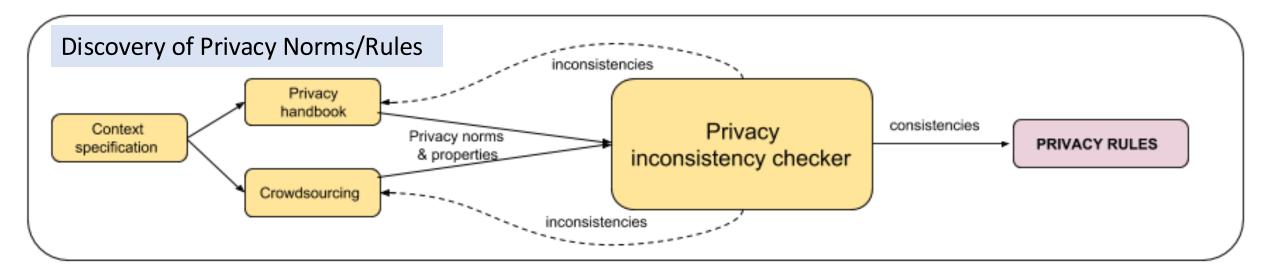
Assessing an existing practice or evaluating a design alternative:

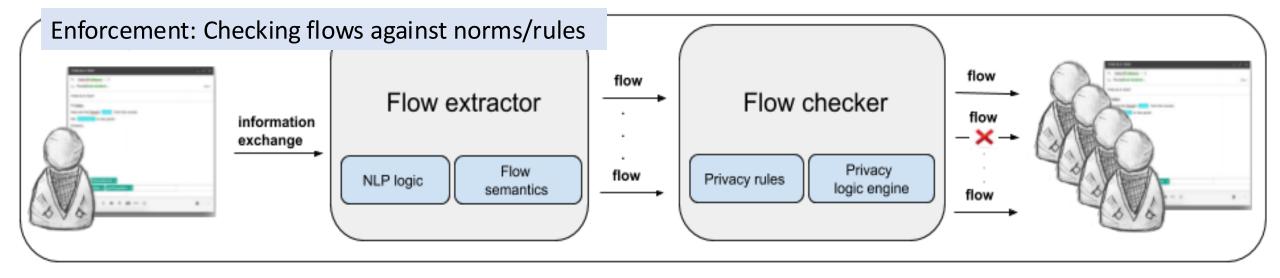
- Trace out data flows in terms of CI parameters
- Locate and map onto relevant privacy norms
- Check conformance



# VACCINE Data Governance for Institutional settings

detecting and expressing





#### Google Maps Street View, launched 2007

#### Privacy concerns



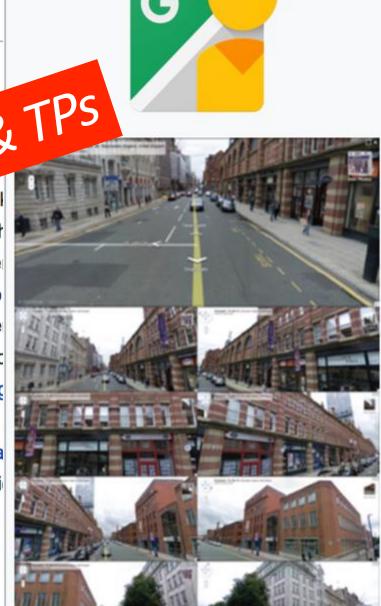
A Street View car park Subaru Servi New Jerse

Main article: Google Street View privacy concerns

Senion of the se

for the Google camera car by lying in the road "while his colleague stood over him with a pickaxe ha it was revealed that Google had collected and stored payload data from unencrypted Wi-Fi connection View.<sup>[48][49]</sup>

#### Google Street View







Our Biggest Health Challenges

A Healthy Mind

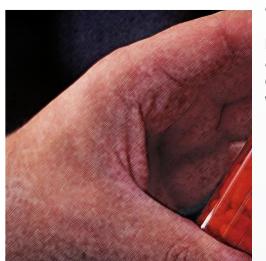
The Future of Biomedicine

**Transformative Technologies** 

Research for Healthy Living

The Promise of Precision Medicine

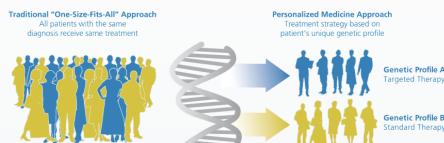
**Looking Forward** 



# The Age of Personalized Medicine

#### What Is Personalized Medicine?

Personalized medicine has the potential to change the way we think about, identify and manage health problems. It is already having an exciting impact on both clinical research and patient care, and this impact will grow as our understanding and technologies improve.



#### **Personalized Medic**

Personalized medicine is a approach to patient care the improves our ability to diag disease, but offers the pote disease at an earlier stage, to treat effectively. The ful of personalized medicine e



Risk As Geneti predisp



**Preven** Behavi **Treatm** to prev

# **Contextual Integrity – NOT**

No flow, no collection, secrecy [access]

.....of sensitive information

Control over personal information [control]

.....that is sensitive

Balance and trade off

# **Contextual Integrity – NOT**

No flow, no collection, secrecy

.....of sensitive information

Control over personal information

.....that is sensitive

Balance and trade off

# Privacy at What Cost? Using Electronic Medical Records to Recover Lapsed Patients Into HIV Care

Laura Derksen, Anita McGahan and Leandro Pongeluppe\*
May 3, 2022

#### Abstract

We show that Malawian healthcare staff save lives by tracking down HIV patients lapsed from care – even against their wishes – using data made accessible with the implementation of an electronic medical records (EMR) system. HIV patients in Malawi receive antiretroviral therapy (ART), a highly effective treatment that also prevents transmission, for free at clinics. Yet patients frequently lapse from care, resulting in increased community transmission and unnecessary deaths. The introduction of EMR allowed health providers to manage patient data, trace lapsed patients, and encourage lapsed patients to reinitiate treatment. We implement an event study analysis using data from 106 clinics that adopted EMR between 2007 and 2019 and find that the introduction of EMR leads to an immediate increase in the number of patients actively in care and to a decline in patient deaths. After five years of implementation, facilities with EMR have approximately 34 percent more patients in care and 28 percent fewer patient deaths than facilities without EMR. These effects are concentrated among patients under 50, and are larger among young children. Effects are also concentrated among patients who do not wish to be traced; these patients are in fact more likely to lapse from care and require tracing. Robust to additional specifications and supported by interview findings, the results demonstrate that an initial preference for privacy gives way to patient reinstatement in care when the health consequences are critical.

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lapsed from care – even against their wishes – using data made accessible with the im-

Challenging the relevance of the private/public dichotomy for privacy expectations

### Three empirical studies (with K. Martin)

- I. CI Reveals Confounding Variables in "sensitive" data flows
- II. CI Exposes Privacy Expectations in Public Records
- III. CI Reveals Privacy Expectations in Location Data collected in public

Benchmarks for a meaningful conception of privacy Faithful to common use
Clear and rigorous
Reveals privacy's ethical
significance

### Factorial Vignette Survey Method

#### Recipient:

- Car Dealership D....all potential car buyers
- Bank B...all potential loan applicants
- A curious guest....the hosts of an upcoming neighborhood party
- Company C....all job applicants

<u>Recipient</u> gathers information about <u>Subject</u> including <u>Information Type</u> which <u>recipient</u> learns by <u>Source</u>.

#### Source:

- by consulting a data broker (i.e., a company that sells data)
- by asking them
- by checking online government records

#### Information Type:

- · their marital status
- · whether they had a criminal record
- · whether they voted in the last election
- now much they paid for their home

Is it OK? -100 to +100

Factor	Operationalized in Vignette				
Information	Marriage Records	their marital status			
	Court Records	whether they had a criminal record			
	Voter Records	whether they voted in the last elec- tion			
	Property Records	how much they paid for their home			
Source	Data Broker	by consulting a data broker (i.e., a company that sells data)			
	Subject	by asking them			
	Online Records	by checking online government rec- ords			
		Subject	Recipient		
Context	Retail	all potential car buyers	Car Dealership D		
	Bank	all potential loan applicants	Bank B		
	Social	the hosts of an upcoming neigh- borhood party	a curious guest		
	Employment	all job applicants	Company C		

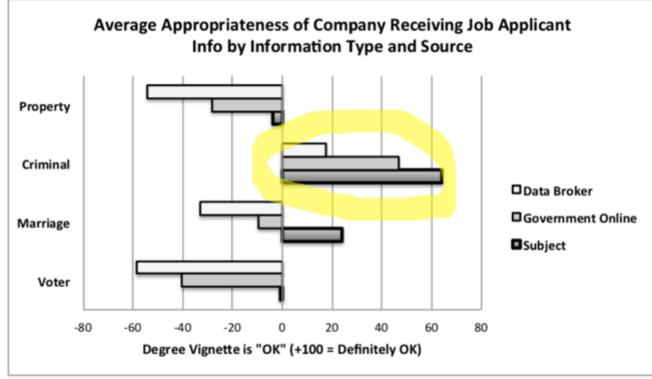
### HARVARD JOURNAL OF LAW & TECHNOLOGY

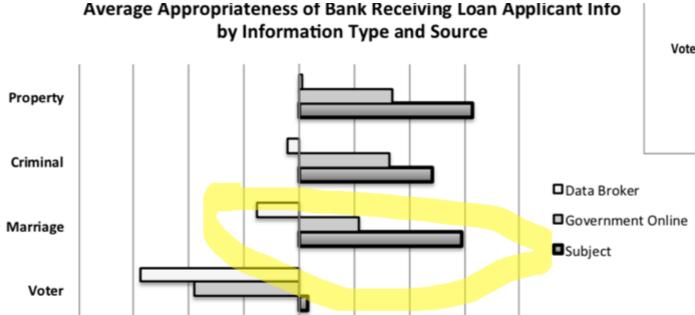
### II. Privacy Interests in "public" information

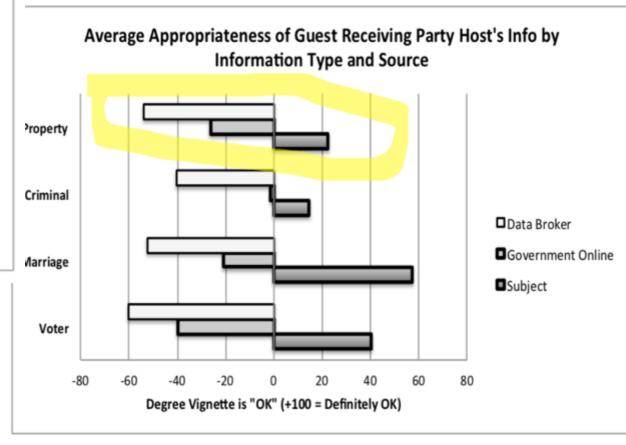
#### ARTICLE

PRIVACY INTERESTS IN PUBLIC RECORDS: AN EMPIRICAL INVESTIGATION Kirsten Martin & Helen Nissenbaum

NOT "Anything goes!"







In sum: Even if data is available in public records, respondents cared about the sources of the data not merely that it was public, viz. other parameters matter.

### Caution

Much regulation and technology design presumes the dichotomy is a good proxy.

Per CI: This approach is reductive & Does not align with common expectations

### **©** Clearview Al

Scraped over **30 billion** photos from social media & other public websites.

Used over 1 million times by 2,400 U.S. law enforcement agencies "Publicly available photos and information derived from them: As part of Clearview's normal business operations, it collects photos that are publicly available on the internet. The photos may contain metadata which may be collected by Clearview due to it being contained in the photos, and information derived from the facial appearance of individuals in the photos." From Privacy Policy

## Large Language Models

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# **Contextual Integrity – NOT**

No flow, no collection, secrecy

.....of sensitive information

Control over personal information

.....that is sensitive

Balance and trade off

Reduces privacy to one parameter -TP- and accepts only one value for it!

"notice + choice"

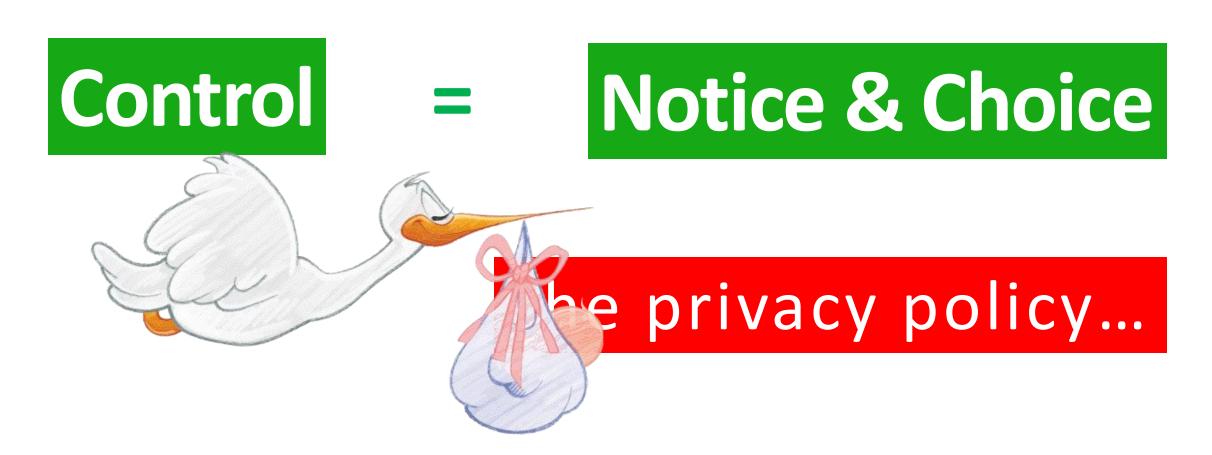
"informed consent"

present-day

privacy nightmare

### Guided by Fair Information Principles

No secret databases Know content/use Purpose/use limit Correction Security/reliability









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剛 3,600

**Ö** 17:40

**£** 4,239

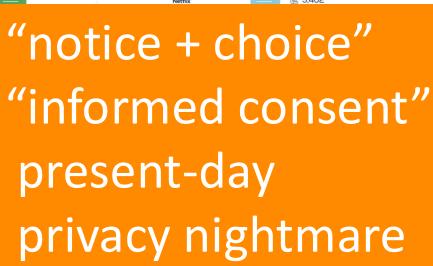
Snapchat

國 3,791

# 9th G







**©** 22:31



### We Read 150 Privacy **Policies. They Were an** Incomprehensible Disaster

Opinion | THE PRIVACY PROJECT

fications for collecting and selling your data

Source: https://www.usdirect.com/business/resource-center/privacy-policy-lengths/

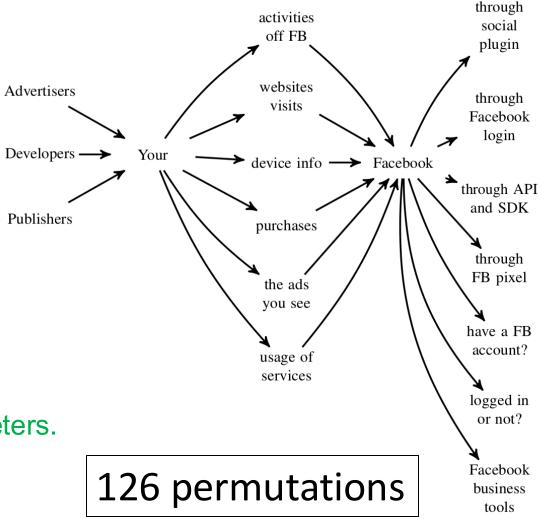
The Seventh AAAI Conference on Human Computation and Crowdsourcing (HCOMP-19)

### Going against the (Appropriate) Flow: A Contextual Integrity Approach to Privacy Policy Analysis

Yan Shvartzshnaider,\* 1,2 Noah Apthorpe,\* 2 Nick Feamster, 3 Helen Nissenbaum 4 New York University, 2 Princeton University, 3 University of Chicago, 4 Cornell Tech yansh@nyu.edu, apthorpe@cs.princeton.edu, feamster@uchicago.edu, helen.nissenbaum@cornell.edu

### Analysis: CI Parameter Bloating

Advertisers, app developers and publishers senders can send us recipient information through Facebook Business Tools that they use, including our social plug-ins (such as the Like button), Facebook Login, our APIs and SDKs or the Facebook pixel TP. These partners provide information about your subject activities off Facebook including information about your device, websites you visit, purchases you make, the ads you see and how you use their services attributes whether or not you have a Facebook account or are logged in to Facebook.



New work automates tagging operation for parameters.



Consent regime punts decisions to data subjects

Least able to assess implications, let alone our own best interests

Q: Isn't this about implementation alone?



**ENVIRONMENTAL CHANGE** 

TYRANNY OF CONVENTION

SCIENTIFIC DISCOVERIES

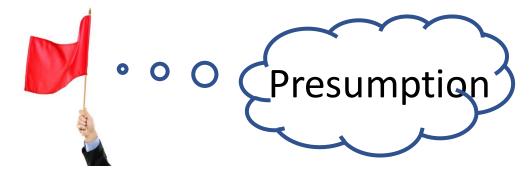
NO NORMS?

CULTURAL SHIFT

# Heuristic (1<sup>st</sup> approximation)

- Confront a disturbing case:
  - WebMD or NIH with Facebook button; 3<sup>rd</sup> party scripts "sell" user data
- Describe data flows in terms of 5 parameters
  - Note: in practice, parameters are often overlooked
- Relevant norm? [rule expressed in terms of 5 parameters]
  - Existence of norms can be discovered a variety of ways
- Check conformance





### what if

New practices don't meet expectations, or entrenched norm(al)

#### or

No relevant entrenched norm(al) guide or shape expectations

Stick-with-old or go-with-the-flow?

Benchmarks for a meaningful conception of privacy Faithful to common use
Clear and rigorous
Reveals privacy's ethical
significance



PART TWO: The ethical argument



- Social Contexts
- Contextual informational norms
- Contextual values ends purpose

### When tech practices are unprecedented

# Cl evaluation of legitimacy

- 1. Interests & preferences of affected parties (stakeholders)
- 2. Ethical and political principles and values (societal)
- 3. Contextual functions, purposes, and values (societal)

#### When tech practices are unprecedented

# Cl evaluation of legitimacy

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#### "Privacy harms"

**Privacy harms** 

Liberties

Speech

Association

Autonomy

**Fairness** 

Equity

**Justice** 

Security

<u>Informational benefits</u>

**Profit** 

Security

Efficiency

Risk reduction (banks, ads)

Speech

#### A contextual approach to privacy

# Cl evaluation of legitimacy

- 1. Interests & preferences of affected parties (stakeholders)
- 2. Ethical and political principles and values (societal)
- 3. Contextual functions, purposes, and values (societal)



# The Age of Personalized Medicine

**Health Information** 

**Grants & Funding** 

COVID-19

• Get the latest public health information from CDC

Get the lates

#### What Is Personalized Medicine?

**Personalized medicine** is the tailoring of medical treatment to the individual characteristics of each patient. The approach relies on scientific breakthroughs in our understanding of how a person's unique molecular and genetic profile makes them susceptible to certain diseases. This same research is increasing our ability to predict which medical treatments will

#### Personalized Medicine Is...

Personalized medicine is a multi-faceted approach to patient care that not only improves our ability to diagnose and trea

potential to detect age, when it is easi full implementati ne encompasses:

### Data flow disruptions: data types, recipients

NIH...Turning Discovery Into Health®

From the Director

Home » About

Our Biggest Health Challenges

A Healthy Mind

The Future of Biomedicine

Transformative Technologies

Research for Healthy Living

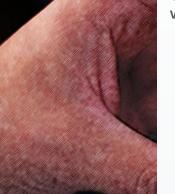
The Promise of Precision Medicine

Looking Forward

protocol based on a patient's molecular profile that may not only Personalized minimize harmful side effects and ensure a more successful outcome,

### Improved health outcomes

exciting impact on both clinical research and patient care, and this impact will grow as our understanding and technologies improve.





Traditional "One-Size-Fits-All" Approach





**Risk Assessment:** Genetic testing to rev predisposition to dise



**Prevention:** Behavior/Lifestyle/ Treatment intervention to prevent disease



**Detection:** 

#### Contextual functions, purposes and values

healthcare: cure disease, alleviate pain and suffering, equity ...

E.g. how confidentiality functions in healthcare contexts [intelligence of the Hippocratic Oath]

#### Contextual functions, purposes and values

healthcare: cure disease, alleviate pain and suffering, equity ...
politics: democracy, autonomy, accountability, justice
home and social: trust, autonomy, stability
education: knowledge, intellect, creativity, fair distribution
commercial marketplace: sell, buy, compete, profit, trust, honesty
(and more)

Is not only only about harm to the **individual (P. Regan)**Not contrary to **societal** values (typical: security)
Not contrary to **utility\*** (research, personalization)

## Not this

"Need to trade off privacy for other goods!"

Providing information ≠ giving up privacy Limiting data subjects' control ≠ giving up privacy

Legitimacy ("appropriate flow") runs deeper, is more tailored

# Privacy at What Cost? Using Electronic Medical Records to Recover Lapsed Patients Into HIV Care

Laura Derksen, Anita McGahan and Leandro Pongeluppe\*
May 3, 2022

#### Abstract

We show that Malawian healthcare staff save lives by tracking down HIV patients lapsed from care – even against their wishes – using data made accessible with the implementation of an electronic medical records (EMR) system. HIV patients in Malawi receive antiretroviral therapy (ART), a highly effective treatment that also prevents transmission, for free at clinics. Yet patients frequently lapse from care, resulting in increased community transmission and unnecessary deaths. The introduction of EMR allowed health providers to manage patient data, trace lapsed patients, and encourage lapsed patients to reinitiate treatment. We implement an event study analysis using data from 106 clinics that adopted EMR between 2007 and 2019 and find that the introduction of EMR leads to an immediate increase in the number of patients actively in care and to a decline in patient deaths. After five years of implementation, facilities with EMR have approximately 34 percent more patients in care and 28 percent fewer patient deaths than facilities without EMR. These effects are concentrated among patients under 50, and are larger among young children. Effects are also concentrated among patients who do not wish to be traced; these patients are in fact more likely to lapse from care and require tracing. Robust to additional specifications and supported by interview findings, the results demonstrate that an initial preference for privacy gives way to patient reinstatement in care when the health consequences are critical.

# Here, privacy as secrecy!

#### Privacy as Contextual Integrity Defined

Contextual Integrity requires that information flows conform with justifiable (legitimate) informational norms.

#### Privacy as Contextual integrity

- A positive conception of privacy
- Offers benefits to societies and individuals
- Supports societal and contextual goods: fairness, justice, autonomy, security, health, liberty, utility, etc.

Why data governance?

What we need

#### I. We need to know more

- More about contexts
- Ends, purposes and values
  - We cannot avoid semantics
- Informational norms: make the implicit explicit
- Improve methods to uncover, map, and visualize
- About impacts of data flows on societal & contextual ends as well as on data subjects and other stakeholders

#### II. Sensible regulation

- Require data flows to be mapped with values for all parameters
- Map flows against contextual ends and values
- Impose substantive constraints (where necessary)\*
- Revisit sectoral privacy laws, e.g. HIPAA, FERPA, GLBA\*
- Avoid the "privacy utility" trap
- Invite domain experts to the table
- \*Data subject consent may be neither necessary nor sufficient
- \*Novel tech and regulatory dodges

## Collaborators (合作人: 以下为一些美国的著名教授的名字)

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