



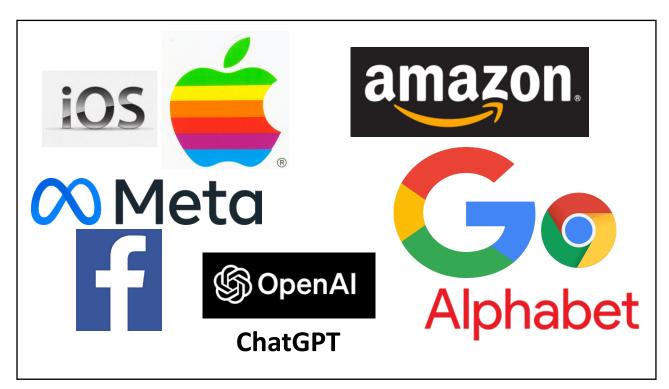
## Privacy → data governance?

There's a lot going on in the world of privacy regulatory efforts + industry ("PETs") + pressure from academia and advocacy



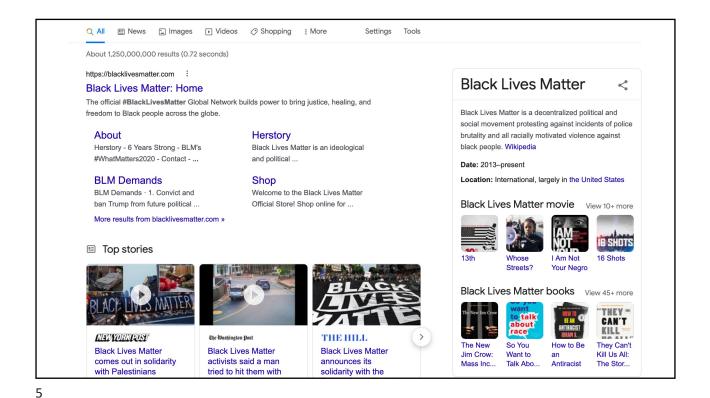
Contextual Integrity is a different way of thinking about privacy











National Institute of Allergy and Infectious Diseases

Research Diseases & Conditions Grants & Contracts Clinical Trials News & Events About NIAID

Syphilis

Syphilis is a sexually transmitted disease (STD)

These sores can be found on the genitals, vagina,

Facebook is receiving sensitive medical information from hospital websites, even inside password protected

patient portals. (The Markup, June 16<sup>th</sup>, 2022)



## Digital Technologies Threaten Privacy!

GPS, mobile, implantable devices, RFID, CCTV, Sensors, networked sensors, image, video and audio, Web cookies, Collect, Track, Surveil, flash cookies, web bugs, cross device, browser tracking

"Big Data," Databases, data aggregation, mining, predictive modeling, machine learning, data science, data analytics,

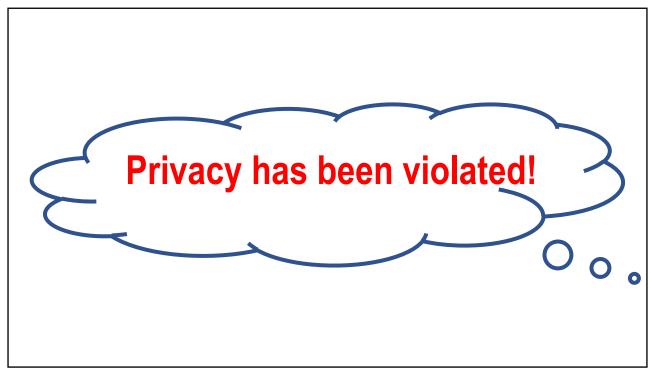
Profile, predict, target, manipulate

AI, biometrics, facial recognition, recommendation

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

Distribute, communicate, network, platforms

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Need a conception that holds up, explains, guides, justifies

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## **Privacy as Contextual Integrity**

## Key ideas

https://nissenbaum.tech.cornell.edu/



#### Benchmarks

[A meaningful conception of privacy]

faithful to common use

**Clear and rigorous** 

**T**eveals privacy's ethical significance

**Explains the technology challenges** 

Informs technology & policy

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## **Contextual Integrity**

Is Not



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

(The right to) privacy is (a right to)

appropriate information flow

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(The right to) privacy is (a right to)

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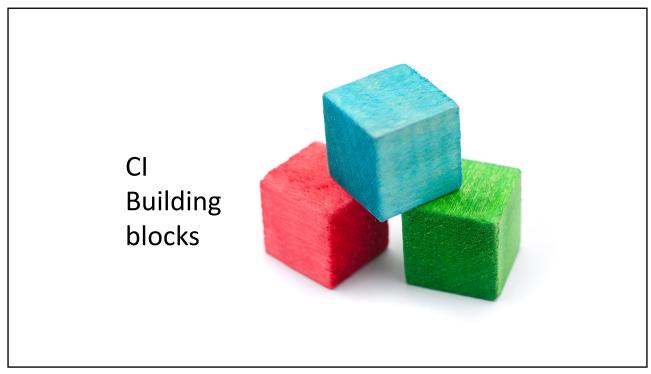


## **KEY IDEAS**

- 1. Appropriate flow
- 2. Contextual informational norms [policy+technology]
- 3. Legitimacy (rules & practices) [moral standing]



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#### **Social Contexts**

- > Differentiated social spheres
  - > E.g. health, education, family, politics, commerce
- ➤ May differ across nations, historical times, cultures
- Interact with one another in complicated ways
  - overlap, be nested, include specific institutions
- Constituted by functions, practices; distinctive ontologies of roles and information types;
- Governed by contextual norms & rules
  - Include information flow <u>norms</u>, <u>rules</u>, <u>expectations</u>
- > Defined by contextual purposes, goals, values

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#### Contexts

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  - E.g. health, education, family, politics, commerce
- > May differ across nations, historical times, cultures
- Interact with one another in complicated ways
  - > overlap, be nested, include specific institutions
- Defined by purposes, goals, values
- Constituted by functions; practices; distinctive ontologies of roles and information types [has semantics]
- Governed by contextual norms & rules
  - > Include information flow norms, rules, expectations



#### **Contextual Informational Norms**

<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

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<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 obliged to show contents of their luggage to the TSA agents upon request.

<sup>\*</sup>acting in capacities
\*contextual ontologies



#### **ALL THE PARAMETERS MATTER!**

A Rule must specify values for all parameters!

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

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From Privacy Rule: US Health Insurance Portability & Accountability Act

A covered entity may disclose protected health information about an individual who has died to a law enforcement official for the purpose of alerting law enforcement of the death of the individual if the covered entity has a suspicion that such death may have resulted from criminal conduct." (1996)



#### From HIPAA privacy rules

Sender role

Subject role

A covered entity can disclose <u>a patient's</u>

Attribute <u>psychotherapy notes</u> to the <u>patient</u> Recipient role

only with prior approval from the patient's psychiatrist

Transmission principle

In our formal policy language,

 $\square \forall p_1, p_2, q : P. \forall m : M. \forall t : T.$ 

 $\operatorname{incontext}(p_1,c) \wedge \operatorname{send}(p_1,p_2,m) \wedge \operatorname{contains}(m,q,t) \rightarrow$ 

 $inrole(p_1, covered-entity) \land inrole(p_2, individual) \land (q = p_2) \land (t \in psychotherapy-notes) \rightarrow$ 

 $\diamondsuit\exists p: P. \operatorname{inrole}(p, psychiatrist) \land \operatorname{send}(p, p_1, approve-disclose-psychotherapy-notes)$ 

Exactly as Contextual

**Integrity** says!

H. DeYoung, D.Garg, L. Jia, D. Kaynar, A. Datta, Experiences in the Logical Specification of the HIPAA and GLBA Privacy Laws, in *Proceedings of 9th ACM Workshop on Privacy in the Electronic Society*, October 2010.

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#### **Privacy DEFINITION: 1ST APPROXIMATION**

Privacy as CI is satisfied iff: information flows conform with entrenched informational norms (meet privacy expectations)



## **HEURISTIC** (1st 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



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#### **Google Street View** Google Maps Street View, launched 2007 Privacy concerns Main article: Google Street View privacy concerns ents & TPs Google Street View will blur houses for any user who to the automatic blurring of faces and licens objected to the Google Street Vie strip clubs, protesters Google missed chan engaging in perty in which th n is the height of the came and Switzerland, [45] Google has had to A Street View car pa so as to not peer over fences and hedges. The se Subaru Serv themselves to flag inappropriate or sensitive imagery for Go **New Jers** 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 connecti View.[48][49]





#### **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

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Balance and trade off

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? faithful to common use

? moral standing



Demonstrating that secrecy, even moderated by the private/public dichotomy does not map onto 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

#### Others empirical studies

- I. CI and privacy expectations for IoT devices
- II. "Contextual expectations of privacy" [Selbst, 2013]
- III. CI reveals surprising practices of disaster apps
- IV. CI exposes impossibility of privacy through Notice & Choice

Recipient:  Car Dealership Dall potential car buyers  Bank Ball potential loan applicants  A curious guestthe hosts of an upcoming neighborhood party  Company Call job applicants  Recipient gathers information about Subject including Information Type which recipient learns by Source.  Source:  Information Type:  their marital status company that sells data)  whether they had a criminal record whether they voted in the last election	Factor	Operationalized in Vignette		
	Information	Marriage Records	their marital status	
		Court Records	whether they had a criminal record	
		Voter	whether they voted in the last elec-	
		Records	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	by checking online government rec-	
		Records	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



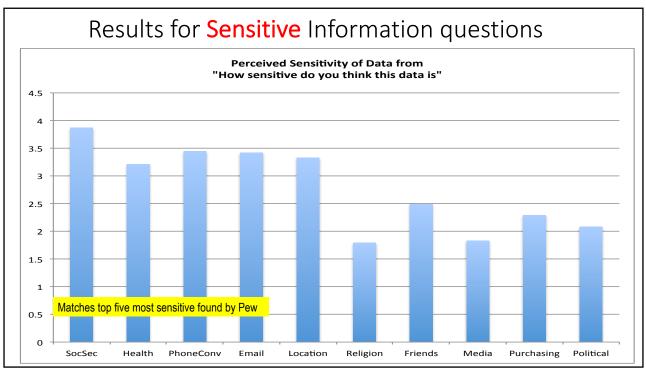
# THE COLUMBIA SCIENCE & TECHNOLOGY LAW REVIEW

I. It's OK for "private" information to flow

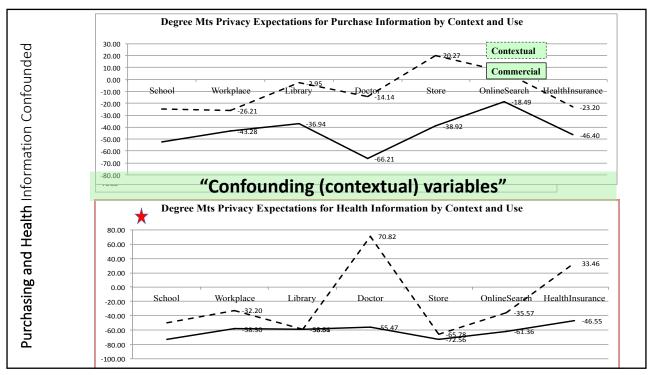
#### ARTICLE

MEASURING PRIVACY: AN EMPIRICAL TEST USING CONTEXT TO EXPOSE CONFOUNDING VARIABLES †

Kirsten Martin and Helen Nissenbaum\*







#### HARVARD JOURNAL OF LAW & TECHNOLOGY

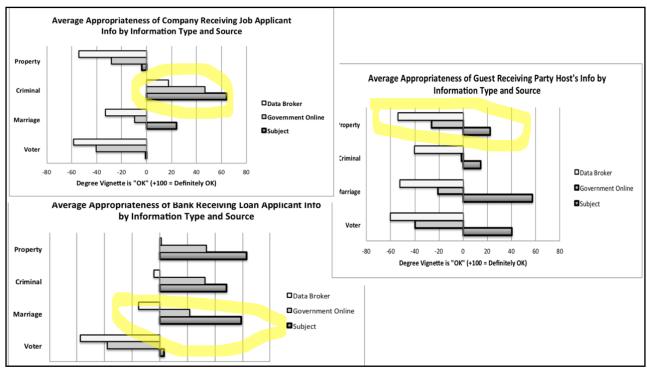
#### II. Privacy Interests in "public" information

#### ARTICLE

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

NOT "Anything goes!"





#### **Takeaways**

- 1) Even if data is judged to be sensitive, people still are positive when the flow is appropriate
- 2) Even if data is available in public records, responses were sensitive to all the parameters are.



#### **Caution**

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

EG: GDPR

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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

#### 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.



#### **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

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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"

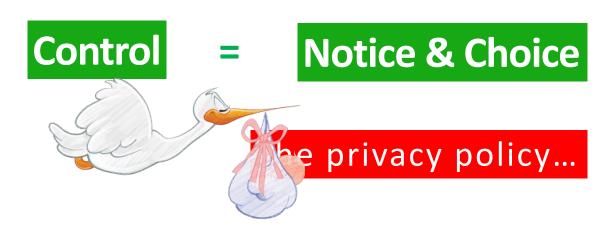
present-day

privacy nightmare

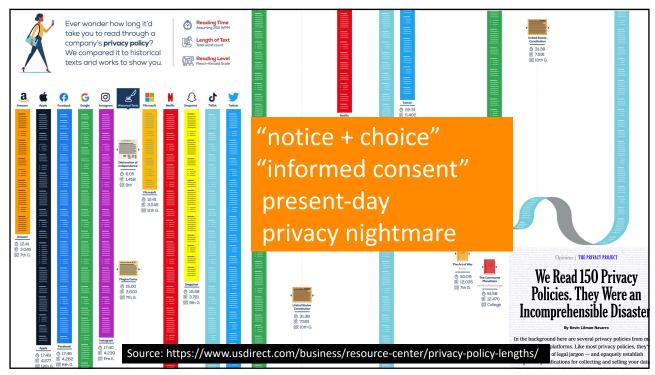
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#### Guided by Fair Information Principles

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



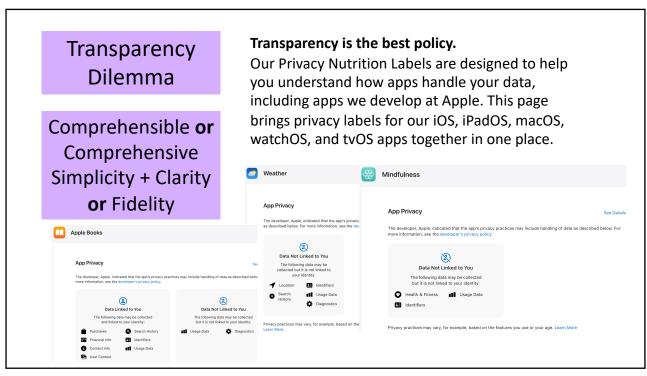




#### Ongoing research to make consent work in practice

- Usable choice architectures; opt-in/opt-out; "just-in-time", tiered, etc.
- More comprehensible, supple privacy policies; plain language, "visceral notice," etc.
- Privacy nutrition labels







Consent regime punts decisions to data subjects

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





#### Heuristic

- Confront a disturbing case:
  - WebMD or NIH with Facebook button; 3rd 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
- Notice a discrepancy?





#### what if

## When tech practices are unprecedented

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

or

No relevant entrenched norm(al) guide or shape expectations

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



#### [achieving a meaningful concept of privacy]

clear and rigorous faithful to common use

## carries moral weight

& ideally detensible with technology & policy

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"reveals privacy's moral significance"



#### **Contextual Integrity – KEY IDEAS**

- 1) Appropriate flow of information/data
- 2) Flow conforms with contextual info norms
- 3) Flow conforms with legitimate contextual info norms



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**Data Governance** = Regulation of data practices, entitlements, flow in accordance with societal values

## CI 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)



**Data Governance** = Regulation of data practices, entitlements, flow in accordance with societal values

### CI evaluation of legitimacy

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#### Contextual functions, purposes and values

healthcare: cure disease, alleviate pain and suffering, equity ... E.g. how does confidentiality function in healthcare contexts

politics: democracy, autonomy, accountability, justice

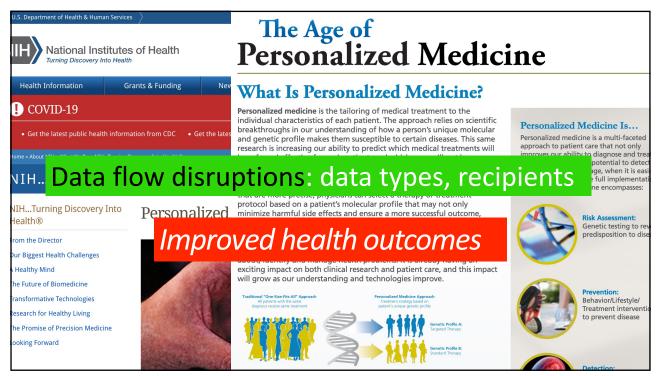
home and social: trust, autonomy, stability

education: knowledge, intellect, creativity, fair distribution

commercial marketplace: sell, buy, compete, profit, trust, honesty

(and more)





Harvard Data Science Review • Special Issue 1 - COVID-19: Unprecedented Challenges and Chances

Individual Acceptance of
Using Health Data for
Private and Public Benefit:
Changes During the COVID19 Pandemic

Frederic Gerdon, Helen Nissenbaum, Ruben L. Bach, Frauke Kreuter, Stefan Zins

Published on: Apr 06, 2021



### **Contextual Integrity – NOT**

Only only about harm to the **individual (Pris Regan)**Contrary to **societal** values (typical: security)
Is not a tradeoff with **utility\*** (research, personalization)

\*Recall the case for differential privacy – tradeoff between "privacy and utility"

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#### Why Privacy as CI?

- Offers a positive conception of privacy
- Good for societies and for individuals
- Supports societal and contextual goods: fairness, justice, autonomy, security, health, liberty, utility



#### PRIVACY → DATA GOVERNANCE

#### Governing (personal) data: What to do?

Articulate purposes and values of social contexts

Discover and uncover contextual norms: make the implicit explicit Require data processors to reveal data flows with values for all the CI parameters

Work with domain experts to understand impacts of data flows on interests, values, and contextual ends (e.g. does surveillance help students learn?

Be ready to impose substantive constraints in service of stakeholder interests and social integrity

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#### Bringing contextual integrity into privacy regulation

"It's too complicated for regulators!!"







## Informational Norms Embedded in Law: Example (GLB Act)

Sender role

Subject role

Financial institutions must notify consumers
if they share their non-public personal Attribute
information with non-affiliated companies,
but the notification may occur either before
or after the information sharing occurs
Transmission principle

Exactly as CI says!

In our formal computer language,

With, Adam Barth, Anupam Datta, John Mitchell

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#### Social policy for the sake of privacy, as CI

Identify contextual (sectoral) ends, purposes, and values Ends, purposes and values as guidance for data governance

education: knowledge, intellect, creativity, fair distribution FERPA Education Privacy 1974

healthcare: cure disease, alleviate pain and suffering, equity ... HIPAA Health Privacy Rules ~2000

finance: invest, bank, sell, buy, compete, profit, trust, honesty FCRA Fair credit reporting Act 1970; GLBA Privacy rules ~2000



#### **California Consumer Privacy Act (CCPA)**

Home / Privacy / California Consumer Privacy Act (CCPA)

Updated on February 15, 2023

The California Consumer Privacy Act of 2018 (CCPA) gives consumers more control over the personal information that businesses collect about them and the CCPA regulations provide guidance on how to implement the law. This landmark law secures new privacy rights for California consumers, including:

- The right to opt-out of the sale or sharing of their personal information; and
- The right to non-discrimination for exercising their CCPA rights.

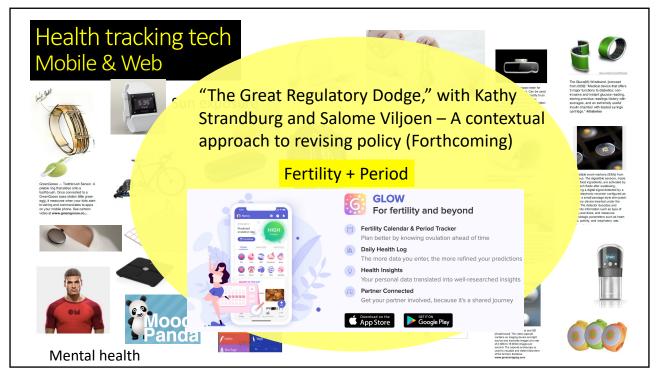
GENERAL DATA PROTECTION REGULATION **EU GDPR** 

• The right to know about the personal information a business collects about Control, as consent, with them and how it is used and shared;

The right to delete personal information collected from them (with some FIPPS their bone structure)

**Omnibus vs. Sectoral? Both!** 

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#### Art. 5 GDPR Principles relating to processing of personal data

- 1.Personal data shall be:
  - 1. processed lawfully, fairly and in a transparent manner in relation to the data subject ('lawfulness, fairness and transparency');
  - 2. collected for **Specified**, **explicit and legitimate purposes** and not further processed in a manner that is incompatible with those purposes; further processing for archiving purposes in the public interest, scientific or historical research purposes or statistical purposes shall, in accordance with <u>Article</u> 89(1), not be considered to be incompatible with the initial purposes ('purpose limitation');
  - **3.adequate, relevant and limited** to what is necessary in relation to the purposes for which they are processed ('data minimisation');
  - 4. accurate and, where necessary, kept up to date; every reasonable step must be taken to ensure that personal data that are inaccurate, having regard to the purposes for which they are processed, are erased or rectified without delay ('accuracy');
  - 5. kept in a form which permits identification of data subjects for no longer than is necessary for the purposes for which the personal data are processed; personal data may be stored for longer periods insofar as the personal data will be processed solely for archiving purposes in the public interest, scientific or historical research purposes or statistical purposes in accordance with <a href="Article 89(1">Article 89(1)</a>) subject to implementation of the appropriate technical and organisational measures required by this Regulation in order to safeguard the rights and freedoms of the data subject ('storage limitation');
  - 6. processed in a manner that ensures appropriate security of the personal data....

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#### Art. 6 GDPR Lawfulness of processing

- 1.1 Processing shall be lawful only if and to the extent that at least one of the following applies:
  - 1. the data subject has given consent to the processing of his or her personal data for one or more specific purposes;
  - 2. processing is necessary for the performance of a contract to which the data subject is party or in order to take steps at the request of the data subject prior to entering into a contract;
  - 3. processing is necessary for compliance with a legal obligation to which the controller is subject;
  - 4. processing is necessary in order to protect the vital interests of the data subject or of another natural person;
  - 5. processing is necessary for the performance of a task carried out in the public interest or in the exercise of official authority vested in the controller;
  - 6. processing is necessary for the purposes of the legitimate interests

    pursued by the controller or by a third party, except where such
    interests are overridden by the interests or fundamental rights and freedoms of the data subject
    which require protection of personal data, in particular where the data subject is a child.

...



#### Art. 6 GDPR Lawfulness of processing, contin.

- 1.2 The purpose of the processing shall be determined in that legal basis or, as regards the processing referred to in point (e) of paragraph 1, shall be necessary for the performance of a task carried out in the public interest or in the exercise of official authority vested in the controller. --. 4 The Union or the Member State law shall meet an objective of public interest and be proportionate to the legitimate aim pursued.
- 2. Where the processing for a purpose other than that for which the personal data have been collected is not based on the data subject's consent or on a Union or Member State law which constitutes a necessary and proportionate measure in a democratic society to safeguard the objectives referred to in <a href="Article 23">Article 23</a>(1), the controller shall, in order to ascertain whether processing for another purpose is compatible with the purpose for which the personal data are initially collected, take into account, inter alia:
  - 1. any link between the purposes for which the personal data have been collected and the purposes of the intended further processing;
  - 2.the context in which the personal data have been collected, in particular regarding the relationship between data subjects and the controller;
  - 3. the nature of the personal data, in particular whether special categories of personal data are processed, pursuant to <a href="Article 9">Article 9</a>, or whether personal data related to criminal convictions and offences are processed, pursuant to <a href="Article 10">Article 9</a>, or whether personal data related to criminal convictions and offences are processed, pursuant to <a href="Article 10">Article 10</a>;
  - 4. the pessible consequences of the intended further processing for data subjects

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

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#### https://nissenbaum.tech.cornell.edu/

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