

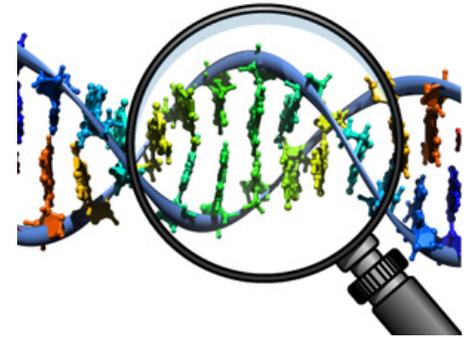


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# An **Exploratory** Ethnographic Study of Issues and Concerns with **Whole Genome Sequencing**

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# Genomics 101



## Genomes...

Information to build/maintain an organism's living example

At least one copy of the genome is in almost all cells

Encoded in **DNA** (or **RNA** for viruses)

DNA: a double stranded polymer of nucleotides (A, C, G, T)

In humans, **3.2B nucleotides** (in 23 chromosome pairs)

## Whole Genome Sequencing (**WGS**)...

Determining the **complete** DNA sequence in a genome

# WGS Progress



## Some dates

- 1970s: DNA sequencing starts
- 1990: The “Human Genome Project” starts
- 2003: First human genome fully sequenced
- 2005: Personal Genome Project (PGP) starts
- 2012: UK announces sequencing of 100K genomes

## Some numbers

- \$3B: Human Genome Project (2003)
- \$250K: Illumina (2008)
- \$5K: Complete Genomics (2009), Illumina (2011)
- \$1K: Illumina (2014)

# The Good News

Affordable WGS facilitates the creation of large **datasets** for **research** purposes

Crucial for hypothesis-driven research, e.g., **GWAS**

Low-cost WGS will bring genomics to the **masses**

Large number of individuals will have the means to have their (fully) genome sequenced, and possibly store/retain it

Personalized medicine

Diagnosis/treatment tailored to patient's genetic makeup

In general, genomic tests can be done **“in silico”**, using specialized computation algorithms

# The Bad News

The genome is a unique **identifier**

Once leaked, you cannot “revoke” it

Anonymization / de-identification useless

Gymrek et al., Identifying personal genomes by surname inference, Science, 2013



Genomic information is extremely **sensitive**

Contains ethnic heritage, predisposition to diseases and conditions (even mental), many phenotypical traits

Raises the risk of genetic discrimination – “genism”

# It gets worse...

Leaking one's genome  $\approx$  leaking **relatives'** genome

~99.9% of genomes of closely related humans identical

Basis of Gymrek's attack

The case of **Henrietta Lacks**

See Humbert et al. (ACM CCS, 2013)

Sensitivity of human genomes is (almost) **perpetual**

Even if encrypted, can't guarantee security of the encryption algorithm past 30-50 years

**More details:**

Ayday et al., Chills and Thrills of WGS, IEEE Computer

# The Greater Good vs Privacy?

Advances in genomics often promoted as dependent on volunteers and **data sharing**

Sharing is actually a requirement for most grants

Sharing is an important **asset** for research

Chatterjee et al. (Nature, 2013) project that **several million** samples may be needed for robust GWAS

But privacy and discrimination fears may drive potential participants away?

McGuire et al. (Genetics in Medicine, 2011) finds correlation between opting out and privacy fears

# Open Questions

What do we **understand** about users' perceptions and attitudes with respect to Whole Genome Sequencing

Do privacy perceptions/concerns experienced by individuals **correspond** to what the scientific community would expect?

How to identify effective mechanisms to **communicate** risks and benefits? How to reconcile the greater good/privacy **tension**?

(Little understanding from prior work in context of WGS)

# Methodology 1/3

Recruited 16 study **volunteers** in SF Bay Area

**Sex:** female (8), male (8)

**Age:** 18-24 (2), 25-34 (7), 35-44 (3), 45-54 (1), 55-64 (1), 65-(2)

**Degree:** College (4), Master (8), PhD (4)

**Income:** <\$50K (3), \$50K-\$75K (3), >\$75K (10)

**Westin:** Unconcerned (4), Pragmatist (7), Fundamentalist (5)

Participants skewed toward high-income/high-edu

Representative population for early WGS adopter, as per related work, e.g., Facio et al. (Nature, 2011), 2012 NPR study, ...

# Methodology 2/3

Participants guided through a set of **slides** depicting a few hypothetical **scenarios**

Asked to **comment** on and **rank** these scenarios

## Four experiments

**Exp A:** Assessing perception of today's genetic tests

**Exp B:** Comparing attitudes toward different WGS program

**Exp C:** Assessing perception of privacy/ethical issues with WGS

**Exp D:** Comparing the response to medical/genomic/personal information loss

# Exp A – Trust

Genetic Tests: More to less inclined	Avg	Std
(A.6) Determine Cancer Treatment	5.81	0.39
(A.5) Determine Drug Dosage	4.63	0.70
(A.2) Genetic Compatibility	4.06	1.25
(A.1) Disease Predisp. (Doctor)	2.63	0.99
(A.4) Disease Predisp. (Company)	2.13	0.70
(A.3) Ancestry Testing	1.75	1.09

(A.6), (A.5), (A.2) statistically significantly higher than (A.1)

Mann-Whitney U Test ( $U = 210.5$ ,  $n_1 = n_2 = 16$ ,  $P < 0.01$ , two-tailed)

(A.1) and (A.4) close

(A.4) was ranked among the bottom because of mistrust in company

# Exp B – Control

WGS Programs: More to less inclined	Avg	Std
(B.3) Data-only (DVD)	2.68	0.58
(B.1) Healthcare Provider	2.00	0.71
(B.2) Direct-to-Consumer (DTC) Company	1.31	0.46

(B.3) the “favorite” (12/16 ranking at the very top)

(B.2) the least “favorite” (11/16 ranking at the very bottom)

Diff b/w (B.1) and (B.2) stat. significant ( $U = 194; P < 0.05$ , two-tailed)

12/16 participants mention they wanted to “feel in control”

Mistrust against health provider: “use against me”, company “even worse”

When prospecting a \$1,000 discount for (B.1), even more suspicious

# Exp C – Discrimination

Incidents: More to less discomfort	Avg	Std
(C.1) Labor Discrimination	3.31	0.58
(C.2) Health Insurance Discrimination	3.00	0.94
(C.3) Sequenced Genome Leaked	2.56	0.93
(C.4) Sibling Donating Genome to Science	1.13	0.33

(C.4) least discomfoting (14/16 at the very bottom), (C.1) most discomfoting (15/16 participants ranking in top two)

Some participants not surprised by (C.2)

Some participants find (C.1) extremely unjust because of environmental factors

# Exp D – Harm

Information loss: More to less frightened	Avg	Std
(D.1) Identity Theft	3.50	0.63
(D.3) Emails and Pictures Leaked	2.63	1.61
(D.4) Sequenced Genome Leaked	2.00	0.63
(D.2) Medical Records Leaked	1.88	0.48

(D.1) and (D.4) statistically significantly different

Correlation b/w lower income and (D.3), higher income and (D.1)

$\chi^2 (1; N = 32) = 8.60$   $p < 0.01$  (both cases)

Correlation b/w fundamentalists and (D.1)

$\chi^2 (1; N = 32) = 4.36$   $p < 0.05$

# Summary of (Preliminary) Results

- 1) Users' **perception** depends on related **perceived** medical **benefit**
- 2) Participants **prefer** that **doctors** administer/explain genetic tests, **mistrust** of **DTC** companies
- 3) Raising issue of **control** – prefer to **retain & own** genomics data to minimize fear of potential discrimination
- 4) Labor/healthcare **discrimination** top concerns, also due to mistrust/unawareness of legislation
- 5) Genetic information **disclosure** not well understood

# Related Work

## Response to learning results of genetic tests

E.g. predisposition to cancer

## Control

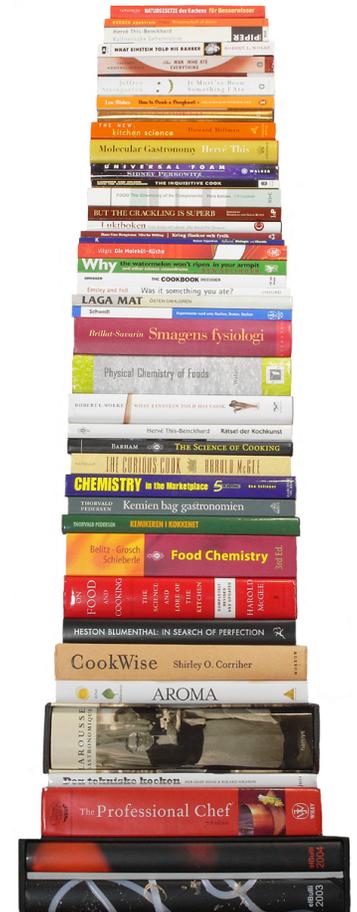
Participants want the opt-out option

## Genetic discrimination

Well-known fear, not well contextualized

## Informed consent issues

Very important area of research, very hard to get the consent right



# Discussion

How to use preliminary study for a larger, more focused study?

What to focus on?

How to select/recruit participants?

How to interview users on an emerging technology?

How to drive user-centered design of personal (computational) genomics?

How to raise awareness/communicate concerns and regulation from/to users?



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