

#### **Ben Elsworth**

Lead Data Engineer ben.elsworth@ourfuturehealth.org.uk

## Processing and releasing genetic data at Our Future Health

In partnership with

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NHS

## Forthcoming series of Charity Researcher Webinars



- We are pleased to announce a series of webinars for researchers organised in collaboration with our Charity Partners.
- For further details, please email <u>partnerevents@ourfuturehealth.org.uk</u> to register an interest
- Here are the dates for the upcoming webinars, which will feature several of our Early Adopters.
- 1. British Heart Foundation & Our Future Health Wednesday, April 2, 9-11 am
- 2. Cancer Research UK & Our Future Health Monday, May 12, 3-5 pm
- 3. Asthma and Lung UK & Our Future Health Tuesday, June 10, 12-2 pm
- 4. Affiliate Charity & Our Future Health Webinars Monday, June 16, 10-12 pm and Thursday, June 19, 2-4 pm

# Agenda

Programme Overview
 Genetic Data
 Where We Are
 The Future





# A strong collaboration across the life sciences sector and health system

- Our Future Health is designed to harness the power of collaboration so we can collectively help people live healthier lives for longer.
- We're a not-for-profit organisation combining support from industry, charities and government to build a world-leading health research programme





## Central aims of the programme

- Build a new prospective cohort in the UK with the mission to help everyone live longer and healthier lives through the discovery and testing of more effective approaches to prevention, earlier detection, and treatment of diseases.
- Recruit 5 million volunteers from the UK adult population to create a unique resource which will catalyse aetiological and translational research for both common and rare diseases.
- Facilitate translational research by providing access to data and stored biosamples, and by enabling recontact studies/trials with participants selectively invited based on demographics, phenotypes, and disease risks.
- Provide personal disease risk information for participants, based on genetic and nongenetic information, and deliver population health insights, facilitating insights into the health of the whole population and the assessment of the impact of interventions/ policies at the individual level.



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## Recruitment



# Our Volunteers

- We're monitoring recruitment to ensure our participants are reflective of the UK population by age, sex, ethnicity and deprivation.
- Our Future Health will be the largest cohort of:
  - Multi-ethnicities in the UK
  - Non-European ancestry in the world
  - Young people and working age populations
  - Over 60s



(e.g., primary care, secondary care, cancer, death)



Provide permission to be recontacted for further surveys/ biospecimens/assessments and to be invited to additional studies/trials

Physical measurements taken at clinic appointment (height, weight, waist circumference, blood pressure, heart rate)

A blood sample for genotyping and for long-term storage of

DNA is genotyped using a custom array that captures 700k up-todate variants of interest for optimal research insights



## **Recruitment to date**





The Our Future Health custom genotype array types 700,000 variants for aetiologic and translational research

- GWAS backbone is **optimised for multi-ethnic imputation capability**
- Design incorporates up to date sets of disease- and phenotype-associated genetic variants from the Genotype Assay Working Group including polygenic risk score (PRS), GWAS catalog, ACMG, and ClinVar sets
- The array is also designed to **predict blood types and assess pharmacogenetic variants** to further enhance healthcare insights.
- We have built an integrated genotyping workflow and have contracted with Genomics to provide imputed data, polygenic and integrated risk scores.
- Further **concordance analyses** will enable any additional array optimisation and a final assessment of accuracy relative to a gold standards (WGS, blood type serology)





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## Progress to Date

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#### Demographics - 1,035,446 full participants





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#### Demographics –1,925,136 consented participants



#### Number of male and female participants



450,000

400,000

#### Participants by ethnicity 140000 8.4% 120000 100000 80000 60000 3.3% 3.0% 2.6% 40000 1.6% 20000 0 Mixed / Other Other White Indians South Asian / Black

\*1,219,122 (81.1%) White British participants

#### Distribution of participants across IMD\* quintiles

Number of participants by age group

20.4%

20.9%



\*Index of Multiple Deprivation - 1st quintile is most deprived; 5th is least deprived

Data on sex and ethnicity are shown only for participants who started the questionnaire

Other Asian



# A platform for research

What data *do* we have and what data *will* we have on our volunteers

Secure, de-identified data available to approved researchers in our Trusted Research Environment

- 1,414,260 participants with baseline health questionnaires
  - 651,050 participants with genotype array data
- 1,151,453 participants with NHS-E secondary care data
- 1,025,498 participants with clinic measurements data

5,128 participants with imputed data (for testing purposes only)



## Genetic data is...

#### Varied and esoteric:

- Raw genotype data contains 7 different file types,
  3 of which are specific to genetics
- Release data contains 25 different file types, 12 of which are specific to genetics

#### Relatively large:

- 710k genotyped / 160M imputed variants per person
- 4 different values for each genotype
- 1.8 trillion data points (P9 = 650k samples x 710k variants x 4 data points)

## Often redundant:

- Raw genotype data for each participant contains the exact same data for 9 out of 10 columns
- 50 TB of raw data = 2 TB of release data

#### In demand:

Researchers are very keen to get access ASAP.

## Genetic software is often...

#### Frequently file based:

 Transformations from one file type into another

#### Not cloud native:

 Historically run using on premise compute

## Domain specific:

 Little uptake outside the bioinformatics community

## Not production ready / optimized:

- Single threaded
- Rigid format expectations



## Why we can't use standard methods

Domain specific files and tooling don't lend themselves towards traditional methods.

• To add or remove a sample requires reading and writing all data every time

This gets slower as the cohort grows

Works for now, but alternative is required long term



## Overall

- To meet the quarterly release cycle, and withdrawal requirements, we have (probably) built the most efficient and advanced genetic data processing and release pipelines in the world, in record time.
- This requires specific skills and expertise from across various domains, e.g., engineering, bioinformatics, statistical genetics, product, delivery and management,
- Compared to other similar initiatives, the squad is very small. However, we are fortunate to have invaluable assistance from the wider organization.
- To date, we have met all deliverables, but this has not been without a cost, and we still deal with large amounts of technical and data debt.

## Successes

- 1. Received, QC'd and tracked genotype data for over 1 million participants (2 million total).
- 2. Built robust and scalable pipeline that can produce genotype release data for millions of participants in under 24 hours
- **3.** Within 12 months of receiving data we were able to create a genotype data release for 660k participants
- 4. Set up imputation data flow via Genomics Ltd and UK Biobank and released first data



#### Samples that have passed QC over time



## VCF vs Zarr

VCF

variants

VCF Zarr

#### samples



10,000 variants x 1,000 samples

VCFs are monolithic two dimensional objects that can only be searched efficiently by row

**Zarr** chunks the data by sample and more:

- Natively supports cloud object stores
- Single thread analytic performance is better than traditional methods
- Parallelisable

## (GIGA)<sup>n</sup> SCIENSE

PAPER

#### Analysis-ready VCF at Biobank scale using Zarr

Eric Czech<sup>1,2\*</sup>, Timothy R. Millar<sup>3,4\*</sup>, Will Tyler<sup>5,\*</sup>, Tom White<sup>6,\*</sup>, Benjamin Elsworth<sup>7</sup>, Jérémy Guez<sup>8,9</sup>, Jonny Hancox<sup>10</sup>, Ben Jeffery<sup>11</sup>, Konrad J. Karczewski<sup>8,9,12</sup>, Alistair Miles<sup>13</sup>, Sam Tallman<sup>14</sup>, Per Unneberg<sup>15</sup>, Rafal Wojdyla<sup>1</sup>, Shadi Zabad<sup>16</sup>, Jeff Hammerbacher<sup>1,2,†</sup> and Jerome Kelleher<sup>11,†,‡</sup>

<sup>1</sup>Open Athena AI Foundation and <sup>2</sup>Related Sciences and <sup>3</sup>The New Zealand Institute for Plant & Food Research Ltd, Lincoln, New Zealand and <sup>4</sup>Department of Biochemistry, School of Biomedical Sciences, University of Otago, Dunedin, New Zealand and <sup>5</sup>Independent researcher and <sup>6</sup>Tom White Consulting Ltd. and <sup>7</sup>Our Future Health, Manchester, UK. and <sup>8</sup>Program in Medical and Population Genetics, Broad Institute of MIT and Harvard, Cambridge, Massachusetts 02142, USA and <sup>9</sup>Analytic and Translational Genetics Unit, Massachusetts General Hospital, Boston, Massachusetts 02114, USA and <sup>10</sup>NVIDIA Ltd, Reading, UK and <sup>11</sup>Big Data Institute, Li Ka Shing Centre for Health Information and Discovery, University of Oxford, UK and <sup>12</sup>Novo Nordisk Foundation Center for Genomic Mechanisms of Disease, Broad Institute of MIT and Harvard, Cambridge, Massachusetts 02142, USA and <sup>13</sup>Wellcome Sanger Institute and <sup>14</sup>Genomics England and <sup>15</sup>Department of Cell and Molecular Biology, National Bioinformatics Infrastructure Sweden, Science for Life Laboratory, Uppsala University, Uppsala, Sweden and <sup>16</sup>School of Computer Science, McGill University, Montreal, QC, Canada

<sup>\*</sup>Joint first author. <sup>†</sup>Joint senior author. <sup>†</sup>Jerome.kelleher@bdi.ox.ac.uk Collab with groups around the world:

- Genomics England
- Broad / MIT
- Big Data Institute
- Novo Nordisk
- NVIDIA



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## Thanks. Any questions?

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