



# Australia's precision medicine powered by machine learning and cloud-computing

Hon A/Prof Denis Bauer | PhD  
11 March 2019, SCA

HEALTH AND BIOSECURITY  
[www.csiro.au](http://www.csiro.au)



# Building a healthier world together



## Precision medicine

... in Australia



## Find Disease Genes

... using Apache  
Spark



**VariantSpark**  
Machine Learning for  
Genomic Variants



## Share Disease Insight

... using serverless  
architecture



**GT-Scan2**  
Computationally Guiding  
Genome Engineering

# CSIRO: Top 1% of global research agencies

- Invented **WiFi**, used in five billion devices globally.
- Developed the vaccine for the **Hendra Virus**.
- Developed the **Total Wellbeing** & Low-Carb Diets.



Credit <https://tooltotal.com/>

# CSIRO's vision for the #FutureOfHealth

The health system will shift...



...from treating patient illness to managing consumer health and wellbeing



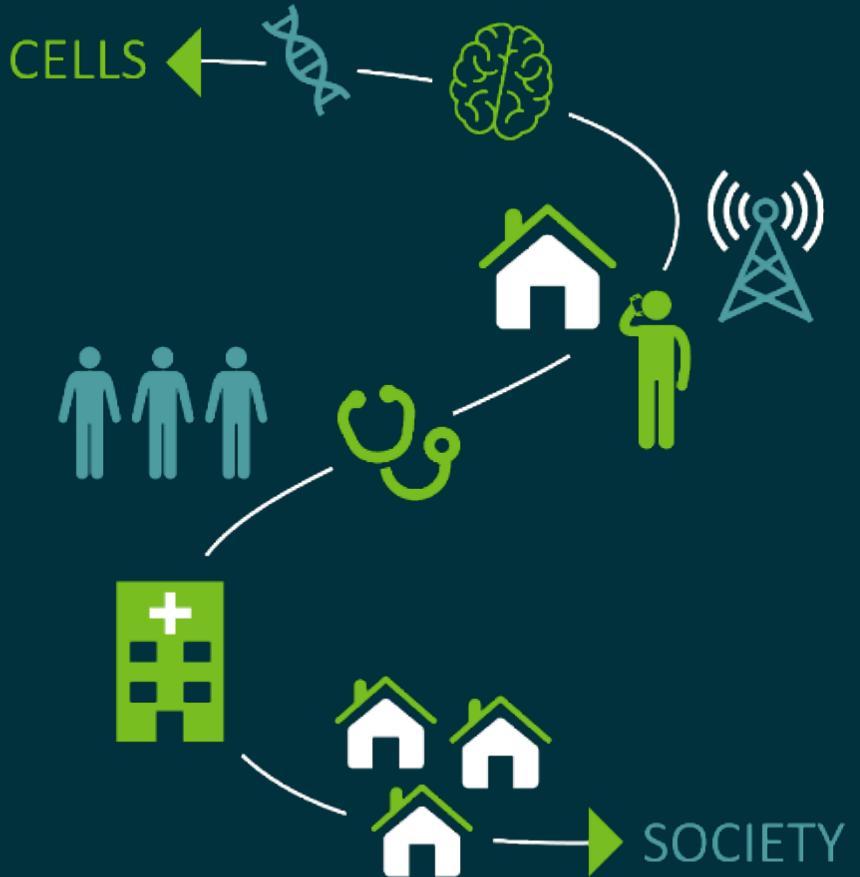
...from accepting one-size-fits-all to precision health solutions



...from a reactive system to a holistic and predictive approach



...from extending life to improving quality of life over a lifetime



THE AUSTRALIAN  
**E•HEALTH**  
RESEARCH CENTRE



*AU's leading  
national e-Health  
centre*

*World-first clinical  
substantiated  
mobile health app*

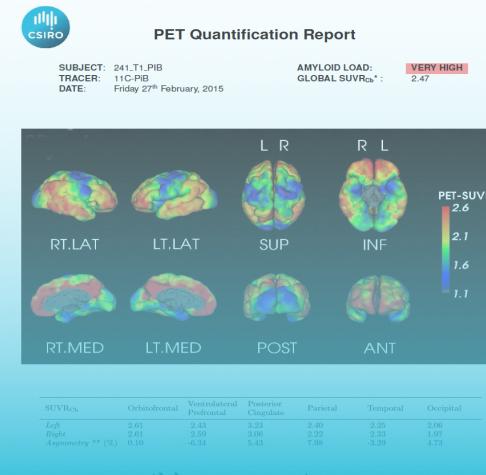
CARDI<sup>HEART</sup>HAB

# Precision medicine is at the heart of our research

## Hospital forecasts



## Quantitative Imaging



## Disease risk prediction

GENOMICS

Volume 110 • Issues 6 • November 2016

aws

Microsoft Azure



Genomics  
england



# Precision medicine is enabled by genomics



 project  
**MinE**  
Make it yours

\$70  
Million

 Global Alliance  
for Genomics & Health

\$25  
Million

 **Australian  
Genomics**  
Health Alliance



 **Queensland  
Genomics  
Health Alliance**

\$25  
Million

 Genomics  
Strategy  
**Health**

\$25  
Million

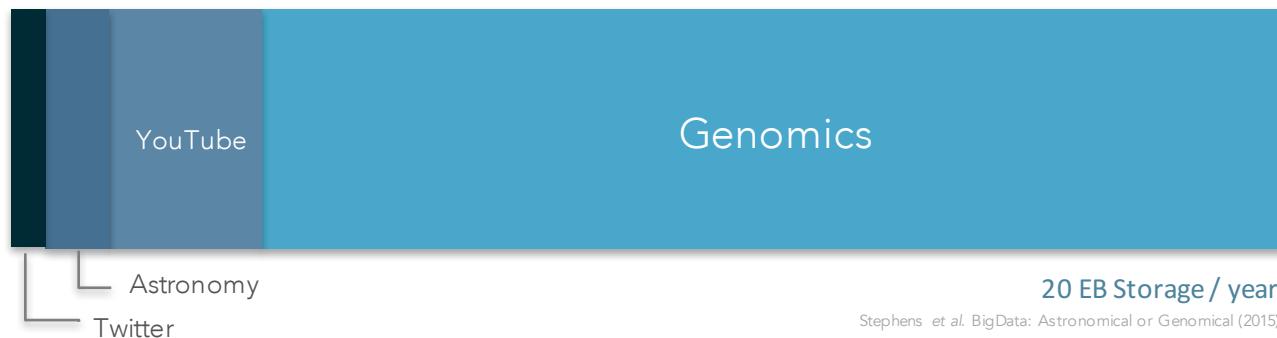
 **Melbourne Genomics  
Health Alliance**

\$25  
Million

By **2025** it is estimated that **50%** of the world population will have been sequenced.

Frost&Sullivan

Data acquisition of BigData disciplines in 2025



# Overview



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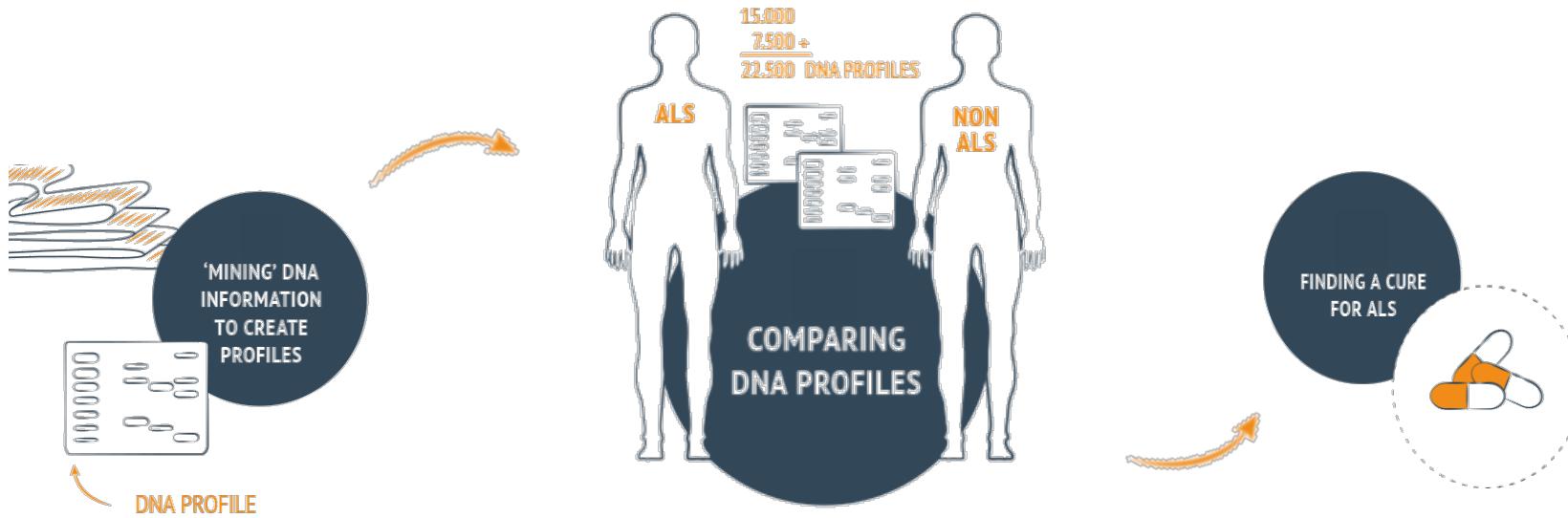
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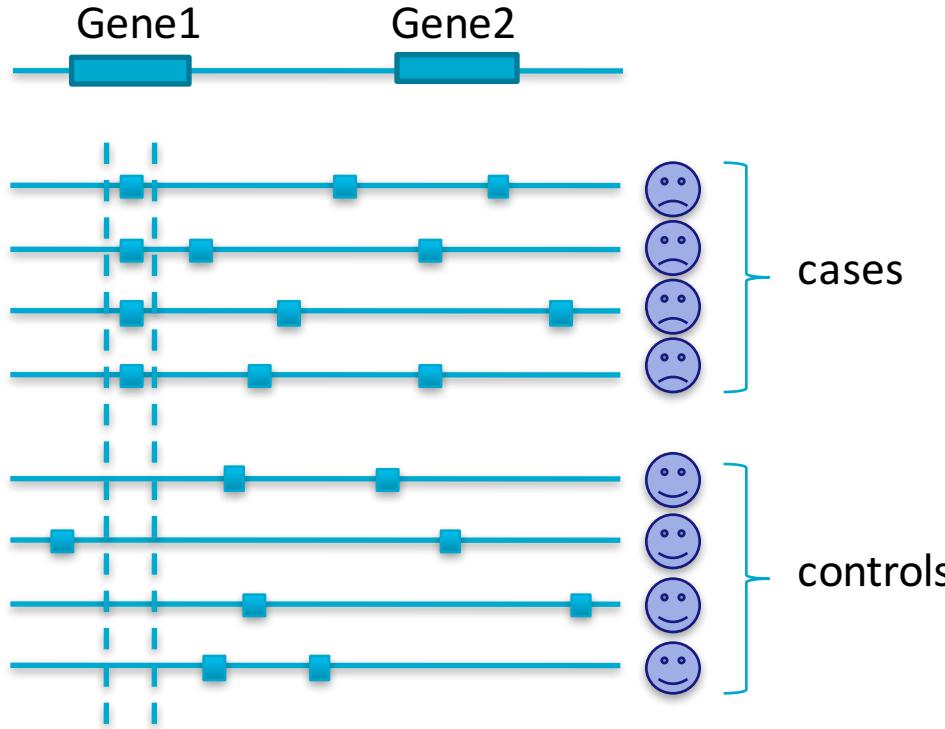
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# Finding the cure for ALS

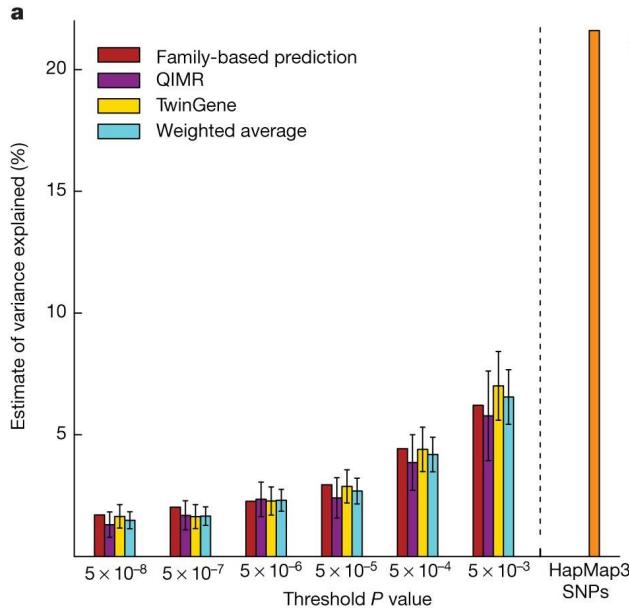


<https://www.projectmine.com/about/>

# Finding the disease gene(s)



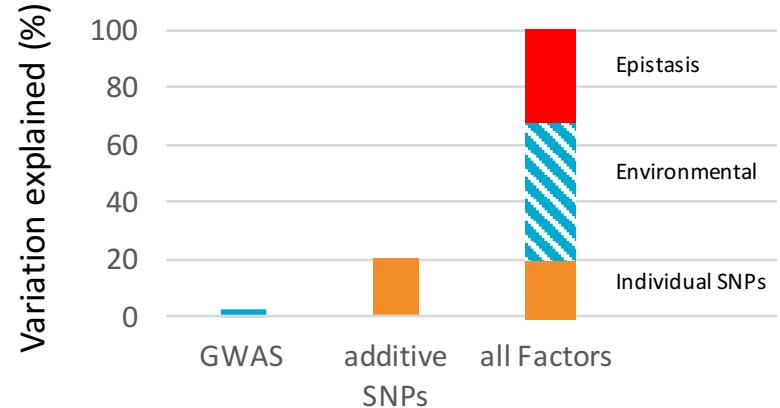
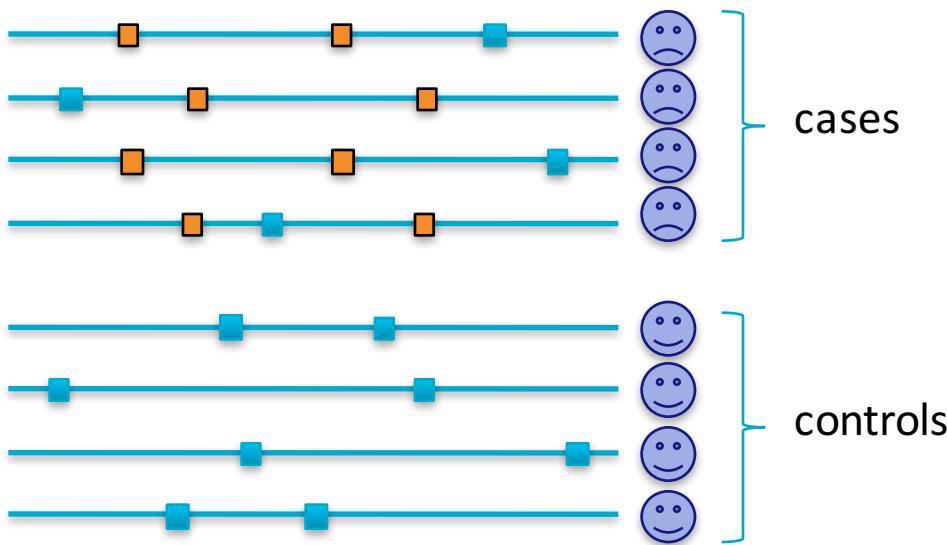
# Complex diseases have polygenic risk factors



Polygene analyses suggest that SNPs with  $P$ -values **well below GWS add significantly** to [obesity] variance explained.

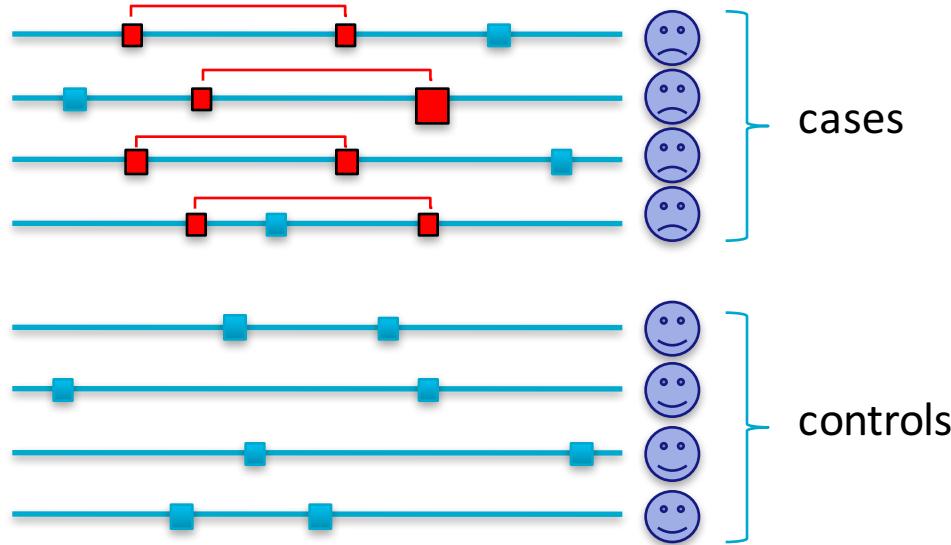
Locke *et al.* Nature 2015

# Complex diseases are driven by multiple genes



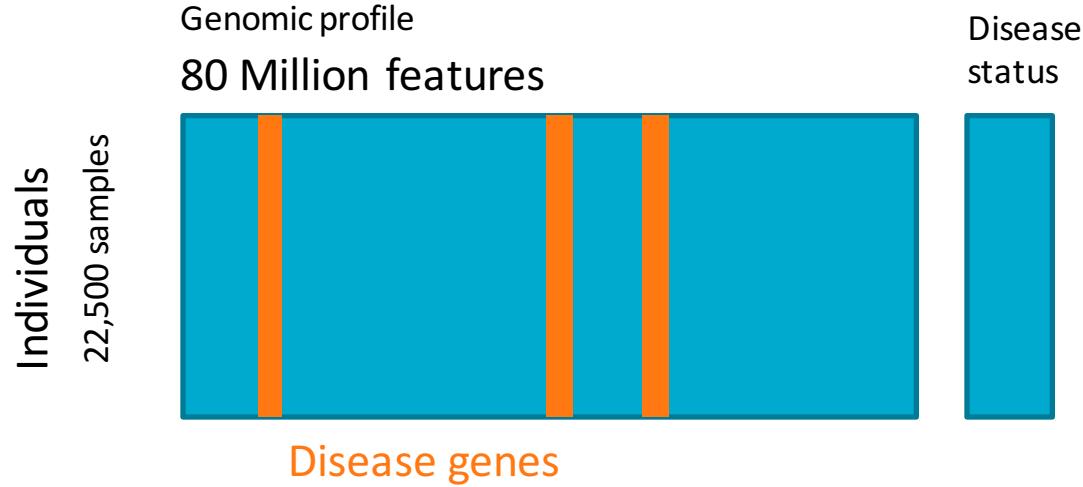
Complex diseases are driven by

# multiple interacting genes with variable contribution



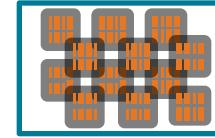
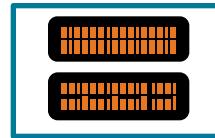
Need a more  
sophisticated  
ML approach,  
such as  
**Random Forest**

# Machine learning on 1.7 Trillion datapoints



# Population-scale genomic data analysis requires BigData solutions

	Desktop compute	High-performance compute cluster	Hadoop/Spark compute cluster
Focus	small data	Compute-intensive	Data-intensive
Node-bound	Yes	Yes	No
Parallelization	10 CPU	100+ CPU	1000+ CPU
Parallelization procedure	bespoke	bespoke	standardized



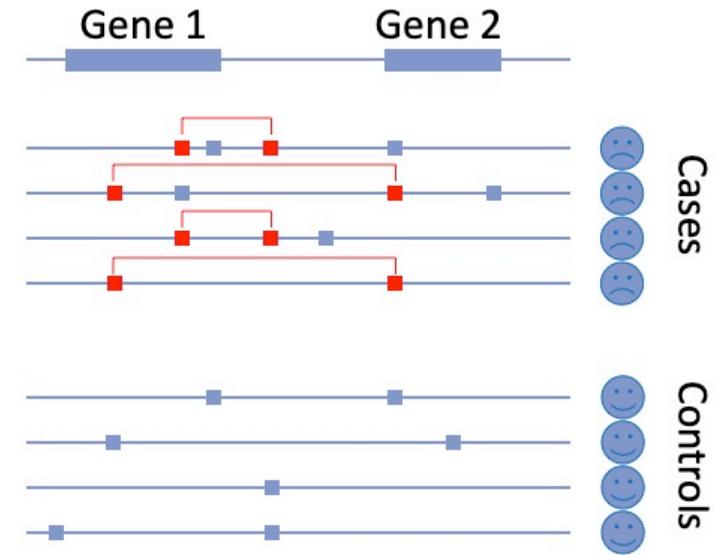
CSIRO solution



**VariantSpark**  
Machine Learning for  
Genomic Variants

# VariantSpark: Machine Learning to find markers for complex diseases

Used by



Faster

*"Analyzes 3000 individuals with 80M features in 30 minutes"*



Smarter

*"Requires 80% fewer samples to detect statistical significant signal"*



MACQUARIE  
University  
SYDNEY · AUSTRALIA



Microsoft  
Azure



databricks™



PATHWAY GENOMICS®



# Compute sovereignty becomes of growing importance

- Retain domestic HPC capability but enable **cloud-like flexibility** (e.g. multi-tenancy)
- **Connect international** datasets without lag
- -> SuperCloud

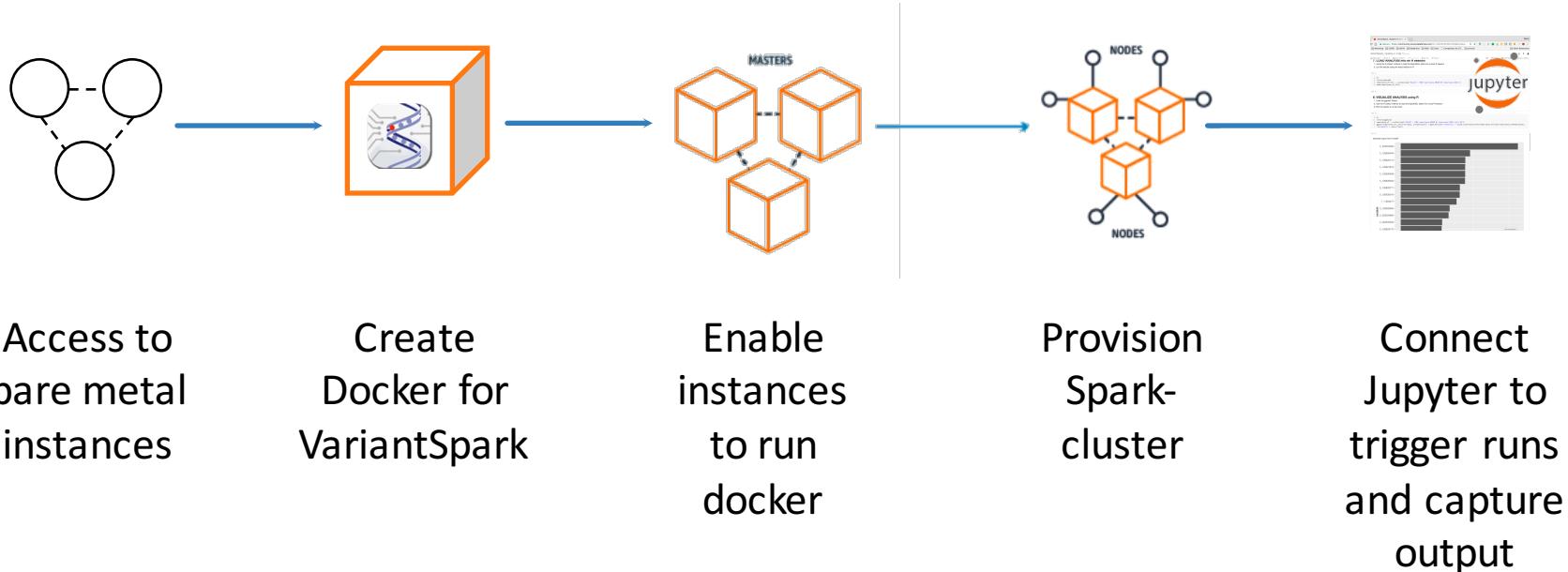
Technical details: **March 13<sup>th</sup> 1630 – 1700**

SuperCloud – The evolution of HPC to Software Defined Computing

Mr. Jacob Anders, CSIRO and

Mr. Garry Swan, CSIRO

# Deploying cloud-like workflows on HPC



# Demo



Genetic  
**Hipster-Index**

Powered by  
 VariantSpark  
Machine Learning for  
Genomic Variants

Activities Terminal ▾

Fri Mar 8 11:32

100 %

and512@razor:~

File Edit View Search Terminal Help

[and512@razor ~ (keystone\_sca19)]\$ █

# Overview



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## Share Disease Insight

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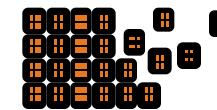
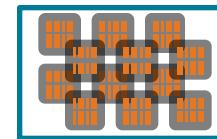
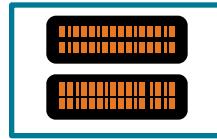
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# Beacon: sharing genomic data

- Today, **70 Beacon** are **lit** to share information about rare genetic diseases.
- **Reduce cost** to enable more sharing.
- Using **serverless (FaaS)** technology.

# Recruiting instantaneous appropriately powered compute

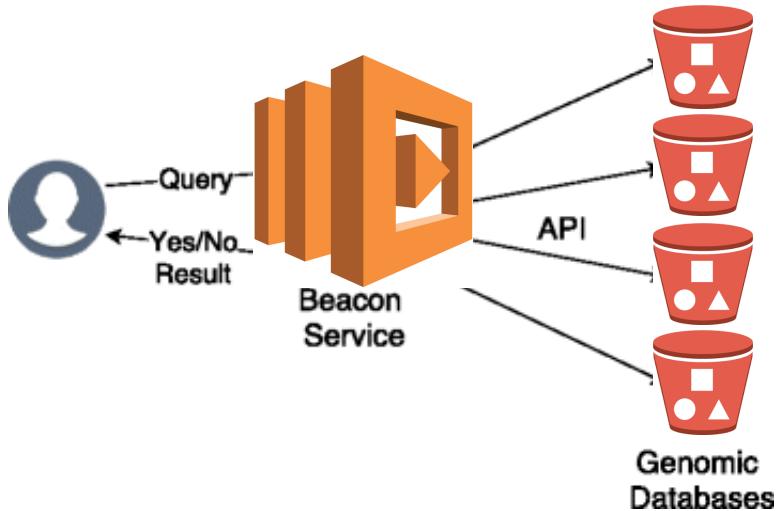
	Desktop compute	High-performance compute	Hadoop/Spark	Serverless
Focus	small data	Compute-intensive	Data-intensive	Agility
Node-bound	Yes	Yes	No	No
Parallelization	10 CPU	100+ CPU	1000+ CPU	1-1000+ CPU
Parallelization procedure	bespoke	bespoke	standardized	standardized
Overhead in the cloud	NA	spin-up lag	spin-up lag	instantaneously



CSIRO solution



# Serverless-Beacon to scale up discovery across continents



**Powerful**

*“Scaling up to large volumes of distributed variant data.”*



**Cheaper**

“Only pay for the resources consumed – zero downtime cost.”

Used by



Global Alliance  
for Genomics & Health



Australian  
Genomics  
Health Alliance

Melbourne Genomics  
Health Alliance



Beacon  
Serverless lookup of genotypes and frequency

# Three things to remember

- Complex multigenic diseases should be studied using '**wide**' ML (VariantSpark).
- **Serverless architecture** makes even data-intensive web-apps affordable (Serverless Beacon).
- SuperCloud offers an exciting and potentially cheaper supplement to public cloud providers: **let's build a healthier future together!**



# Let's build a healthier world together

## Team



Denis Bauer,  
PhD



Oscar Luo,  
PhD



Laurence Wilson,  
PhD



Aidan O'Brien



Natalie Twine,  
PhD



Arash Bayat



Brendan Hosking



We are hiring...  
...email Denis



Rob Dunne, Piotr Szul  
PhD

## Collaborators



**MACQUARIE**  
University  
SYDNEY - AUSTRALIA

Lynn Langit



## Software



**GT-Scan2**  
Computationally Guiding  
Genome Engineering



**VariantSpark**  
Machine Learning for  
Genomic Variants



**Tribes**  
Detecting distantly related  
individuals



**NGSANE**  
Production Informatics for  
High Throughput Data



**GenPhen-Insight**  
Genome-Phenome  
Discovery Framework



**Beacon**  
Serverless lookup of geno-  
types and frequency

## News

