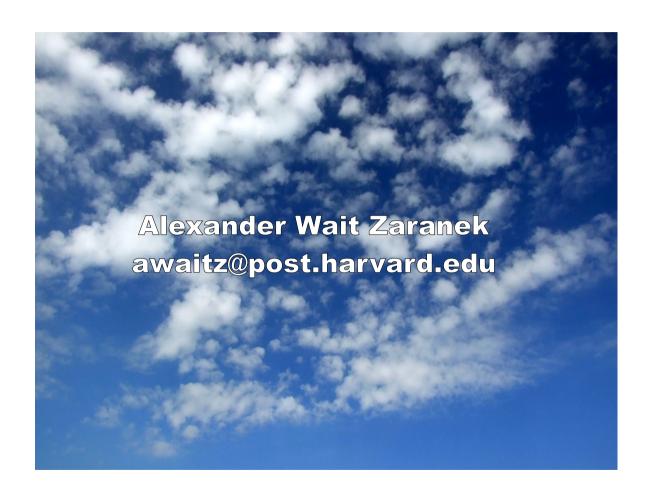
# Free Factories: from the Quantum Coreworld to the Personal Genome Project

(a tour of Genomics, Computing and Economics topics in my research)



Biophysics 101 seminar Thursday, September 17<sup>th</sup>, 2009

## **Overview**

"Big Data" and Free Factories

#### **Applications of Free Factories:**

Swift, Editing, Four Individual Genomes

#### The Aim of Free Factories:

Enable the Personal Genome Project to bring together physicians, scientists and the general public in a single endeavor

# Nucleic acids are the largest repository of digital information on Earth

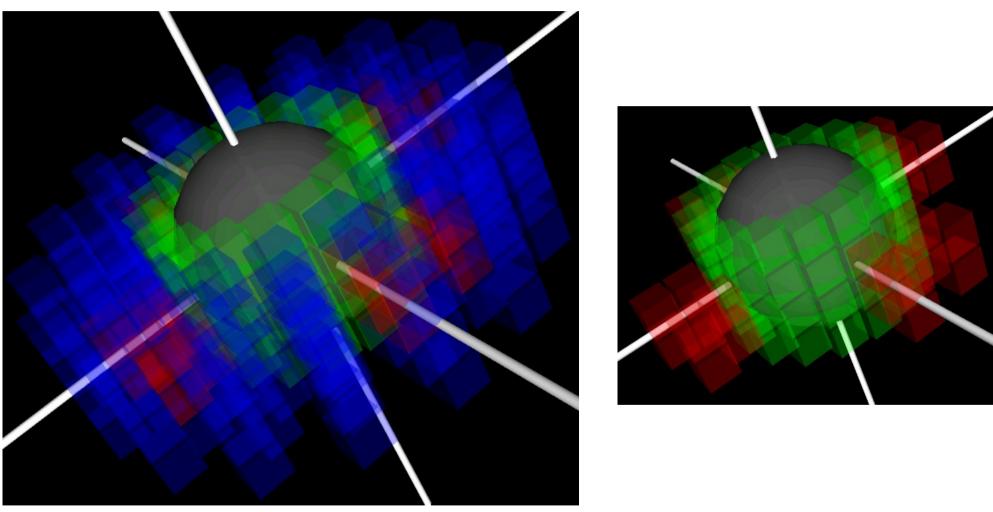
NCBI Trace Archive - 10<sup>15</sup>

"Ordinary" digital universe - 10<sup>21</sup>

Human associated digital universe - 10<sup>32</sup>

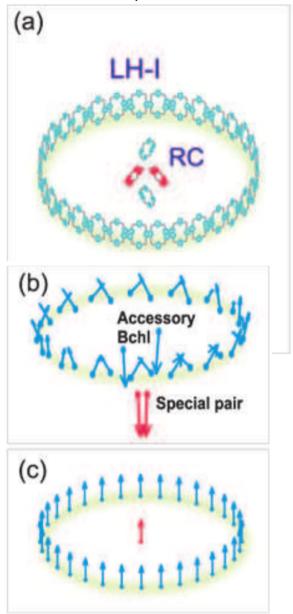
Biological digital universe - 10<sup>36</sup>

# The Quantum Coreworld is a 3D digital evolution system consistent with the rules of quantum information processing

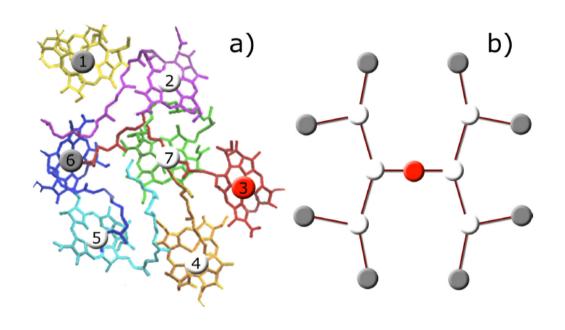


Translucent cubes represent one femtoliter of water (a cube one micron on each side) Digital organisms—written in a simple assembly language—evolve in the Coreworld Regions of the world periodically exchange material at well defined boundaries (red) New digital lifeforms enter the world nearest to the center (green)

#### **Quantum Information in Real Biology**

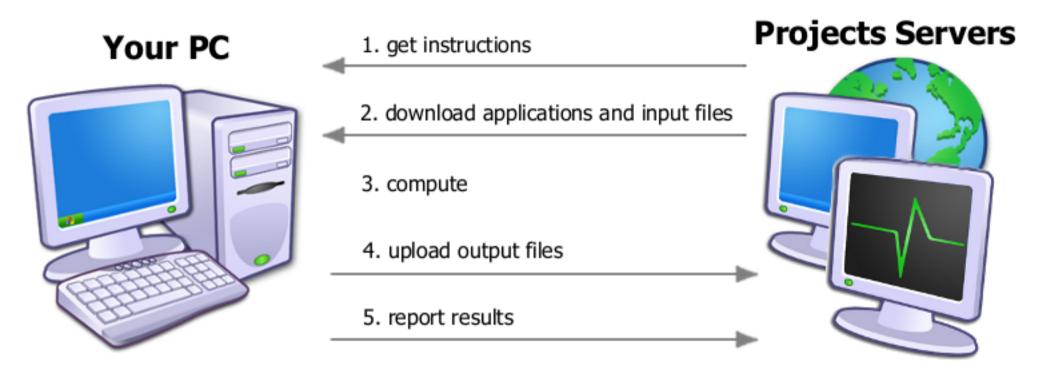


Schematic of the LH1-RC core of purple bacteria *Rhodobacter sphaeroides*. Olaya-Castro (2007) Phys Rev B.



ArXiv:0807.0929v1—Aspuru-Guzik group (Harvard)

#### **Volunteer Computing**





Active: 335,473 volunteers, 562,937 computers.

24-hour average: 1,309.43 TeraFLOPS.

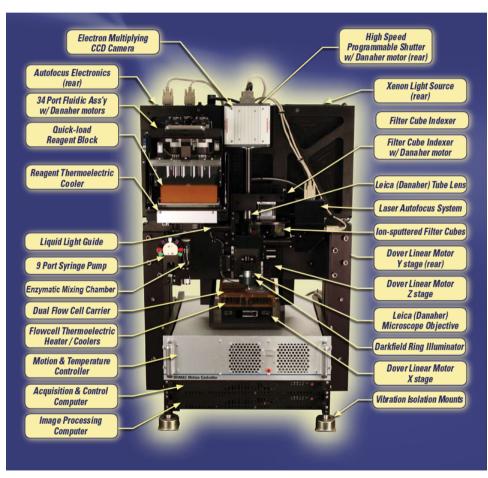
#### A Free Factory is inspired by Free Software

Free Software is a matter of the users' freedom to run, copy, distribute, study, change and improve the software.

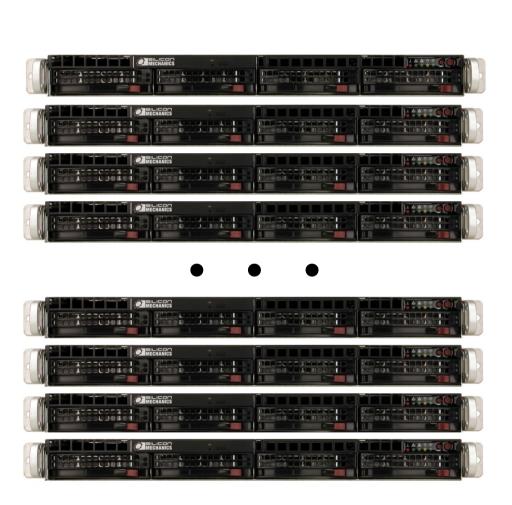
(http://www.gnu.org/philosophy/free-sw.html)

- A Free Factory should protect the freedom of its user community to:
- 1) operate their own identical factory;
- 2) operate a modified factory;
- 3) distribute the information required to operate and modify the factory to others, and;
- 4) study and improve all factory equipment, methods, software, raw materials, and so on.

# A Free DNA Sequencing Factory could be built by combining the "Polonator" with commodity computers running Free and Open Source Software



Courtesy — Rich Terry and Greg Porreca



I designed the Free Factories computational infrastructure to complement the Polonator.

With sequencing costs falling more rapidly than computing costs, this is a formidable challenge.

#### A recent budget for a Free (DNA Sequencing) Factory

#### Setup costs (\$490,000 total)

- \$150,000 Polonator
- \$80,000 local storage & computation cluster
- \$160,000 remote storage & computation cluster (deployed in second year)
- \$100,000 cluster maintenance, support, training (2 years, 1/2 FTE)

#### Operational costs (\$181,000 in first year)

- \$30,000 power, cooling, network for Polonator and local cluster
- \$40,000 bioinformatics technician (1/2 FTE)
- \$40,000 lab technician (1/2 FTE)
- \$71,000 reagents (\$7,085 per run, w/ 2x13bp reads, 100Gbp)

#### Operational costs (\$315,000 in second year)

- \$30,000 power, cooling, network for Polonator and local cluster
- \$30,000 power, cooling, network for remote cluster
- \$80,000 bioinformatics technician (1 FTE)
- \$80,000 lab technician (1 FTE)
- \$95,000 reagents (\$4,769 per run, w/ 2x48bp reads, 740Gbp)

Total costs (\$986,000 two years w/ 840Gbp at \$1174 per gigabase.)

In this budget, computing costs are 38% of the total while they were only 11% for a similar project last year.

To realize the benefits of cheap sequencing, free and open source methodologies help us consider the whole ecosystem of scientists, physicians and the general public as a single system.

## **Overview**

"Big Data" and Free Factories

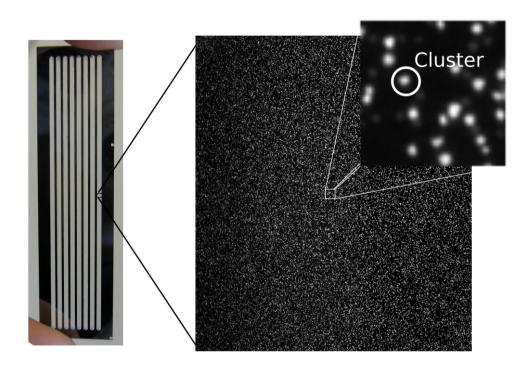
#### **Applications of Free Factories:**

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# Swift—the open source data processing pipeline for the Illumina GA achieves a 14% improvement in placed reads for PGP2 data

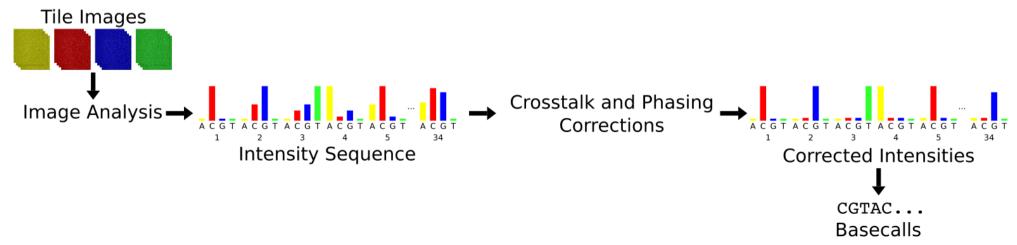


An Illumina GA2 flow-cell consists of 8 lanes which are imaged in 100 tiles (see left)

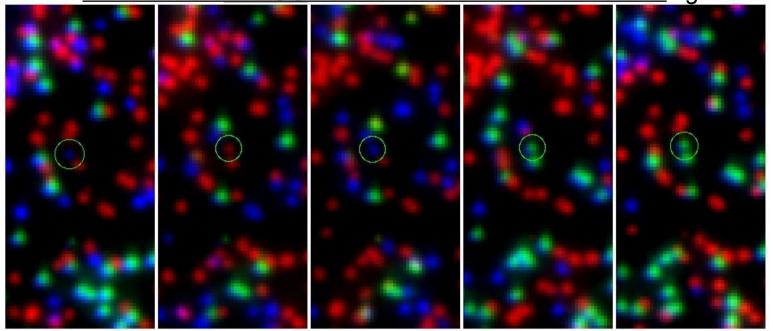
The Swift pipeline examines all images in a tile and makes basecalls. (see below)

This process is very similar for the Polonator and for ABI SOLiD

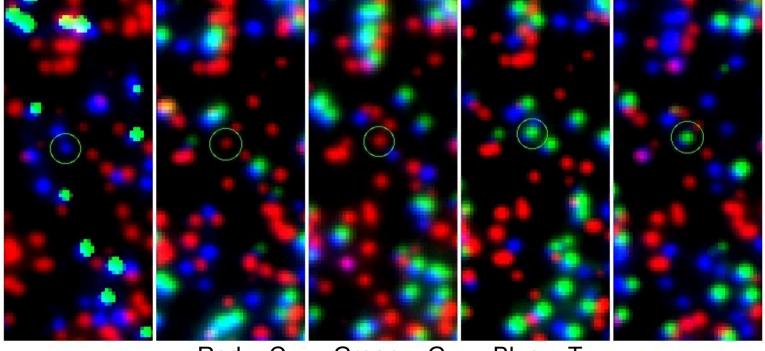
The community is eager to adapt the pipeline to new instruments



<u>GCACACGG**TCTGG**GCCAAGCAGATTGCAGAGGCG</u>Gg

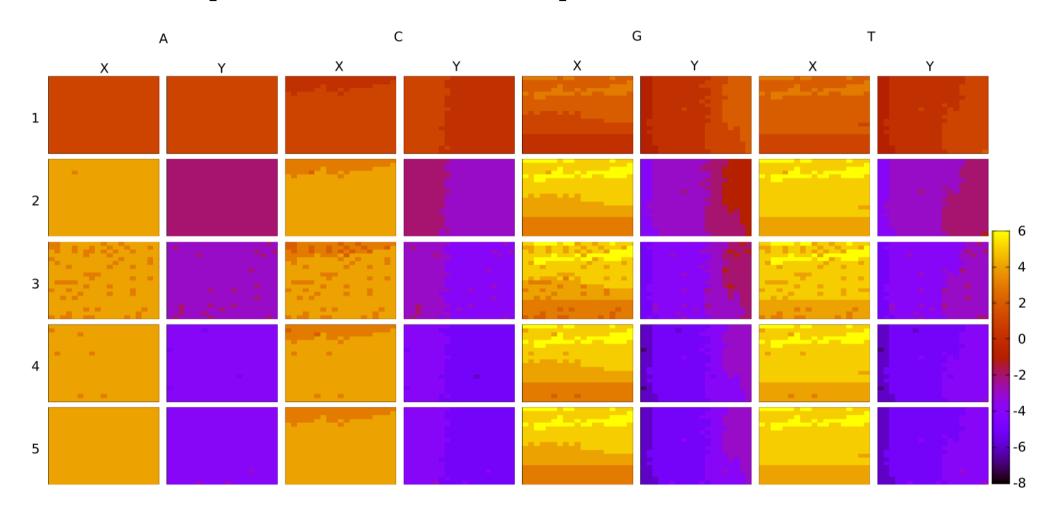






Red = C Green = G Blue = T

# Open-source encourages innovations on one platform to be adopted on others



Plot shows X,Y offsets—separately for A,C,G,T florescence channels—in 400 subregions from 5 tiles of Illumina data (processed by the Swift pipeline). The Swift community is eager to try such innovations in the Polonator.

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"Big Data" and Free Factories

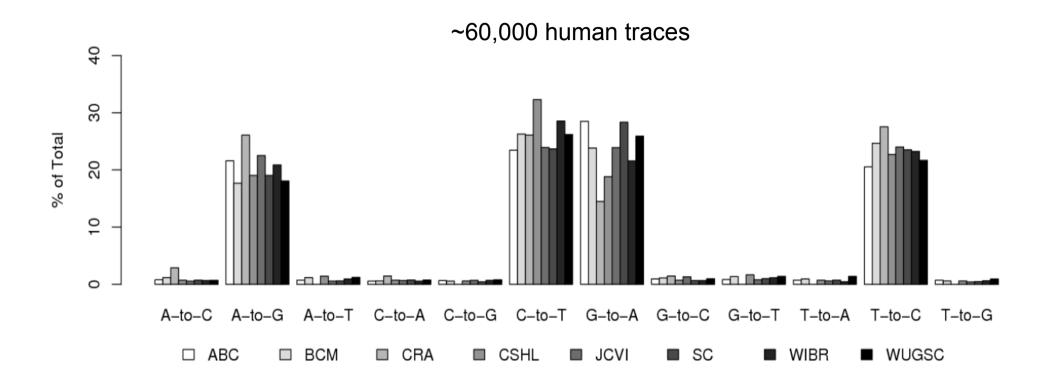
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#### Search for DNA and RNA editing candidates



Align 600 million traces (200 million human) to their reference genome

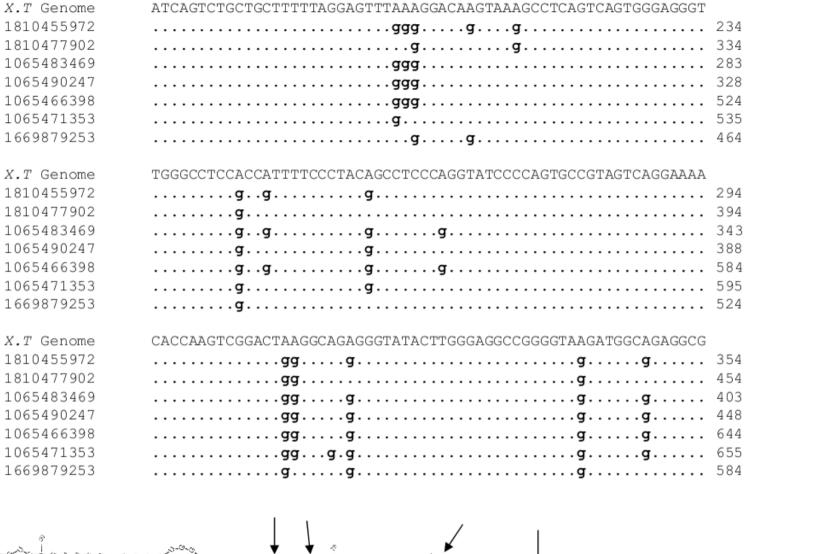
Extract 20.7 million w/ three consecutive mismatches

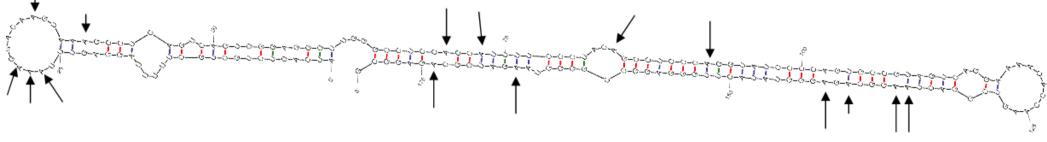
Report mismatches with phred 40 or greater and spanning 100bp or more

Consumed 5.8 terabytes of disk and 5 years of computer time

Genome 421 Trace 421	CGGTCCTGAAGGCACAAGTAAGTTACATGAGGAAGTGGCTCAAGTGCCCATGGTCTCTAC	480 480
Genome 481 Trace 481	TCCTGCCACCTGCCTTCTCCCCCTAGCCTGCACCGATGGCCTCATGGGGAGTTCCCTGT	540 540
Genome 541 Trace 541	GATCAGTTGACAGAGGAAGGGAAGACTAGGCCCTGGTTCAGAGATGGTTCTACATGATAT	600 600
Genome 601 Trace 601	GCAGGCACCACCCGGAAGTGGACAGCTGCAGGACTACAGCCCTTTCTAGGACATCCCTGA	660 660
Genome 661 Trace 661	AGGACAGCGGTGGAGGGAACTTCCCAGTGGGCAGAACTTCGAGCAGTGCACCTGGTTATG	720 720
Genome 721 Trace 721	CACTTTGCATGGAAGGAGAAATGGCCAGATGTCTGATTATATACTGATTCATGGGCTGCA	780 780
Genome 781 Trace 781	GCCAATGGTTTGGCTGGATGGTCAGGGACTTGGAAGAAGCATGATTGGAAAATGTGTGACAAAAAAA	840 840
Genome 841 Trace 841	AAAGAAATCTAGGGAAGAAGTATGTGGATGGACCTCTCTGAGAGGTCAAAAACTGTGAAG	900 900
Genome 901 Trace 901	ATATTTGTATCCCATGTGAGTGCTCACCAATGGGTGACCTCAGCAGAGGGGGATTTTAAC	960 960
Genome 961 Trace 961	AATCAAGTGGATAGGAT 977977	

A DNA editing candidate at the locus of a human retrotransposon. Tl#1735626615 aligns uniquely to Chr2 where the known retrotransposon HERVL-A1 is located. A cluster of mismatches (worst mismatch phred 35; best mismatch phred 49) suggests that the trace originates from an edited version of the element. GG-to-AG (11/15) and GA-to-AA (4/15) motifs suggest the preferred dinucleotide context for APOBEC3G and APOBEC3F.





Evidence for RNA editing in X. Tropicalis. Multiple traces (of RNA origin) show numerous A-to-G mismatches. The predicted RNA structure shows a long dsRNA structure which is the preferred target of editing by ADARs.

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#### **Analysis of individual genomes**

Use GeneTests to focus on genes where clinical action is already taken

Convert variants in HG18 coordinates into gene/ protein coordinates

Cross-reference with OMIM to obtain a list of known variants with pointers into the literature

Obtain allele frequencies when available (typically not available for rare variants)

Ref. coordinate Gene, amino acid change	Genotype Ref. allele, trait-assoc'd allele <sup>1</sup>	MAF	Associated trait	Proposed clinical action	OMIM dbSNP
<b>chr21:34664672</b> <i>KCNE2</i> , Q9E	C/G C G	_	Acquired long QT syndrome susceptibility [elderly African American female; more clinical data needed]	Electrocardiogram, avoid drugs causing prolonged QT intervals	603796.0001
<b>chrX:38111547</b> <i>OTC</i> , K46R	G A G	0.441	Ornithine transcarbamylase polymorphism; apparently benign and not known to be associated with OTC deficiency	None	<b>300461.0009</b> rs1800321

Analysis of an individual African genome reveals a rare mutation—KCNE2 Q9E—not present in dbSNP. Since the individual is anonymous, recommendations cannot be returned to them.

<sup>&</sup>lt;sup>1</sup> All DNA sequences are given for the NCBI reference sequence + strand; where possible, the reference allele is listed first in heterozygous genotypes.

```
aggagggaagcatgtctactttatccaatttcacaG
                                           #$'+&#*,-..$35<$4+<9IC=9EGE?/%IICI2+
                                           1(*+)...48029*22<=:?44AIIIIIIGI5IIIII
aggagggaagcatgtctactttatccaatttcacaC
qqaqqqaaqcatqtctactttatccaatttcacaCa
                                            IIIIIIIIIIIIIIII7EIIIIIII?4+::I>:I05)
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                                              gggaagcatgtctactttatccaatttcagaGagac
                                               IIIAIIIIII:I<3III+III)1III/1%%1%0./
   gggaagcatgtctactttatccaatttcacaGagac
                                               ggaagcatgtctactttatccaatttcacaGagacg
                                                IIIIIIIIIII@:IIII8I>C?'IIDI*I9+-H-8-
     qaaqcatqtctactttatccaatttcacaGaqacqctqqaa
                                                 /CI-(@379*58+A+@I7)III9+6BCIIIIIIIIIIII
        qcatqtctactttatccaatttcacaGagacqctqq
                                                   IIIIIDIF; I@EE2<I/2&5<9: . <+&&3+.(++&(
                                                    ","#"'"%#%*-$4$&/,(,3":59%+I2;I#C003
        gcatgtatactttatccaatttcacaGagacgctgg
        catgtctactttatccaatttcacaGagacgctggaa
                                                    +%,/'1(&2(++7)/III(-&@>IB8I6<III+EH?D
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                       aatttcacaGagacgctggaagacgtcttccgaagg
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                               C 25 sum(q) = 676
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                              G 22 sum(q) = 607
                                   2 sum(q)=10
```

The Free Factories infrastructure was used to assemble the raw reads—120 gigabases—from HapMap NA18507. The alignment for KCNE2 Q9E is shown above. SNPs for this genome did not accompany Bentley et al. (2008) Nature.

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## P

## PersonalGenomes.org

Subject & public access (not just research elite)

Entrance exam to ensure highly informed consent

Scalable to millions of research subjects, budget \$1,000/person for DNA & trait data

Highly integrated, holistic, systems-biology

Cells available for personal functional genomics





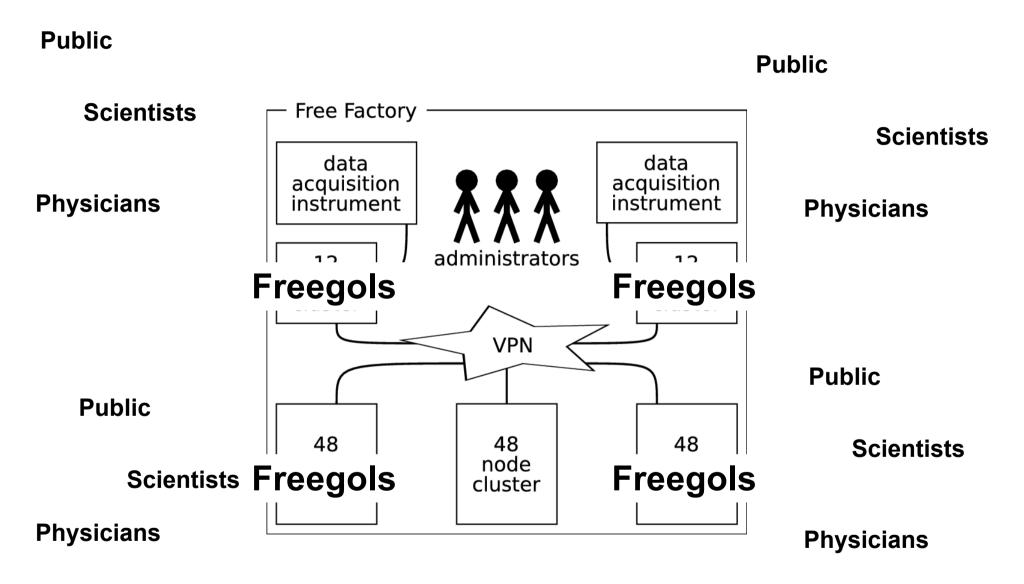






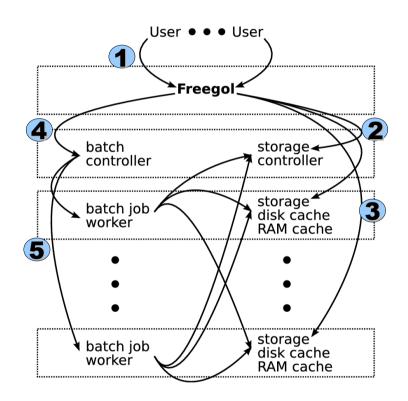
How do we organize computational resources to serve the combined needs of scientists, physicians and the general public?

#### The Idea



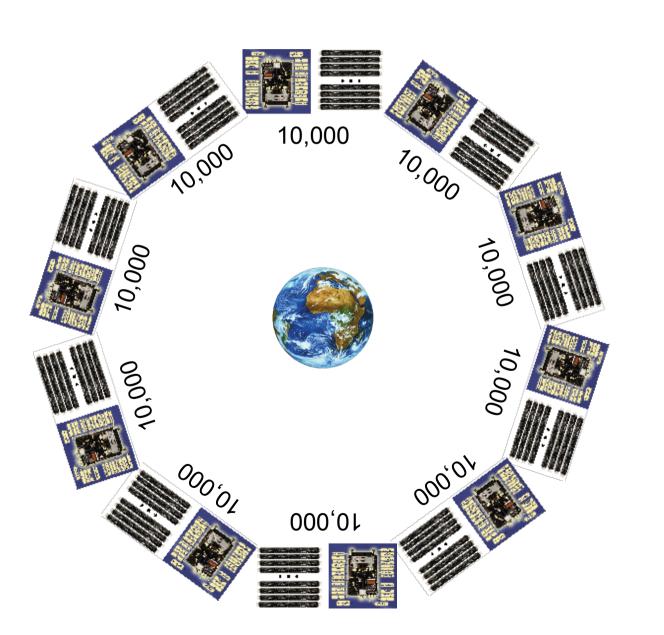
A shared infrastructure for web service virtual machines, which I call "Freegols".

Freegols—or <u>Free Gol</u>ems (another word for robot)—operate in independent virtual machines running on the Free Factories infrastructure.



As a Freegol services many simultaneous user requests, it continually supervises "workflows" that process terabytes of data and consume many thousands of CPU hours

#### Scalable Infrastructure for 100,000 people



Maintain infrastructure close to participants

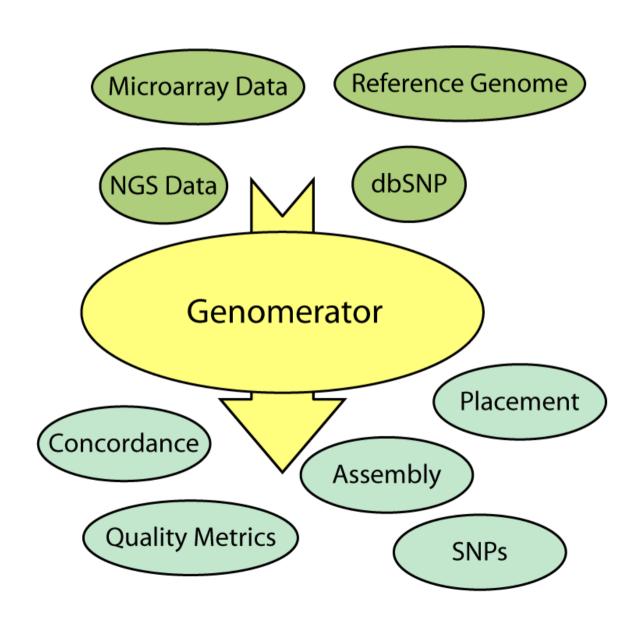
Add sequencing instruments, computational clusters, and storage independently

Freegols can use storage and compute resources from any Free Factory

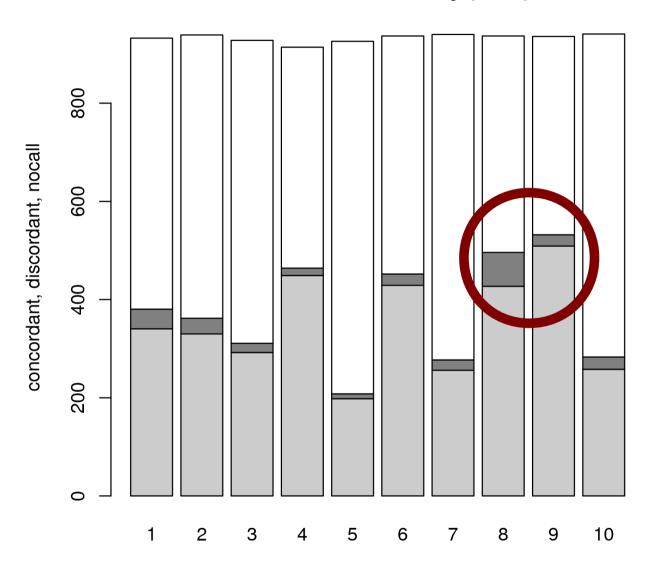
Fault-tolerant to hardware and software failures

Built-in provenance tracking

## Genomerator manages Next-Generation-Sequencing data, launches workflows, and, generates quality metrics

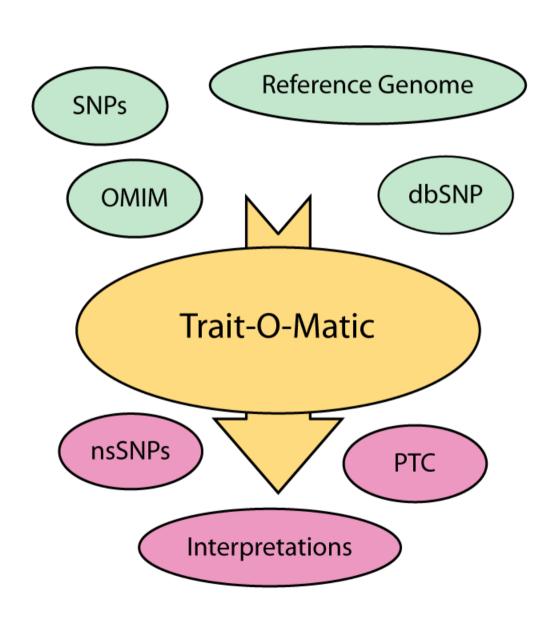


#### **Concordance with Affy (2s3c)**

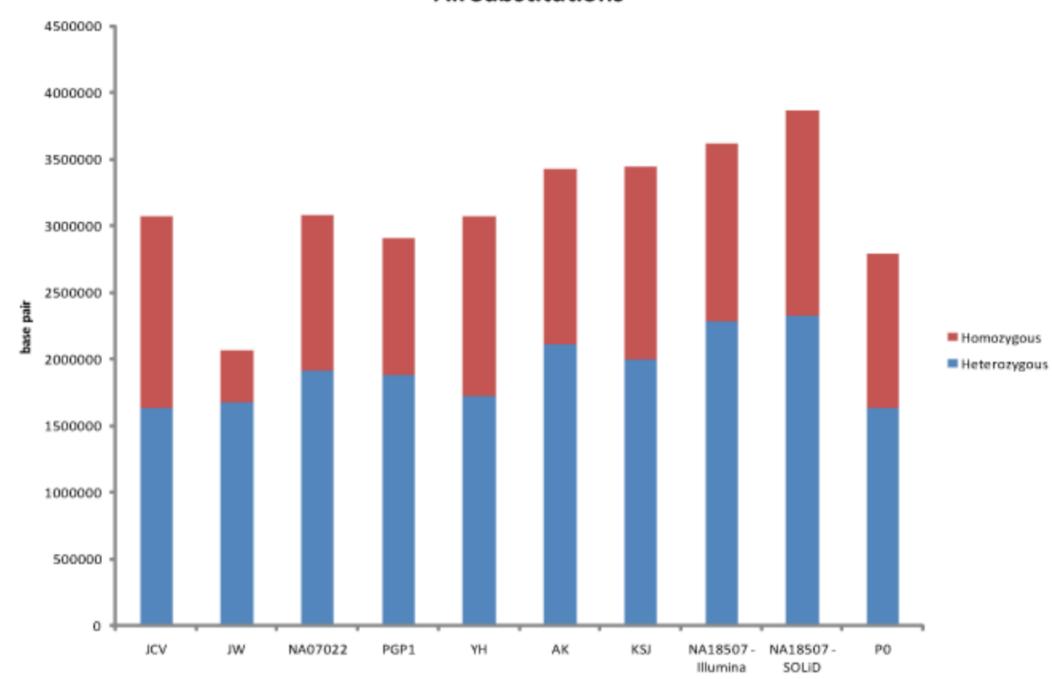


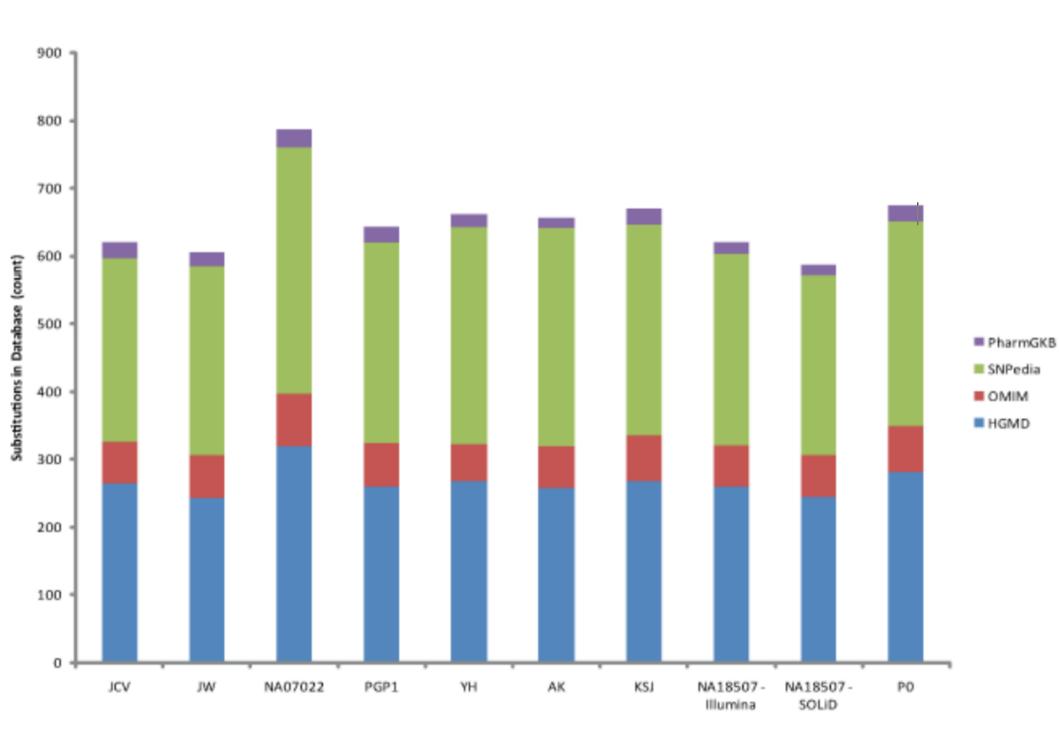
By reprocessing the data, from images, we can improve the accuracy of PGP8 (the worst sample) to be equivalent to PGP9 (the best) while increasing the number of called variants.

#### **Trait-o-matic interprets variants**

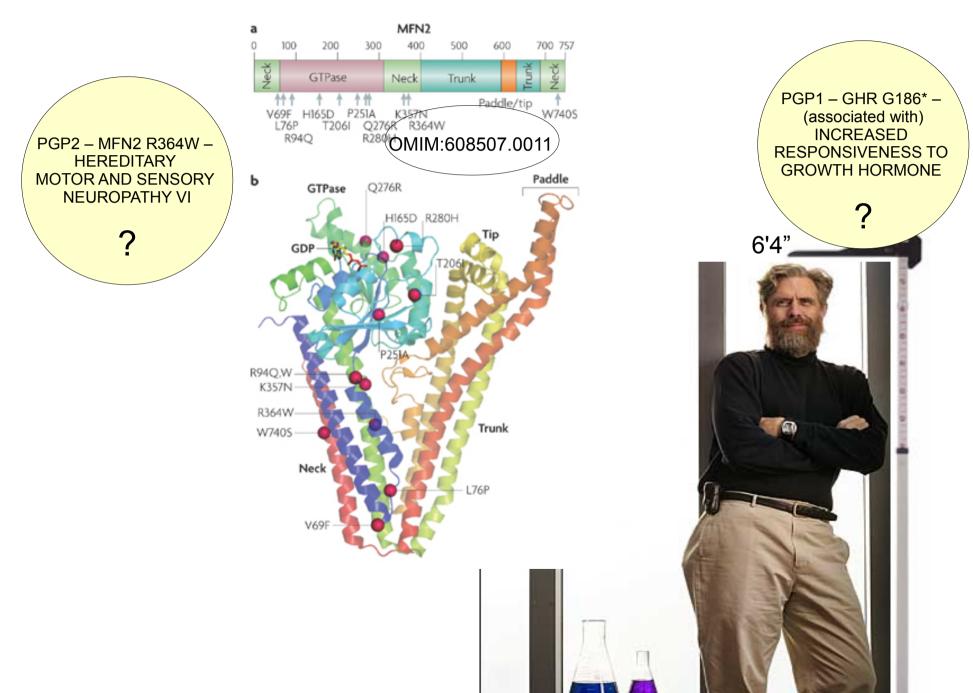


#### **All Substitutions**





## Trait-o-matic cross-references variants with major databases and looks for damaging coding changes



#### **PGP1 HGR Mutation**

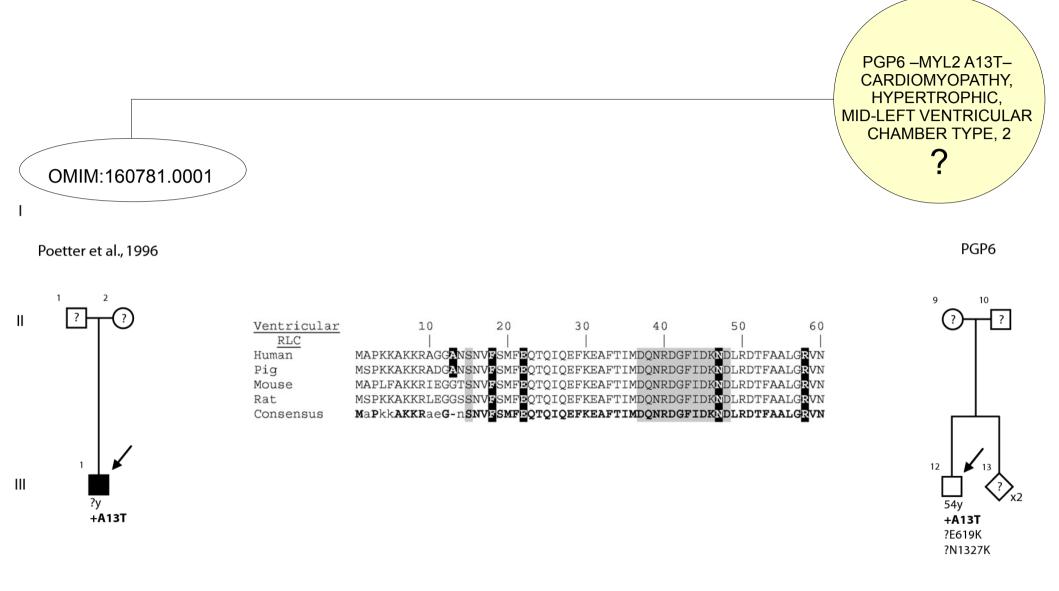
chr5	42735769	42735805	GAAGCACCACGcAaTGCAGATaTTcaGAAaGGAtGG
chr5	42735776	42735812	${\tt CaCgcAATgCaGaTaTtCagaaA}{oldsymbol{t}}{\tt gATggAtggttc}$
chr5	42735776	42735812	CacGCaaTGCaGatATTcaGaaA <b>T</b> GaTggATggtTc
chr5	42735776	42735812	$ ext{CAcGCAATGCAGaTaTTcagaAA}$ $ ext{T}$ $ ext{gatggatggtTc}$
chr5	42735776	42735812	CACGCAATGCAGATATTCAGAAA <b>T</b> GATGGATGGtTc
chr5	42735790	42735826	ATTCAGAAAGGATGGATGTTCTGGAGTATGAACTT
chr5	42735790	42735826	AttcAgAAAGGATGGAtGGTtCtGGAGTATGAACtT

#### PGP2 MFN2 Mutation

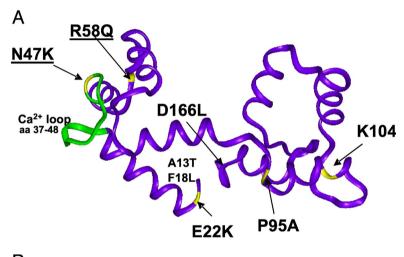
chr1	11984646	11984682	AGTGAAGACCAAGTTTGAGCAGCACACGGTCCGGGC
	11984658		GTTTGAGCAGCACACGGTCCGGGCCAAGCAGATTGC
chr1	11984658	11984694	GTTTGAGCAGCACACGGTCCGGGCCAAGCaGATTGC
chr1	11984658	11984694	GTTTGAGCAGCACACGGTCCGGGCCAAGCAGATTGC
chr1	11984658	11984694	GTTTGAGCAGCACACGGTCCGGGCCAAGCAGATTGC
chr1	11984658	11984694	GTTTGAGCAGCACACGGTCCGGGCCAAGCaGATTGC
chr1	11984658	11984694	GTTTGAGCAGCACACgGTCCgGGCCaaGCAGATTgC
chr1	11984658	11984694	GTTTGAGCAGCACACGGTCCGGGCCAAGCAGATTGC
chr1	11984662	11984698	GAGCAGCACACGGTCCGGGCCAAGCAGATTGCAGAG
chr1	11984662	11984698	GAGCAGCACACGGTCCGGgCCAagCAgATTgCAGAg
chr1	11984662	11984698	GAGCAGCACACGGTCCGGGCCAAGCAGaTTGCAGAG
chr1	11984662	11984698	gAgCAGCACACgGTCCGGGCCaAGCAGATTGCAGAG
chr1	11984665	11984701	CAGCACACGGTCCGGGCCAAGCAGATTGCAGAGGCG
chr1	11984667	11984703	GCACACGGTC <b>T</b> GGGCCAAGCAGATTGCAGAGGCGGg
chr1	11984667	11984703	GCACACGGTC <b>T</b> GGGCCAaGCAGATTGCAGAGGCGGg
chr1	11984667	11984703	GCACACGGTC <b>T</b> GGGCCAAGCAGATTGCAGAGGCGGg
chr1	11984667	11984703	GCACACGGTC <b>T</b> GGGCCAAGCAGATTGCAGAGGCGGt
chr1	11984668	11984704	CACACGGTCCGGGCCAAGCAGATTGCAGAGGCGGTT
chr1	11984668	11984704	CACACGGTCCGGGCCAAGCAGATTGCAGAGGCGGTT
			*

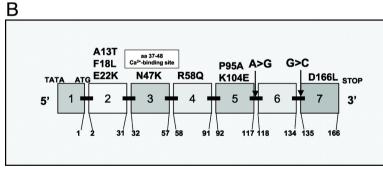
So what went wrong? The error probably occurs in an amplification step required by the capture process.

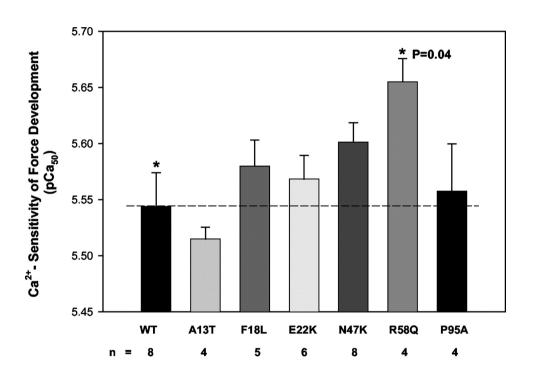
**Trait-o-matic finds MYL2 A13T in PGP6** 



#### Effect of MYL2 A13T is inconclusive in functional studies







#### More clinical data for MYL2 A13T

Poetter et al., 1996

PGP6

PG

#### Based on this data, PGP6 visited a cardiologist.

IV

While he, thankfully, remains negative for any signs of cardiac disease, the late onset nature of this disease suggests a need for periodic followup.

Free Factories can help scientists, physicians and the general public work together to advance personalized medicine

#### **Acknowledgments**

George Church Harris Wang

James Hogle Tom Clegg

Zak Kohane Ward Vandewege

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Thank-you!