

Bioinformatic approaches to discover post-transcriptional regulatory elements in human mRNAs

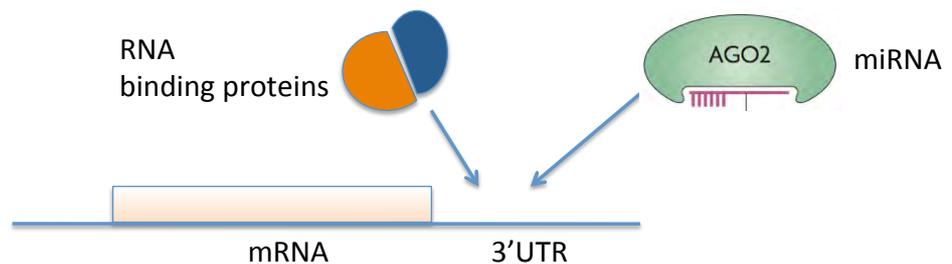
Chris Brown

Bioinformatics mainly: Ambarish Biswas Brad Croft, Gareth Gillard.

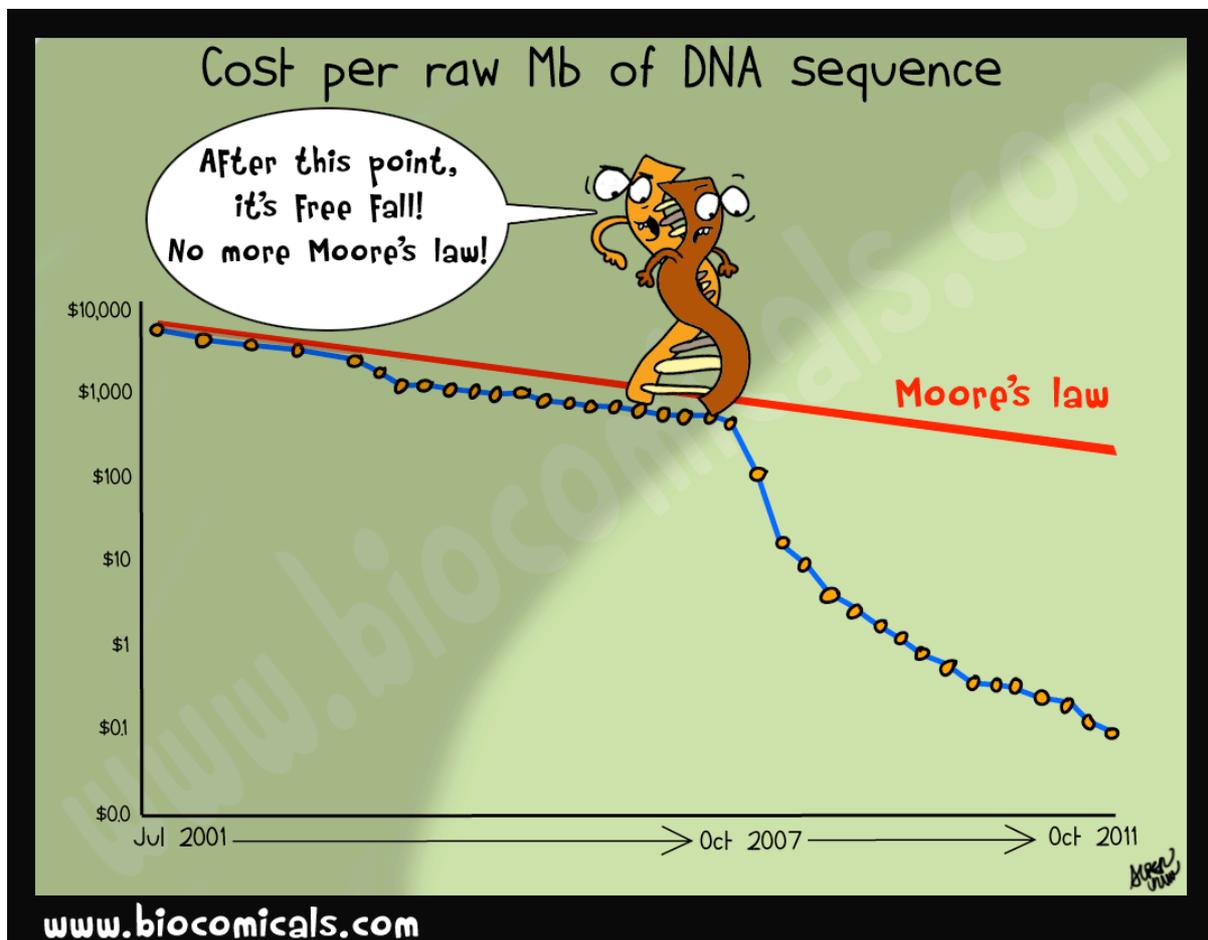
Cell Biology mainly: Sam Tayler-Wardell, Lim Chen

Biochemistry and Genetics Otago

University of Otago



Post-transcriptional control through the 3'UTR





SCIENCE

October 3, 2013 - 5:00pm [f](#) [t](#)

“Build-a-Baby” DNA Database Patent Sounds Worryingly Like *Gattaca*

Gerald Lynch - Do you remember *Gattaca*, the 1997 dystopian sci-fi film in which Ethan Hawke endures a lifetime of prejudice because his parents chose not to supercharge his genes at birth? It's an unsettling vision of an intolerant future, and one that could become a reality if 23andMe's "Build-a-Baby" DNA database patent ever becomes an actual thing.

The "Family Traits Inheritor Calculator" could be used to predict the chance of a child being born with an inherited disease, as well as picking up details of a person's future appearance, such height and weight, and maybe even personality.

And though 23andMe [has since distanced itself](#) from the potential use of the tool as a designer baby catalogue for fertility clinics, experts fear that this could be the technology's ultimate application.

Gattaca



[More images](#)

Andrew Niccol

Screenwriter

Andrew M. Niccol is a New Zealand screenwriter, producer, and director. He wrote and directed *Gattaca*, *S1m0ne*, *In Time*, and *Lord of War*. [Wikipedia](#)

Born: January 1, 1960, [Paraparaumu](#)

Spouse: [Rachel Roberts](#) (m. 2002)

Awards: Saturn Award, Saturn Award for Best Writing, [More](#)

Children: [Jack Niccol](#), [Ava Lila Rae Niccol](#), [Mia Niccol](#)

Siblings: [Linda Niccol](#)

Movies



[The Host](#)
2013



[In Time](#)
2011



[Gattaca](#)
1997



[Lord of War](#)
2005

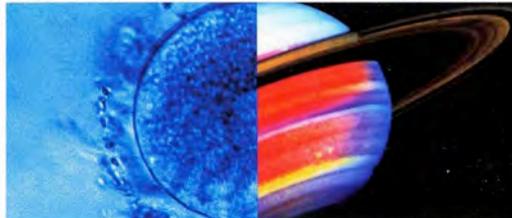


[The Truman S...](#)
1998

ETHAN HAWKE UMA THURMAN JUDE LAW



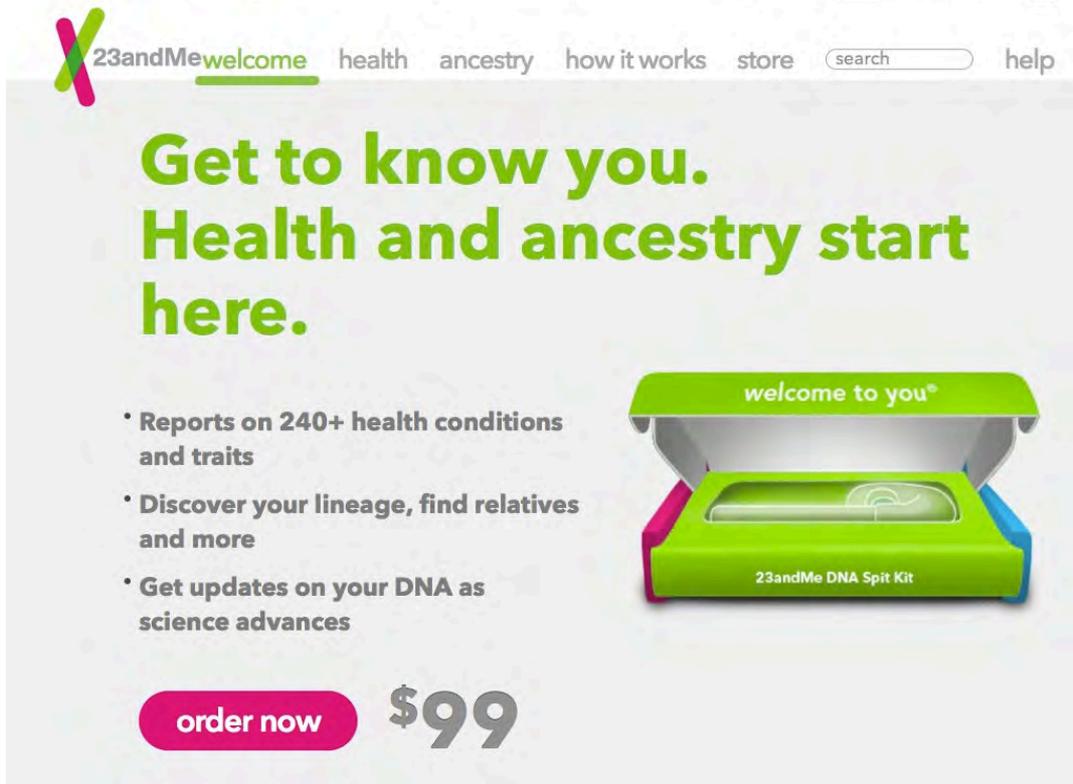
G A T T A C A



THERE IS NO GENE FOR THE HUMAN SPIRIT



https://www.youtube.com/watch?v=jpm4T2-v_bw



The banner features the 23andMe logo on the left, a navigation menu with 'welcome', 'health', 'ancestry', 'how it works', 'store', 'search', and 'help', and a large green headline. Below the headline is a list of features and an image of the DNA spit kit. At the bottom left is an 'order now' button and the price '\$99'.

23andMe welcome health ancestry how it works store search help

Get to know you. Health and ancestry start here.

- Reports on 240+ health conditions and traits
- Discover your lineage, find relatives and more
- Get updates on your DNA as science advances

welcome to you®

23andMe DNA Spit Kit

order now \$99

Spit Happens! Genentech And 23andMe Team Up To Advance Genomic Testing In Clinical Trials

+ Comment Now + Follow Comments

Has genomic testing come of age?

I'm sure you've seen or heard the [23andMe](#) commercials. It's the consumer-focused genomic testing service that, for \$99, will analyze your DNA to provide an informational profile of hundreds of health conditions and trails. The key word here is "informational". These data are interesting, yet the exact clinical significance, in many instances is uncertain. It's the combination of this information with the combined wisdom of the medical community that can empower 23andMe. However, 23andMe is now teaming up with [Genentech](#) to profile a broad group of patients exposed to the Genentech drug Avastin (bevacizumab). The new consumer campaign is all about spit—and leverages the "playful ease" of getting a saliva sample that is rich with data—and dollars.



TED Talk 2009 23andMe co-founder

PHILANTHROPY 50

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February 10, 2013

No. 5: Sergey Brin and Anne Wojcicki

By Maria Di Mento

Amount donated in 2012: approximately \$22.9-million

Top beneficiary: Brin Wojcicki Foundation

Other notable gift: \$32.8-million to the Michael J. Fox Foundation for Parkinson's Research

Background: Mr. Brin co-founded Google. Ms. Wojcicki is a biotechnology analyst and



Kevork Djansezian/Getty Images

Sergey Brin and Anne Wojcicki

[Enlarge Image](#)

co-founded the genetic-testing company, 23andMe.

Mr. Brin and Ms. Wojcicki, both 39, gave about \$190.1-million to their Brin Wojcicki Foundation, which supports a variety of causes. Last year the foundation awarded grants to Ashoka, which brings together social entrepreneurs to work on education, environment, women's issues, and many other causes; the Human Rights Foundation; and Tipping Point Community, a nonprofit that seeks to eliminate poverty in Northern California.



HOME MY RESULTS FAMILY & FRIENDS RESEARCH & COMMUNITY

KEY HEALTH RECOMMENDATIONS

Chris, there are hundreds of ways in which your DNA can relate to your health. To get you started, we've highlighted a handful of the *most important* health recommendations for you.

500,000+

locations of DNA (SNPs) analyzed

5,000+

research studies evaluated by our scientists

240+

health reports generated

3 KEY RECOMMENDATIONS

Learn how your DNA influences your response to a common blood thinner.

Your DNA suggests that if you take a blood thinner called warfarin (Coumadin®) you may require a lower dose.

Blood thinners like warfarin prevent blood clots. The right dose of warfarin is important - too much can cause bleeding and too little can lead to blood clots.

Talk to your doctor about adding this genetic result to your medical record. If you are currently taking warfarin, discuss this result with your doctor.

[SEE WARFARIN \(COUMADIN®\) SENSITIVITY REPORT](#)

Avoid raw oysters and unwashed lettuce.

Your DNA indicates that you are sensitive to the most common strain of norovirus.

Thought you had the stomach flu? If you had stomach upset and vomiting, then you probably had norovirus.

People contract norovirus by eating contaminated food. Raw oysters, which may be grown in contaminated water, also pose a risk.

[SEE NOROVIRUS SUSCEPTIBILITY REPORT](#)

Talk to your family about carrier testing for inherited disease.

You are a carrier for one or more inherited conditions.

23andMe tests for genetic mutations that can be passed from parent to child and can cause inherited disease. A "carrier" does not have the disease, but can pass the mutation on to his or her children.

Click the link below to learn more about the conditions that apply to you.



Your DNA suggests that if you take a blood thinner called warfarin (Coumadin®) you may require a lower dose.



Your DNA indicates that you are sensitive to the most common strain of norovirus.



You are a carrier for one or more inherited conditions.

Direct to consumer genetic testing

SHOW RESULTS FOR: Chris Brown

SEE NEW AND RECENTLY UPDATED REPORTS

Health Risks (120)

	YOUR RISK	AVERAGE RISK
* ELEVATED RISKS		
Psoriasis	43.3%	11.4%
Chronic Kidney Disease	4.2%	3.4%
Scleroderma (Limited Cutaneous Type)	0.08%	0.07%
* DECREASED RISKS		
Prostate Cancer	8.2%	17.8%
Alzheimer's Disease	4.3%	7.2%

See all 120 risk reports...

Inherited Conditions (50)

REPORT	RESULT
Hemochromatosis (HFE-related)	Variant Present
Familial Dysautonomia	Variant Absent
Canavan Disease	Variant Absent
Familial Hyperinsulinism (ABCC8-related)	Variant Absent
Primary Hyperoxaluria Type 2 (PH2)	Variant Absent
Rhizomelic Chondrodysplasia Punctata Type 1 (RCDP1)	Variant Absent
Torsion Dystonia	Variant Absent
Autosomal Recessive Polycystic Kidney Disease	Variant Absent

See all 50 carrier status...

Traits (60)

REPORT	RESULT
Alcohol Flush Reaction	Does Not Flush
Bitter Taste Perception	Can Taste
Earwax Type	Wet
Eye Color	Likely Blue
Hair Curl	Straighter Hair on Average

See all 60 traits...

Drug Response (24)

REPORT	RESULT
Warfarin (Coumadin®) Sensitivity	Increased
Clopidogrel (Plavix®) Efficacy	Reduced
Fluorouracil Toxicity	Typical
Sulfonylurea Drug Clearance (Type 2 Diabetes Treatment)	Typical
Alcohol Consumption, Smoking and Risk of Esophageal Cancer	Typical

See all 24 drug response...

Genome wide association studies

- E.g. for Multiple Sclerosis, Heart Disease, Depression, etc

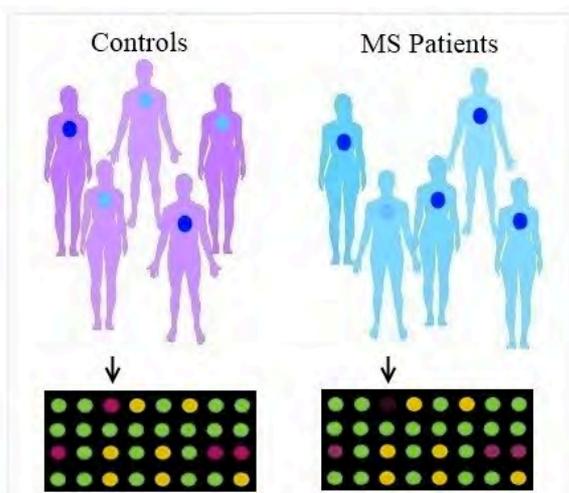
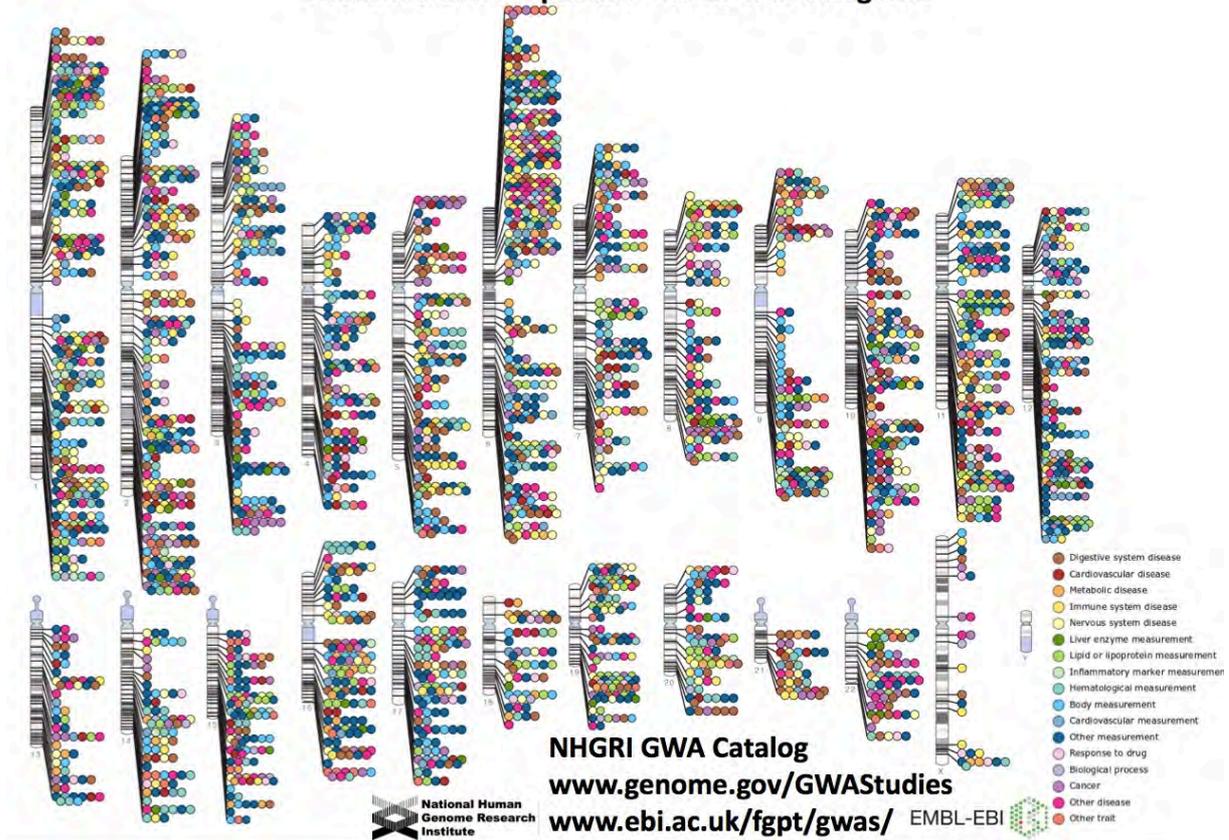


Fig. 2. Genome-wide association studies (GWAS) and MS. GWAS scan hundreds of thousands of points along the genome and identify single-nucleotide differences between MS cases and controls. In this image, one variant of a gene (represented by the light blue dot) is more prevalent among control subjects, whereas another variant of the same gene (represented by the dark blue dot) is more prevalent among people who have MS.

Single nucleotide polymorphisms (SNP)

Published Genome-Wide Associations through 12/2012
Published GWA at $p \leq 5 \times 10^{-8}$ for 17 trait categories



Neanderthal?

This lab estimates your genome-wide percentage of Neanderthal ancestry

Got Neanderthal DNA?

An estimated **2.9%** of your DNA is from Neanderthals.

Chris Brown (you)  **2.9%** 81st percentile

Average European user  **2.7%**

MODERN HUMANS	NEANDERTHALS
Higher brow	Heavy eyebrow ridge
Narrower shoulders	Long, low, bigger skull
Slightly taller	Prominent nose with developed nasal chambers for cold-air protection

So what, I'm a caveman?

Actually yes, but that has little to do with the percentage of Neanderthal DNA in your genome. Our perception of Neanderthals as big oafs is clouded by our own notion of superiority and pop culture caricatures. How we are different and why modern humans survived and Neanderthals didn't is still mostly a mystery.

Neanderthal and proud?



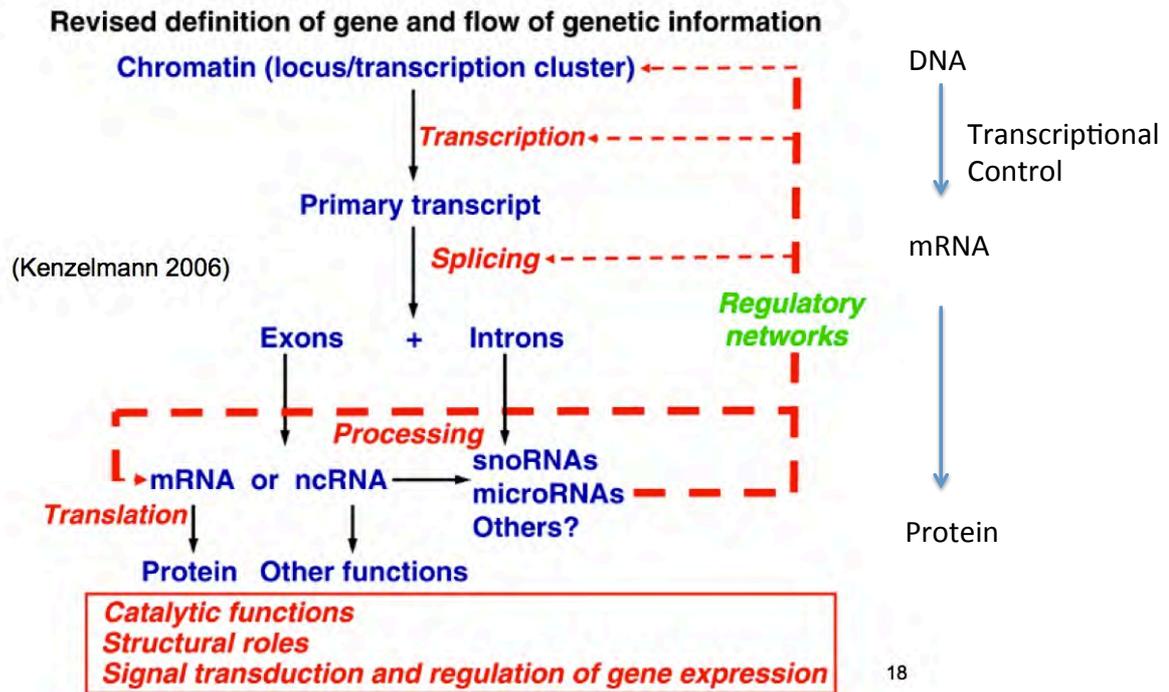
Whatever your Neanderthal

Friends & Family

You are ranked **1st** among your friends. [Invite more friends](#)

Chris Brown (you)  **2.9%** 81st percentile among European users

Revision – Lecture 3/Slide18



Bioinformatics Research in Chris Brown group

Aim: Discovery of functional regulatory elements in (m)RNAs.

Experimental testing by ourselves or collaborators (NZ, USA, Swiss)

A. Databases of mRNAs and mRNA regulatory elements

Webbased: Transterm, CRISPRTarget, CRISPRDetect

B. Methods for discovery of regulatory elements

Refinement or adaptation of existing methods for motif discovery, MEME, FIRE, etc. Results integration with SVM.

New algorithms – e.g. MLOGD, CDS-plotcon

Expression studies – microarrays and NGS

C. Workflows and Visualisation of elements on genomes

Galaxy browser for mRNA analysis (bioanalysis.otago.ac.nz)

Viral genomes (VirDB) using GBrowse (prototype: HBVRegDB)

Possible Summer project 2015 – Viral Genomic database, Virus genome analysis

D. Gene expression in plants

Effect of a bacterium on leaves – Model system (Plant and Food Auckland)

Beneficial fungus (endophyte) on Maize roots. (Lincoln)

People past and present - Brown lab

Dream to turn sea urchins into lucrative export industry

Home » News » Dunedin
 By John Gibb on Sat, 27 Aug 2011
 University of Otago | News: Dunedin | Graduation

Share 0 Tweet 0 ShareThis

Daniel Garama has realised his dream of becoming a biochemist and his research on sea urchins could help develop a lucrative aquaculture export industry.

Mr Garama (30) will today gain a doctorate from the University of Otago, as one of about 350 graduands in all disciplines who will graduate in person in a 3pm ceremony at the Regent Theatre.

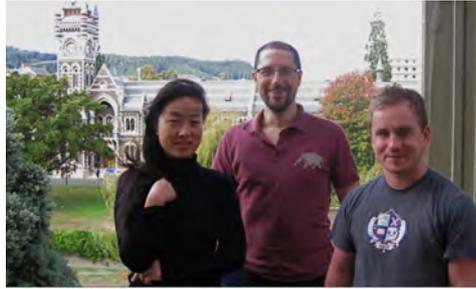
"Obviously, I'm proud," he said yesterday.

He felt "a sense of fulfilment" to have finally reached his goal, after many years of hard work.

Dr Dan Garama (Cancer, Kina)



Biochemist Daniel Garama, who graduates from the University of Otago with a PhD today, looks at sea urchin shells. Photo by Craig Baxter.



Some of Brown Group: Dr Sylvia Chen (now in Netherlands –Regulatory elements), Stewart Stevens (PhD student- Gene expression, MEd) Josh Gagnon (Software developer- lots)

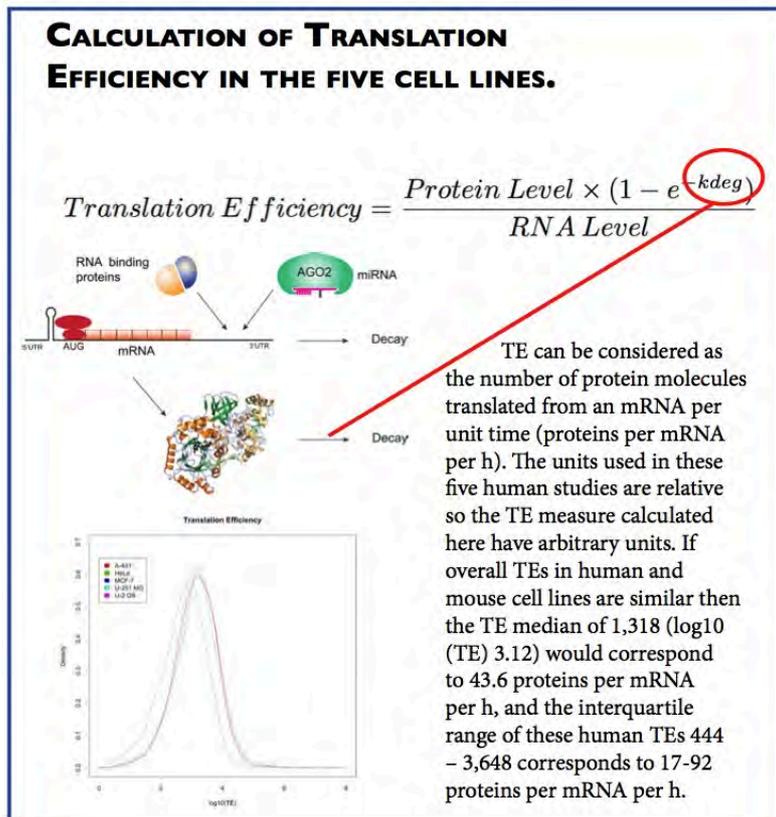
2013

Andrew Sarman (MSc Genetics) – Breast cancer

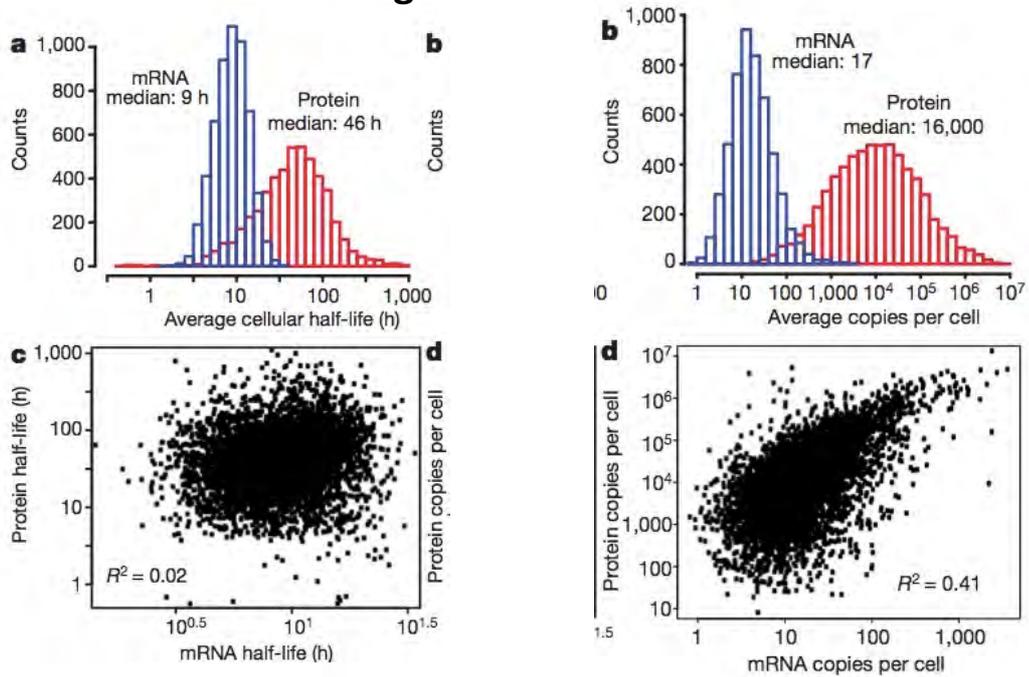
Scout Liu (Hons, Mol Biotech) – Cancer- MYC transcription factor

Ambarish Biswas (PhD Biochem) – Regulatory elements

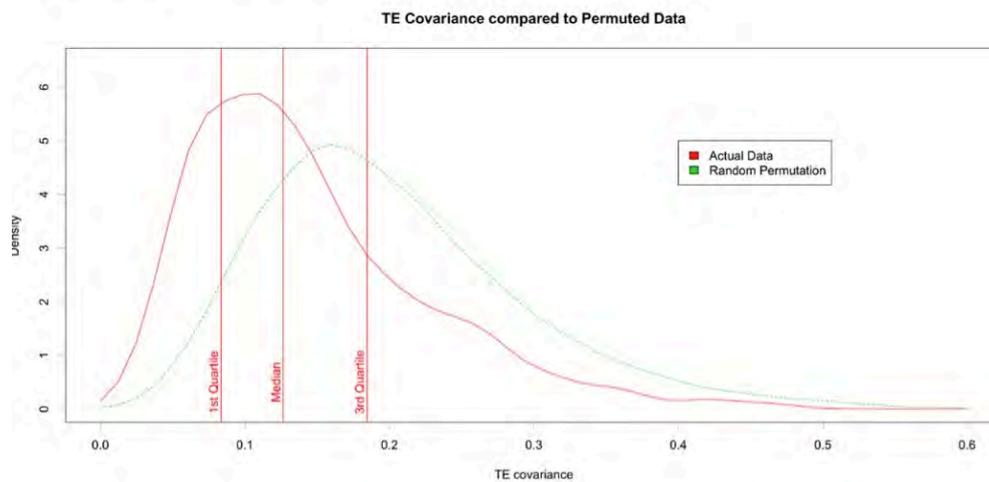
Gareth Gillard (MSc Biochem) – Gene expression, Genomics, RNA-seq.



‘Good’ correlation between protein and mRNA copies
However, no correlation between stabilities! – complex regulation

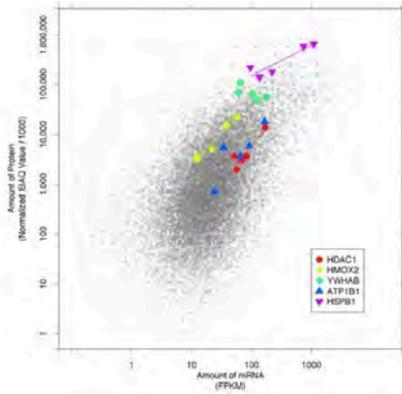


TRANSLATION EFFICIENCY SHOWS GREATER CONSISTENCY THAN EXPECTED BY CHANCE WITHIN GENES ACROSS CELL LINES.



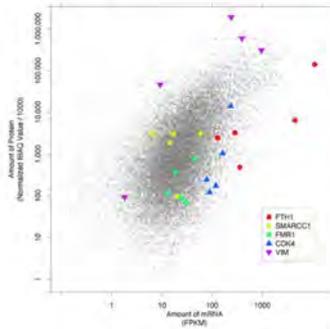
We did a random permutation of TE values and compared the resulting covariance with the actual covariance observed within each gene.

GENES WITH A LOW COEFFICIENT OF VARIATION (CV) IN TE VALUE.



Some examples of well-studied genes are shown here. They tend to either have similar expression values at both the protein and mRNA level (e.g. YWHAB) or have linear relationships between these values (e.g. HMOX2, HSPB1).

GENES WITH A HIGH COEFFICIENT OF VARIATION (CV) IN TE VALUE.

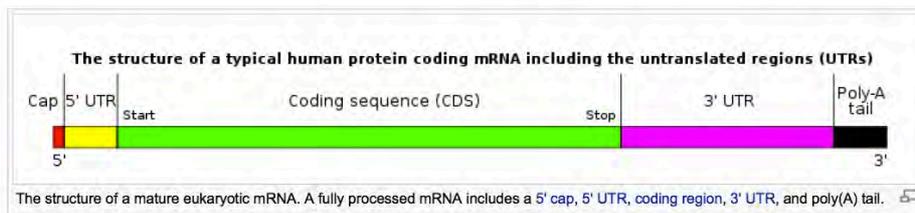


Examples shown here include FTH1, which has well studied translational control mechanisms. Genes such as SMARCC1 have large variation in the amount of mRNA with smaller variation in the amount of protein. Conversely genes such as CDK4 have widely ranging amounts of protein but little difference in the amounts of mRNA. Other genes such as VIM vary in both protein and mRNA amounts.

Human mRNA structure

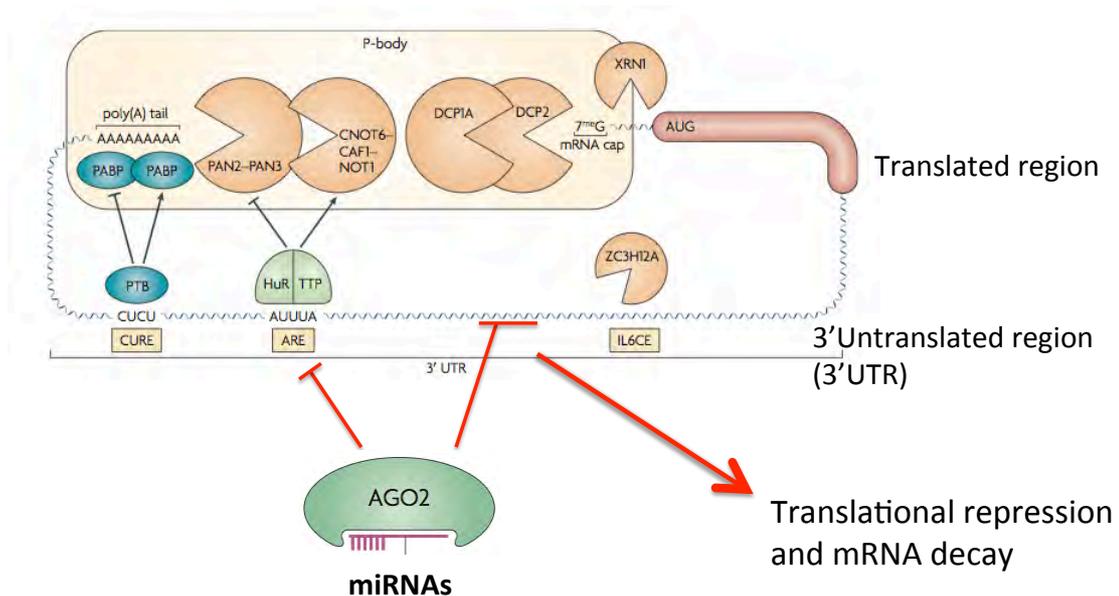
Structure

[edit]



Interactions with mRNA and its decay

-Post-transcriptional control may be through the 3'UTR



Paul Anderson
Nature Reviews Immunology 2010

Review

Cell
PRESS

Feature Review

De novo prediction of structured RNAs from genomic sequences

Jan Gorodkin¹, Ivo L. Hofacker², Elfar Torarinsson¹, Zizhen Yao³,
Jakob H. Havgaard¹ and Walter L. Ruzzo^{3,4}

¹Section for Genetics and Bioinformatics, IBHV and Center for Applied Bioinformatics, University of Copenhagen, Grønnegårdsvej 3, DK-1870 Frederiksberg C, Denmark

²Institut für theoretische Chemie, University of Vienna, Währingerstr. 17, A-1090 Vienna, Austria

³Fred Hutchinson Cancer Research Center, 1100 Fairview Ave. N. PO Box 19024, Seattle, Washington 98109, USA

⁴Departments of Computer Science and Engineering and Genome Sciences, University of Washington, Seattle, Washington 98195, USA

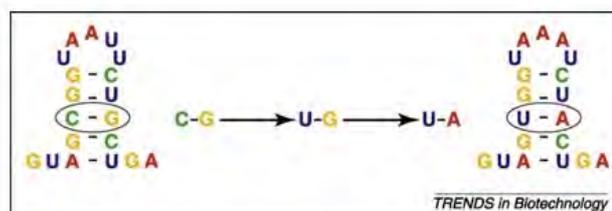


Figure 1. Compensating base changes. Changes in base pairing might preserve structure, but not the primary sequence. In addition to the usual Watson-Crick base pairs, less stable G-U pairs (sometimes called "wobble pairs") are often seen in RNAs, and are evolutionarily important because they allow single base substitutions that are not structurally disruptive. This might allow sequences to accumulate substitutions much more rapidly than would be the case if both nucleotides in a base pair needed to be changed more or less simultaneously. Adapted with permission from Ref. [80].

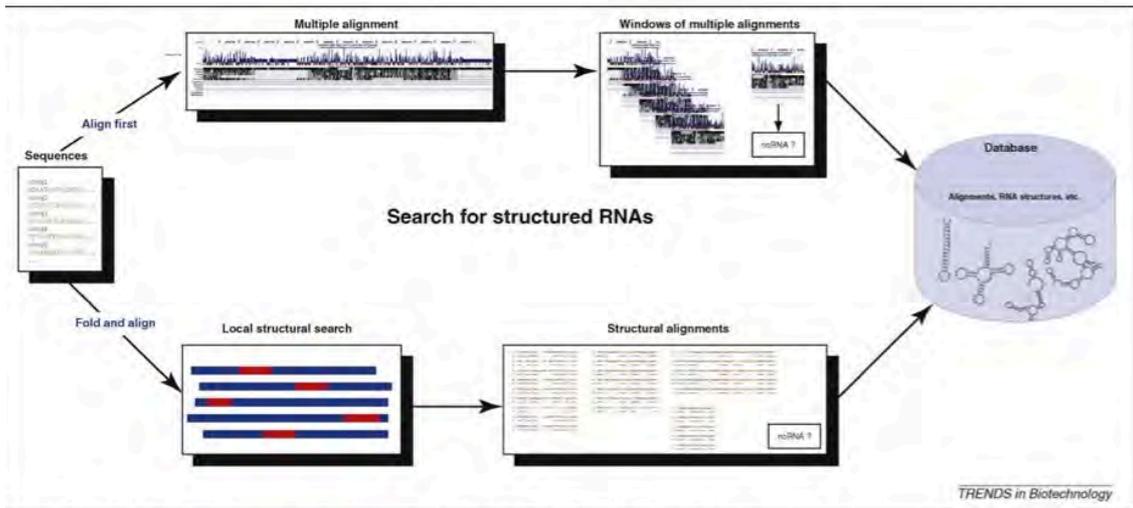


figure 2. Strategies for ncRNA screening. The upper path illustrates RNA structure prediction using existing sequence alignments that are divided into overlapping windows (an align first strategy). By contrast, in the lower path, labeled “fold and align,” sequence and structure alignments are performed directly from unaligned sequence data (a joint strategy), which searches simultaneously for conserved structure and sequence, and results in structural alignments. To date, alternative fold-first strategies have not been applied to genome-scale screening.

Little overlap between algorithms

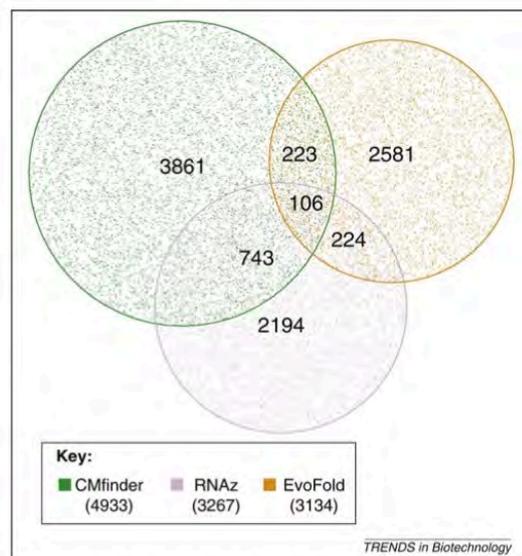
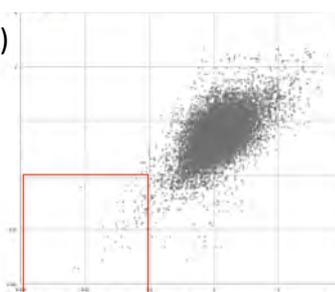


Figure 6. Comparison of ENCODE scans. The Venn diagram compares RNA elements in the ENCODE regions predicted by the three screening methods discussed here, CMfinder, RNAz, and EvoFold. Only predictions from input data that are common to all three studies are tallied, that is, repeat, exon and PhastCons regions are excluded [64]. As illustrated here, of the 4933 candidates reported by CMfinder, 3861 were reported by neither of the other methods, while 106 candidates were reported by all three. Adapted with permission from [Ref. 64].

Changes in mRNA levels by RNA-Seq

- ~30 million SE, 75 base Illumina reads (Massey).
- $304 \leq 0.5$ down, $100 \geq 2$ up of 13,792 transcripts with > 50 reads in control.
- Ratios good correlation with array and Q-PCR
- Examples of mRNAs with changes in levels:

Gene	miR-ve (reads)	miR-30e (norm reads)	Ratio	Ratio from Array	Prediction
ZDHHC20	418	60.0	0.14	0.21	1
IDH1	2848	464.7	0.16	0.22	4
SEC23A	6902	1247.5	0.18	0.3	5
KDELC2	3552	733.5	0.21	0.31	3
SPTLC3	421	87.8	0.21	0.43	4
TWF1	1972	414.4	0.21	0.4	5
GM2A	675	145.6	0.22	0.4	3
RARG	868	187.4	0.22	NS	4
EXTL2	686	157.4	0.23	0.34	5
CD99	3701	905.9	0.24	0.37	2
NT5E	6486	1592.3	0.25	0.32	6
MAP2K6	64	17.1	0.27	NS	1
AP3S1	961	258.1	0.27	0.49	3
PEG10	951	260.2	0.27	0.38	3



Ratio (Array)

Predictions - Votes 0-6

MiR-30e target prediction was from

TargetScan (3% of genes predicted positive)

Miranda (15%)

mirTarget2 (3%)

Pictar (4%)

Pita (29%)

RNAHybrid (97%),

CisReg: A Benchmarking set of Structured cis-regulatory RNA elements

CisReg- A set of structured cis-regulatory elements located in mRNA sequences, and flanking regions.

Published in Lange and Maticzka et al., "Global or local? Predicting secondary structure and accessibility in mRNAs", Submitted to NAR Oct 2011

CisReg 1.0 data was processed in May 2011 from Rfam 10.0 Data curation by: Sita J. Lange (1) Joshua N. Gagnon (2) Chris M. Brown (2) . It was used for the development of the *LocalFold* algorithm.

(1) Department of Computer Science, Albert-Ludwigs-University, Freiburg, Germany

(2) Department of Biochemistry and Genetics Otago, University of Otago, Dunedin, New Zealand

Contact chris.brown@otago.ac.nz

Seed families have been carefully selected from the Rfam database (version 10.0) have been filtered to optimise the quality of sequences. The consensus structures for each seed has been mapped to each single sequence in the seed alignment and then folded using the mapped consensus structure as a constraint using RNAfold. Alignment, family, sequence and structure information is saved in separate files.

The RFxxxxx_struct files (e.g. [RF00032_struct](#)) are the key file used for benchmarking structure prediction. These files include all the information to evaluate how well the final structure for the element fits to the consensus structure of the family. According to these values, the best candidates can be chosen for the evaluation of structure prediction programs, etc.

The readme file is [here](#) and build statistics [here](#)

Download the complete set described in the documentation ([Download](#))

Set A. Structured elements with simple secondary structures

mRNA set (27)

RF00031 **SECIS** Selenocysteine insertion sequence

Expand All

more detail ...

Covariation Model (Rfam) Seed (Stockholm from Rfam) Seed (fa)

Structural file

Seed +100, (fa) Seed +200, (fa) Seed +500, (fa) 3000 or whole mRNA (fa)

Seed length : 64

CisReg filtered sequences: 53 of 61 from the Rfam seed

Comment from CisReg on SECIS - Contains 4 A-G base pairs



Published online 28 February 2011.

Global or local? Predicting secondary structure and accessibility in mRNAs

Sita J. Lange¹, Daniel Maticzka¹, Mathias Möhl¹, Joshua N. Gagnon², Chris M. Brown² and Rolf Backofen^{1*}

¹Department of Computer Science and Centre for Biological Signalling Studies (BIOSS),

Albert-Ludwigs-Universität Freiburg, Germany and ²Department of Biochemistry and Genetics Otago, University of Otago, P.O. Box 56, 710 Cumberland St, Dunedin 9054, New Zealand

NeSI and high RAM computers



STAT 435

STAT435 Data Analysis for Bioinformatics

First Semester, 20 points

[Resources](#)

The analysis of large data sets is becoming increasingly important in many areas. The techniques covered in this course will be applicable to a wide range of data types, including non-biological data. Exposure to other disciplines (in this case biomedical science) is a must for any applied statistician. Interacting with students from other fields is simulating, and will help you appreciate your statistical skills.

Paper details

- ▶ Overview of genetics and molecular biology.
- ▶ Introduction to genetic, genomic, and proteomic technologies.
- ▶ Methods for the statistical analysis of large data sets.
- ▶ Application of standard statistical methods.
- ▶ Introduction to new purpose-built methods.
- ▶ Incorporation of biological information into the statistical analysis process.

Potential students

This course is open to 4th year students from the biological and medical sciences, mathematics and statistics, and computer science. As long as you have skills in one of these areas, any remaining gaps will be filled in during the course. Experience with R will certainly help.

Bioinformatics Research in Chris Brown group

Aim: Discovery of functional regulatory elements in (m)RNAs.

Experimental testing by ourselves or collaborators (NZ, USA, Swiss)

A. Databases of mRNAs and mRNA regulatory elements

Webbased: Transterm, CRISPRTarget, CRISPRDetect

B. Methods for discovery of regulatory elements

Refinement or adaptation of existing methods for motif discovery, MEME, FIRE, etc . Results integration with SVM.

New algorithms – e.g. MLOGD, CDS-plotcon

Expression studies – microarrays and NGS

C. Workflows and Visualisation of elements on genomes

Galaxy browser for mRNA analysis (bioanalysis.otago.ac.nz)

Viral genomes (VirDB) using GBrowse (prototype: HBVRegDB)

Possible Summer project 2015 – Viral Genomic database, Virus genome analysis

D. Gene expression in plants

Effect of a bacterium on leaves – Model system (Plant and Food Auckland)

Beneficial fungus (endophyte) on Maize roots. (Lincoln)