Human Genome Annotation, focusing on SVs

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Slides at Lectures.GersteinLab.org (See Last Slide for References & More Info.)





2001: Most of the genome is not coding (only ~1.2% exon). It consists of elements such as repeats, regulatory regions, non-coding RNAs, origins of replication, pseudogenes, segmental duplications....What do these elements do? How should [IHGSC, *Nature* 409, 2001] they be annotated?



2007 : Pilot results from ENCODE Consortium on decoding what the bases do

- 1% of Genome (30 Mb in 44 regions)
- Tiling Arrays to assay Transcription & Binding
- Multi-organism sequencing and alignment
- Careful Annotation
- Variation Data

[IHGSC, *Nature* 409, 2001] [ENCODE Consortium, *Nature* 447, 2007]



Different Views of the Function of Junk DNA

[NY Times, 26-Jun-07]

Human DNA, the Ultimate Spot for Secret Messages (Are Some There Now?)

By DENNIS OVERBYE

ESSAY

In Douglas Adams's science fiction classic, "The Hitchhiker's Guide to the Galaxy," there is a character by the name of Slartibartfast, who designed the fjords of Norway and left his signature in a glacier.

I was reminded of Slartibartfast recently as I was trying to grasp the implications of the feat of a team of Japanese geneticists who announced that they had taught relativity to a bacterium, sort of.

Using the same code that computer keyboards use, the Japanese group, led by Masaru Tomita of Keio University, wrote four copies of Albert Einstein's famous formula, E=mc², along with "1905," the date that the young Einstein derived it, into the bacterium's genome, the 400-million-long string of A's, G's, T's and C's that determine everything the little bug is and everything It's ever going to be.

The point was not to celebrate Einstein. The feat, they said in a paper published in the journal Biotechnology Progress, was a demonstration of DNA as the ultimate information storage material, able to withstand floods, terrorism, time and the changing fashions in technology, not to mention the ability to be imprinted with little anobtrusive trademark labels — little "Made by Monsanto" rags, say.

In so doing they have accomplished at least a part of the dram that Jaron Lanier, a computer scientist and musician, and David Sulzer, a biologist at Columbia, enunciated in 1999. To create the ultimate time capsule as part of the miliennium festivities at this newspaper, they proposed to encode a year's worth of the New York Times magazine into the junk DNA of a cockrach. "The archival cockroach will be a robust repository," Mr. Lanier wrote, "able to survive almost all conceivable scenarios."

If cockroaches can be archives, why not us? The human genome, for example, consists of some 2.9 billion of those letters — the equivalent of about 750 megabytes of dgta — but only about 3 percent of it goes into composing the 22,000 or so genes that make us what we are.

10 The remaining 97 percent, so-called junk DNA, looks like gibberish. It's the dark matter of inner space. We don't know what it is saying to or about us, but within that see of megabytes there is plenty of room for the imagination to roam, for trademark labels and much more. The King James Bible, to pick one obvious example, only amounts to about five megabytes.



If a bacterium can be encoded with E=mc², if cockroaches can be archives, why not us?

Inevitably, if you are me, you begin to wonder if there is already something written in the warm wet archive, whether or not some Slartibartlast has already been here and we ourselves are walking around with lit le trademark tags or more wriggling and squiggling and folded inside us. Gill Bejerano, a geneticist at the University of California, Santa Cruz, who mentioned Slartibartfast to me, pointed out that the problem with raising this question is that people who look will see messages in the genome even if they aren't there — the way people have claimed in recent years to have found secret codes in the Bible.

Nevertheless, no less a personage than Francis Crick, the co-discoverer of the double helix, writing with the chemist Leslie Orgel, now at the Salk Institute in San Diego, suggested in 1973 that the primitive Earth was infected with DNA broadcast through space by an allen species.

As a result, it has been suggested that the search for extraterrestrial intelligence, or SETI, should look inward as well as outward. In an article in New Scientist, Paul Davies, a cosmologist at Arizona State University, Using the same code that computer keyboards use, the Japanese group... wrote four copies of Albert Einstein's famous formula, E=mc2... into the bacterium's genome... In so doing they have accomplished at least a part of the dream that Jaron Lanier, a computer scientist and musician, and David Sulzer, a biologist at Columbia, enunciated in 1999. To create the capsule as part of the millennium festivities at they proposed to encode a year's worth of the New York Times magazine into the junk DNA of a cockroach. "The archival cockroach will be a robust repository," Mr. Lanier wrote, "able to survive almost all conceivable scenarios."

change, and have remained identical in humans, rats, mice, chickens and dogs for at least 300 million years.

But Dr. Bejerano, one of the discoverers of these

ultraconserved" strings of the genome, said that many

"Why they need to be so conserved remains a mystery," he said, noting that even regular genes that do

thing undergo more change over time. Most junk

The Japanese team proposed to sidestep the muta-

tion problem by inserting redundant copies of their mes

sage into the genome. By comparing the readouts, they

said, they would be able to recover Einstein's formula

even when up to 15 percent of the original letters in the

ng had changed, or mutated. "This is the ma

of them had turned out to be playing important com-

bits of DNA that neither help nor annoy an organism

mand and control functions.

mutate even more rapidly.

sections of junk DNA seem to be markedly resistant to St





with their minds and hearts and hands they can shape their own destiny. ... identified on chromosome 16 in families with the sentence of the s



Junk DNA as Art

How might we annotate a human text?

The Semicolon Wars

Brian Hayes

F YOU WANT TO BE a thoroughgoing world traveler, you need to learn 6,912 ways to say "Where is the toilet, please?" That's the number of languages known to be spoken by the peoples of planet Earth, according to Ethnologue.com.

glot programmer, you also have quite a challenge ahead of you, learning all the ways to say:

printf("hello, world\n");

Color is **Function**

Lines are Similarity

[B Hayes, Am. Sci. (Jul.-Aug. '06)]

If you want to be the complete poly-

(This one is in C.) A catalog maintained by Bill Kinnersley of the University of Kansas lists about 2,500 programming languages. Another survey, compiled by Diarmuid Piggott, puts the total even higher, at more than 8,500. And keep in mind that whereas human languages have had millennia to evolve and diversify, all the computer language es have sprung up in just 50 years. Even by the more-conservative standards of the Kinnersley count, that means we've been inventing one language a week, on average, ever since Fortran. For ethnologists, linguistic diversity

is a cultural resource to be nurtured and preserved, much like biodiversity.

Every programmer knows there is one true programming language. A new one every week

a good-enough notation—for expressing an algorithm or defining a data structure.

There are programmers of my acquaintance who will dispute that last statement. I expect to hear from them. They will argue—zealously, ardently, vehemently-that we have indeed found the right programming language, and for me to claim otherwise is willful ignorance. The one true language may not vet be perfect, they'll concede, but it's built on a sound foundation and solves the main problems, and now we should all work together to refine and improve it. The catch, of course, is that each of these friends will

cide which end of a boiled egg to crack. This famous tempest in an egg cup was replayed 250 years later by designers of computer hardware and communications protocols. When a block of data is stored or transmitted, either the leastsignificant bit or the most-significant bit can go first. Which way is better? It hardly matters, although life would be easier if everyone made the same choice. But that's not what has happened, and so quite a lot of hardware and software is needed just to swap ends at boundaries between systems.

This modern echo of Swift's Endian wars was first pointed out by Danny Cohen of the University of Southern California in a brilliant 1980 memo, "On holy wars and a plea for peace." The memo, subsequently published in Computer, was widely read and admired; the plea for peace was ignored.

Another feud—largely forgotten, I think, but never settled by truce or treaty—focused on the semicolon. In Algol and Pascal, program statements have to be separated by semicolons. For example, in x := 0; y := x+1; z := 2 the semicolons tell the compiler where one statement ends and the next begins. C

Overview of the Process of

Annotation of non-coding Regions

Basic Inputs

1. Comparative Genomics.

Doing large-scale similarity comparison, looking for repeated or deleted regions

2. Functional Genomics.

Determining experimental signals for activity (e.g. transcription) across each base of genome

Comparative Genomics

Finding repeated or deleted blocks in the genome

- 1. As a function of similarity (i.e. age, perhaps using explicit models)
- 2. vs. other organisms, vs. human reference, or within the human population (synteny, SDs, and CNVs)
- 3. Big and small blocks (duplicated regions and retrotransposed repeats)
- 4. Creation of formal annotations (e.g. genes and pseudogenes)

ENCODE + modENCODE Consortia for functional annotation & 1KG Consortium for variable blocks in human population



1000 Genomes

A Deep Catalog of Human Genetic Variation



Technologies used for Interrogating the Human Genome, over the past 6 years: Reading out "active" or "tagged" regions

Tiling Arrays



Application in a variety of contexts:

Transcription Mapping

Massively Parallel SequencingDNA binding (inc.chromatin struc.)

'06+



AGTTCACCTAAGA... CTTGAATGCCGAT... GTCATTCCGCAAT... Replication

Structural Variation

Plummeting Cost of Sequencing



Outline



 Calling Variable Blocks in Genome (CNVs,SDs)

Calling them with various signal processing approaches

 Analyzing Association of Variable Blocks with repeats, in relation to formation mechanisms

Terminology for Variable Duplicated Elements in the Human Genome



<u>Segmental duplications (SDs) - Recent duplications</u> (~40 million years and younger)

Terminology for Variable Duplicated Elements in the Human Genome



Segmental duplications (SDs) - Contain Duplicated Paralogs and Duplicated Pseudogenes





4. Local Reassembly

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Segmentation of Array Signal (a precursor to Read Depth)





- To get highest resolution on breakpoints need to smooth & segment the signal
- BreakPtr: prediction of breakpoints, dosage and crosshybridization using a system based on Hidden Markov Models



http://breakptr.gersteinlab.org

BreakPtr statistically integrates array signal and DNA sequence signatures (using a discrete-valued bivariate HMM)



Korbel*, Urban* *et al.*, PNAS (2007)

<u>'Active' approach for breakpoint identification: initial scoring</u> with preliminary model, targeted validation (with sequencing), retraining, and rescoring



CNV breakpoints sequenced in ~10 cases following BreakPtr analysis;

Median resolution <300 bp

No improvement in accuracy with higher resolution (9nt tiling)

HMM optimized iteratively (using Expectation Maximization, EM) Korbel*, Urban* *et al.*, PNAS (2007)

Read-Depth from sequencing



Read depth



<u>Mean-shift-based</u> (MSB) Segmentation: no explicit model

- For each bin attraction (meanshift) vector points in the direction of bins with most similar RD signal
- No prior assumptions about number, sizes, haplotype, frequency and density of CNV regions
- Not Model-based (e.g. like HMM) with global optimization, distr. assumption & parms. (e.g. num. of segments).
- Achieves discontinuity-preserving smoothing
- Derived from image-processing applications



Some Intuition on how MSB works: Non-Parametric Density Estimation

Assumption : The data points are sampled from an underlying PDF



Some Intuition on how MSB works: Non-Parametric Density Estimation





[Adapted from S Ullman et al. "Advanced Topics in Computer Vision," www.wisdom.weizmann.ac.il/~vision/courses/2004_2]

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[Adapted from S Ullman et al. "Advanced Topics in Computer Vision," www.wisdom.weizmann.ac.il/~vision/courses/2004_2]

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[Adapted from S Ullman et al. "Advanced Topics in Computer Vision," www.wisdom.weizmann.ac.il/~vision/courses/2004_2]

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[Adapted from S Ullman et al. "Advanced Topics in Computer Vision," www.wisdom.weizmann.ac.il/~vision/courses/2004_2]

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[Adapted from S Ullman et al. "Advanced Topics in Computer Vision," www.wisdom.weizmann.ac.il/~vision/courses/2004_2]

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The blue data points were traversed by the windows towards the mode

[Adapted from S Ullman et al. "Advanced Topics in Computer Vision," www.wisdom.weizmann.ac.il/~vision/courses/2004_2]



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GC bias correction



 $RD_{corrected} = \overline{RD}_{global} RD/\overline{RD}_{GC}$

Example of Application of MSB to RD data


RD works well on a variety of sequencing platforms



[NA18505]

MSB works well on array data too





wavelet

CLAC

GLAD

[Wang et al. Gen. Res ('09) 19:106]



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Looking for Aberrantly Placed Paired Ends





PEMer: Detecting Structural Variants from Discordant Paired Ends in Massive Sequencing

> [Korbel et al., Science ('07); Korbel et al., GenomeBiol. ('09)]



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Parameterize Error Models <u>through</u> Simulation

Reconstruction efficiency at different coverage **Deletion** size Reconstruction efficiency at 5x coverage by 2.5 kb inserts 1000 3 2000 11 49 3000 4000 80 5000 91 92 6000 88 10000 Total 414 False positives 5



[Korbel et al., GenomeBiol. ('09)]

Reconstruction of heterozygous <u>insertions</u>

5x coverage by 2.5 kb inserts		5x coverage by 10 kb inserts	
Insertion size	Reconstruction efficiency	Insertion size	Reconstruction efficiency
250	0	1000	8
500	1	2000	42
750	2	3000	72
1000	1	4000	69
1250	8	5000	61
1500	3	6000	55
1750	3	7000	37
2000	1	8000	23
2250	1	9000	4
2500	0	10000	1
2750	0		
3000	0		
False positives	4		4

Better coverage and fewer reads allow to relax cutoff on outlier lengths and reconstruct more insertions

[Korbel et al., GenomeBiol. ('09)]

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Local Reassembly



Optimal integration of sequencing technologies: Local Reassembly of large novel insertions

Given a fixed budget, what are the sequencing coverage A, B and C that can achieve the maximum reconstruction rate (on average/worst-case)? Maybe a few long reads can bootstrap reconstruction process.



Du et al. (2009), PLoS Comp Biol, in press

Optimal integration of sequencing technologies: *Need Efficient Simulation*

Different combinations of technologies (i.e. read lenghs) very expensive to actually test.

Also computationally expensive to simulate.

(Each round of whole-genome assembly takes >100 CPU hrs; thus, simulation exploring 1K possibilities takes 100K CPU hr)

C Simplification of the simulation to the insertion region only



Optimal integration of sequencing technologies: Efficient Simulation Toolbox using Mappability Maps



Optimal integration of sequencing technologies: *Efficient Simulation using A Simplified Assembler*

G Iterative contig elongation with the best supported extension



Du et al. (2009), PLoS Comp Biol, in press

Optimal integration of sequencing technologies: Simulation shows power of PEs

Simulation results w/ shotgun & paired-end reads on the same ~10Kb insertion



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Optimal integration of sequencing technologies: Simulation shows combination better than single technology



Analyzing Repeated Blocks in the Genome (SDs & CNVs)



SEGMENTAL DUPLCATIONS AND COPY NUMBER VARIANTS ARE RELATED PHENOMENA AND HAVE BEEN CREATED BY SEVERAL DIFFERENT MECHANISMS



NAHR

(Non-allelic homologous recombination)

Flanking repeat (e.g. Alu, LINE...)



NHEJ

(Non-homologous-endjoining)

No (flanking) repeats. In some cases <4bp microhomologies

PERFORM LARGE SCALE CORRELATION ANALYSIS TO DETECT REPEAT SIGNATURES OF SDs AND CNVs



OLDER SDs ARE MUCH MORE LIKELY TO BE FORMED BY ALU ELEMENTS



- The co-localization of Alu elements with SDs is highly significant.
- Older SDs have a much higher association with Alus than younger SDs.
- Hence it is likely, that Alu elements were more active in mediating NAHR in the past (consistent with the Alu burst)

FOCUSSING ON SDS: SDS CAN PROPAGATE THEMSELVES, WHICH LEADS TO A POWER-LAW DISTRIBUTION



Corollary

- SDs can mediate NAHR and lead to the formation of CNVs
- CNVs can become fixed and then be SDs
- Such mechanisms ("preferential attachment") are well studied in physics and should leads a very skewed ("power-law") distribution of SDs.



[Kim et al. Gen. Res. (submitted, '08), arxiv.org/abs/0709.4200v1]

FOCUSSING ON SDS: SDs COLOCALIZE WITH EACH OTHER



Corollary

- SDs can mediate NAHR and lead to the formation of CNVs
- CNVs can become fixed and then be SDs
- SDs of similar age should co-localize better with each other:



Pseudogenes & CNV/SDs (whole genome, not just encode pilot)



[Kim et al. Gen. Res. (submitted, '08), arxiv.org/abs/0709.4200v1]

CNVs ARE LESS

ASSOCIATIONS ARE DIFFERENT FOR SDs AND CNVs

ASSOCIATED WITH SD association with repeats **SDs THAN THE GENERAL SD TREND** 0.27 CNV 0.21 0.094 Association 0.07 with SDs Alu Microsatellite Pseudogenes LINE 0.31 (<0.001 (<0.001) (0.046) 0.001 0.11 **CNV** association with repeats 0.0739 0.048 0.0466 0.0006 >99% SDs* CNVs Microsatellite Pseudogenes LINE Alu < 0.001 0.92 0.046 0.001

[Kim et al. Gen. Res. ('08), arxiv.org/abs/0709.4200v1]



AFTER THE ALU BURST, THE **IMPORTANCE OF ALU ELEMENTS FOR GENOME** REARRANGEMENT DECLINED RAPIDLY

- About 40 million years ago there was a burst in retrotransposon activity
- The majority of Alu elements stem from that time
- This, in turn, led to rapid genome rearrangement via NAHR
- The resulting SDs, could create more SDs, but with Alu activity decaying, their creation slowed





Outline



 Calling Variable Blocks in Genome (CNVs,SDs)

Calling them with various signal processing approaches

 Analyzing Association of Variable Blocks with repeats, in relation to formation mechanisms

Signal Processing #2: Identifying Structural Variants in Human Population

- BreakPtr
 - Ø Model-based segmentation using bivariate HMM
- MSB
 - Mean-shift segmentation approach following grad. of PDF
 - Equally applied to aCGH and depth of coverage of short reads

- PEMer
 - Detecting Variants from discordantly placed pairedends
 - Simulation to paramaterize statistical model
- ReSeqSim
 - Efficiently simulating assembly of a representative variant
 - Shows that best reconstruction has a combination of long, med. and short reads

Analysis of Duplication in the Genome: SVs and SDs

- Large-scale analysis of existing CNVs & SDs in human genome
- SDs assoc. with Alu, pseudogenes and older SDs
- CNVs assoc. other repeats (microsat.) and not as much with SDs
- Suggestion: Alu burst 40 MYA triggered much NAHR rearrangement, then dupl. feed on itself in hotspots but now dying down and NAHR assoc. with other repeats and CNVs also from NHEJ

YK Lam J Du J Korbel L Wang P Kim A Abyzov M Snyder



GenomeTECH.gersteinlab.org

X Mu, D Greenbaum, A Urban, P Cayting, J Rozowsky, R Bjornson, S Weissman, Z Zhang, S Balasubramanian

More Information on this Talk

TITLE: Human Genome Annotation

SUBJECT: GenomeAssembly

DESCRIPTION:

IEEE International Conference on Bioinformatics & Biomedicine
(BIBM-2009), 2009.11.02, 15:45-16:15; [I:BIBM] (Short adaption of
GenomeTechAnnote talk, building on [I:UCSC] focusing just on SV
reconstruction and analysis, includes updates msb* . Takes 29' with
2 questions, or ~24' of talk time with sdcnvcorr* sect.)

(Works equally well on mac or PC. Paper references in the talk were mostly from Papers.GersteinLab.org. The above topic list can be easily cross-referenced against this website. Each topic abbrev. which is starred is actually a papers "ID" on the site. For instance, the topic **pubnet*** can be looked up at http://papers.gersteinlab.org/papers/pubnet)

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