Genome Structural Variation

Evan Eichler
Howard Hughes Medical Institute
University of Washington

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Genetic Variation

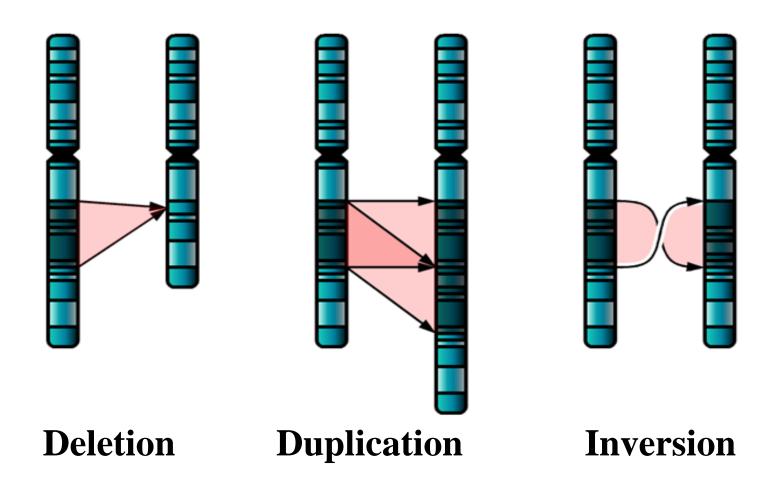
Types

Sequence

- Single base-pair changes point mutations
- Small insertions/deletions- frameshift, microsatellite, minisatellite
- Mobile elements—retroelement insertions (300bp -10 kb in size)
- Large-scale genomic variation (>1 kb)
 - Large-scale Deletions, Inversion, translocations
 - Segmental Duplications
- Chromosomal variation—translocations, inversions, fusions.

Cytogenetics

Genome Structural Variation



Introduction

• Genome structural variation includes copynumber variation (CNV) and balanced events such as inversions and translocations—originally defined as > 1 kbp but now >50 bp

Objectives

- 1. Genomic architecture and disease impact.
- 2. Detection and characterization methods
- 3. Primate genome evolution

Copy number polymorphism in Fcgr3 predisposes to glomerulonephritis in rats and humans

Timothy J. Aitman¹, Rong Dong¹*, Timothy J. Vyse²*, Penny J. Norsworthy¹*, Michelle D. Johnson¹, Jennifer Smith³, Jonathan Mangion¹, Cheri Roberton-Lowe^{1,2}, Amy J. Marshall¹, Enrico Petretto¹, Matthew D. Hodges¹, Gurjeet Bhangal³, Sheetal G. Patel¹, Kelly Sheehan-Rooney¹, Mark Duda^{1,3}, Paul R. Cook^{1,3}, David J. Evans³, Jan Domin³, Jonathan Flint⁴, Joseph J. Boyle⁵, Charles D. Pusey³ & H. Terence Cook⁵ Nature, 2006

The Influence of CCL3L1 Gene-**Containing Segmental Duplications** on HIV-1/AIDS Susceptibility

Enrique Gonzalez, 1* Hemant Kulkarni, 1* Hector Bolivar, 1*† Andrea Mangano, 2* Racquel Sanchez, 1 Gabriel Catano, 1 t Robert J. Nibbs, 3 Barry I. Freedman, 4 Marlon P. Quinones, 1 American P. Quinones, 1 Michael J. Bamshad, Krishna K. Murthy, Brad H. Rovin, William Bradley, 8,9 Robert A. Clark, Stephanie A. Anderson, 8,9 Robert J. O'Connell, 9,10 Brian K. Agan, 9,10 Seema S. Ahuja, Rosa Bologna, Luisa Sen, Luisa Sen, 2 Matthew J. Dolan, 9,10,12 Sunil K. Ahuja S

Discovery of previously unidentified genomic disorders from the duplication architecture of the human genome

Andrew J Sharp¹, Sierra Hansen¹, Rebecca R Selzer², Ze Cheng¹, Regina Regan³, Jane A Hurst⁴, Helen Stewart⁴, Sue M Price⁴, Edward Blair⁴, Raoul C Hennekam^{5,6}, Carrie A Fitzpatrick⁷, Rick Segraves⁸, Todd A Richmond², Cheryl Guiver³, Donna G Albertson^{8,9}, Daniel Pinkel⁸, Peggy S Eis², Stuart Schwartz⁷, Samantha J L Knight³ & Evan E Eichler¹ VOLUME 38 | NUMBER 9 | SEPTEMBER 2006 NATURE GENETICS

Association between Microdeletion and Microduplication at 16p11.2 and Autism

Lauren A. Weiss, Ph.D., Yiping Shen, Ph.D., Joshua M. Korn, B.S., Dan E. Arking, Ph.D., David T. Miller, M.D., Ph.D., Ragnheidur Fossdal, B.Sc., Evald Saemundsen, B.A., Hreinn Stefansson, Ph.D., Manuel A.R. Ferreira, Ph.D., Todd Green, B.S., Orah S. Platt, M.D., Douglas M. Ruderfer, M.S., Christopher A. Walsh, M.D., Ph.D., David Altshuler, M.D., Ph.D., Aravinda Chakravarti, Ph.D., Rudolph E. Tanzi, Ph.D., Kari Stefansson, M.D., Ph.D., Susan L. Santangelo, Sc.D., James F. Gusella, Ph.D., Pamela Sklar, M.D., Ph.D., Bai-Lin Wu, M.Med., Ph.D., and Mark J. Daly, Ph.D., for the Autism Consort N Engl | Med 2008:358:667-75

Rare chromosomal deletions and duplications increase risk of schizophrenia

The International Schizophrenia Consortium*

Nature 455:237-41 2008

Large recurrent microdeletions associated with Nature 455:232-6 2008 schizophrenia

Strong Association of De Novo Copy **Number Mutations with Autism**

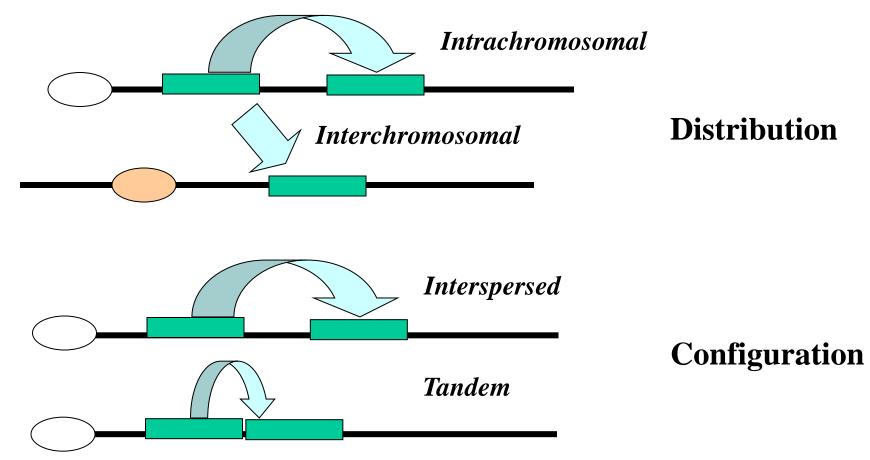
Jonathan Sebat, 1* B. Lakshmi, 1 Dheeraj Malhotra, 1* Jennifer Troge, 1* Christa Lese-Martin, 2 Tom Walsh, Boris Yamrom, Seungtai Yoon, Alex Krasnitz, Jude Kendall, Anthony Leotta, Deepa Pai, Ray Zhang, Yoon-Ha Lee, James Hicks, Sarah J. Spence, Annette T. Lee, Kaija Puura,⁶ Terho Lehtimäki,⁷ David Ledbetter,² Peter K. Gregersen,⁵ Joel Bregman,⁸ James S. Sutcliffe, Vaidehi Jobanputra, Wendy Chung, Dorothy Warburton, Mary-Claire King, David Skuse, Daniel H. Geschwind, T. Conrad Gilliam, Kenny Ye, 14 Michael Wigler 1

SCIENCE VOL 316 20 APRIL 2007

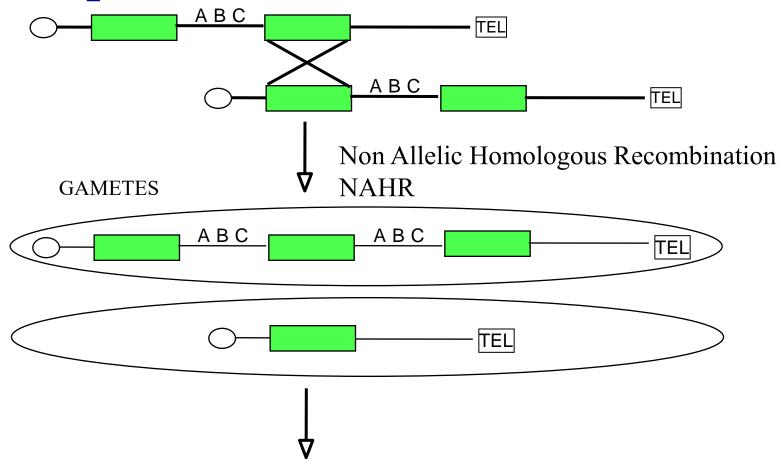
Hreinn Stefansson¹*, Dan Rujescu²*, Sven Cichon^{3,4}*, Olli P. H. Pietiläinen⁵, Andres Ingason¹, Stacy Steinberg¹, Pagabaidur Facedal 1 Engilbart Sigurdagan 6 Thardur Sigurndagan 6 Iacabina E Buizar Vactama 7

Perspective: Segmental Duplications (SD)

Definition: Continuous portion of genomic sequence represented more than once in the genome (>90% and > 1kb in length)—historical copy number variation

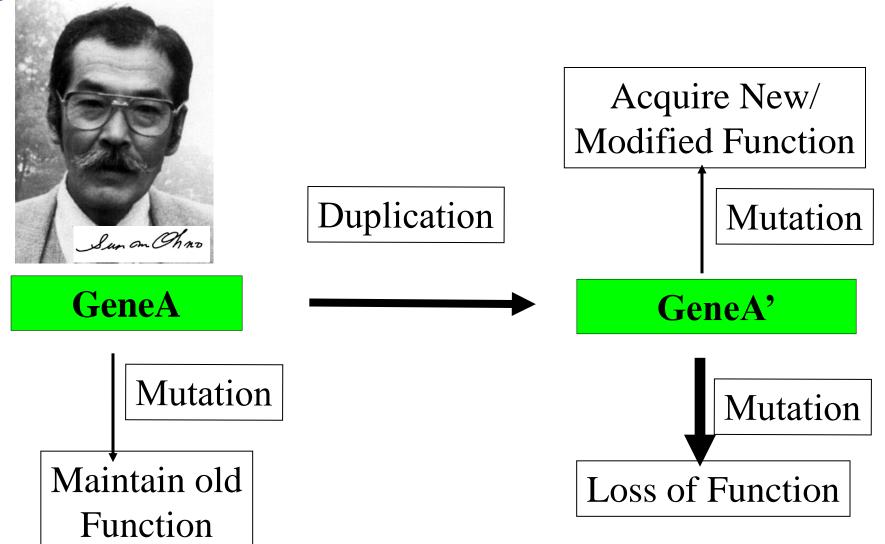


Importance: SDs promote Structural Variation

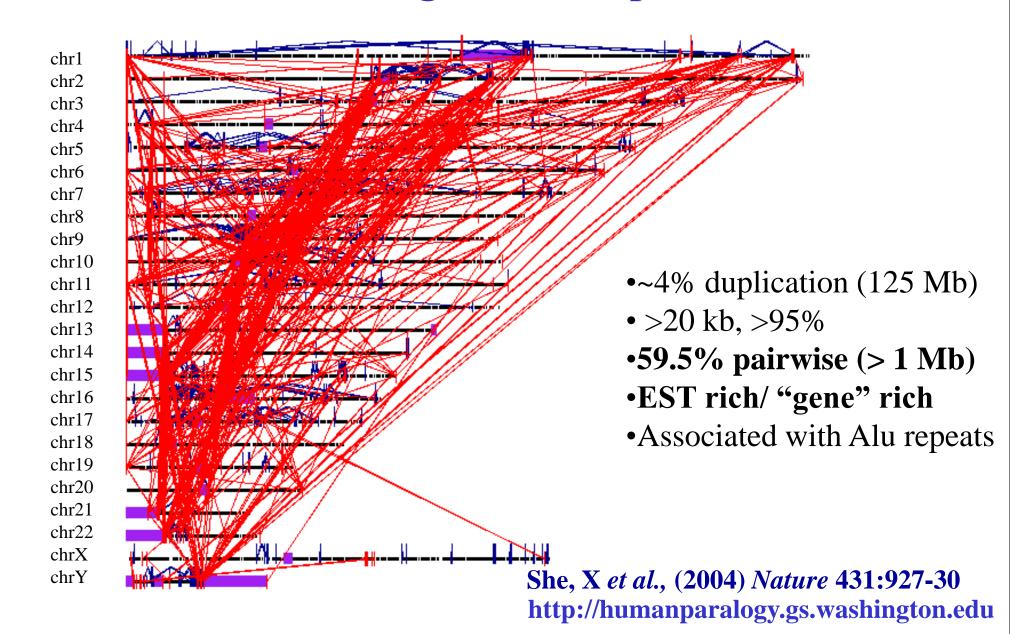


Human Disease
Triplosensitive, Haploinsufficient and Imprinted Genes

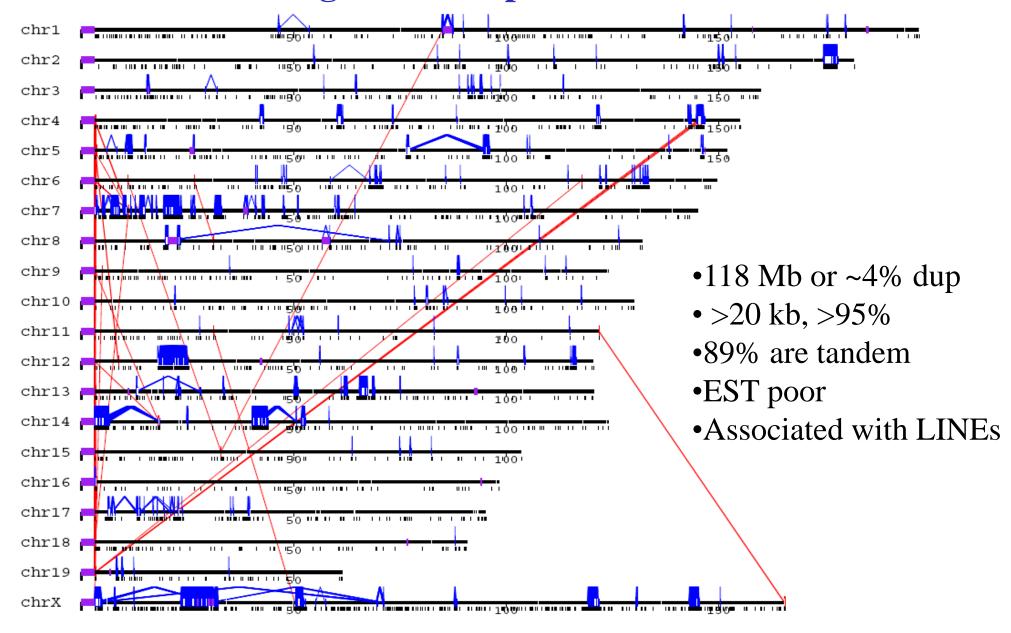
Importance: Evolution of New Gene Function



I. Human Genome Segmental Duplication Pattern



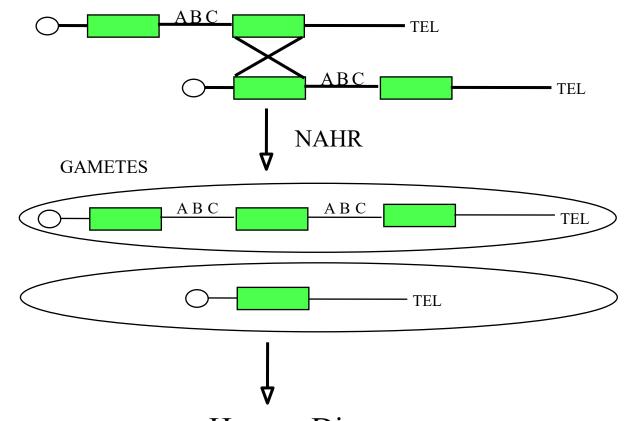
Mouse Segmental Duplication Pattern



Human Segmental Duplications Properties

- Large (>10 kb)
- Recent (>95% identity)
- Interspersed (60% are separated by more than 1 Mb)
- Modular in organization
- Difficult to resolve

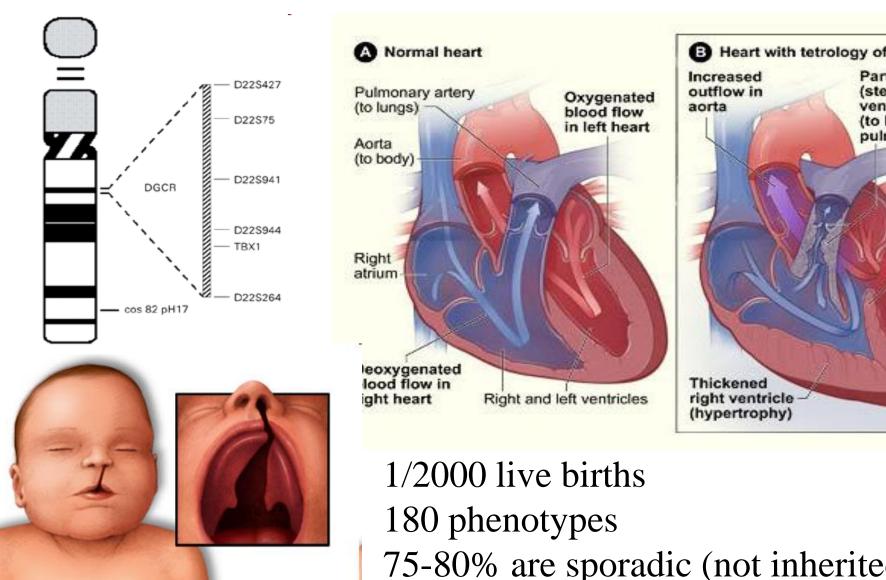
Rare Structural Variation & Disease

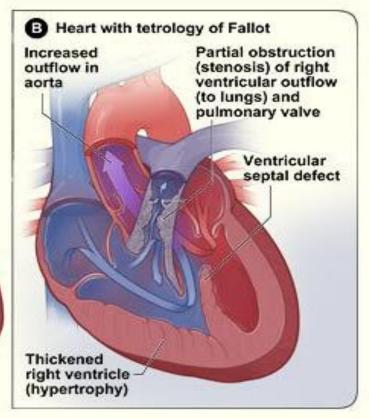


Human Disease
Triplosensitive, Haploinsufficient and Imprinted Genes

•Genomic Disorders: A group of diseases that results from genome rearrangement mediated mostly by non-allelic homologous recombination. (*Inoue & Lupski*, 2002).

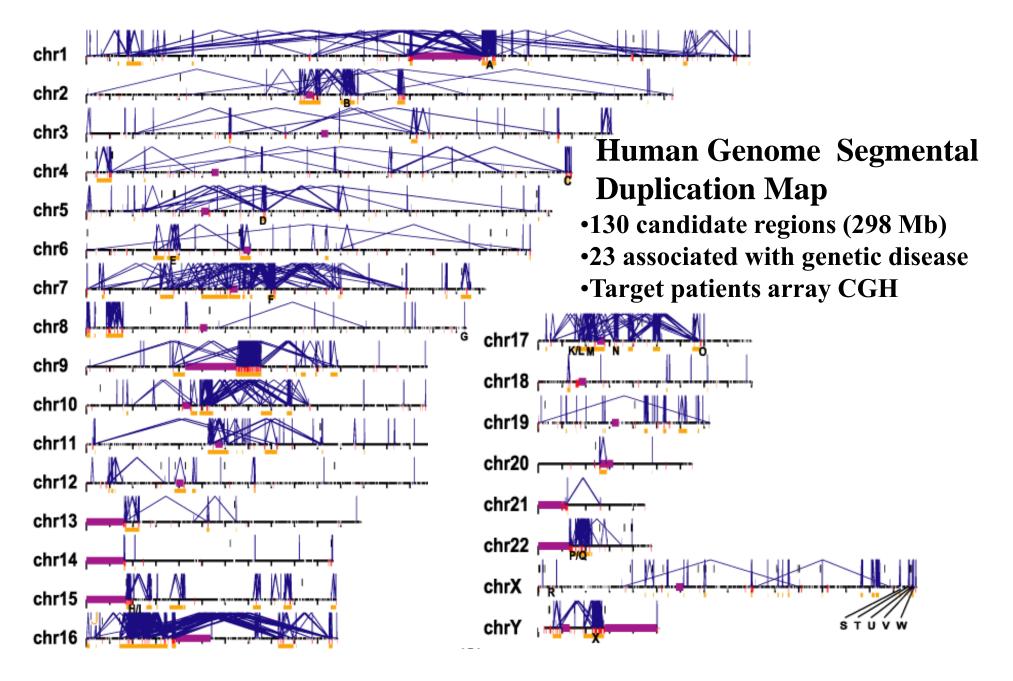
DiGeorge/VCFS/22q11 Syndrome





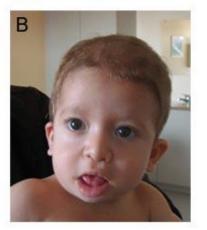
75-80% are sporadic (not inherited)

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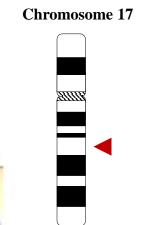
Bailey et al. (2002), Science







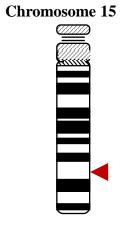




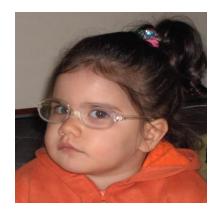




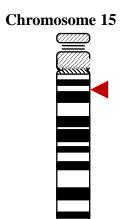






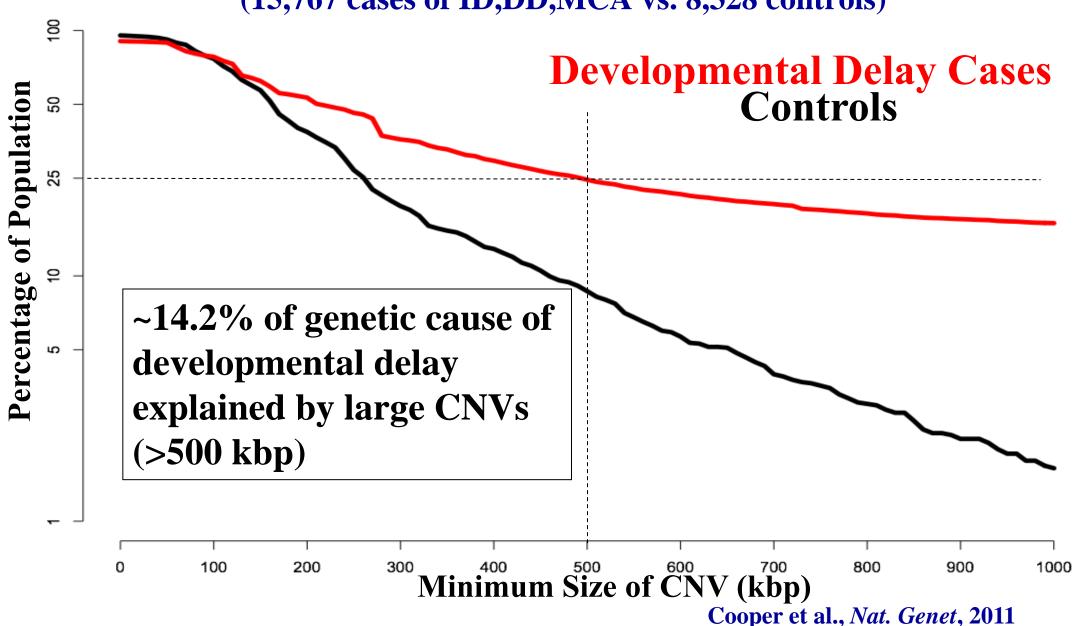




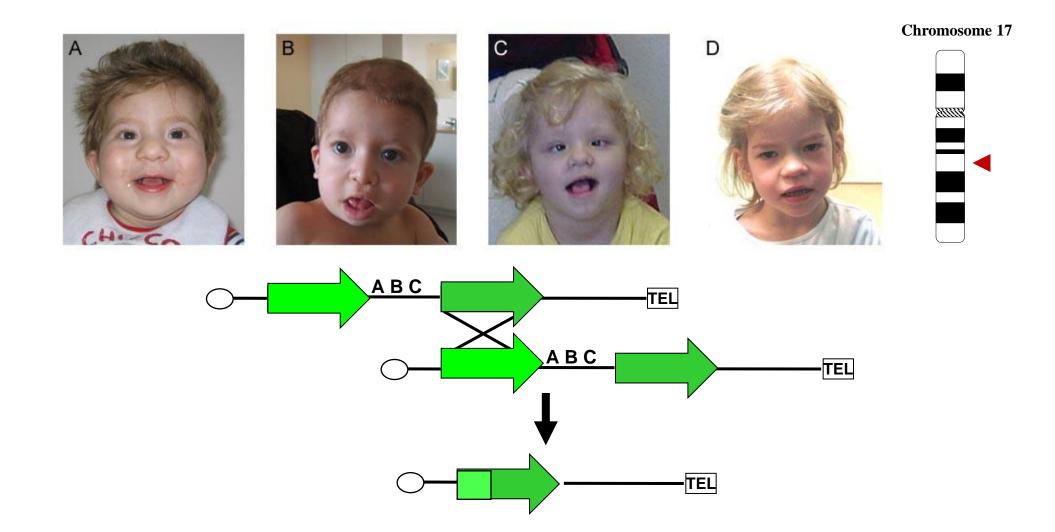


Genome Wide CNV Burden

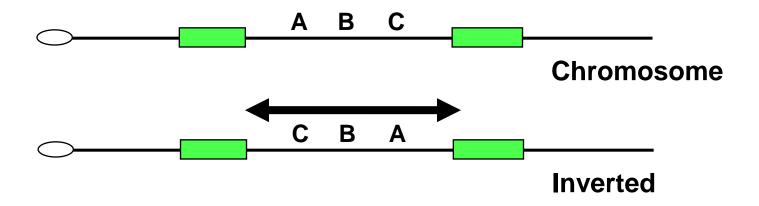
(15,767 cases of ID,DD,MCA vs. 8,328 controls)



Common and Rare Structural Variation are Linked 17q21.31 Deletion Syndrome

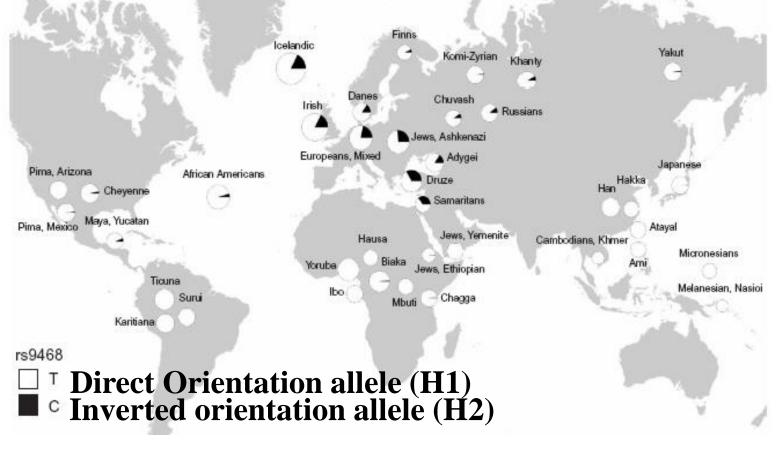


17q21.31 Inversion



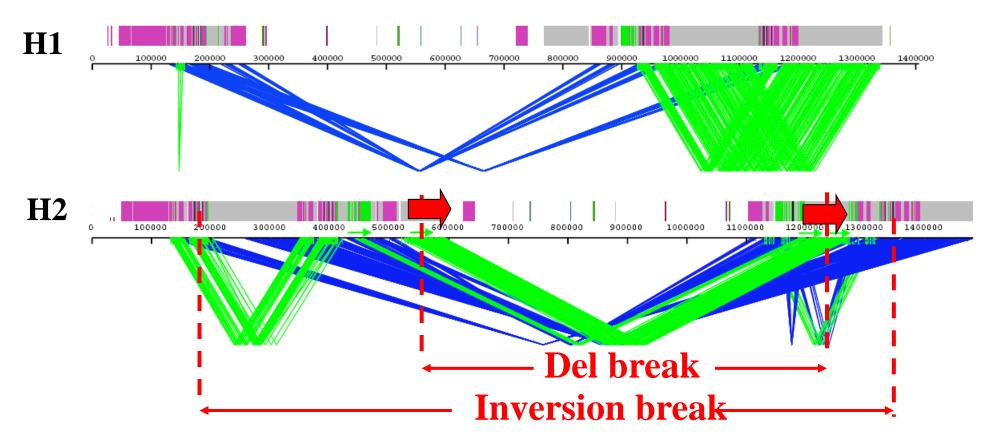
- Region of recurrent deletion is a site of common inversion polymorphism in the human population
- Inversion is largely restricted to Caucasian populations
 - 20% frequency in European and Mediterranean populations
- Inversion is associated with increase in global recombination and increased fecundity

b A Common Inversion Polymorphism



- •Tested 17 parents of children with microdeletion and found that every parent within whose germline the deletion occurred carried an inversion
- •Inversion polymorphism is a risk factor for the microdeletion event

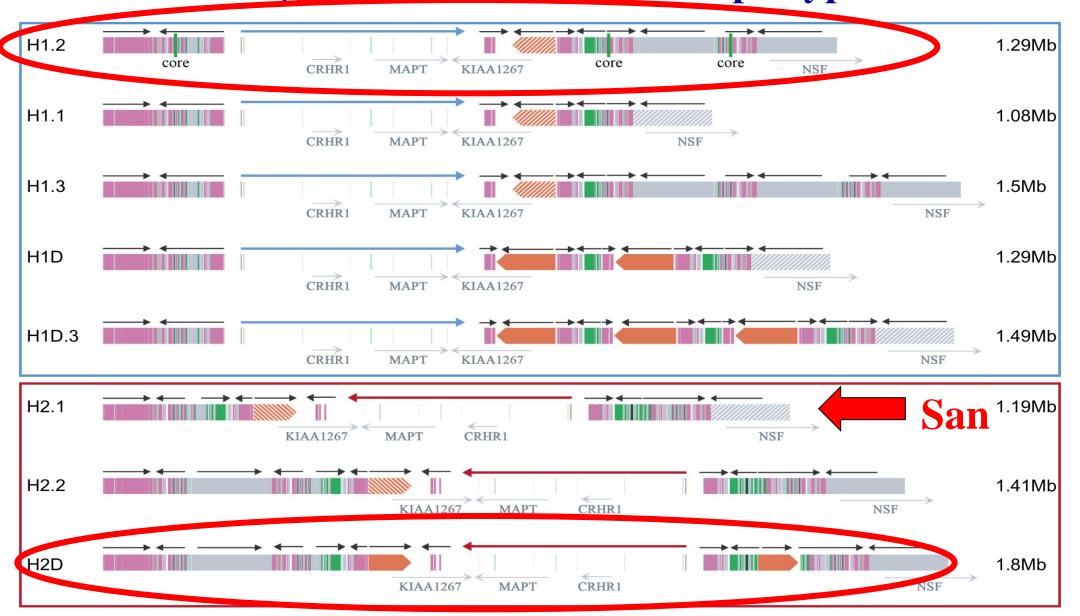
Duplication Architecture of 17q21.31 Inversion (H2) vs. Direct (H1) Haplotype

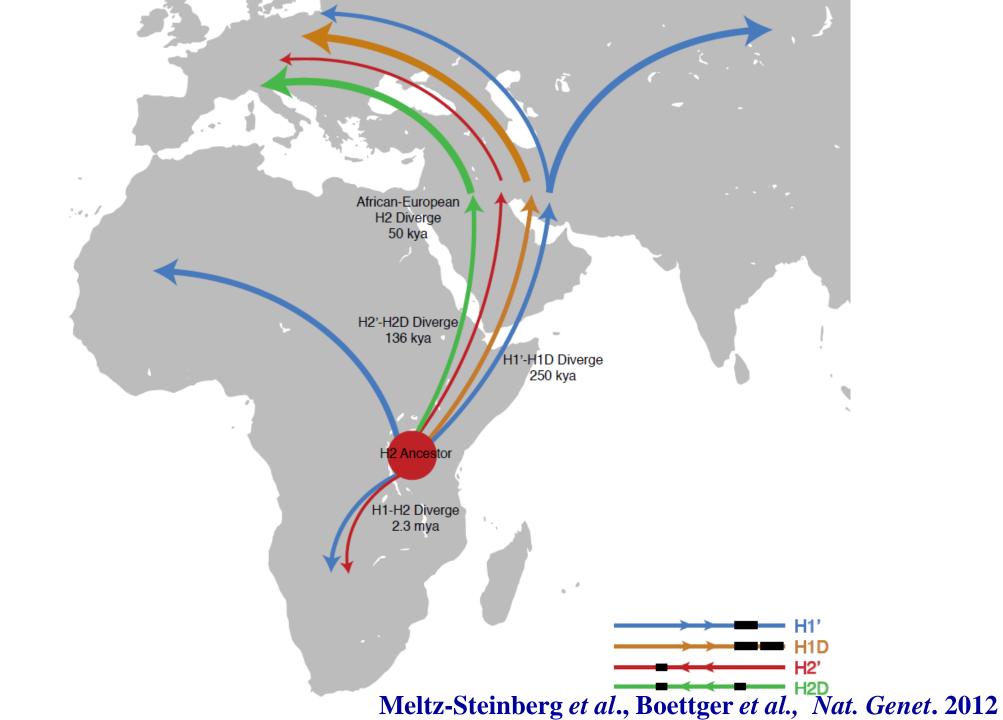


- •Inversion occurred 2.3 million years ago and was mediated by the LRRC37A core duplicon
- •H2 haplotype acquired human-specific duplications in direct orientation that mediate rearrangement and disrupts *KANSL1* gene

Zody et al., Nat. Genet. 2008, Itsara et al., Am J. Human Genet 2012

Structural Variation Diversity Eight Distinct Complex Haplotypes





Summary

- Human genome is enriched for segmental duplications which predisposes to recurrent large CNVs during germ-cell production
- 15% of neurocognitive disease in intellectual disabled children is "caused" by CNVs—8% of normals carry large events
- Segmental Duplications enriched 10-25 fold for structural variation.
- Increased complexity is beneficial and deleterious: Ancestral duplication predisposes to inversion polymorphism, inversion polymorphisms acquires duplication, haplotype becomes positively selected and now predisposes to microdeletion

II. Genome-wide SV Discovery Approaches

Hybridization-based

- Iafrate et al., 2004, Sebat et al., 2004
- SNP microarrays: McCarroll *et al.*, 2008, Cooper *et al.*, 2008, Itsara *et al.*, 2009
- Array CGH: Redon et al. 2006,
 Conrad et al., 2010, Park et al.,
 2010, WTCCC, 2010

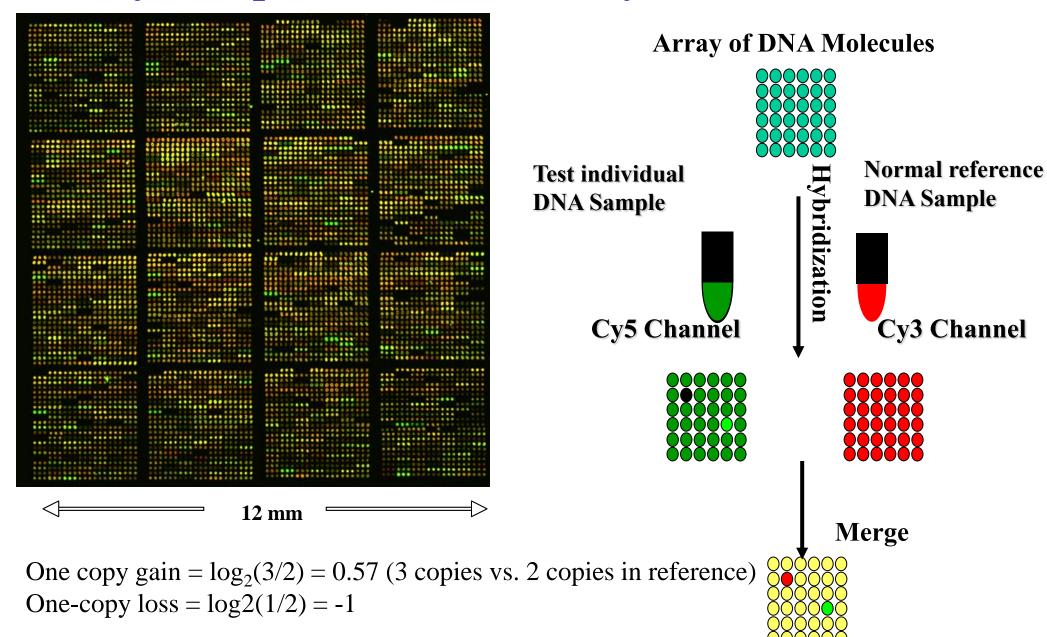
Single molecule mapping

• **Optical mapping:** Teague et al., 2010

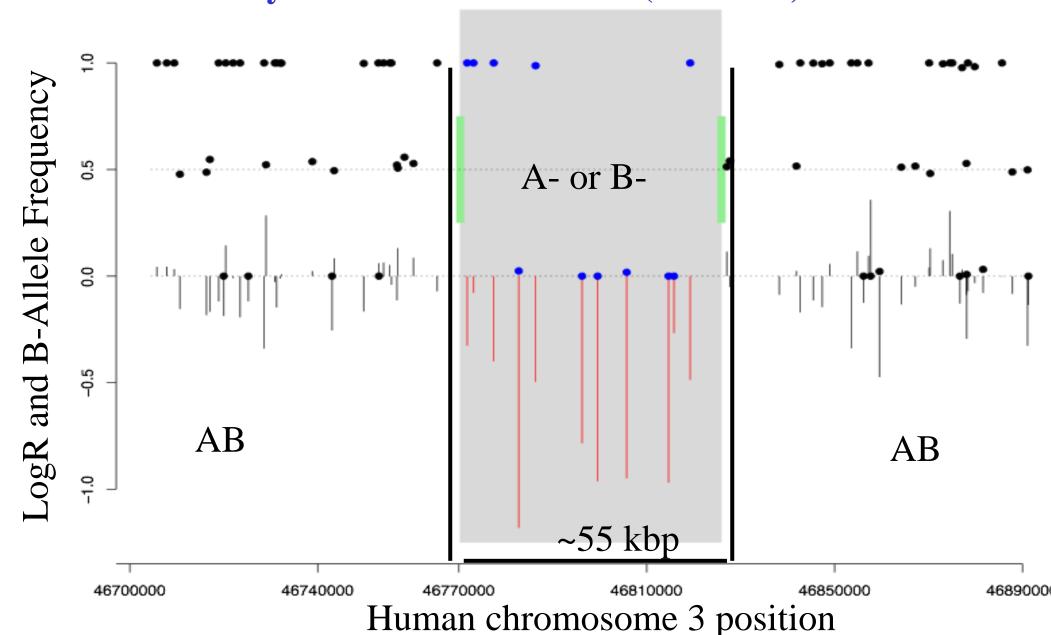
Sequencing-based

- Read-depth: Bailey et al, 2002
- Fosmid ESP: Tuzun et al. 2005,
 Kidd et al. 2008
- Sanger sequencing: Mills *et al.*, 2006
- Next-gen sequencing: Korbel et al. 2007, Yoon et al., 2009,
 Alkan et al., 2009, Hormozdiari et al. 2009, Chen et al. 2009;
 Mills 1000 Genomes Project,
 Nature, 2011, Sudmant 2015
- 3rd generation --long-reads: Chaisson et al., 2015

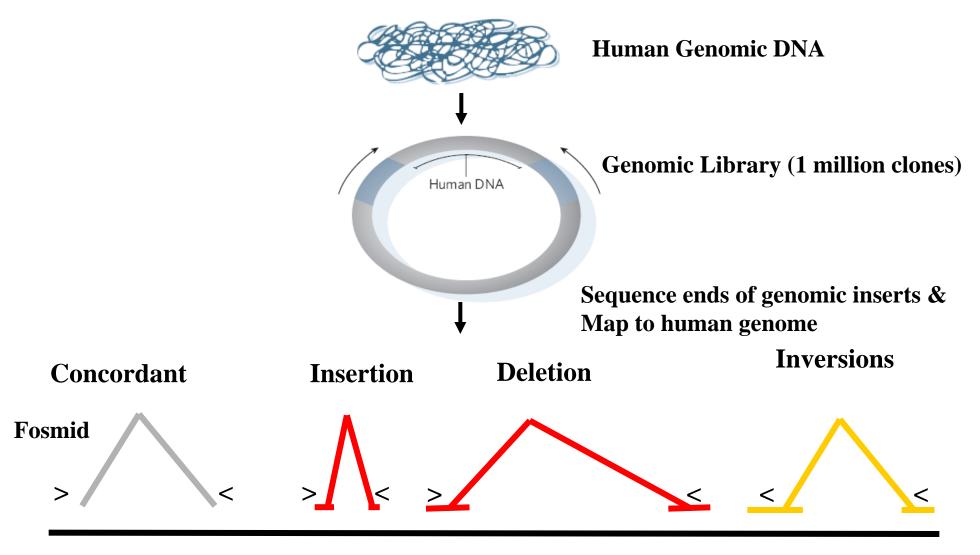
Array Comparative Genomic Hybridization



SNP Microarray detection of Deletion (Illumina)



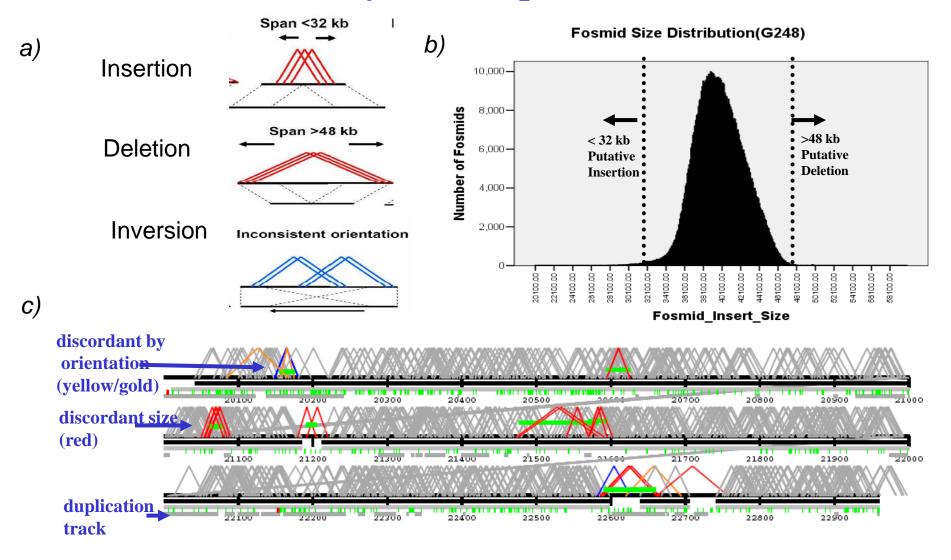
Using Read Pairs to Resolve Structural Variation



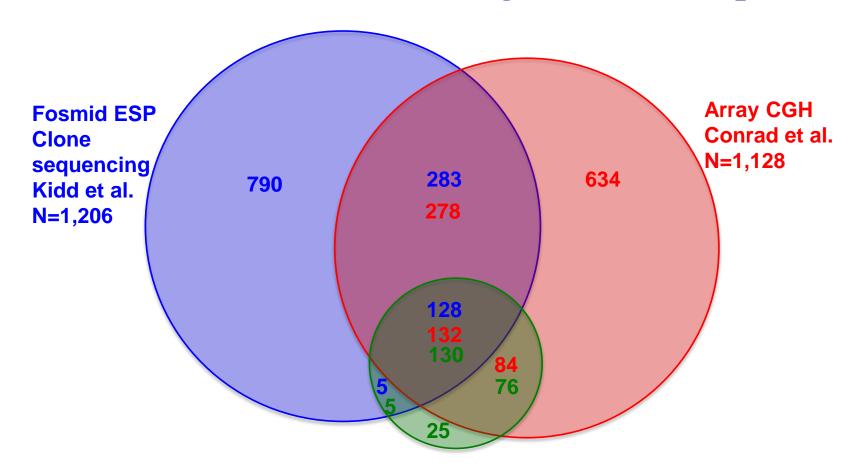
Build35

Dataset: 1,122,408 fosmid pairs preprocessed (15.5X genome coverage) 639,204 fosmid pairs BEST pairs (8.8 X genome coverage)

Genome-wide Detection of Structural Variation (>8kb) by End-Sequence Pairs



Experimental Approaches Incomplete (Examined 5 identical genomes > 5kbp)



McCarroll et al. N=236 Affymetrix 6.0 SNP Microarray

Next-Generation Sequencing Methods

Read pair analysis

- Deletions, small novel insertions, inversions, transposons
- Size and breakpoint resolution dependent to insert size

Read depth analysis

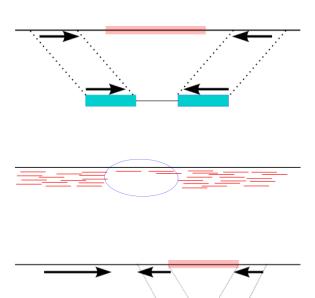
- Deletions and duplications only
- Relatively poor breakpoint resolution

• Split read analysis

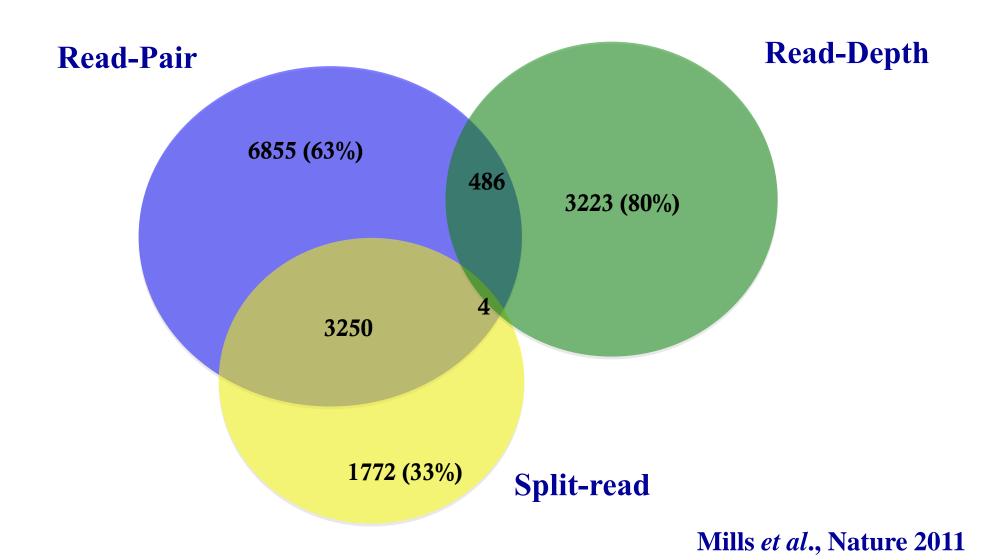
- Small novel insertions/deletions, and mobile element insertions
- 1bp breakpoint resolution

Local and de novo assembly

- SV in unique segments
- 1bp breakpoint resolution



Computational Approaches are Incomplete 159 genomes (2-4X) (deletions only)

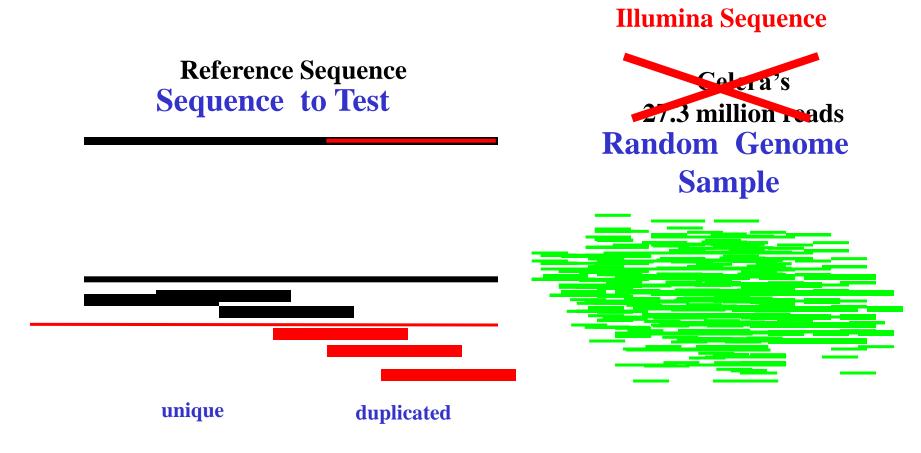


Challenges

- Size spectrum—>5 kbp discovery limit for most experimental platforms; NGS can detect much smaller but misses events mediated by repeats.
- Class bias: deletions>>>duplications>>>>balanced events (inversions)
- Multiallelic copy number states—incomplete references and the complexity of repetitive DNA
- False negatives.

Using Sequence Read Depth

- Map whole genome sequence to reference genome
 - Variation in copy number correlates linearly with read-depth
- Caveat: need to develop algorithms that can map reads to all possible locations given a preset divergence (eg. mrFAST, mrsFAST)



Personalized Duplication or Copy-Number Variation Maps Segmental Dups Celera WSSD Celera WSSD Venter Depth Cover Venter (Sanger) 150 -200 -250 -CNP#1 300 -Watson Depth Coverage **Watson (454)** 150 -200 -250 -300 -NA12878 Depth Coverage 1000 -1500 NA12878 (Solexa) 2500 -3000 -NA12891 Depth Coverage 1000 **NA12891** (Solexa) 1500 NA12892 Depth Coverage 1000 -1500 -**NA12892** (Solexa) 2500 -3000 -4000 NA12878_1t826 NA12878_1t826 UCSC Known Genes (June, Based on UniProt, RefSeq, and GenBank mRNA FLJ22955 ##+++ HI\$1 | ARHGAP27 (##4) CRHR1 (H) Lbc201175 | AB011135 GOSR2 H CRHR1 | HIN FMNL1 PLEKHM1 (HILLIH L00284958 #k##+ LRRC37A # HI FLJ25414 H

ACBD4 ⊪

ACBD4 ⊪

AK897219 k

•Two known ~70 kbp CNPs, CNP#1 duplication absent in Venter but predicted in Watson and NA12878, CNP#2 present mother but neither father or child

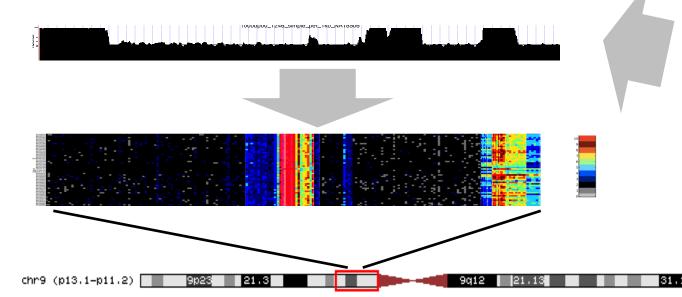
GOSR2 H

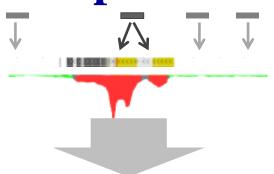
AF119889 keekk

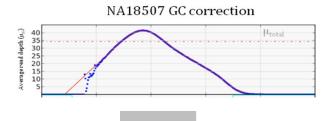
BC041803 ##

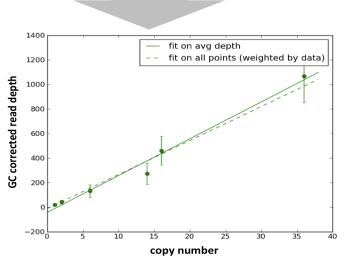
Copy number from short read depth

- Map reads to reference with *mrsFAST*
 - Records <u>all</u> placements for each read
 - http://mrsfast.sourceforge.net
- Per-library QC, (G+C)-bias correction
- Train estimator using depths at regions of known, invariable copy
- 1 kbp-windowed CN genomewide heatmap

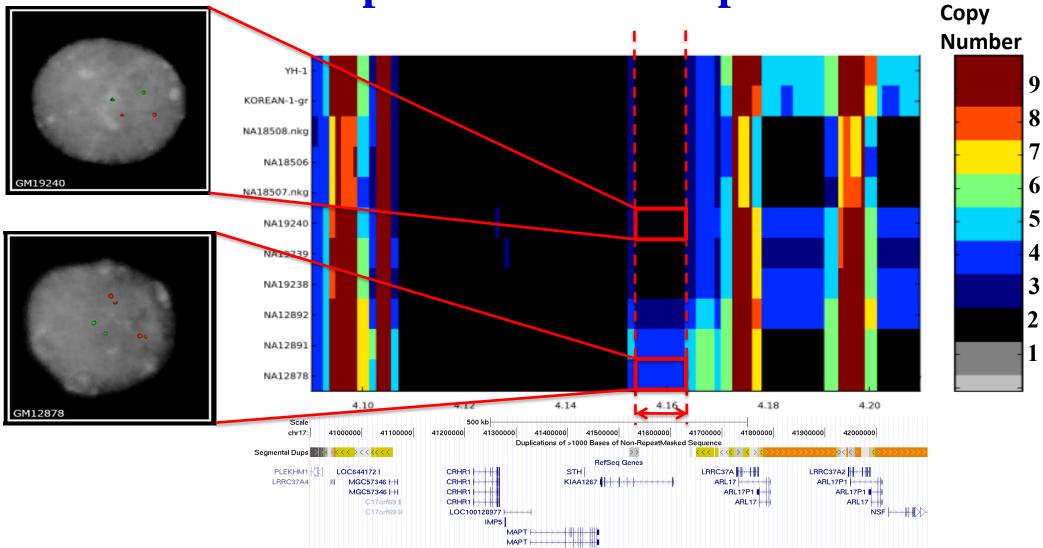






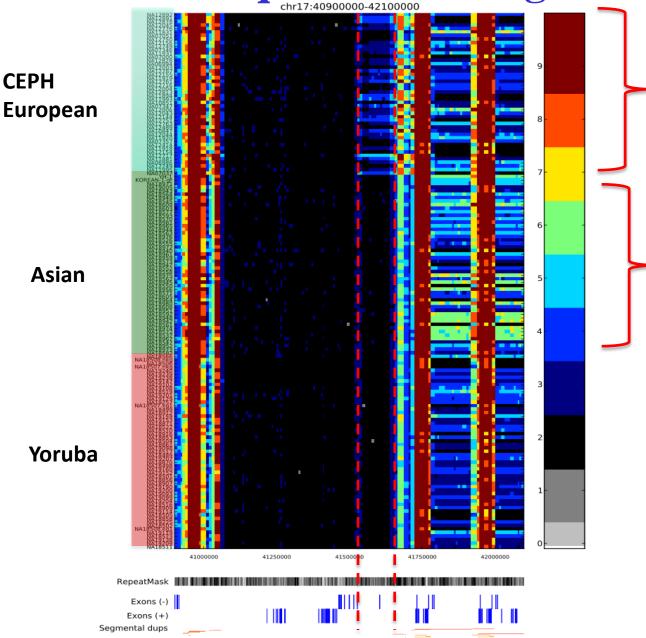


Interphase FISH Read-Depth CNV Heat Maps vs. FISH



- •72/80 FISH assays correspond precisely to read-depth prediction (>20 kbp)
- •80/80 FISH assays correspond precisely to+/- 1 read-depth prediction

17q21 MAPT Region for 150 Genomes



71% of Europeans carry at least Partial duplication distal (17q21 associated)—all inversions carry the duplication

24% of Asians are hexaploid for NSF gene N-ETHYLMALEIMIDE-SENSITIVE FACTOR potentially important in synapse membrane fusion; NSF (decreased expression in schizophrenia brains (Mimics, 2000), Drosophila mutants results in aberrant synaptic transmission)

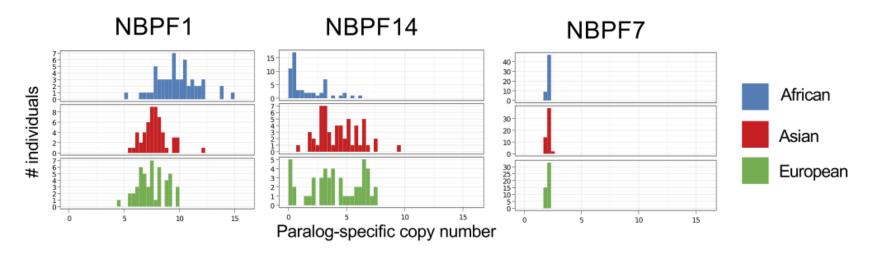
Sudmant et al., 2010, Science

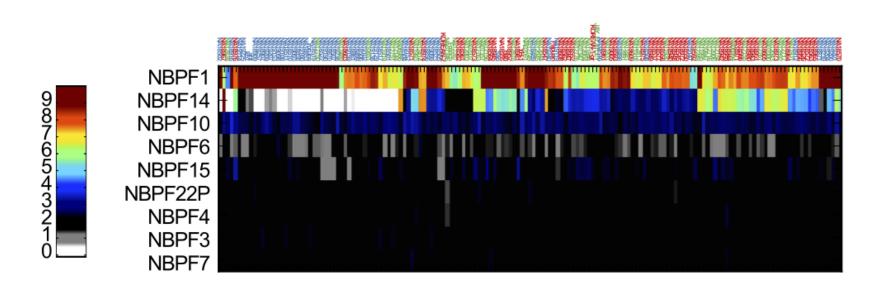
Unique Sequence Identifiers Distinguish Copies

COPY1 ATGCTAGGCATATAATATCCGACGATATACATATAGATGTTAG...
COPY2 ATGCTAGGCATAGAATATCCGACGATATACATATACATGTTAG...
COPY3 ATGCTACGCATAGAATATCCCACGATATACATATACATGTTAG...
COPY4 ATGCTACGCATATAATATCCGACGATATAC—ATACATGTTAG.

- Self-comparison identifies 3.9 million singly unique nucleotide (SUN) identifiers in duplicated sequences
- Select 3.4 million SUNs based on detection in 10/11 genomes=informative SUNs=paralogous sequence variants that are largely fixed
- Measure read-depth for specific SUNs--genotype copy-number status of specific paralogs

NBPF Gene Family Diversity



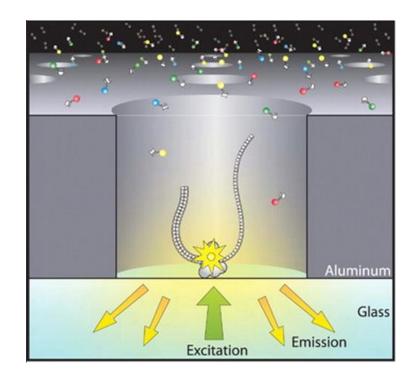


Going Forward

- 1) Focus on comprehensive assessment of genetic variation—large portions of human genetic variation are still missed
- 2) Current NGS methods are indirect and do not resolve structure but provide specificity and excellent dynamic range response.
- 3) High quality sequence resolution of complex structural variation to establish alternate references/haplotypes—often show extraordinary differences in genetic diversity
- 4) Technology advances in whole genome sequencing "Third Generation Sequencing": Long-read sequencing technologies with NGS throughput in order to sequence and assemble regions and genomes *de novo*

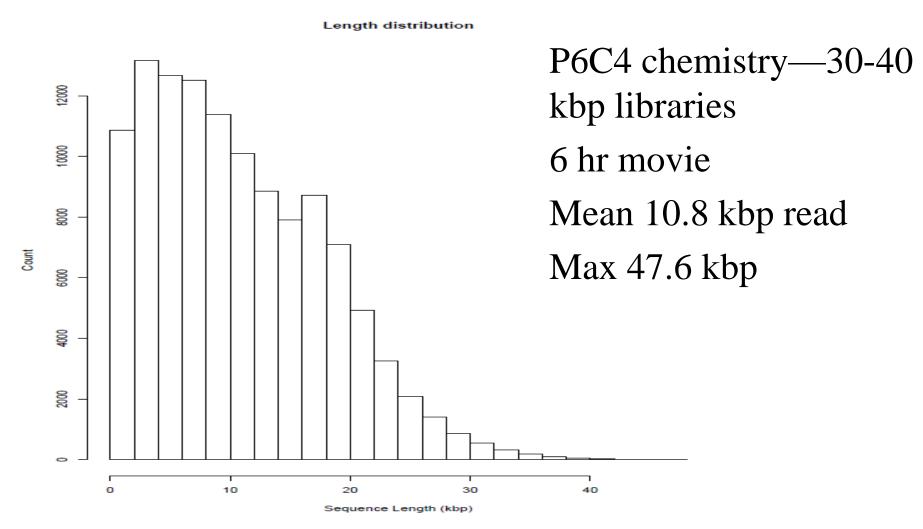
Single-Molecule Real-Time Sequencing (SMRT)



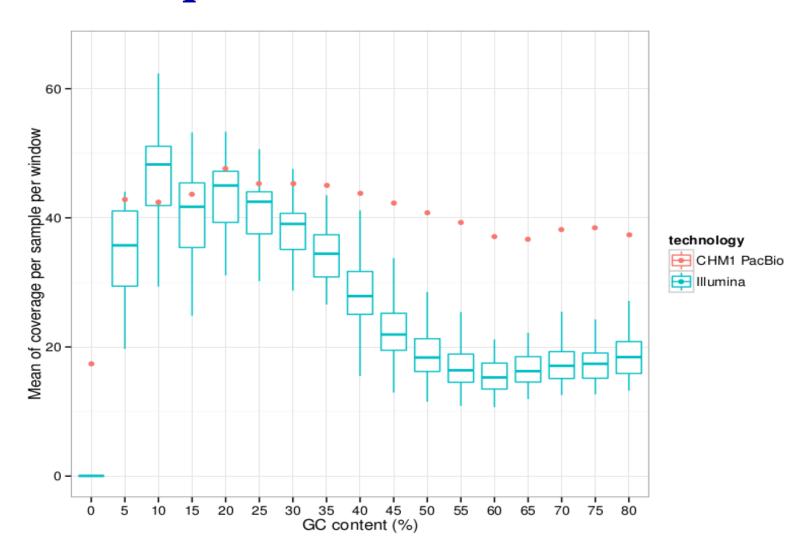


Long reads no cloning or amplification but lower throughput and 15% error rate

PacBio Sequence Reads are long



PacBio Sequence Reads are Uniform

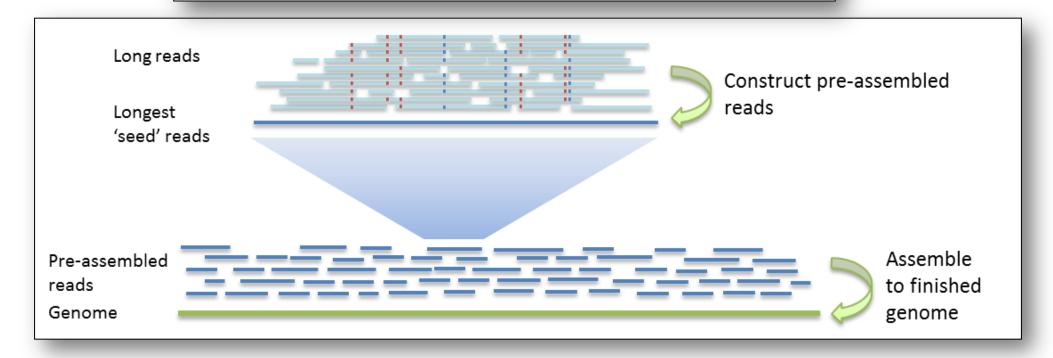


Algorithms: HGAP and QUIVER

ARTICLES

Nonhybrid, finished microbial genome assemblies from long-read SMRT sequencing data

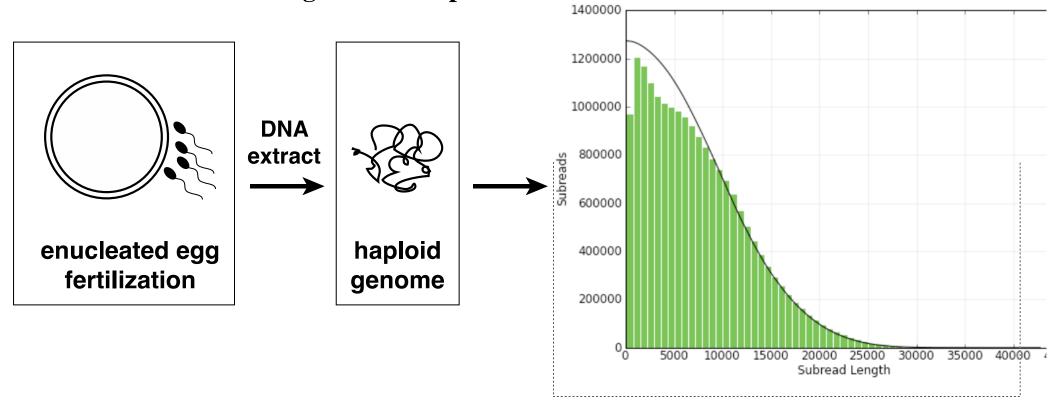
Chen-Shan Chin¹, David H Alexander¹, Patrick Marks¹, Aaron A Klammer¹, James Drake¹, Cheryl Heiner¹, Alicia Clum², Alex Copeland², John Huddleston³, Evan E Eichler³, Stephen W Turner¹ & Jonas Korlach¹



https://github.com/PacificBiosciences/Bioinformatics-Training/wiki/HGAP

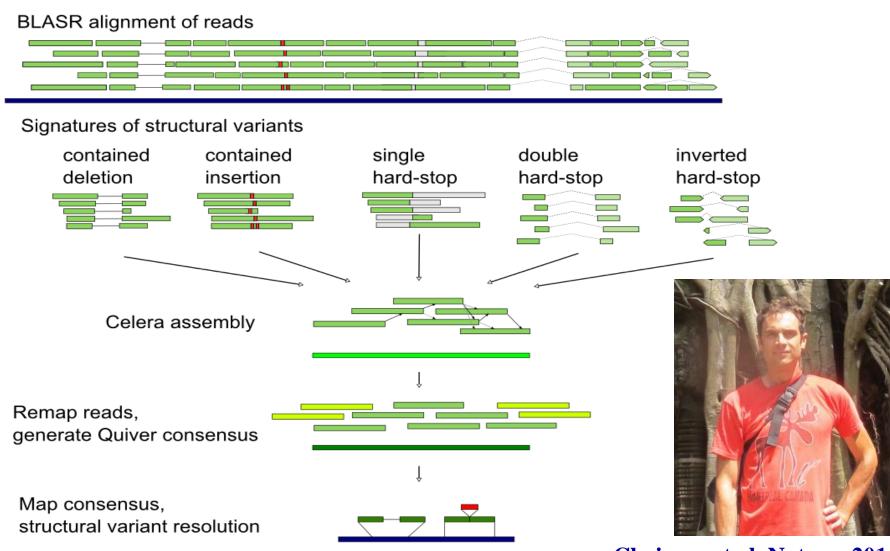
PacBio Whole Genome Sequencing

- CHM1—complete hydatidiform mole (CHM1)- "Platinum Genome Assembly"
- 45.8X Sequence coverage using RSII P5/C3 chemistry
- SMRT read lengths of ~9 kbp with 15% error.



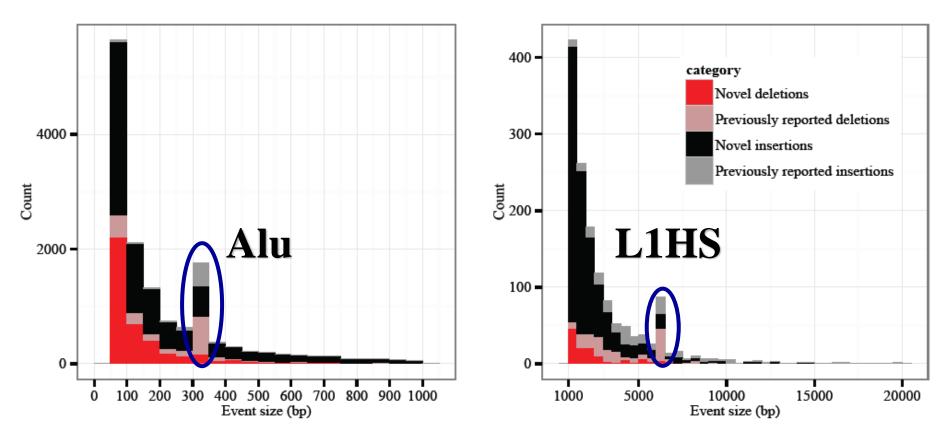
SMRT-SV

Structural Variation Detection using PacBio



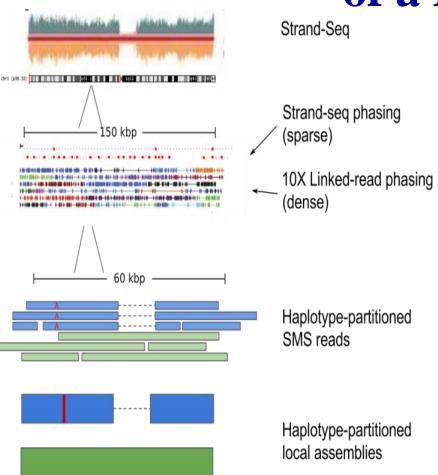
Chaisson et al, Nature, 2015

Increased Resolution of Structural Variation



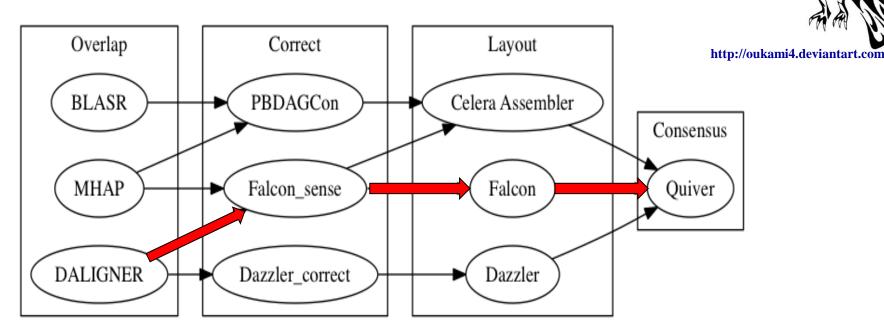
92% of insertions and 60% deletions (50- 5,000 bp) are novel **22,112 novel genetic variants corresponding to 11 Mbp of sequence** 6,796 of the events map within 3,418 genes 169 within coding sequence or UTRs of genes

Phased-SV: Comprehensive SV Detection of a Diploid



- Strand-seq and 10-X linked read data are used to phase 70% of all PacBio Reads
- SVs are called using haplotype-type partitioned reads that are locally assembled
- 3-fold increase in sensitivity compared to 11-Illumina callers (30,000 vs. 11,000 events)

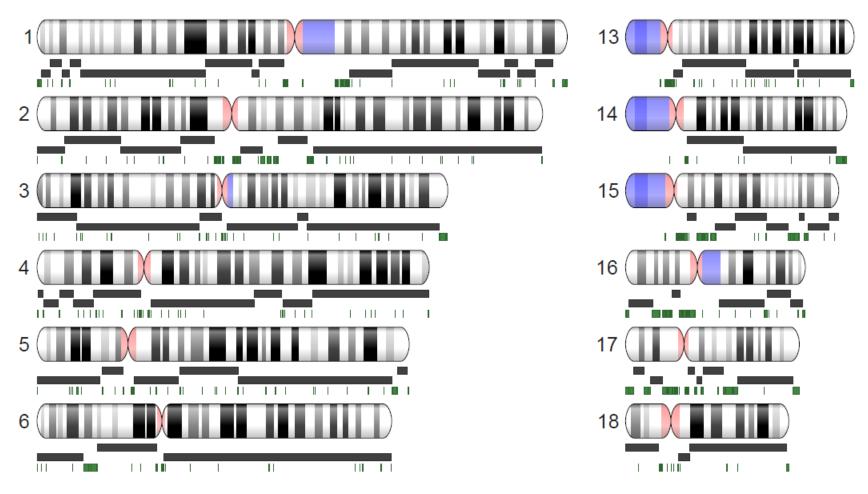
Falcon SMRT Genome Assembly



The stages of single-molecule sequencing assembly

- two phases: long reads are corrected and overlapped to generate a string graph—third phase "repeat unitig bridging"
- By Jason Chin http://github.com/PacificBiosciences/FALCON

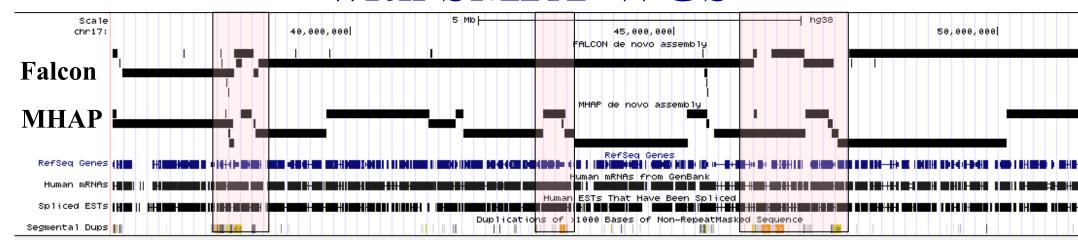
CHM1 Human Genome Assembly



- 67 X sequence coverage— Contig N50 27. 9 Mbp
- 3,777 Contigs

Chin et al, unpublished

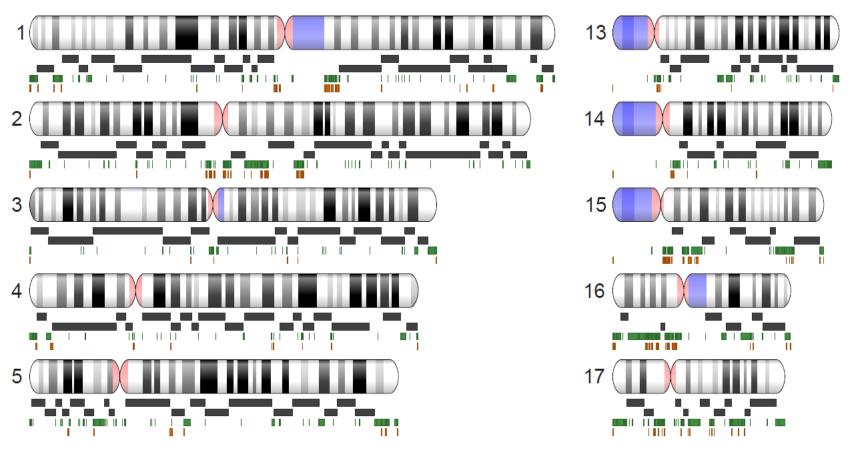
Future: *De novo* Human Genome Assembly with SMRT WGS



- 125/167 Mbp of SD unresolved
- Contigs shatter over segmental duplications because 20 kbp reads are still not long enough.



SMRT Gorilla Genome Assembly

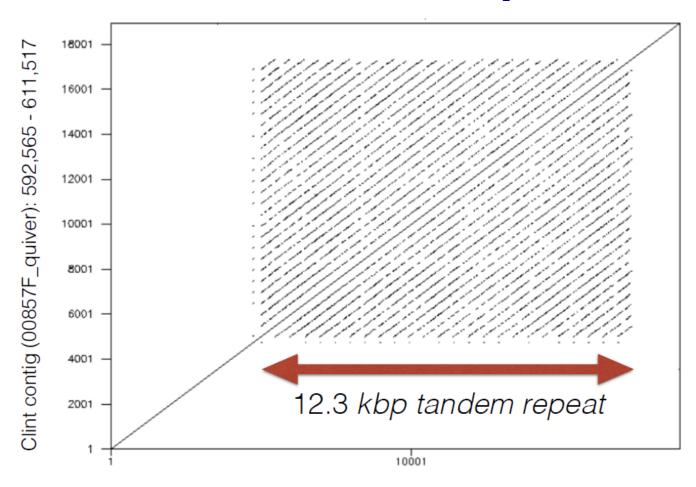


- 71.7 X sequence coverage
- average contig N50 = 9.6 Mbp
- assembly size 3.1 Gbp

- 16,073 contigs
- 911 >= 100 kbp

Gordon et al, Science, 2016

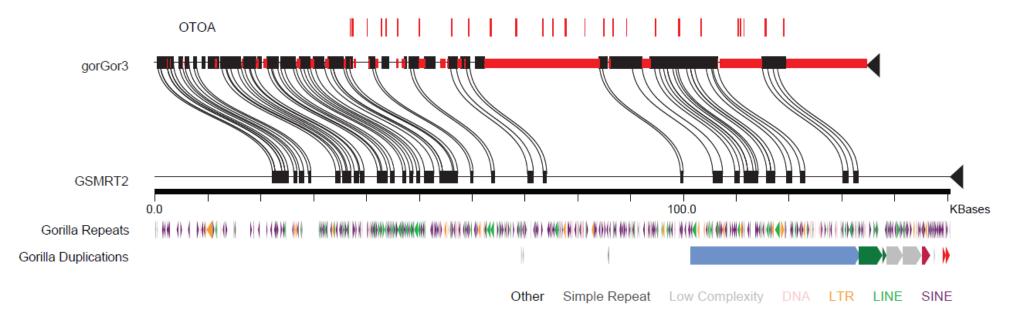
Gorilla Genome Gap Closure



Clint contig (00857F_quiver): 592,565 - 611,517

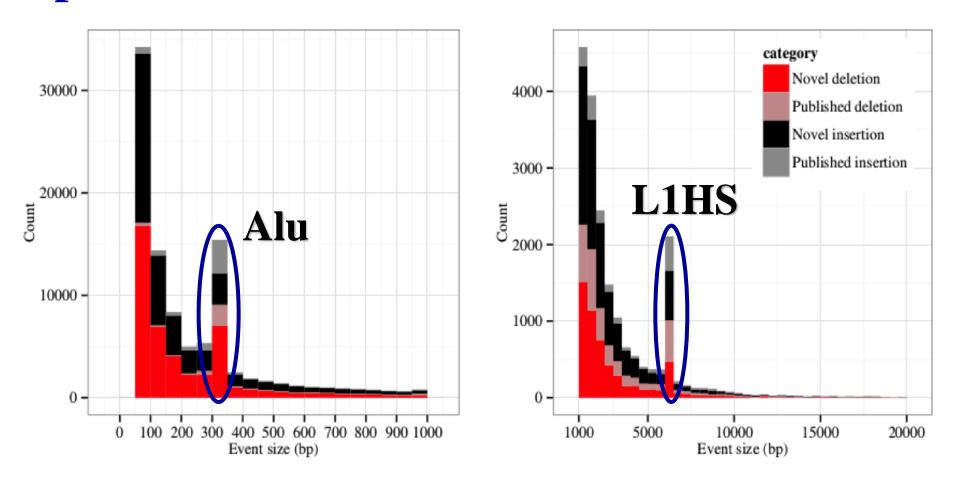
• 180 Mbp corresponding to 92% of euchromatic gaps in gorGor3 were closed. (399,243/433,861 closed gaps)

Complete Gorilla Gene Models



- Recovered 10,779 of 12,757 (84.5%) exons mapping within the gap regions (based on Human RefSeq models
- Estimate 3,269/3,697 (88%) of gorilla models resolved
- 8-9% of additional gorilla RNA-seq data maps to GSMRT3

Ape-Human Structural Variation Resolution

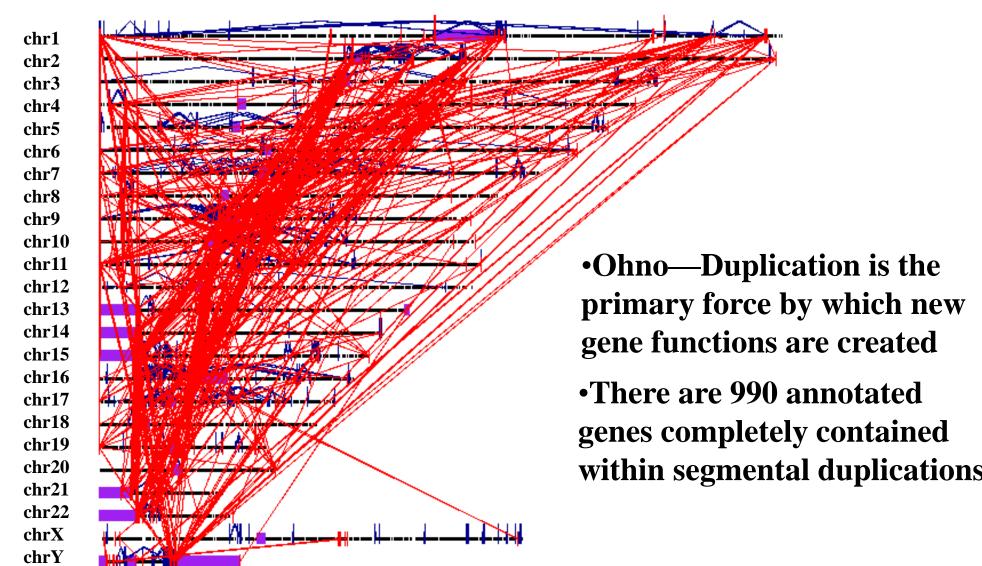


86% (101,109) of gorilla structural variants not previously reported—new insights into the evolution of our species

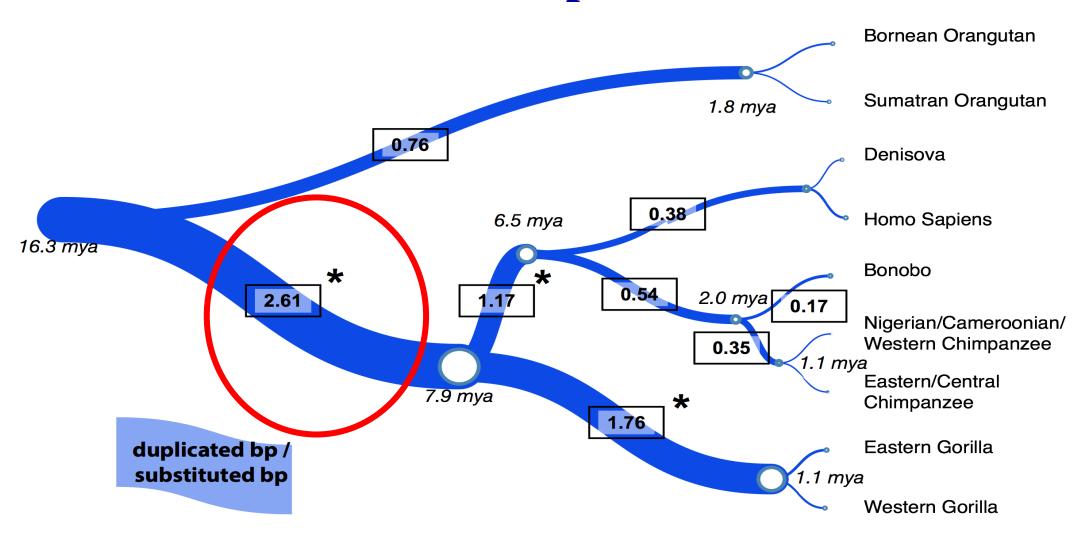
Summary

- Approaches
 - Multiple methods need to be employed—Readpair+Readdepth+SplitRead and an experimental method
 - Tradeoff between sensitivity and specificity
 - Complexity not fully understood
- Read-pair and read-depth NGS approaches
 - narrow the size spectrum of structural variation
 - lead to more accurate prediction of copy-number
 - unparalleled specificity in genotyping duplicated genes (reference genome quality key)
- Third generation sequencing methods hold promise but require high coverage—still expensive. *Sequel*?

III. Why?

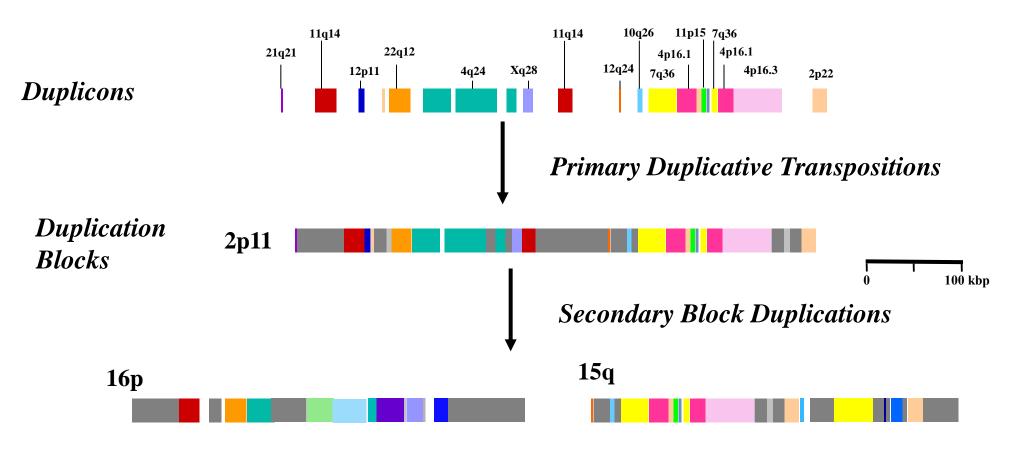


Rate of Duplication



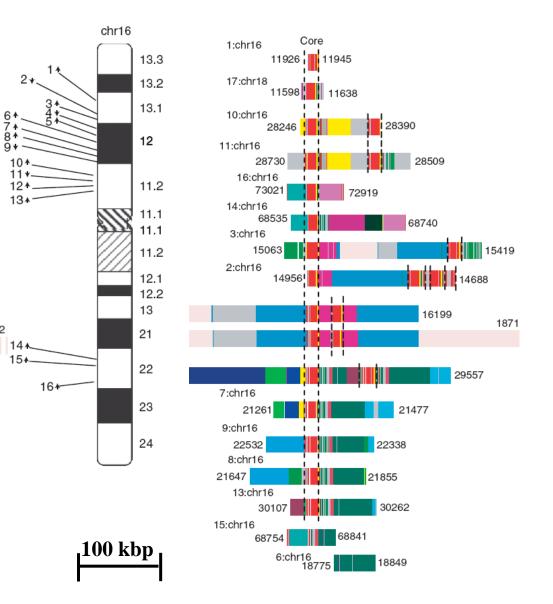
p=9.786 X 10⁻¹²

Mosaic Architecture



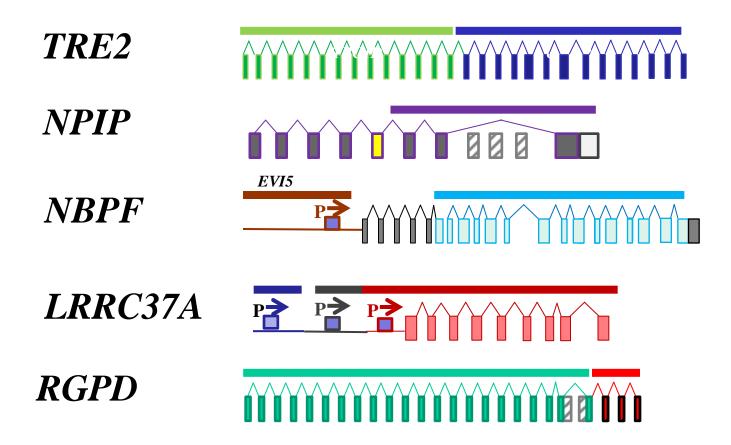
- •A mosaic of recently transposed duplications
- •Duplications within duplications.
- •Potentiates "exon shuffling", regulatory innovation

Human Chromosome 16 Core Duplicon



- •The burst of segmental duplications 8-12 mya corresponds to coreassociated duplications which have occurred on six human chromosomes (chromosomes 1,2, 7, 15, 16, 17)
- •Most of the <u>recurrent</u> genomic disorders associated with developmental delay, epilepsy, intellectual disability, etc. are mediated by duplication blocks centered on a core.

Human Great-ape "Core Duplicons" have led to the Emergence of New Genes



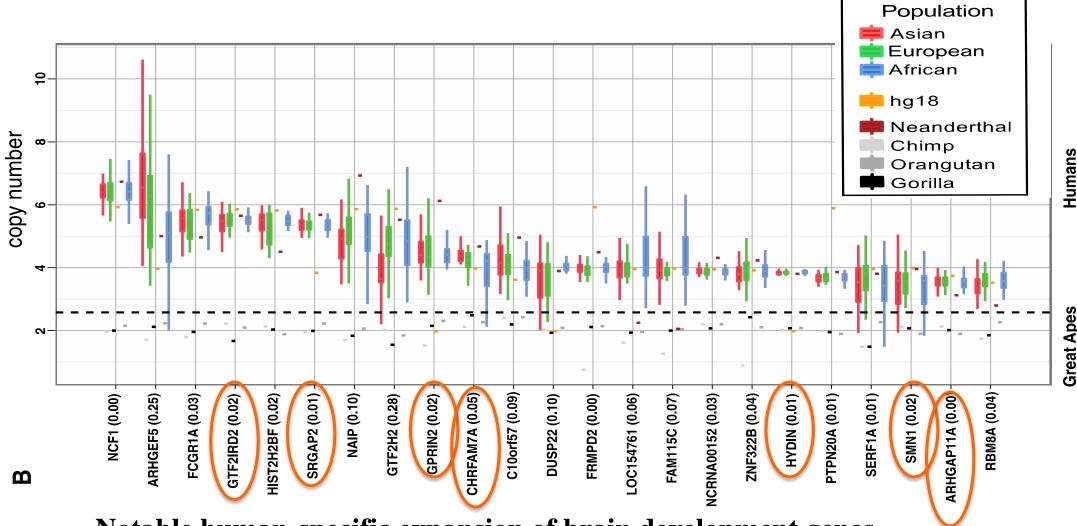
Features: No orthologs in mouse; multiple copies in chimp & human dramatic changes in expression profile; signatures of positive selection

Core Duplicon Hypothesis

The selective disadvantage of interspersed duplications is offset by the benefit of evolutionary plasticity and the emergence of new genes with new functions associated with core duplicons.

Marques-Bonet and Eichler, CSHL Quant Biol, 2008

Human-specific gene family expansions

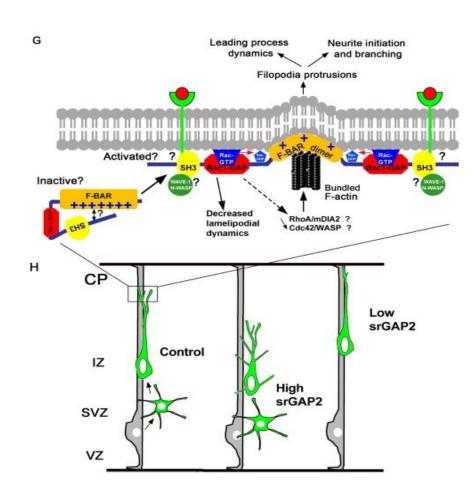


Notable human-specific expansion of brain development genes. Neuronal cell death: p=5.7e-4; Neurological disease: p=4.6e-2

Sudmant et al., Science, 2010

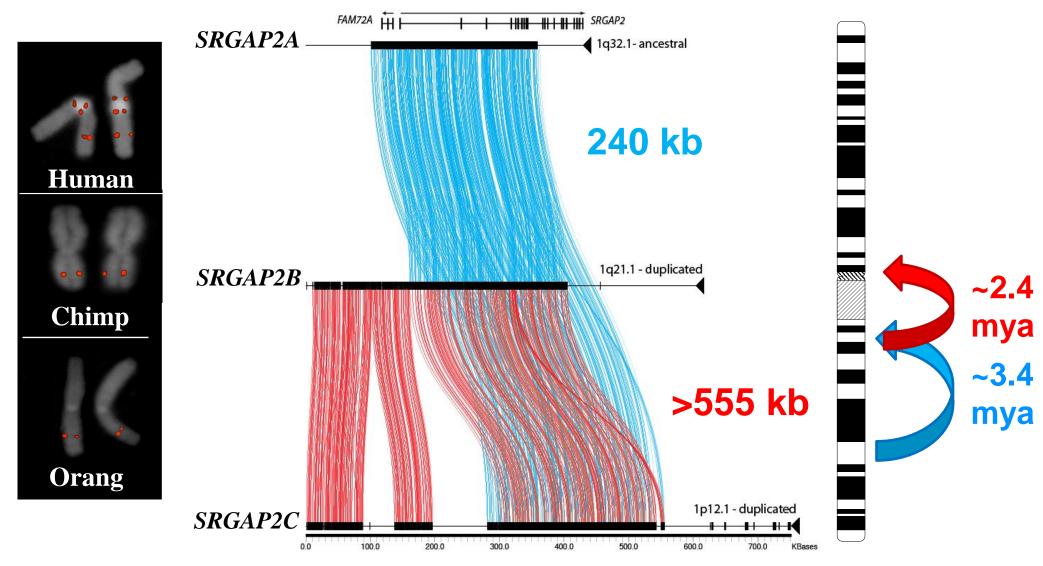
SRGAP2 function

- SRGAP2 (SLIT-ROBO Rho GTPase activating protein 2) functions to control migration of neurons and dendritic formation in the cortex
- Gene has been duplicated three times in human and no other mammalian lineage
- Duplicated loci not in human genome



Guerrier et al., Cell, 2009

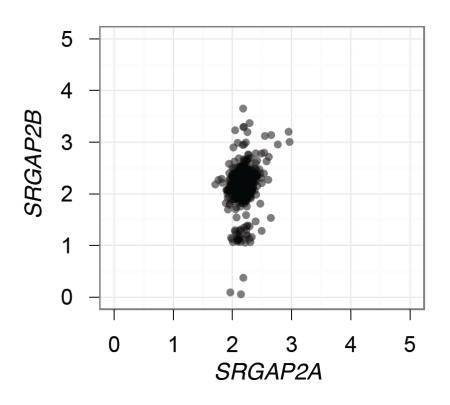
SRGAP2 Human Specific Duplication

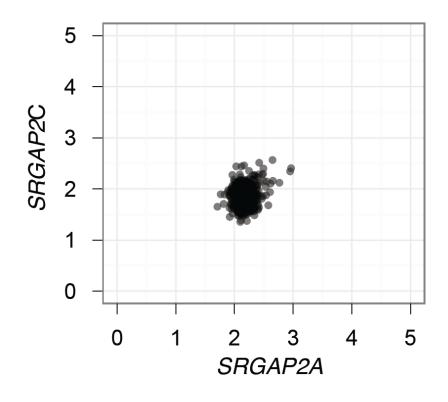


Dennis, Nuttle et al., Cell, 2012

SRGAP2C is fixed in humans

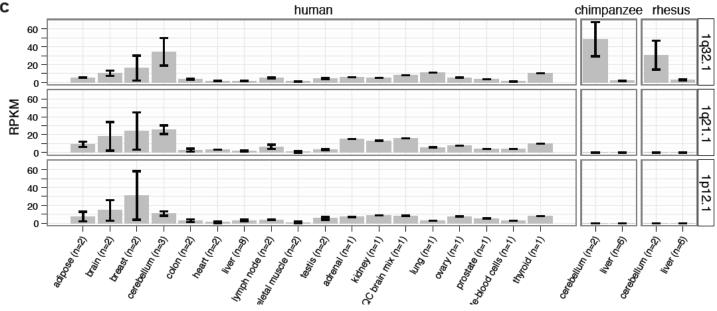
(n=661 individual genomes)



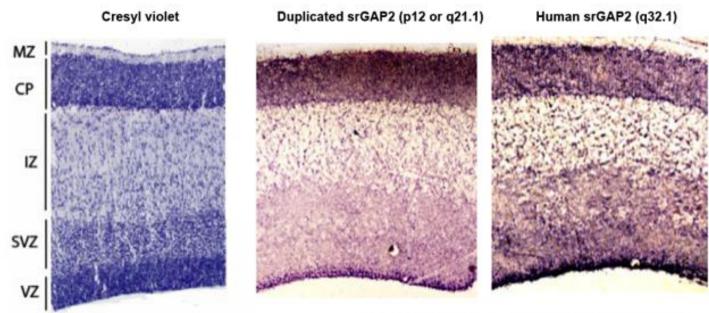


SRGAP2 duplicates are expressed



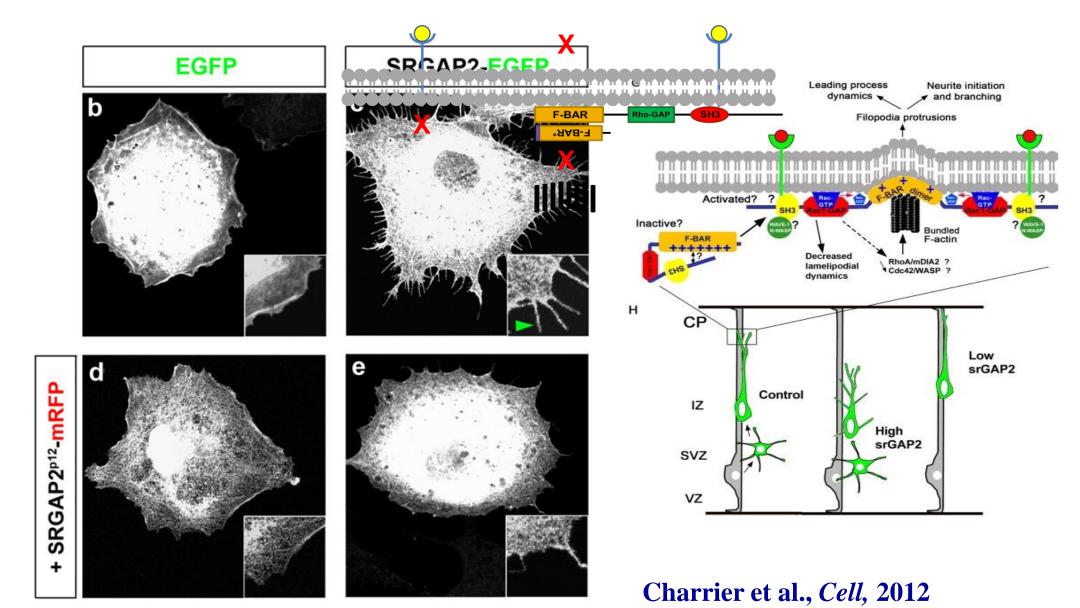


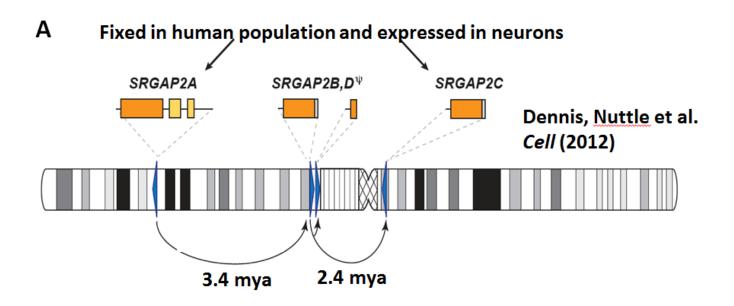
In situ

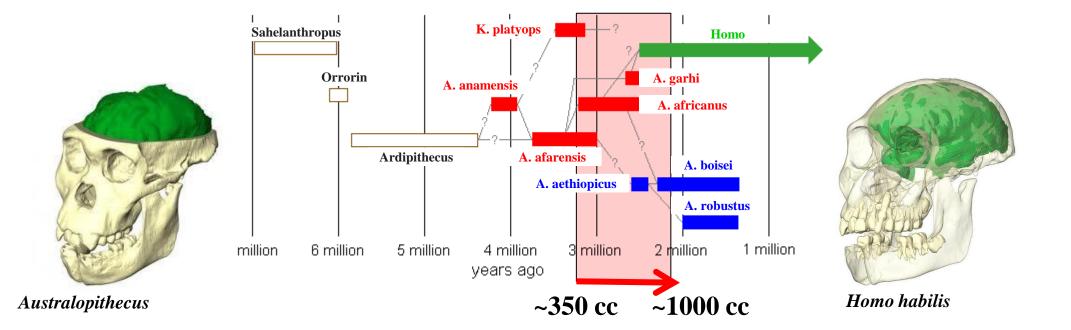


Human embryos Gestational Week 12

SRGAP2C duplicate antagonizes function

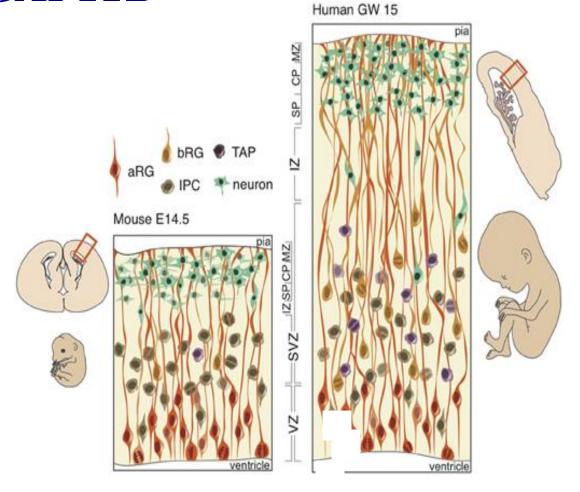






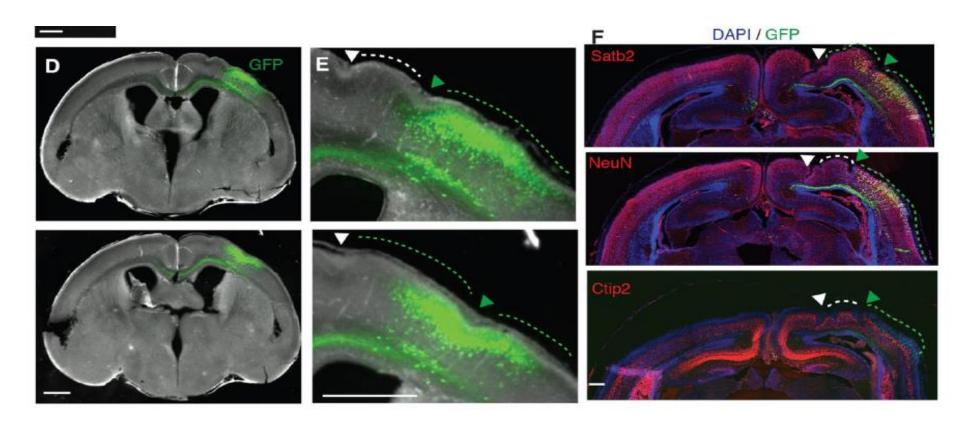
Example 2: Human-specific Duplication of *ARHGAP11B*

- A human-specific duplicated Rho GTPase activating protein that is truncated (5.3 mya)
- Predisposes to the most common cause of epilepsy
- Increase in number of basal radial glial hypothesized to lead to enlargement of the subventricular zone in humans.
- ARHGAP11B is expressed specifically in basal radial glial cells



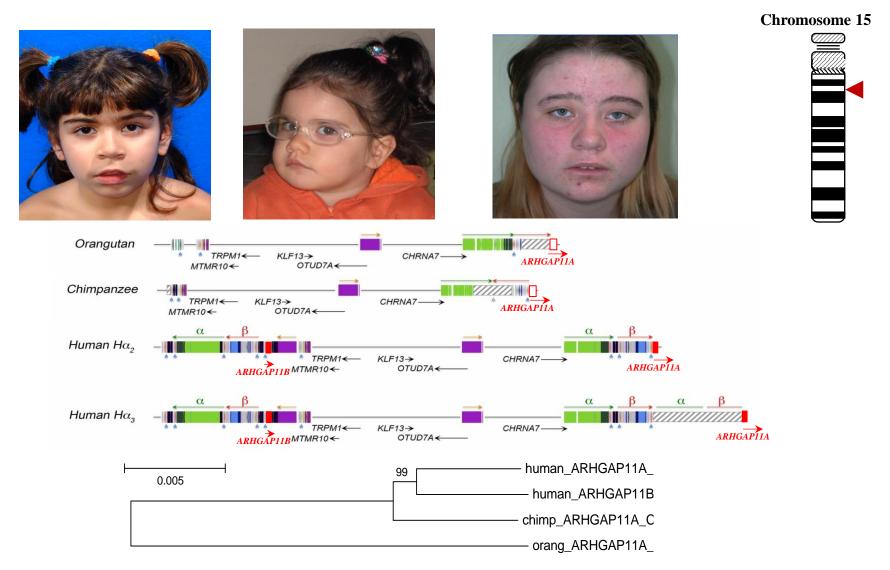
ARHGAP11B induced gyrification of mouse brain

• E13.5 microinjection of *ARHGAP11B* induced folding in the neocortex by E18.5 in ½ of the cases—a significant increase in cortical area.



Florea et al., Science 2015

Duplication of *ARHGAP11B* **and 15q13.3 Syndrome**



Duplication from ARHGAP11A to ARHGAP11B estimated to have occurred 5.3 +/- 0.5 million years ago.

Antonacci et al., Nat Genet, 2014,





Summary

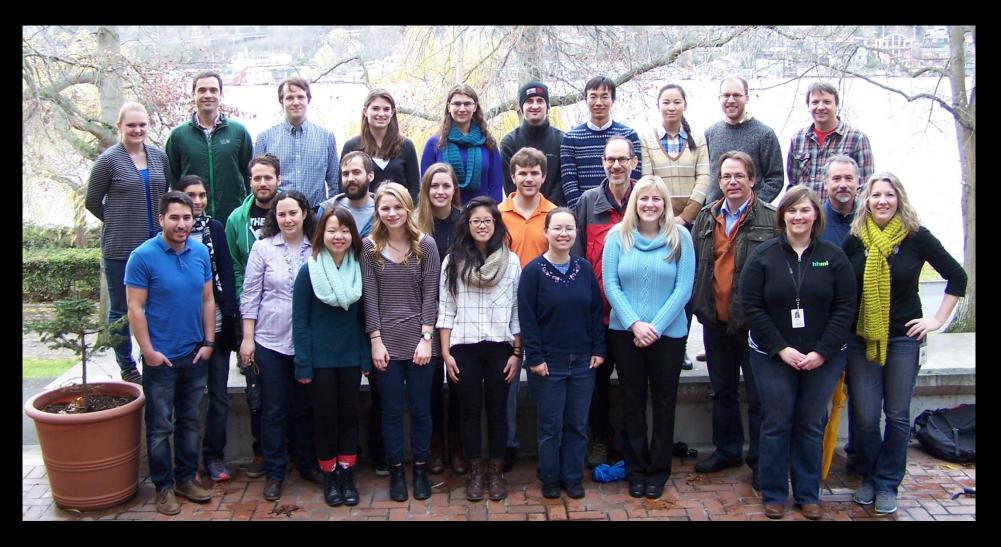
- Interspersed duplication architecture sensitized our genome to copy-number variation increasing our species predisposition to disease—children with autism and intellectual disability
- Duplication architecture has evolved recently in a punctuated fashion around core duplicons which encode human great-ape specific gene innovations (eg. *NPIP*, *NBPF*, *LRRC37*, etc.).
- Cores have propagated in a stepwise fashion "transducing" flanking sequences---human-specific acquisitions flanks are associated with brain developmental genes.
- Core Duplicon Hypothesis: Selective disadvantage of these interspersed duplications offset by newly minted genes and new locations within our species. Eg. *SRGAP2C*

Overall Summary

- I. Disease: Role of CNVs in human disease—relationship of common and rare variants—a genomic bias in location and gene type
- II. Methods: Read-pair and read-depth methods to characterize SVs within genomes—need a high quality reference—not a solved problem.
- III: Evolution: Rapid evolution of complex human architecture that predisposes to disease coupled to gene innovation



Eichler Lab



http://eichlerlab.gs.washington.edu/

genguest

Acronyms

SV-structural variation

CNV- copy number variation

CNP—copy number polymorphism

Indel-insertion/deletion event

SD—segmental duplication

SUN-singly-unique nucleotide identifier

SMRT-single-molecule real-time sequencing

WGS—whole genome shotgun sequencing

SV Software

- *Genomestrip*—Handsaker/McCarroll—combines read-depth and readpair data to identify potential sites of SV data from population genomic data
- *dCGH*—Sudmant/Eichler—measure Illumina read-depth using multi-read sequence mapper (mrsFAST/mrFAST)
- *Delly*—EMBL Rausch/Korbel—uses split-read and readpair signatures to increase sensitivity and specificity
- *VariationHunter*—Hormozdiari/Alkan—uses readpair & multiple mapping to discover SV
- *Lumpy* --Quinlan—uses probabilistic framework to integrate multiple structural variation signals such as discordant paired-end alignments and split-read alignments
- *PINDEL*—Kai Ye-- breakpoints of large deletions, medium sized insertions, inversions, tandem duplications and other structural variants at single-based resolution from next-gen sequence data. It uses a pattern growth approach to identify the breakpoints of these variants from paired-end short reads.
- *SMRT-SV & Phased-SV*—Chaisson/Eichler—maps SMRT long reads (BLASR) to reference, detects signatures of SV and generates local assembly of SV

SD-Mediated Rearrangements

