

# Next Generation Human Genetics

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# Shendure Lab

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- Goal = push the envelope on technology for genomics
- No defining biological theme or model organism
- Coherence & synergies on methodological themes

Genetics  
Function  
Synthetics  
Tagging  
Contiguity  
Translation

# Next generation...

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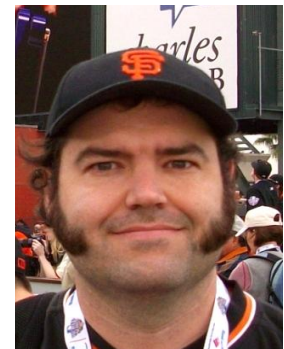
Tagging

Contiguity

Translation



**Sarah  
Ng**

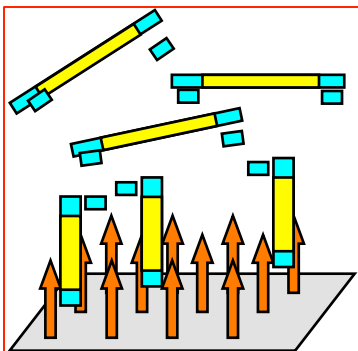


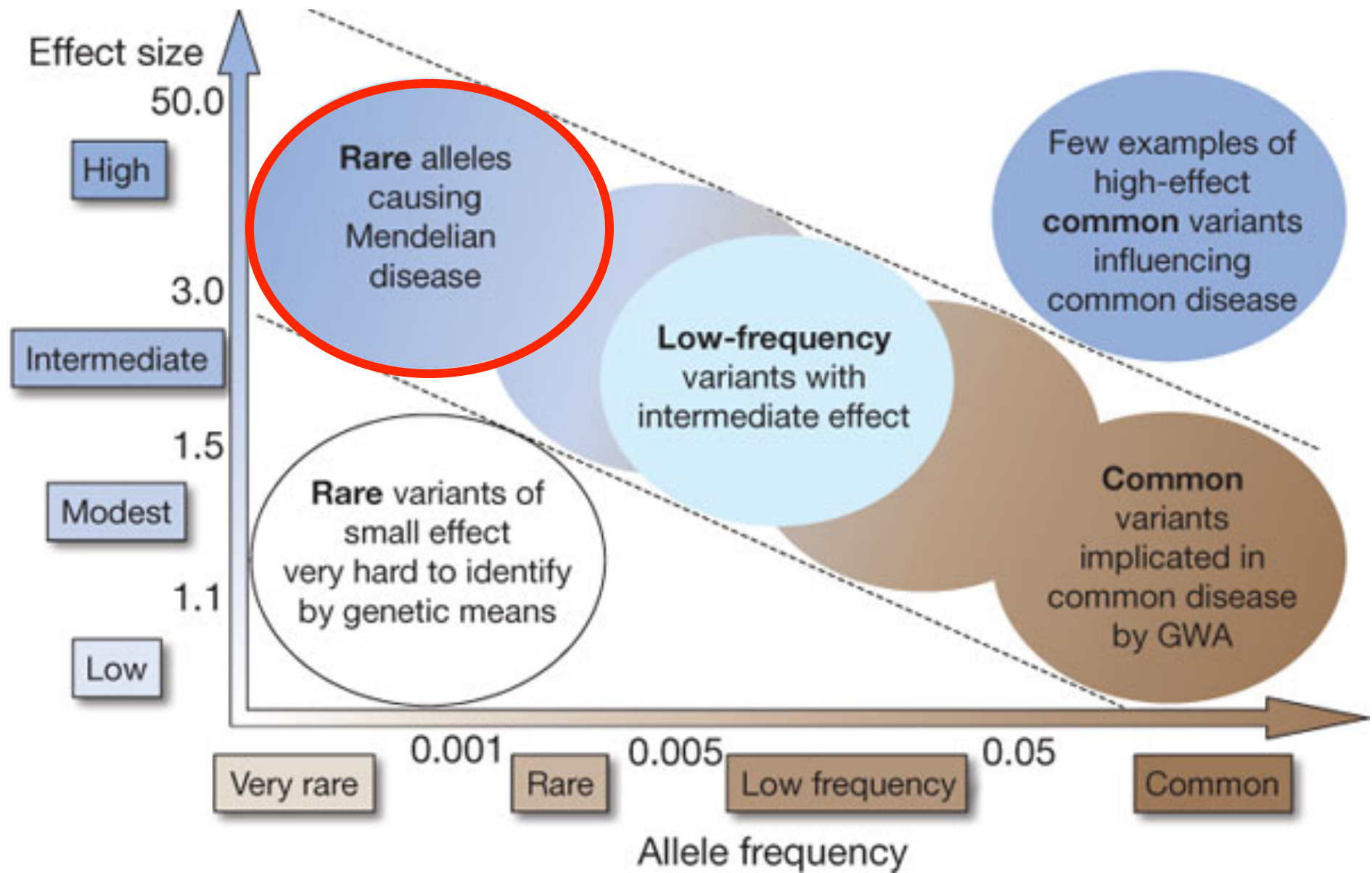
**Brian  
O'Roak**

# Rewind to 2008...

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- Cost of human genome = ~\$250,000
- Technical goal = **exome sequencing** (~1%)
- Still not entirely clear what human genome (or exome) sequencing would be useful for.
- How do you learn anything from a small sample size?





nature

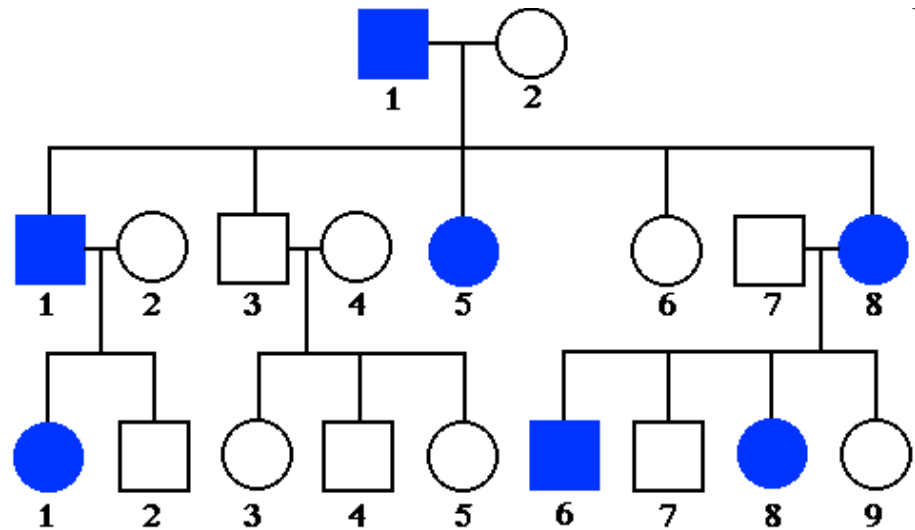
Manolio *et al.* (2009)

# Mendelian disorders

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- Rare, single gene diseases
- Monogenic subsets of common diseases

- **>2,000 solved**
- **>2,000 unsolved**



| <b>Table 2. SNPs Identified through Whole-Genome Sequencing of DNA from the Proband.*</b> |                    |
|-------------------------------------------------------------------------------------------|--------------------|
| <b>SNP Type</b>                                                                           | <b>No. of SNPs</b> |
| Nongene                                                                                   | 2,255,102          |
| Gene                                                                                      | 1,165,204          |
| Intron                                                                                    | 1,064,655          |
| Promoter                                                                                  | 60,075             |
| 3' UTR                                                                                    | 16,350             |
| 5' UTR                                                                                    | 3,517              |
| Splice regulatory site                                                                    | 2,089              |
| Splice site                                                                               | 112                |
| Synonymous                                                                                | 9,337              |
| Stop→stop                                                                                 | 17                 |
| Nonsynonymous                                                                             | 9,069              |
| Stop→gain                                                                                 | 121                |
| Stop→loss                                                                                 | 27                 |
| Total                                                                                     | 3,420,306          |

How does  
one  
pinpoint  
**causal**  
variants in  
human  
genome(s)?

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Lupski et al.  
*NEJM* (2010)

# Targeted capture and massively parallel sequencing of 12 human exomes

Sarah B. Ng<sup>1</sup>, Emily H. Turner<sup>1</sup>, Peggy D. Robertson<sup>1</sup>, Steven D. Flygare<sup>1</sup>, Abigail W. Bigham<sup>2</sup>, Choli Lee<sup>1</sup>, Tristan Shaffer<sup>1</sup>, Michelle Wong<sup>1</sup>, Arindam Bhattacharjee<sup>4</sup>, Evan E. Eichler<sup>1,3</sup>, Michael Bamshad<sup>2</sup>, Deborah A. Nickerson<sup>1</sup> & Jay Shendure<sup>1</sup>

1. Sequence exomes of four unrelated probands affected with a dominant Mendelian disorder
2. Remove “common” variants
  - 8 HapMap ‘control’ exomes
  - public SNP databases
3. Find genes that contain “uncommon” variants in *all* affected individuals

Ng *et al.* Nature (2009)

# Can exome sequencing be applied to identify the cause of a Mendelian disorder?

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| <i>How many genes in genome with....</i>  | Freeman-Sheldon probands |       |       |                         |
|-------------------------------------------|--------------------------|-------|-------|-------------------------|
|                                           | 1/1                      | 2/2   | 3/3   | 4/4                     |
| ...any nsSNP, splice-site, or indel       | 4,510                    | 3,284 | 2,765 | 2,479                   |
| ...not in dbSNP                           | 513                      | 128   | 71    | 53                      |
| ...not in 8 HapMap exomes                 | 799                      | 168   | 53    | 21                      |
| ...not in either dbSNP or 8 HapMap exomes | 360                      | 38    | 8     | <b>1</b><br><b>MYH3</b> |

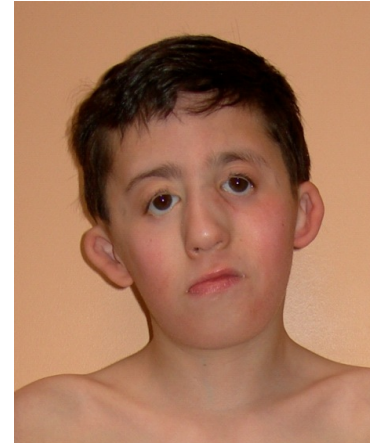
Ng *et al.* Nature (2009)

# Miller syndrome

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Postaxial acrofacial dysostosis

Presumed **autosomal recessive**



Sequenced **4 exomes** from **3 kindreds**

2 siblings from kindred #1 also had CF-like lung phenotype (but not in other Miller cases)

Ng *et al.* Nature Genetics (2010)

# Exome analysis of Miller syndrome

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*How many genes  
in genome with...*

1-A

1-B

1-A+B

2/2

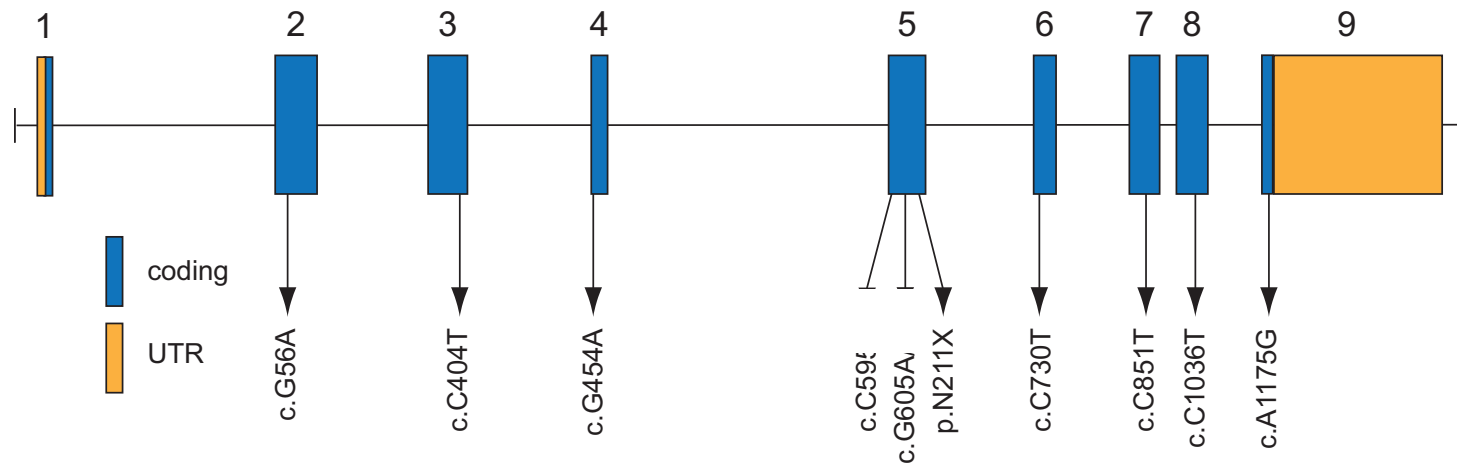
3/3

|                                                 |       |       |       |                                 |                                 |
|-------------------------------------------------|-------|-------|-------|---------------------------------|---------------------------------|
| ...any <b>2</b> nsSNP,<br>splice-site, or indel | 2,789 | 2,777 | 2,278 | 1,740                           | 1,461                           |
| ...not in dbSNP                                 | 93    | 80    | 40    | 16                              | 12                              |
| ...not in 8 HapMap<br>exomes                    | 127   | 120   | 47    | 8                               | 3                               |
| ...not in either<br>dbSNP or 8<br>HapMap exomes | 31    | 26    | 8     | <b>1</b><br><b><i>DHODH</i></b> | <b>1</b><br><b><i>DHODH</i></b> |

Ng *et al.* Nature Genetics (2010)

# DHODH = dihydroorotate dehydrogenase

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*de novo* pyrimidine biosynthesis  
inborn error of metabolism  
same pathway as *rudimentary*



# What about the lung phenotype?

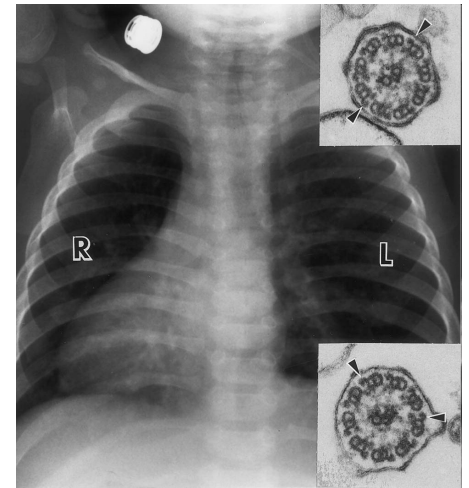
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Sibling kindred (only)

Chronic sinopulmonary infections (CF-like)

Compound heterozygotes for rare,  
damaging mutations in **DNAH5**

Primary ciliary dyskinesia

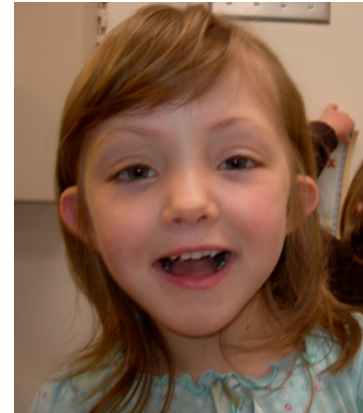


Ng *et al.* Nature Genetics (2010)

# It's not always that easy...

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- **Kabuki syndrome**
- Multiple malformation syndrome
- Suspected **dominant**
- Originally described by Niikawa (1981)
- Sequenced exomes of 10 probands



Ng *et al.* Nature Genetics (2010)

# Exome analysis of Kabuki syndrome

*How many genes  
in genome with...*

|                                            | 5/5   | 6/6   | 7/7   | 8/8   | 9/9   | 10/10 |
|--------------------------------------------|-------|-------|-------|-------|-------|-------|
| ...any nsSNP, splice-site, or indel        | 2,028 | 1,899 | 1,772 | 1,596 | 1,524 | 1,459 |
| ...not in dbSNP or 1000 Genomes            | 63    | 54    | 42    | 36    | 35    | 34    |
| ...not in 26 control exomes                | 44    | 41    | 35    | 5     | 5     | 4     |
| ...not in either dbSNP, 1000G, or controls | 14    | 11    | 6     | 1     | 1     | 1     |

***MUC16 = artifact!***

# Why didn't this work?

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Genetic **heterogeneity**?

**Undercalling** of coding variants?

Causal **non-coding** or **structural** variants?

More than one of the above?

# Exome analysis of Kabuki syndrome

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| <i>How many genes<br/>in genome with...</i> | 5/10  | 6/10  | 7/10  | 8/10  | 9/10  | 10/10 |
|---------------------------------------------|-------|-------|-------|-------|-------|-------|
| ...any nsSNP, splice-site, or indel         | 5,289 | 4,581 | 3,940 | 3,244 | 2,486 | 1,459 |
| ...not in dbSNP or 1000 Genomes             | 288   | 192   | 128   | 88    | 60    | 34    |
| ...not in 26 control exomes                 | 311   | 192   | 124   | 77    | 36    | 4     |
| ...not in either dbSNP, 1000G, or controls  | 140   | 69    | 31    | 14    | 5     | 1     |

Ng *et al.* Nature Genetics (2010)

# Exome analysis of Kabuki syndrome

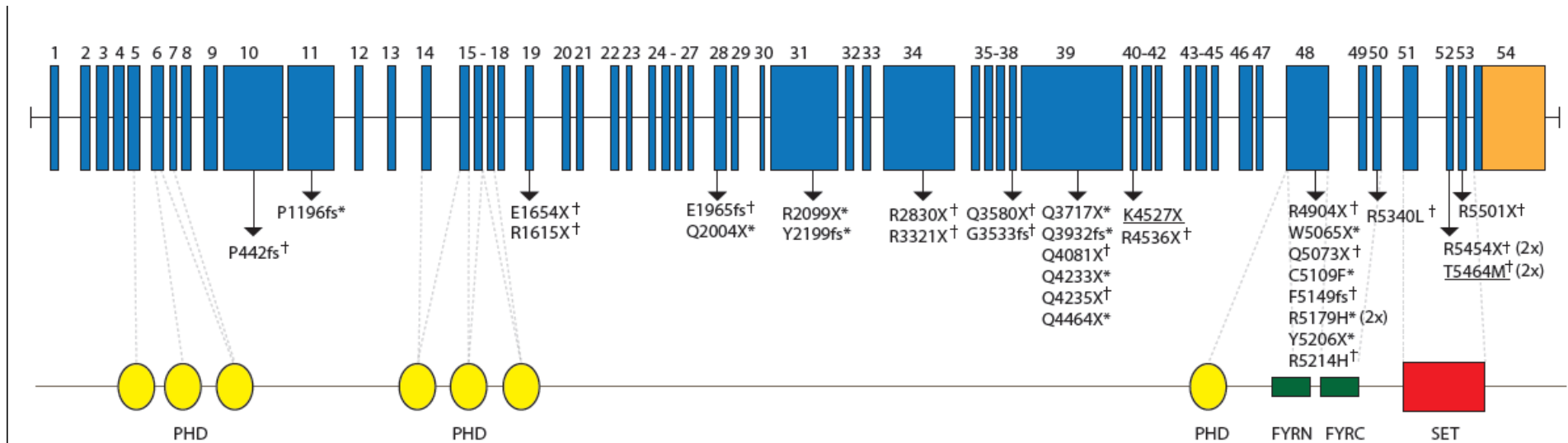
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**phenotypic  
stratification**



**genotypic  
stratification**

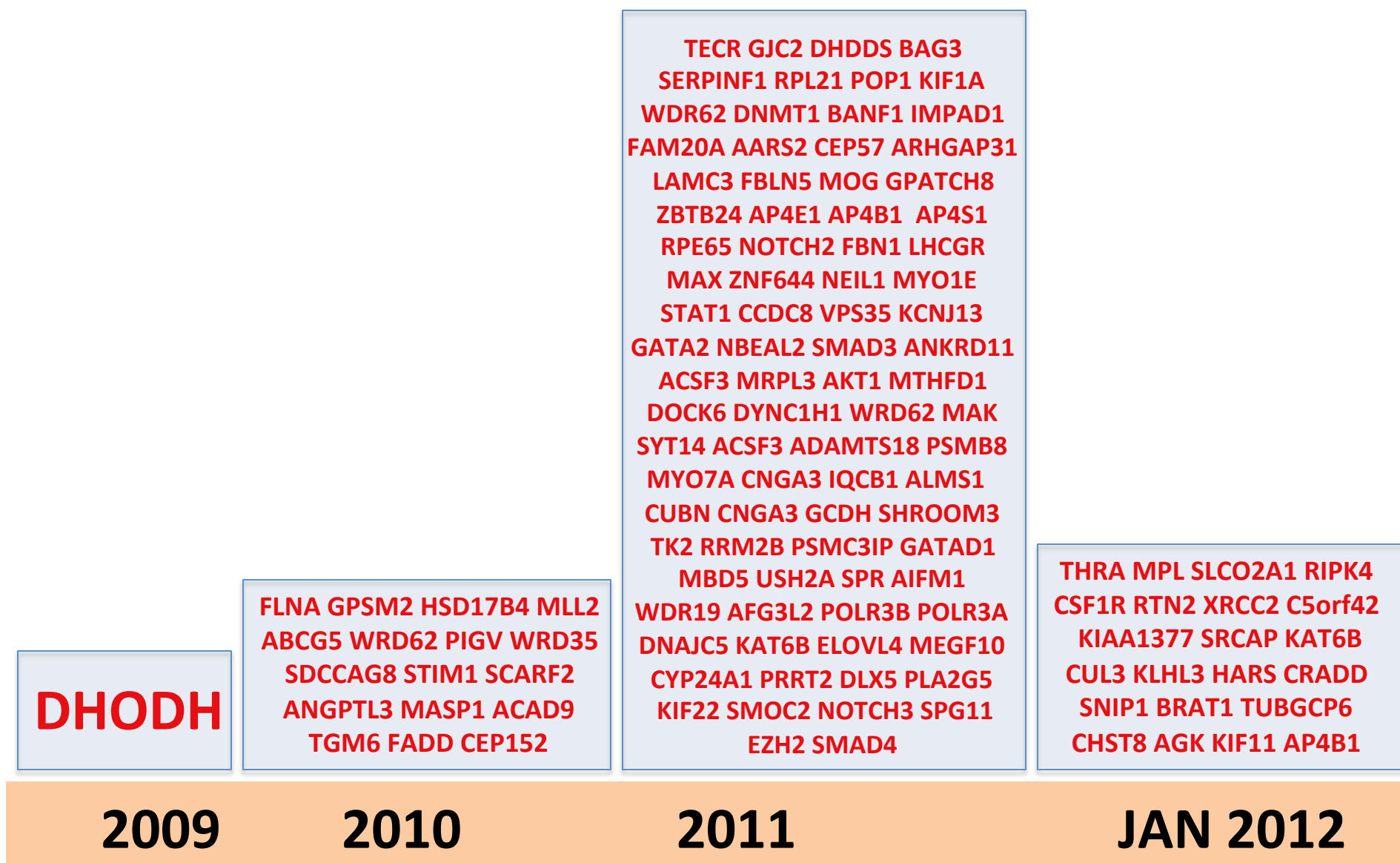
**nonsense > missense  
conserved > nonconserved**



- **MLL2** = trithorax-group histone methyltransferase
- 7 of 10 probands w/ loss-of-function mutation
- 81 mutations in 110 kindreds (74%)
- *de novo*, mostly truncuating
- **Couldn't have been solved by mapping!**

Ng *et al.* Nature Genetics (2010)

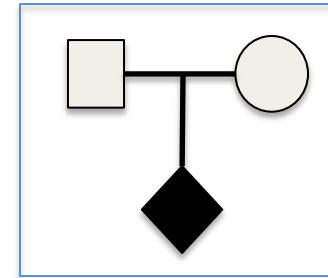
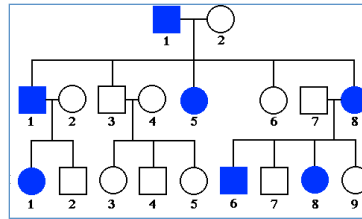
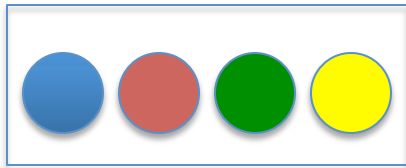
# >100 Mendelian disease genes by exome



# What generalizations can we make?

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- 1) Solving Mendelian disorders is a powerful application of exome/genome sequencing



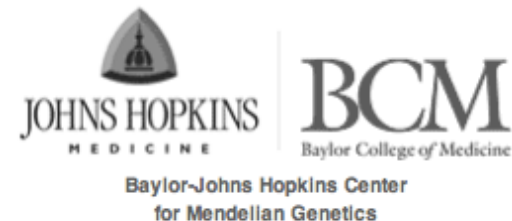
- 2) Only the successes get published!

**Incomplete  
Information**

**Genetic  
Heterogeneity**

## Goals are to:

- 1) Identify the genetic basis for as many Mendelian disorders as possible
- 2) Develop and disseminate improved methods
- 3) Create public resources that facilitate coordinated discovery activities



<http://www.mendelian.org> [gmendel@mendelian.org](mailto:gmendel@mendelian.org)

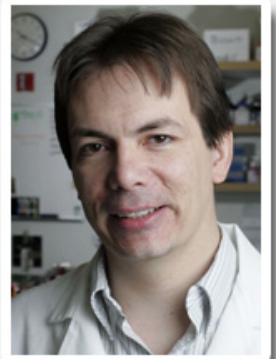
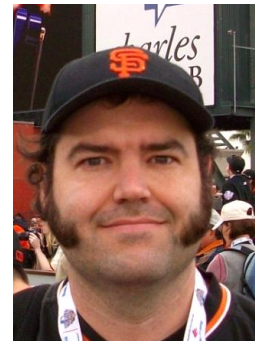
# Autism Spectrum Disorders (ASD)

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Complex phenotype w/ complex genetics

## Simplifying assumptions

- 1) Coding mutations w/ large effects likely contribute to autism
- 2) Some % of these are expected to be ***de novo*** point mutations
- 3) But probably 100's of different genes

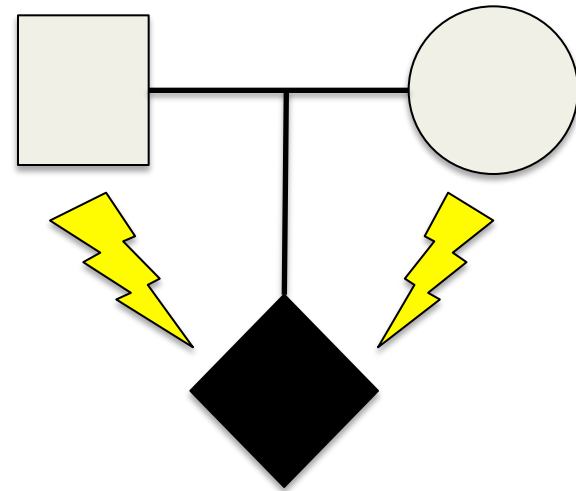


# Trio Sequencing in Simplex Autism

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*De novo* mutations in  
parent-child trios

Simplex pedigrees (Simons)



**209 trios (627 exomes)**

Solution hybridization capture (NimbleGenEZ ExomeV2.0)  
& Illumina sequencing (~90% of ~30 Mb target @  $\geq 8x$ )

**O’Roak *et al.* Nature (2012)**

# ***de novo* SNV analysis: “Haystack”**

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1. Examine bases called in full trio
2. Find Mendelian errors with discordant proband
3. Filter against 2,000+ other exomes
4. Annotate
5. Manual review
6. Sanger confirmation



# Trio Sequencing in Simplex Autism

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242 new *de novo* variants confirmed

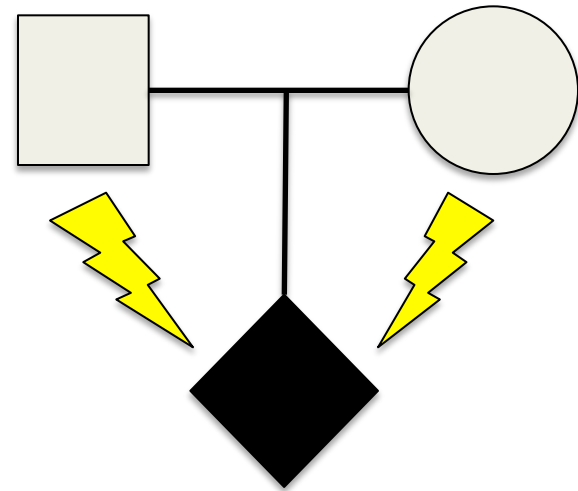
Exome  $\mu = 2.17 \times 10^{-8}$   
per generation

225 substitutions (Ti/Tv= 2.6; 36% CpG)

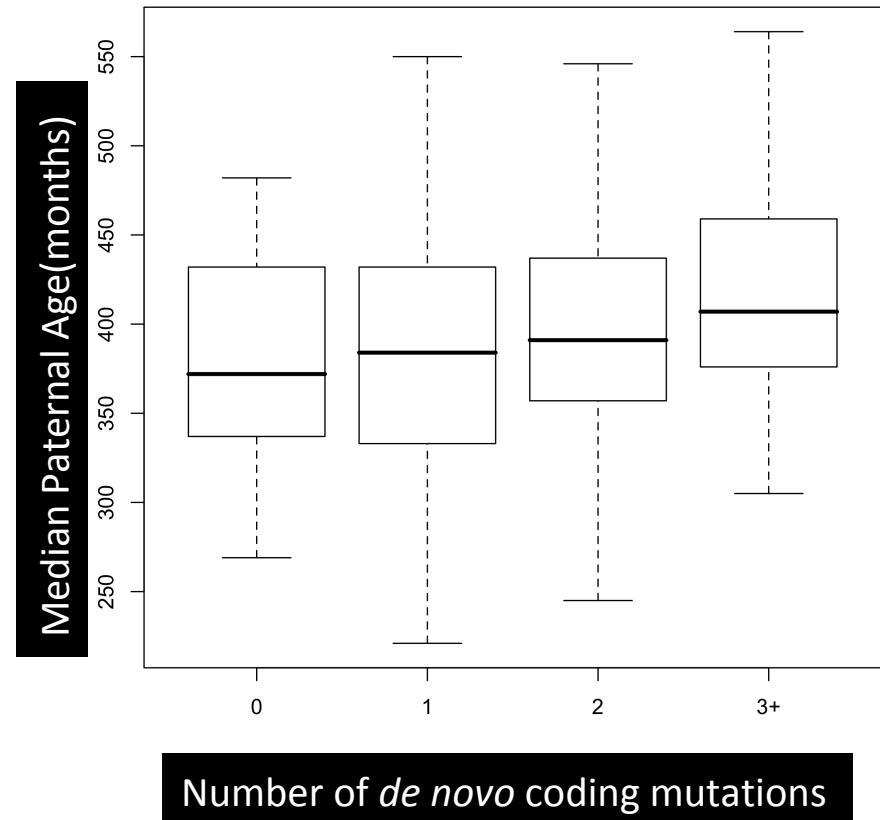
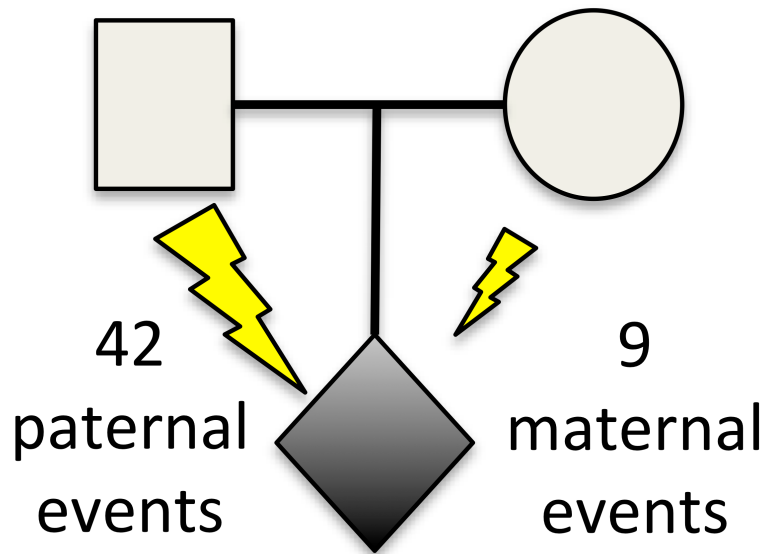
181 non-synonymous (73%)

17 indels (15 truncating)

11 examples of parental or somatic **mosaicism**



# Strong parent-of-origin bias



Haldane (1935) was right...

# Extreme Genetic Heterogeneity

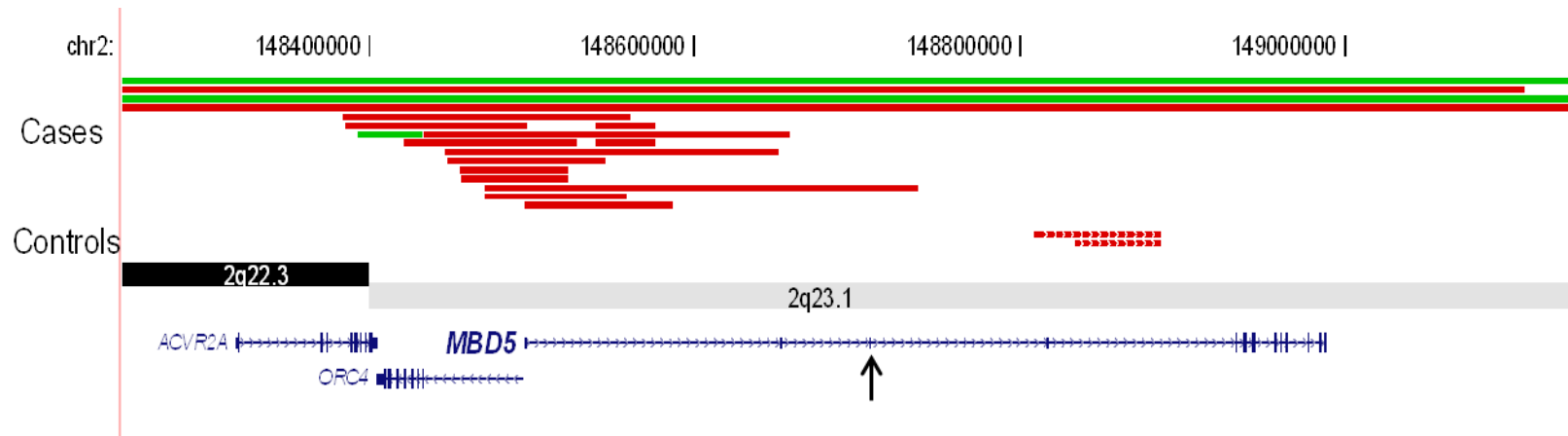
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- 209 trios (627 exomes)
- ~200 nonsynonymous *de novo* mutations
- Many intriguing candidate genes for autism  
(e.g. GRIN2B, LAMC3, FOXP1, SCN1A)
- **But only 2 recurrently disrupted genes!**
- Where do we go from here?



# A subset of mutations pinpoint CNV candidate genes

- 2q23.1 Microdeletion Syndrome-*MBD5*



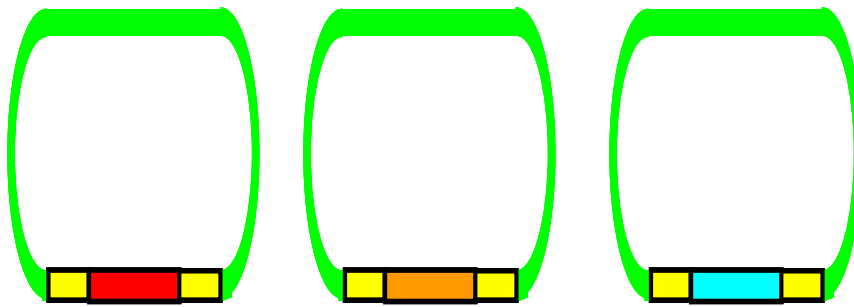
Williams et al. 2009, EJHG; Talkowski et al. 2011 AJHG

- del(18)(q12.2q21.1) syndrome-*SETBP1*
- Down Syndrome critical region-*DYRK1A*

# Molecular Inversion Probes

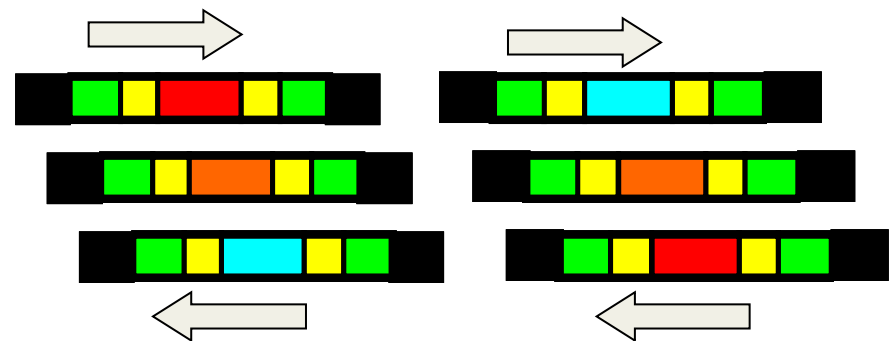
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Multiplex sequence capture



Inverse PCR with common primers that add Illumina adaptors

Direct sequencing with 76 base-pair reads from both directions



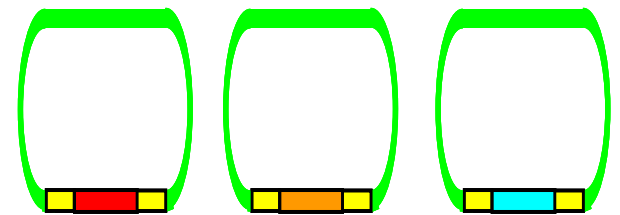
Turner *et al.* Nature Methods (2009)

# Cheap Deep Resequencing

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Target = **6 genes** (autism candidates)

Low input (**50 nanograms**)



1 capture + PCR per sample → pool

**192-plex** or **384-plex** per HiSeq2000 lane

1703 probands and 733 controls (**n=2,436**)

# Cheap Deep Resequencing

---

- >95% of target @ >50x coverage (**192-plex**)
- Both sensitive (99%) & specific (1% FP)
- 2+ *de novo* in 3 genes (in 1,703 probands)

| Gene   | Proband | Type       | Chrom | Pos (hg19) | Genotype |
|--------|---------|------------|-------|------------|----------|
| GRIN2B | 12681   | splice     | 12    | 13722953   | Y        |
| GRIN2B | 12547   | nonsense   | 12    | 13764762   | Y        |
| GRIN2B | 11691   | frameshift | 12    | 14019043   | +G/*     |
| LAMC3  | 11666   | missense   | 9     | 133914290  | R        |
| LAMC3  | 12432   | missense   | 9     | 133914556  | R        |
| LAMC3  | 11704   | missense   | 9     | 133952690  | R        |
| SCN1A  | 12499   | missense   | 2     | 166848071  | R        |
| SCN1A  | 12340   | missense   | 2     | 166848006  | Y        |

# Trio Sequencing in Simplex Autism

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- Extreme Locus Heterogeneity - No single gene causes >0.5% of simplex autism
- Small & large *de novo* mutations clearly relevant
- **Identifying *de novo* mutations in simplex parent-child trios will yield candidate genes**
- **However, replication in large numbers of cases and controls will be key**

# Next generation...

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Genetics

Function

Synthetics

Tagging

Contiguity

Translation



**Jacob  
Kitzman**

# Incomplete Genomics

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- Short reads align ambiguously to ~5% of genome
- Short reads poorly detect many structural variants
- Gaps and errors in the reference genome
- Next-generation 'whole genomes' are essentially blind with respect to phase / haplotype

# Incomplete Genomics

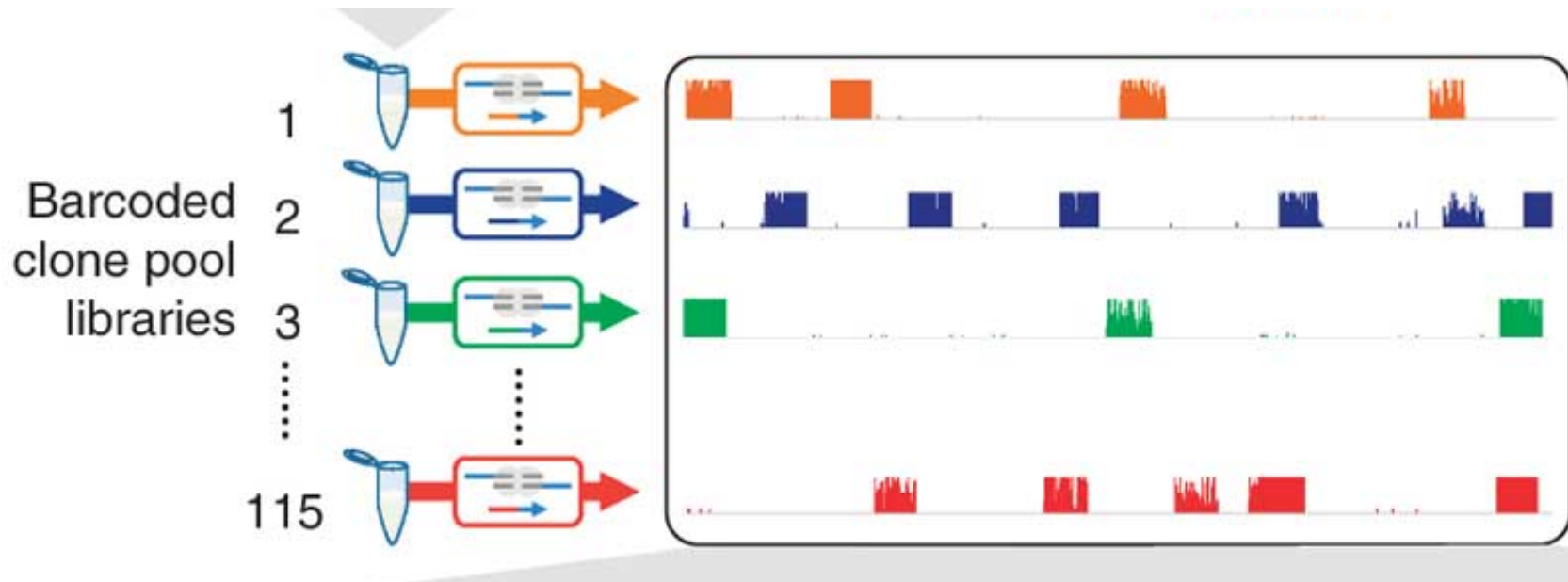
---

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- Next-generation 'whole genomes' are essentially blind with respect to **phase / haplotype**

Kitzman *et al.* **Nature Biotechnology** (2011)

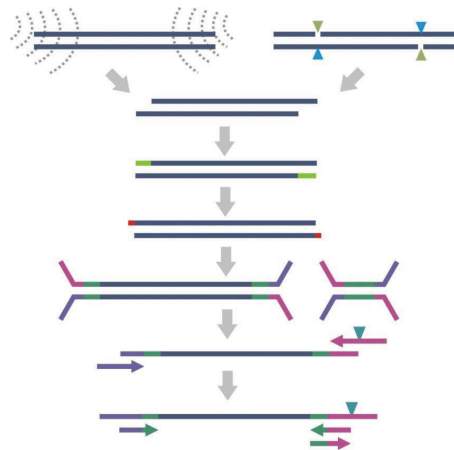
# Haplotype Resolved Genomes

1. Unphased genome sequencing (NA20847 → 15×)
2. Clone gDNA to a single **fosmid** library
3. Split fosmid library into ~100 **subpools**, each w/ ~3% of diploid genome, and sequence separately

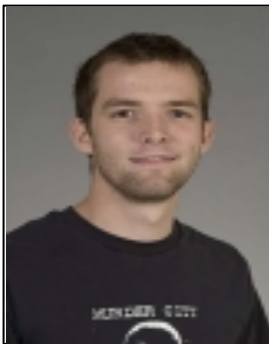
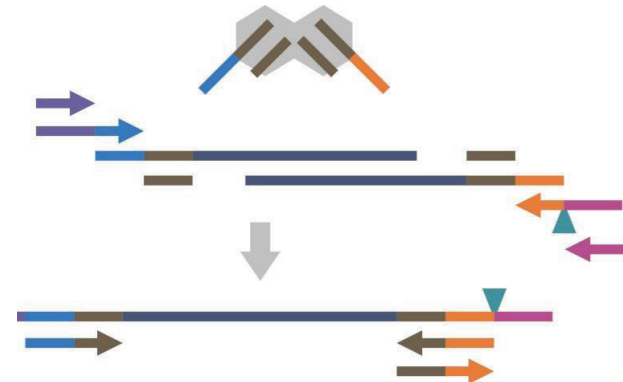


# Making 96, 192, ... indexed libraries quickly

## Standard (2 days)



## Transposase (2 hours)



**Rapid, low-input, low-bias construction of shotgun fragment libraries by high-density in vitro transposition**

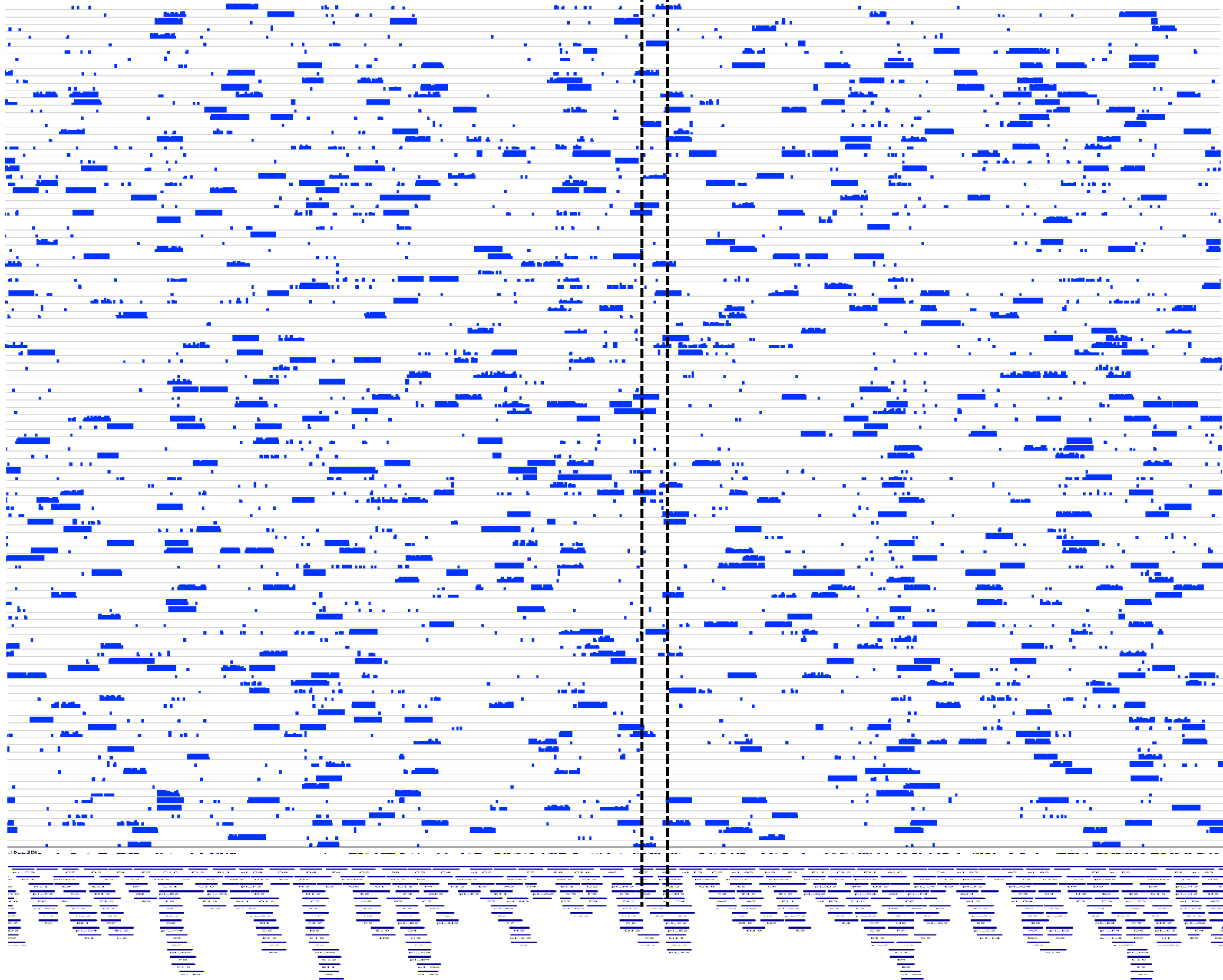
*Genome Biology* 2010, **11**:R119 doi:10.1186/gb-2010-11-12-r119

Andrew Adey (acadey@uw.edu)



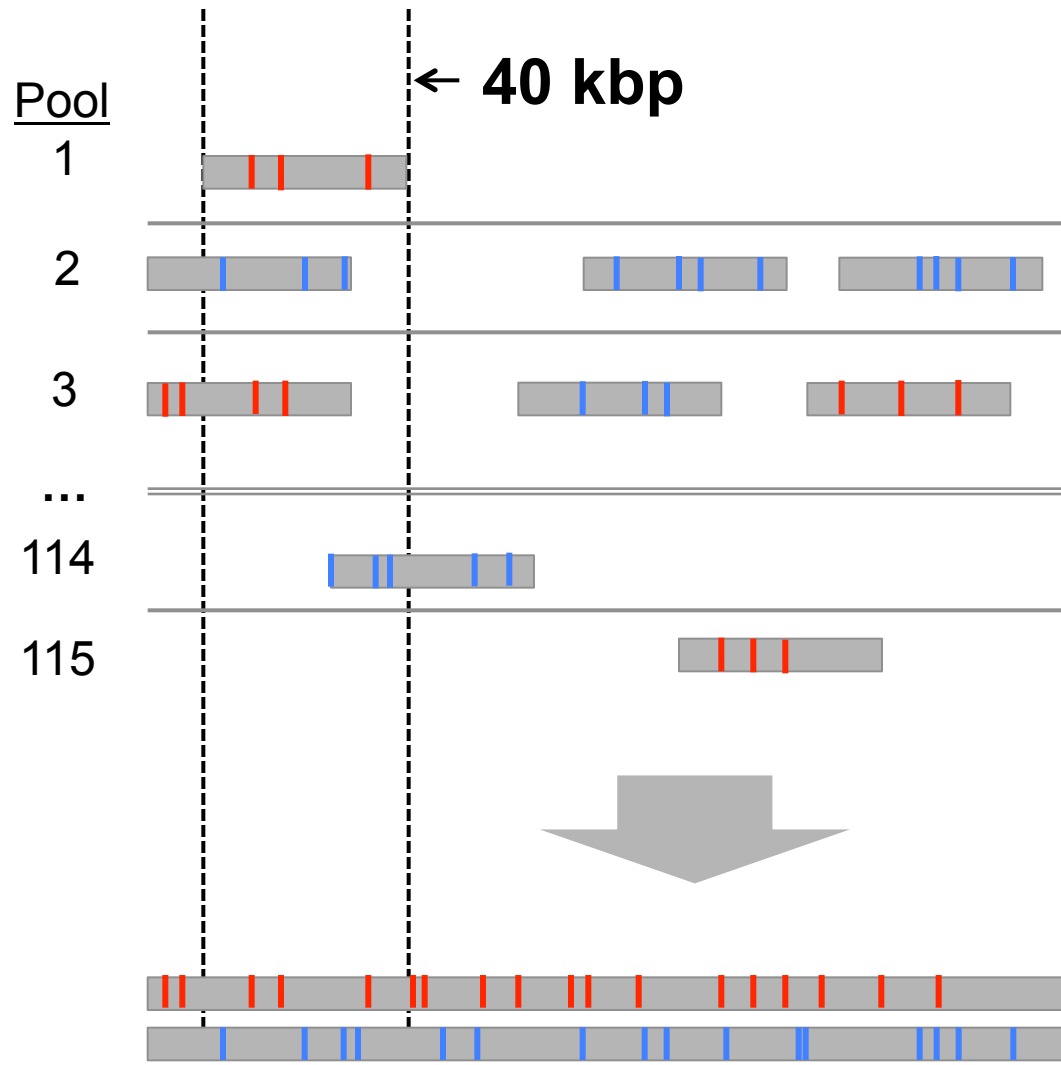
Genome **Biology**

40 kbp→ ← (clones not reads)



Each row = 1 library

# Haplotype Assembly



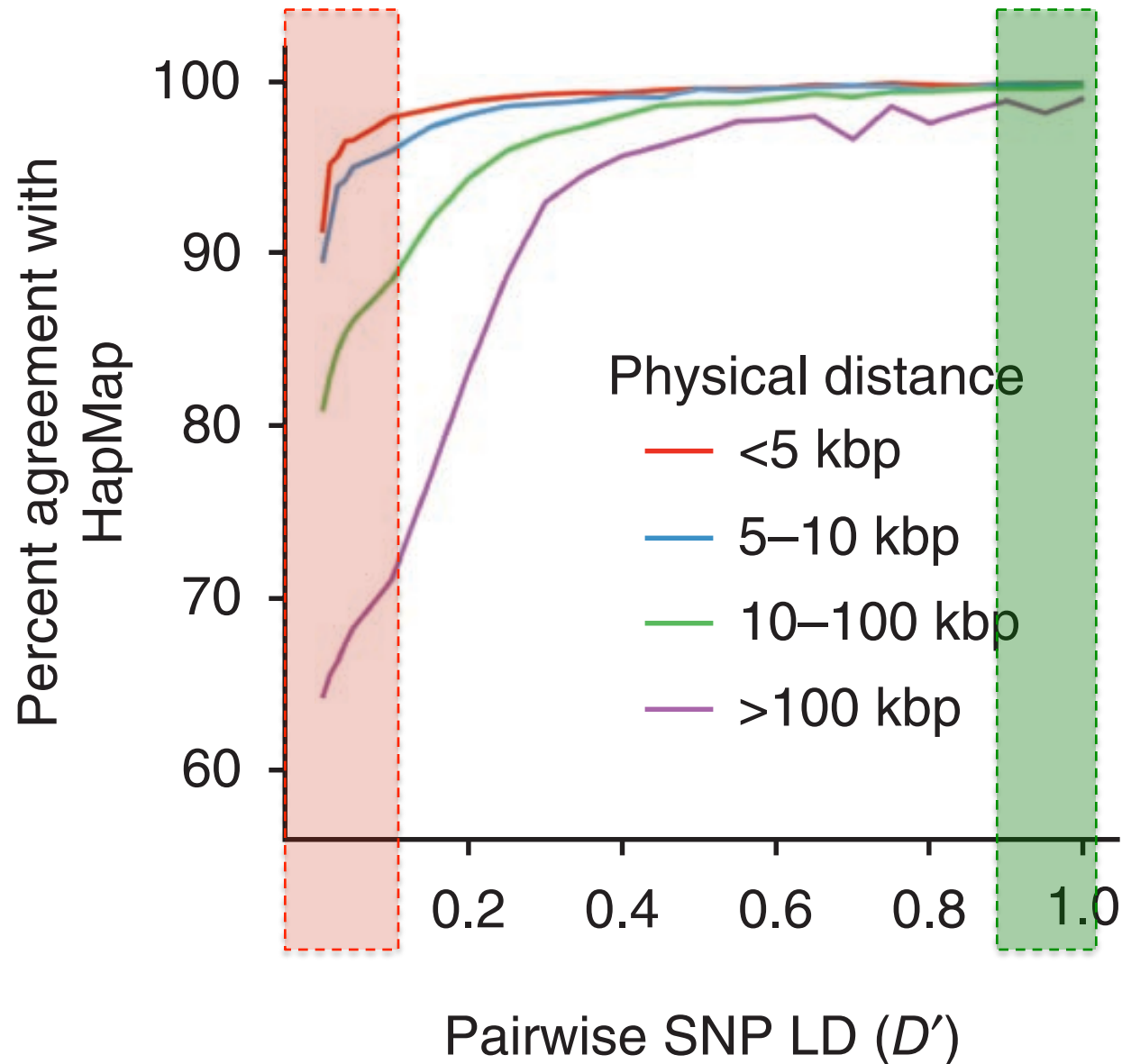
- Genotype the clone pools

- Max-parsimony assembly (Bansal *et al.*)

- **N50 = 386 Kb**

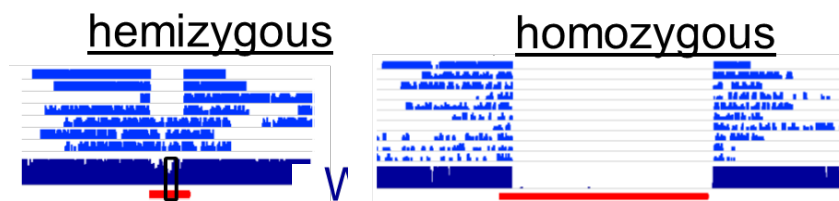
# Strong concordance with HapMap calls

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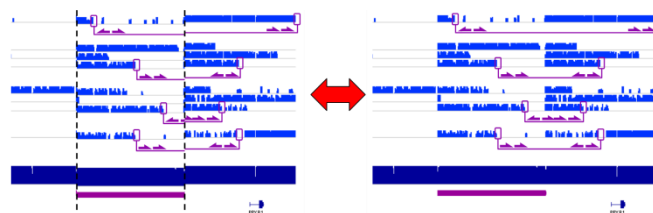


# Resolving structural variation

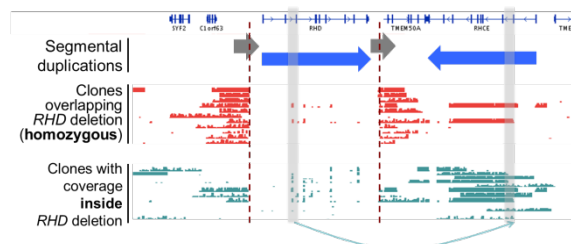
- Deletions



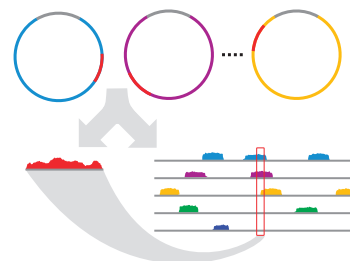
- Inversions



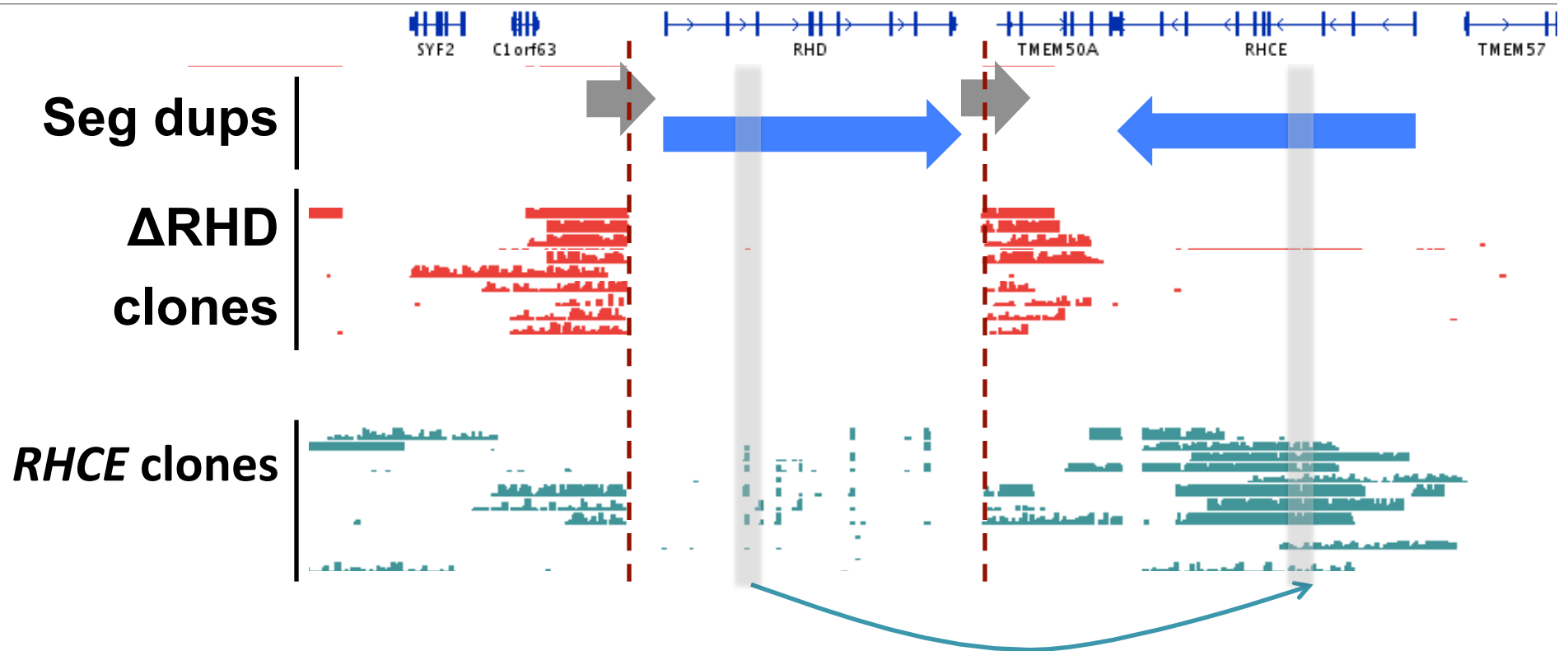
- Gene conversion



- Anchoring insertions

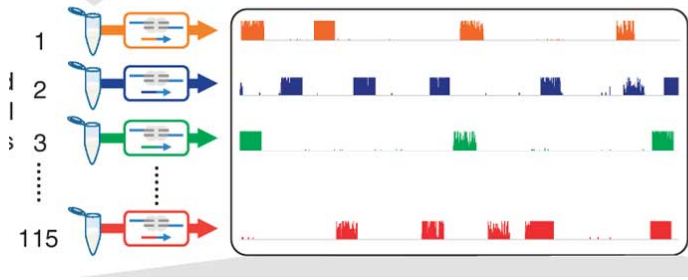


# Deletion and gene conversion at *RHD*



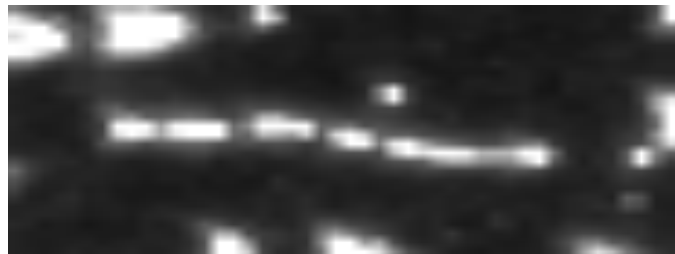
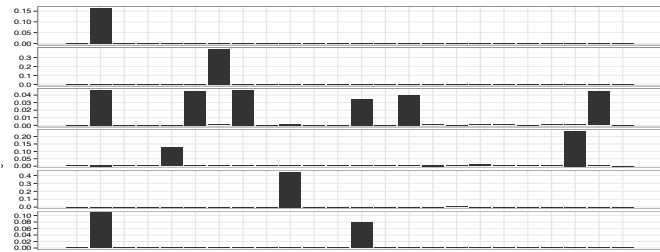
Kitzman *et al.* **Nature Biotechnology** (2011)

# Technology for contiguity



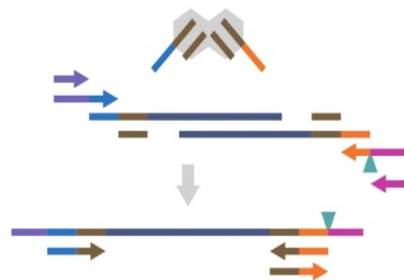
Clone Dilution  
Phasing

Chromosome  
Sorting

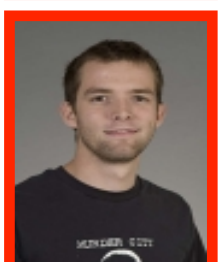
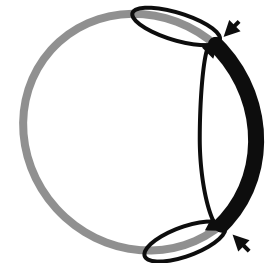


Optical  
Sequencing

Transposase  
Tagging



Fosmids +  
Subassembly



# Next generation...

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Genetics

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Synthetics

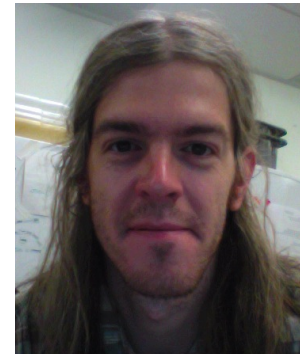
Tagging

Contiguity

Translation



**Jacob  
Kitzman**



**Matthew  
Snyder**

# Prenatal diagnostics

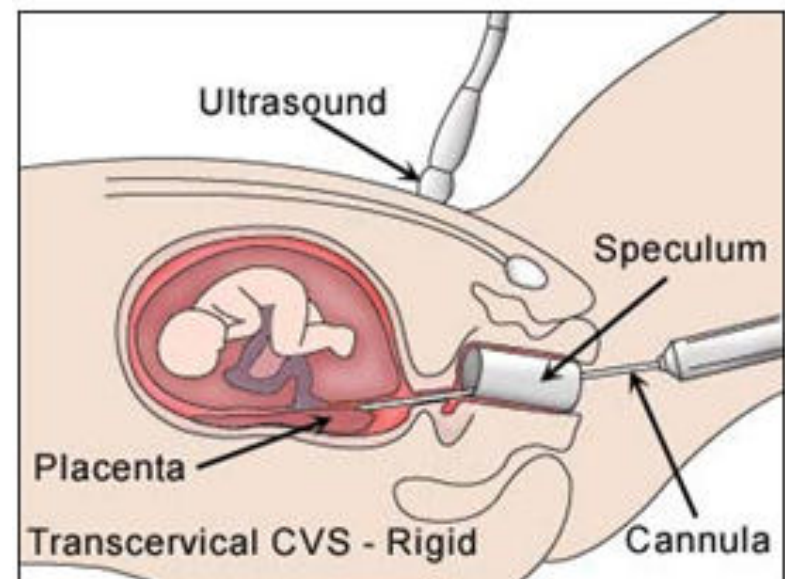
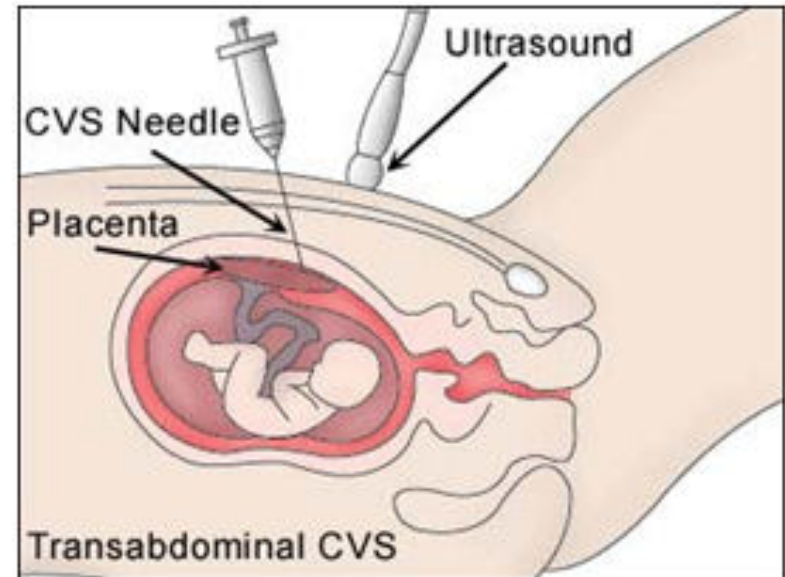
## Non-invasive methods:

- Ultrasound
- Maternal Serum Screening

## Invasive methods:

- Amniocentesis
- Chorionic Villus Sampling

## Risk vs. Sensitivity



# Cell-free fetal DNA in maternal plasma

THE LANCET

## Early report

Vol 350 • August 16, 1997

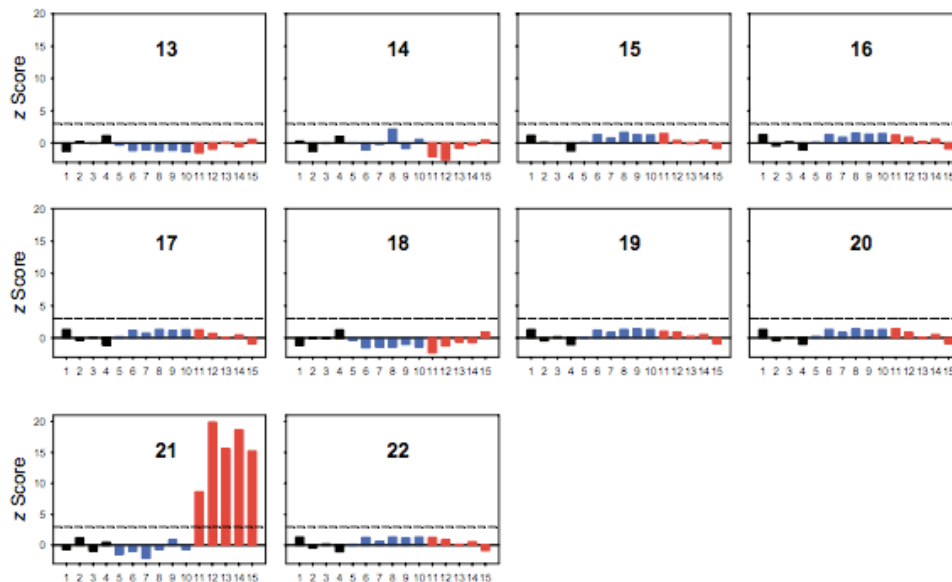
### Presence of fetal DNA in maternal plasma and serum

*Y M Dennis Lo, Noemi Corbetta, Paul F Chamberlain, Vik Rai, Ian L Sargent, Christopher W G Redman, James S Wainscoat*

~5-15% of all cell-free DNA in plasma

Most/all of fetal genome represented

Short fragments



### Maternal Plasma DNA Analysis with Massively Parallel Sequencing by Ligation for Noninvasive Prenatal Diagnosis of Trisomy 21

Rossa W.K. Chiu,<sup>1,2</sup> Hao Sun,<sup>1,2</sup> Ranjit Akolekar,<sup>3</sup> Christopher Clouser,<sup>4</sup> Clarence Lee,<sup>4</sup> Kevin McKernan,<sup>4</sup> Daixing Zhou,<sup>4</sup> Kypros H. Nicolaides,<sup>3</sup> and Y.M. Dennis Lo<sup>1,2\*</sup>

Clinical  
Chemistry

# But can we use this cell-free DNA to infer the complete fetal genome?

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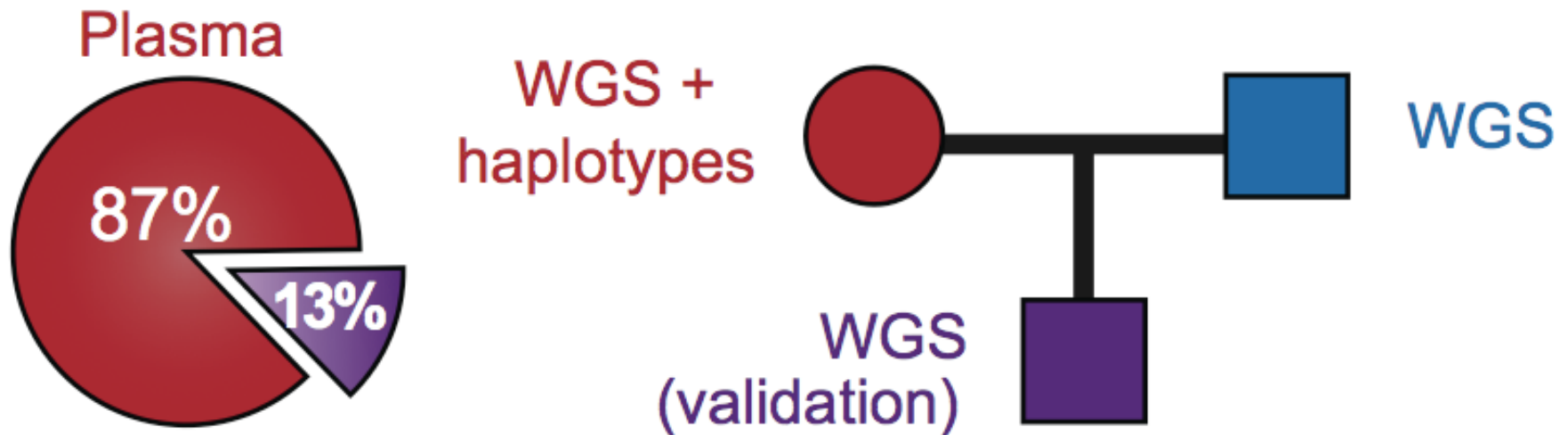
## Inference of inherited alleles

- at sites where mom and dad are homozygous
- at sites where mom is heterozygous
- at sites where dad is heterozygous

## Identification of candidate *de novo* mutations

Kitzman, Snyder *et al.* **Science Translational Medicine** (2012)

# Experimental overview



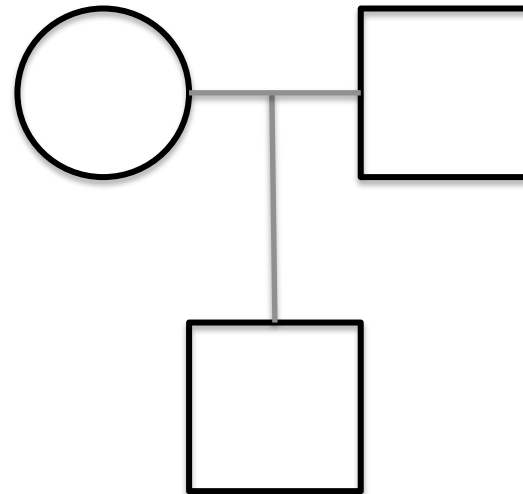
| Individual       | Sample                    | Depth of coverage |
|------------------|---------------------------|-------------------|
| Mother (I1-M)    | Plasma (5 ml, GA 18.5 wk) | 78                |
|                  | Whole blood (<1 mL)       | 32                |
| Father (I1-P)    | Saliva                    | 39                |
| Offspring (I1-C) | Cord blood at delivery    | 40                |

# Inference is trivial at hom/hom sites

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Parental  
Genotypes:

A / A



A / A

Fetal  
Inheritance:

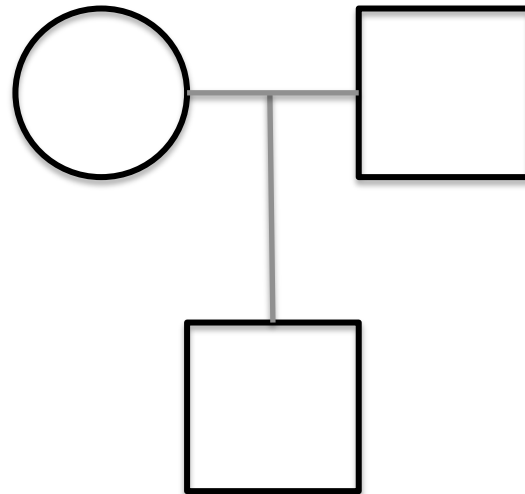
A / A

# Inference is trivial at ANY hom/hom site

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Parental  
Genotypes:

A / A



B / B

Fetal  
Inheritance:

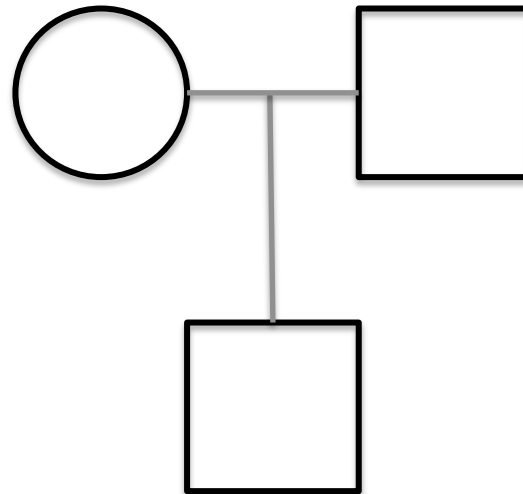
A / B

# Inference is trickier at heterozygous sites

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Parental  
Genotypes:

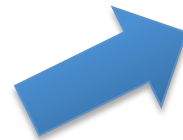
A / B



A / A

Fetal  
Inheritance:

? / A

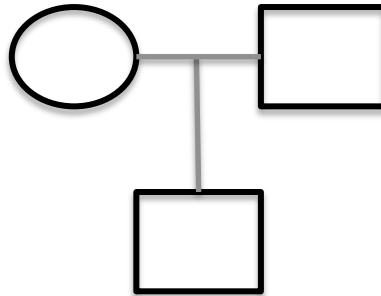


Could use allelic  
imbalance in plasma

# Inference is trickier at heterozygous sites

Parental  
Genotypes:

A / B



A / A

Expected # B reads:

- 43.5 if A transmitted
- 50 if B transmitted

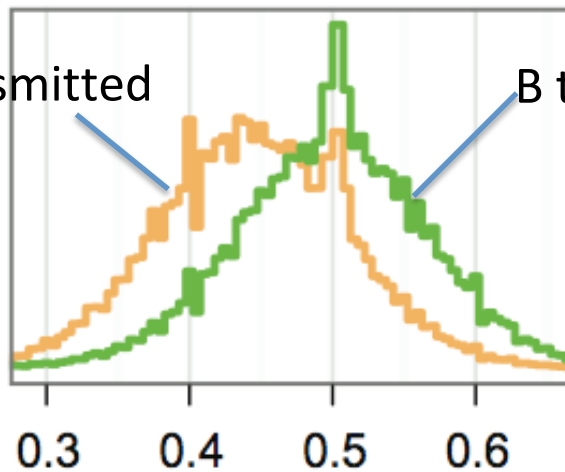
Fetal  
Inheritance:

? / A

A transmitted

B transmitted

100 plasma  
reads



Transmitted allele  
fraction in plasma

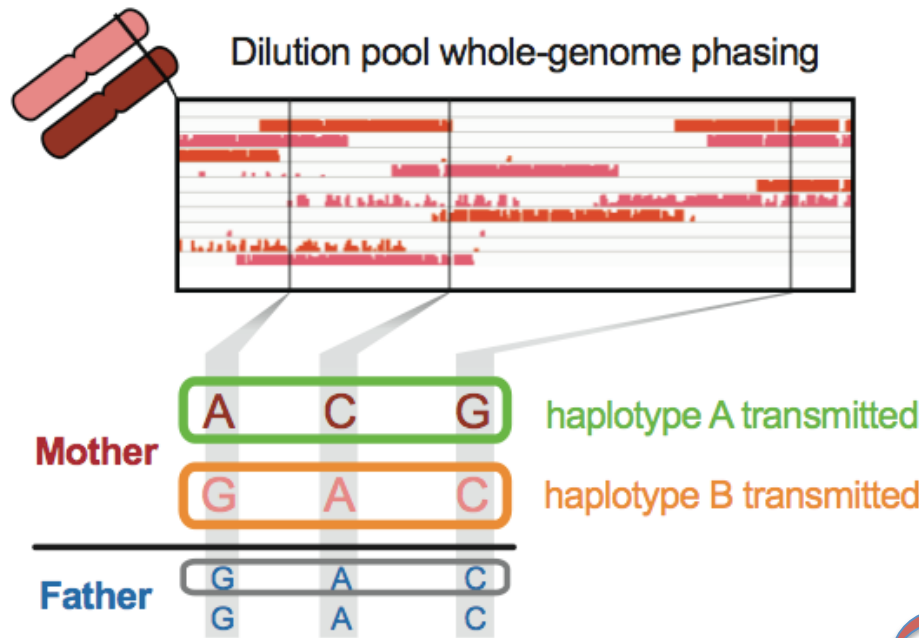
43.5 A

43.5 B

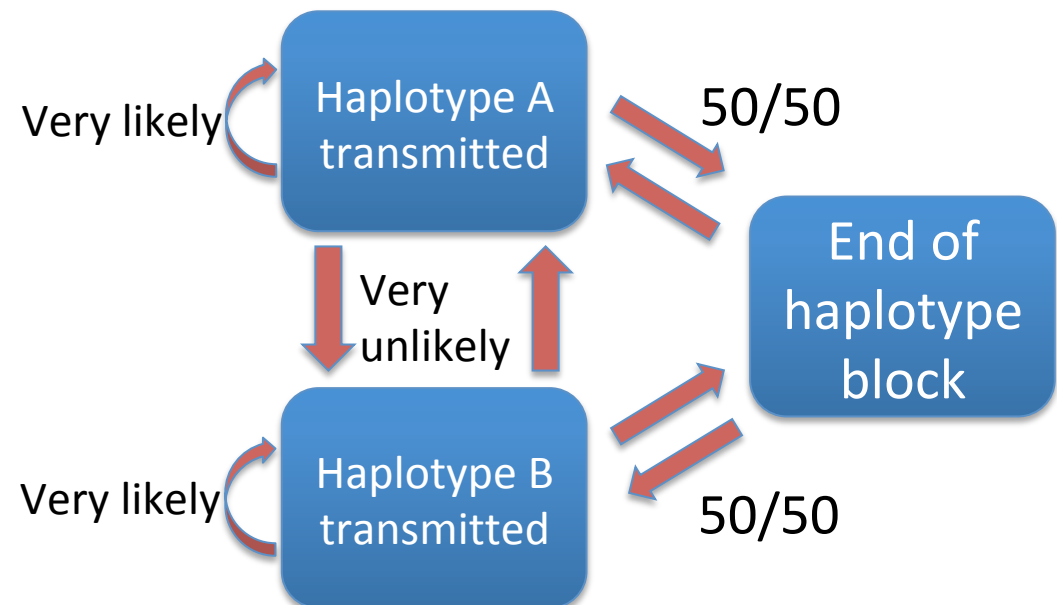
6.5 A  
(from dad)

6.5 A or B  
(from mom)

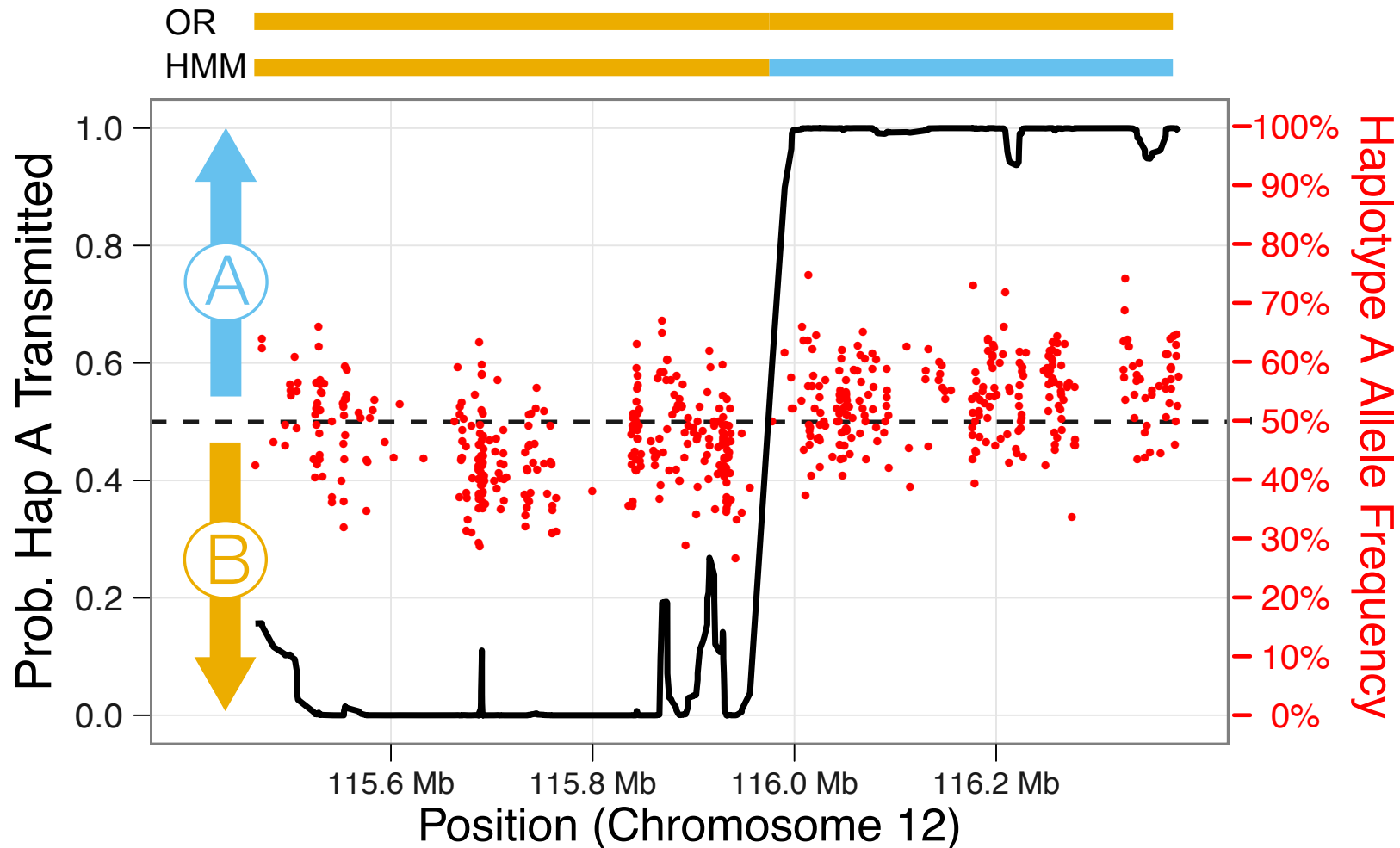
# Haplotypes to the rescue!



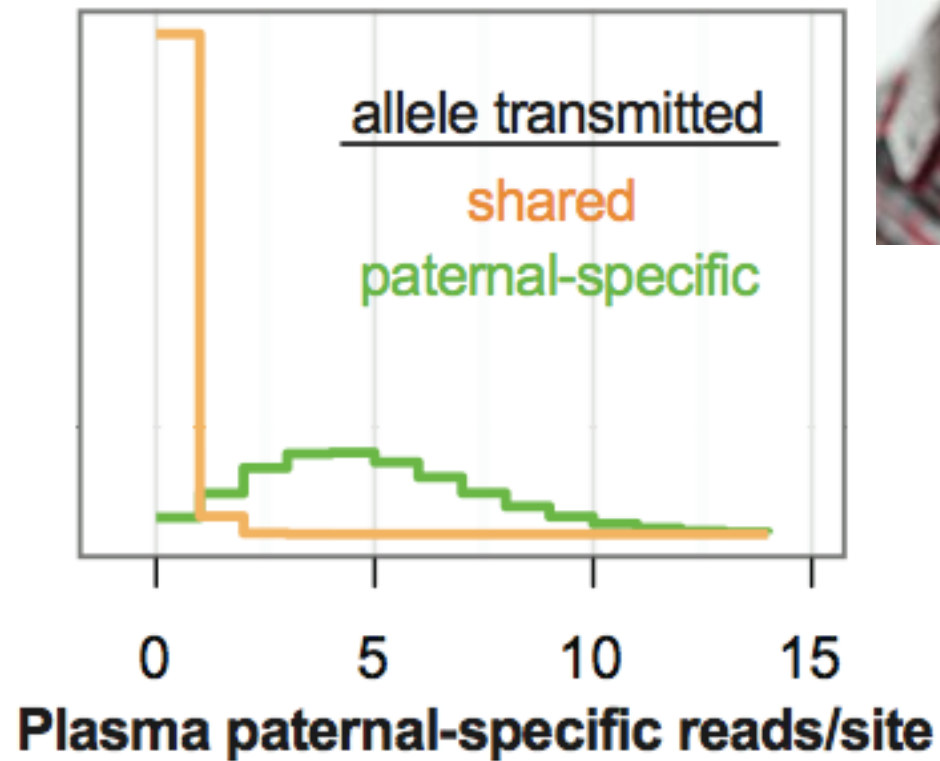
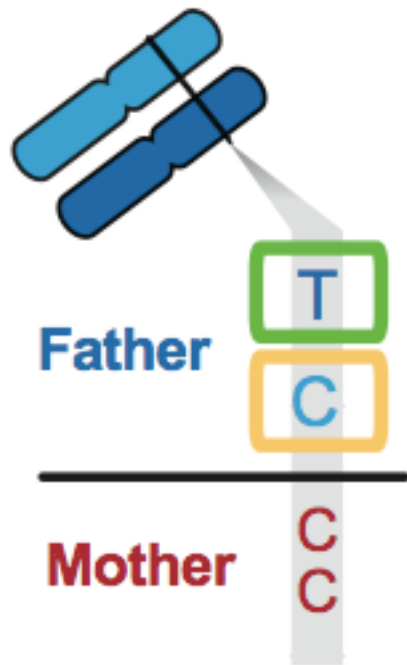
Maternal haplotype  
N50 = 326 Kbp



# HMM allows identification of switch errors and recombination events



# Paternal transmission: site-by-site

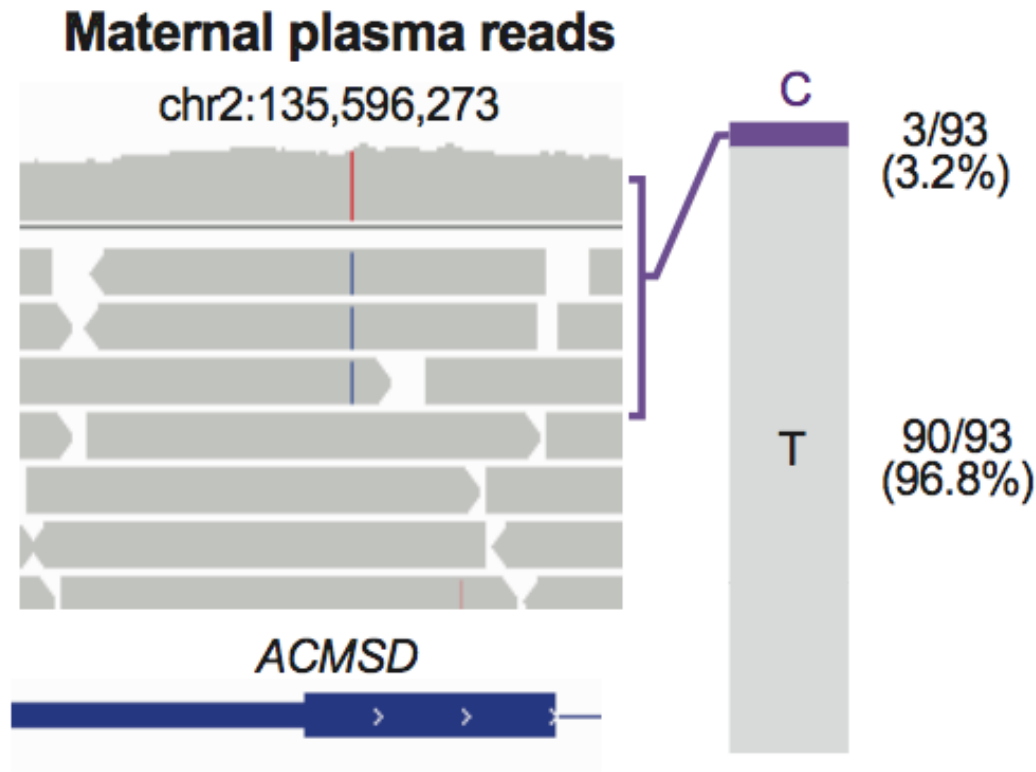


# Accuracy for predicting transmission

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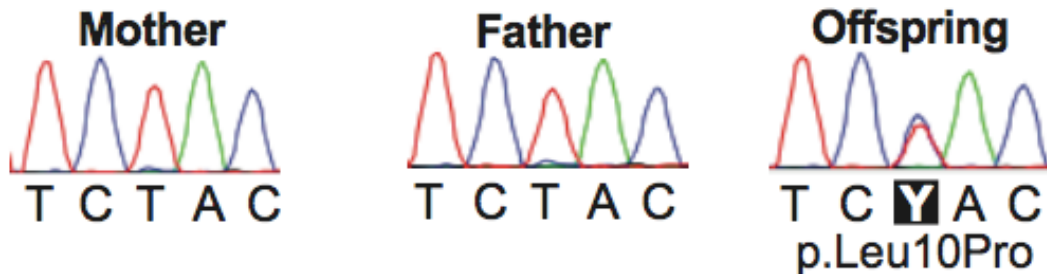
| Category     | Number of Sites    | Accuracy |
|--------------|--------------------|----------|
| Maternal het | $1.06 \times 10^6$ | 99.3%    |
| Paternal het | $1.13 \times 10^6$ | 96.8%    |
| Het/het      | $5.76 \times 10^5$ | 98.7%    |

# Identifying candidate *de novo* mutations



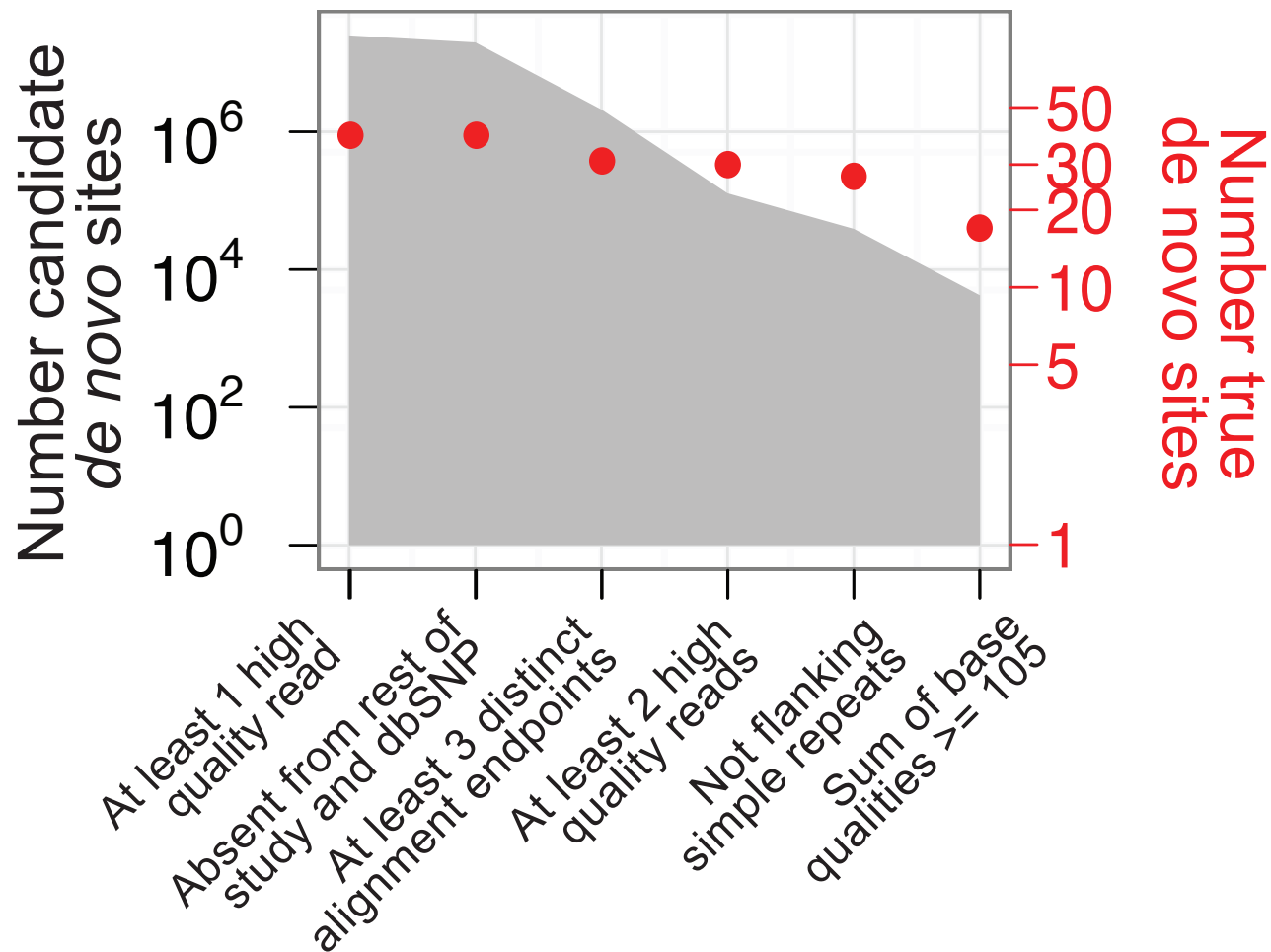
**Identified 39/44 (89%)  
“true” *de novo* sites**

**Also identified 25  
million other sites...**



# Filtering candidate *de novo* sites greatly improves signal-to-noise ratio

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# Where is this going?

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- Replace all current genetic tests that are done invasively w/ non-invasive alternative
- Non-invasive pre-natal diagnosis of Mendelian disorders more broadly?
- Important to note that many technical, analytical & practical challenges remain

## SHENDURE LAB

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David Roach

Steve Salipante

**Matthew Sndyer**

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Bethany Stackhouse

Emily Turner



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