Identifying recurrent mutations in population-level sequencing data

Kelsey Johnson SAGES June 1st, 2018

What is a recurrent mutation?

acggaagctag acggaagctag acggaagctag acggaagctag acggacgctag acggacgctag acggaagctag acggaagctag acggaagctag

What is a recurrent mutation?

acggaagctag acggaagctag acggaagctag acggaagctag acggaCgctag acggaCgctag acggaagctag acggaagctag acggaagctag



Identical by descent (IBD):



What is a recurrent mutation?

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Why care about recurrent mutations?

Recurrent mutations are a hallmark of some Mendelian diseases

| Gene | Disease |
|-------|--------------------------------------|
| CFTR | cystic fibrosis |
| SCN8A | epileptic encephalopathy |
| PKD1 | polycystic kidney disease |
| FGFR1 | Pfeiffer syndrome |
| FGFR3 | achondroplasia |
| LMNA | Hutchinson–Gilford progeria syndrome |

Recurrent mutations are used to identify genes associated with complex disease



ARTICLE

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Recurrent *de novo* mutations implicate novel genes underlying simplex autism risk

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These studies rely on family-based sequencing to identify recurrent mutations

Family-based study







Population-based study



What features can distinguish recurrent and IBD alleles?

Differences in t_{MRCA} for IBD vs. recurrent alleles



Differences in t_{MRCA} for IBD vs. recurrent alleles



Population-level sequencing data with diploid genotypes

1 0 0 2 1 0 0 0 0 0 0 0 0 0 0 0 0 Ο 0 1 0 1 0 0 0 1 0 1 1 0 0 0 0 0 0 0 0 0 0 2 0 0 0 0 0 0 $\mathbf{0}$ Ω Ω Ο Λ Ω Ω 1 Π 0 0 0 0 1 1 0 0 0 0 0 2 0 0 0 0 Ω Ω Ω 2 0 0 0 0 0 1 0 Ο Ο Ο Ο 1 0 0 0 1 0 2 0 0 0 2 0 0 1 0 2 Ο Ο Ο 0 0 Ο 0 0 1 0 0 1 0 0 0 0 1 0 0 1 0 0 0 0 Ω 0 0 0 1 1

| 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 2 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 1 |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| 0 | 1 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 1 |
| 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 2 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 2 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 2 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 2 |
| 0 | 0 | 1 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 | 0 | 2 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 2 |
| 0 | 0 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1 |



Mathieson & McVean, 2014

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 $f(d_L \mid t_{MRCA})$

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With the probability distribution of the t_{MRCA} for recurrent and IBD alleles, we can calculated the probability of d_1 :

$$f(d_L) = \int_{t_{MRCA}} f(d_L \mid t_{MRCA}) f(t_{MRCA}) dt_{MRCA}$$

Theory vs. data: recurrent mutations



Theory vs. data: IBD mutations 4 **UK10K biallelic 8ton Theoretical IBD 8ton** 3 Densit 5 0 3 **Recombination distance (cM)**

Recombination distances follow a predictable pattern

 C_3

C₃



short t_{MRCA} , long rec. dist. long t_{MRCA} , short rec. dist.

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Statistical approach

- Calculate likelihood of observed data under 2 scenarios (IBD or recurrent):
 - Recombination distances on right & left hand sides

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Statistical approach

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- Compute test statistic of composite likelihood ratio

Statistic performance depends on allele count



Application to UK10K: CpG enrichment

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- Application to empirical datasets (e.g. UK10K)
 - Updated measurement of SFS

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• Rare variant burden tests

Thank you!

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