

Missing Heritability *circa* 2009

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Missing Heritability Ten Years On
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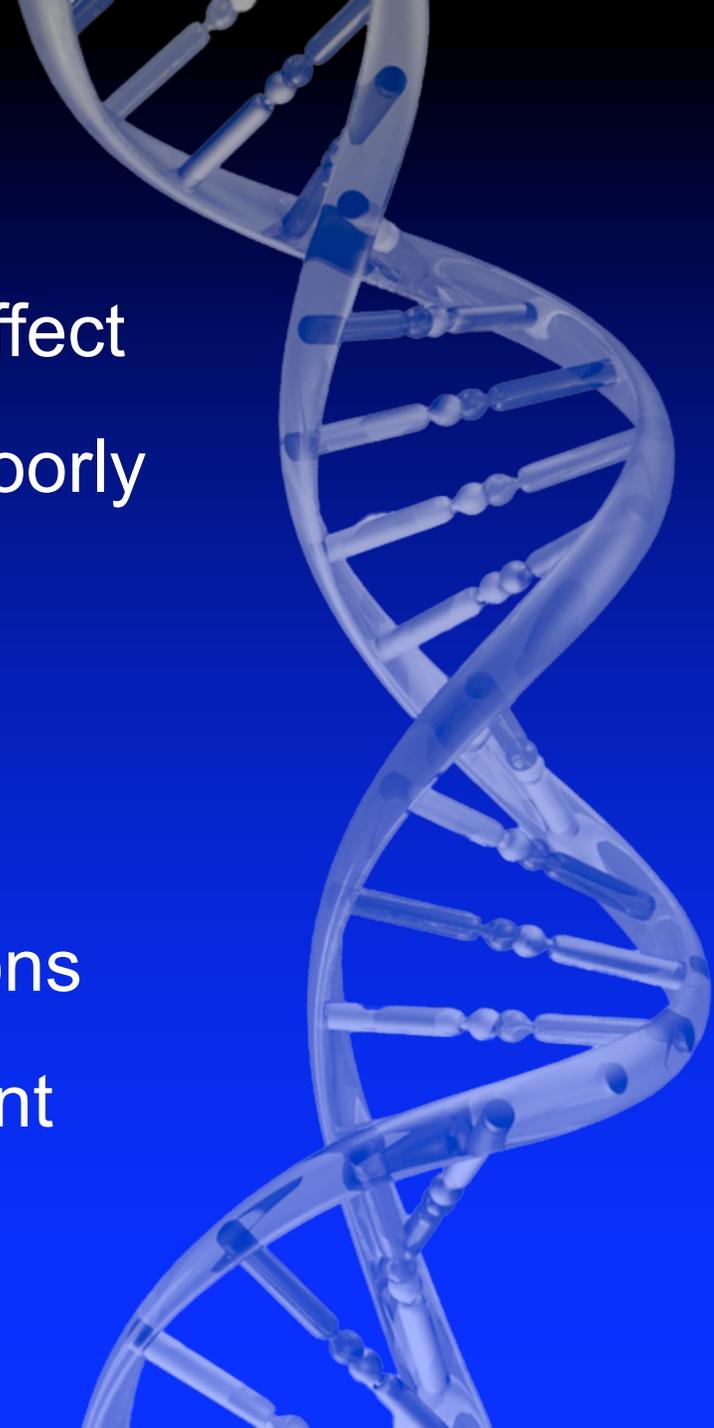
Way Back Then...

- GWAS (barely 4 years old!) had identified hundreds of associated variants
- Most GWAS variants conferred small increments in risk and explained only small proportion of h^2
- 40 loci for height explained 5% of phenotypic variance, but estimated h^2 about 80%
- Where was all this heritability?



Proposed Explanations

- Much larger numbers of variants of smaller effect
- Rarer variants (possibly with larger effects) poorly detected by available arrays
- Structural variants poorly captured by arrays
- Gene-gene interactions
- Gene-environment correlations and interactions
- Inadequate accounting for shared environment
- Over-estimation of h^2



Bold Predictions

- Expanded diversity should:
 - Identify more rare and high impact variants
 - Narrow association regions
- Isolated populations may identify unique variants
- High impact rare variants will be found underlying or co-located with common variants
- Low frequency variants could have substantial effect sizes without clear Mendelian segregation
- Numerous rare variants in a gene will have disparate effects on phenotype



Bold Predictions

- Heritability estimates in unrelated individuals could be more accurate than family-based
- Well-phenotyped groups; large, accessible families; and iterative phenotyping will help
- Improved CNV detection algorithms will produce rapid progress
- Other fruitful sources or approaches:
 - Copy-neutral SVs (inversions and translocations)
 - Chromosomal-region-specific matching
 - Exhaustive characterization of key trait(s)



Things Remaining to be Determined

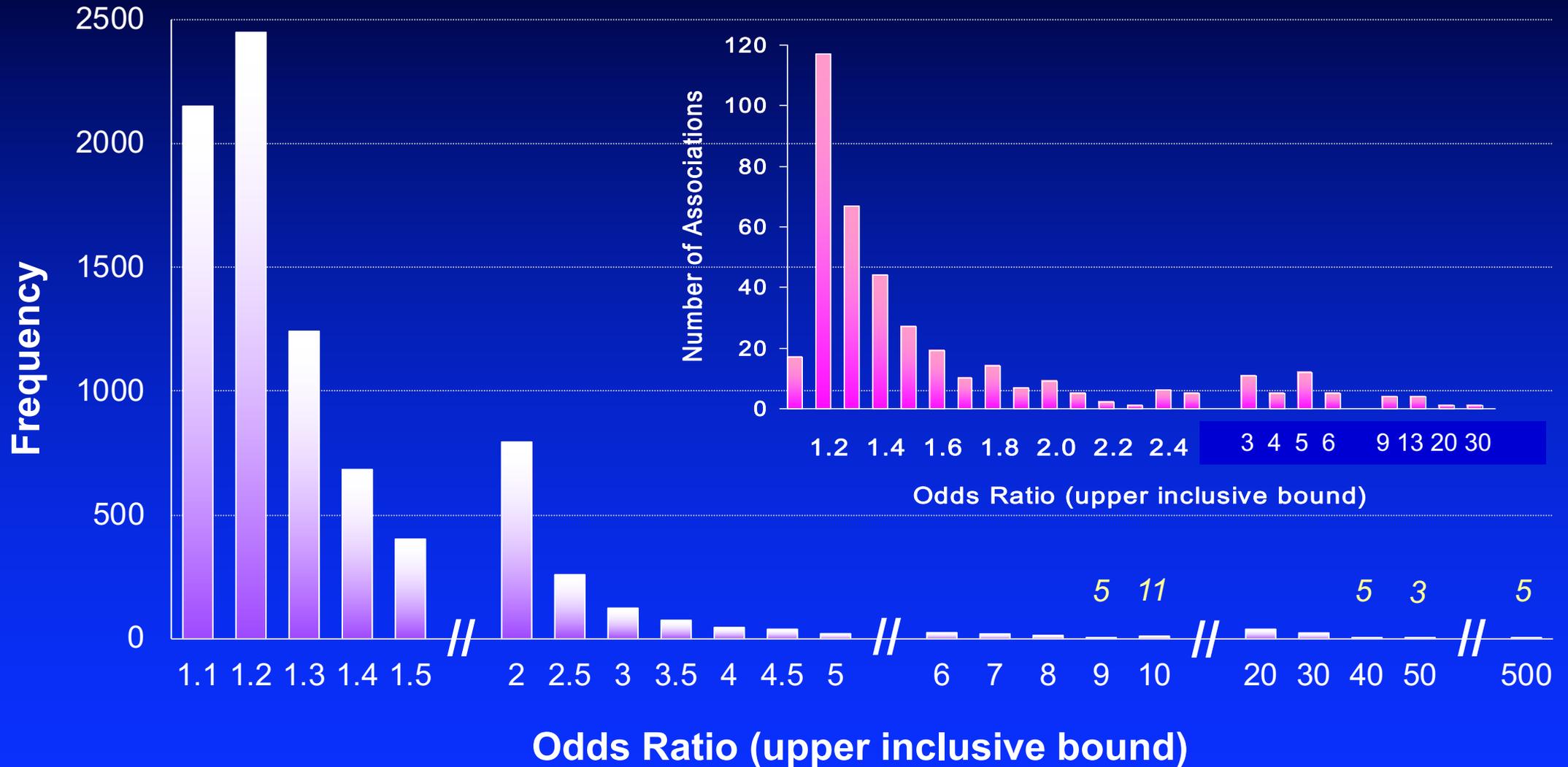
- Best approaches for:
 - Combining functional and statistical evidence
 - Using common SNPs to predict and control for differences in rare SNPs
 - Pooling: classes of variants, optimal MAF
- Has the common disease-common variant hypothesis stood the test of time?
- Is much of the information still provided by people at the extremes of trait distributions?



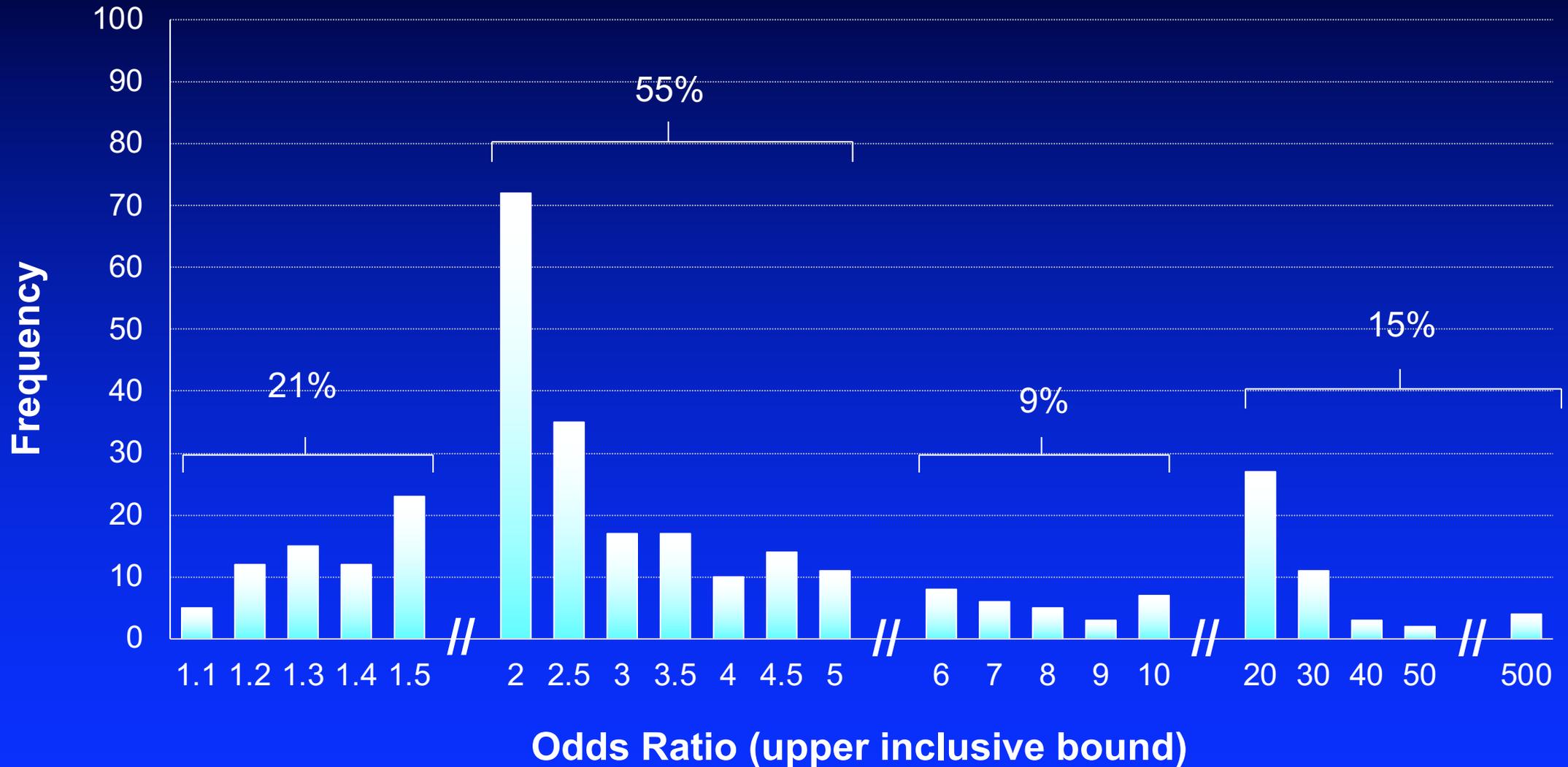
Heritability Estimates Then and Now

Trait	Source	N Alleles	% h2	Measure
AMD	Maller 2006	5	50	Sibling recurrence risk
	Fritsche 2016	52	55	Disease variability
Crohn's	Barrett 2008	32	20	Liability
	Liu 2017	203	13	Liability
SLE	SLEGEN 2008	6	15	Sibling recurrence risk
	Bentham 2017	43 (Europ)	15	Disease variability
	Molinerros 2017	78 (Asian)	28	Variance in liability
T2DM	Zeggini 2008	18	6	Sibling recurrence risk
	Mahajan 2018	243	18	Disease liability
HDL-C	Kathiresan 2008	7	5.2	Residual phenotypic variance
	Surakka 2015	62	12.8	Variance
Height	Visscher 2008	40	5	Phenotypic variance
	Nolte 2017	635	15.5	Phenotypic variance

Histogram of Odds Ratios, All MAFs

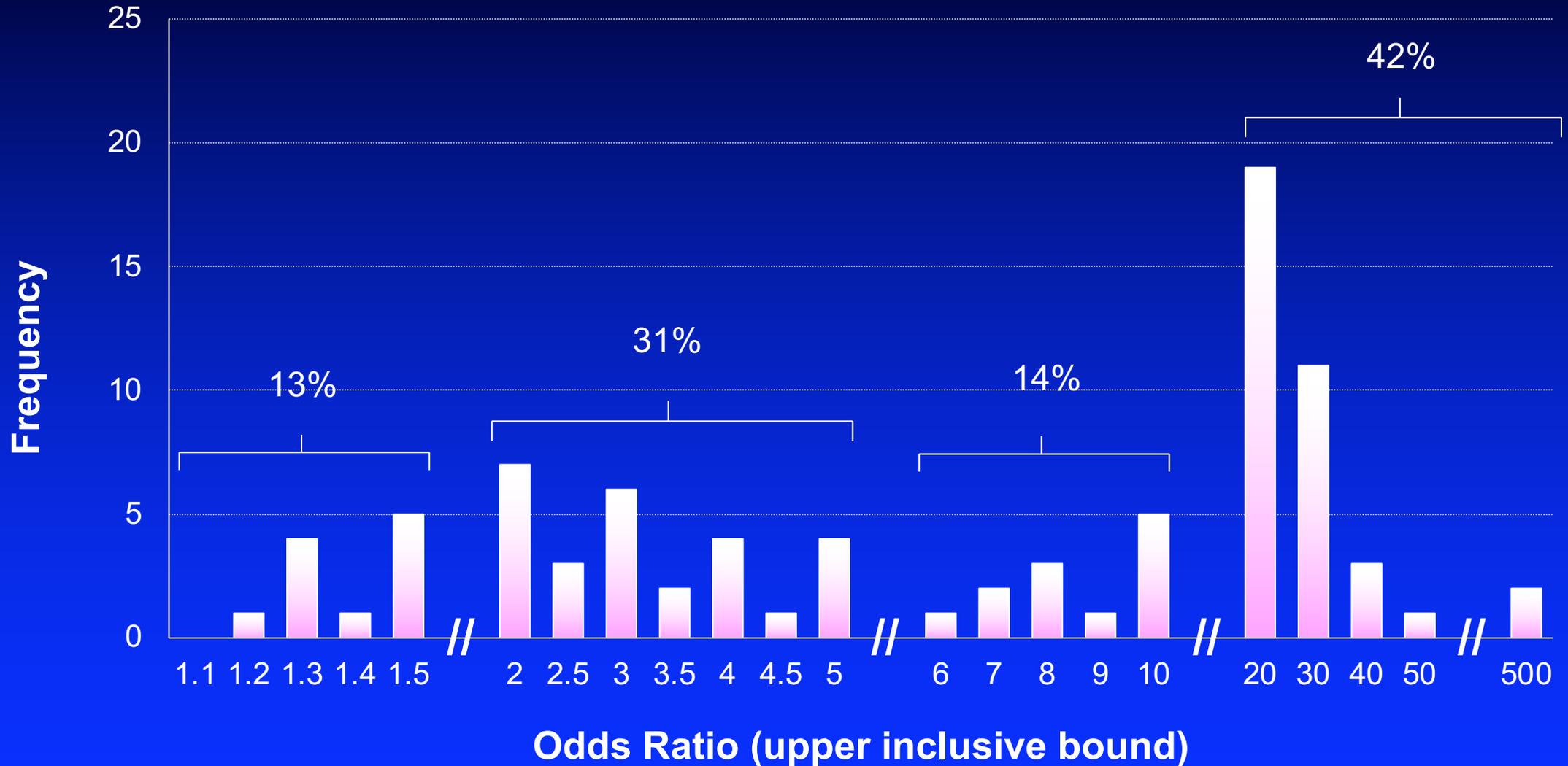


Histogram of Odds Ratios, $MAF \leq 0.05$



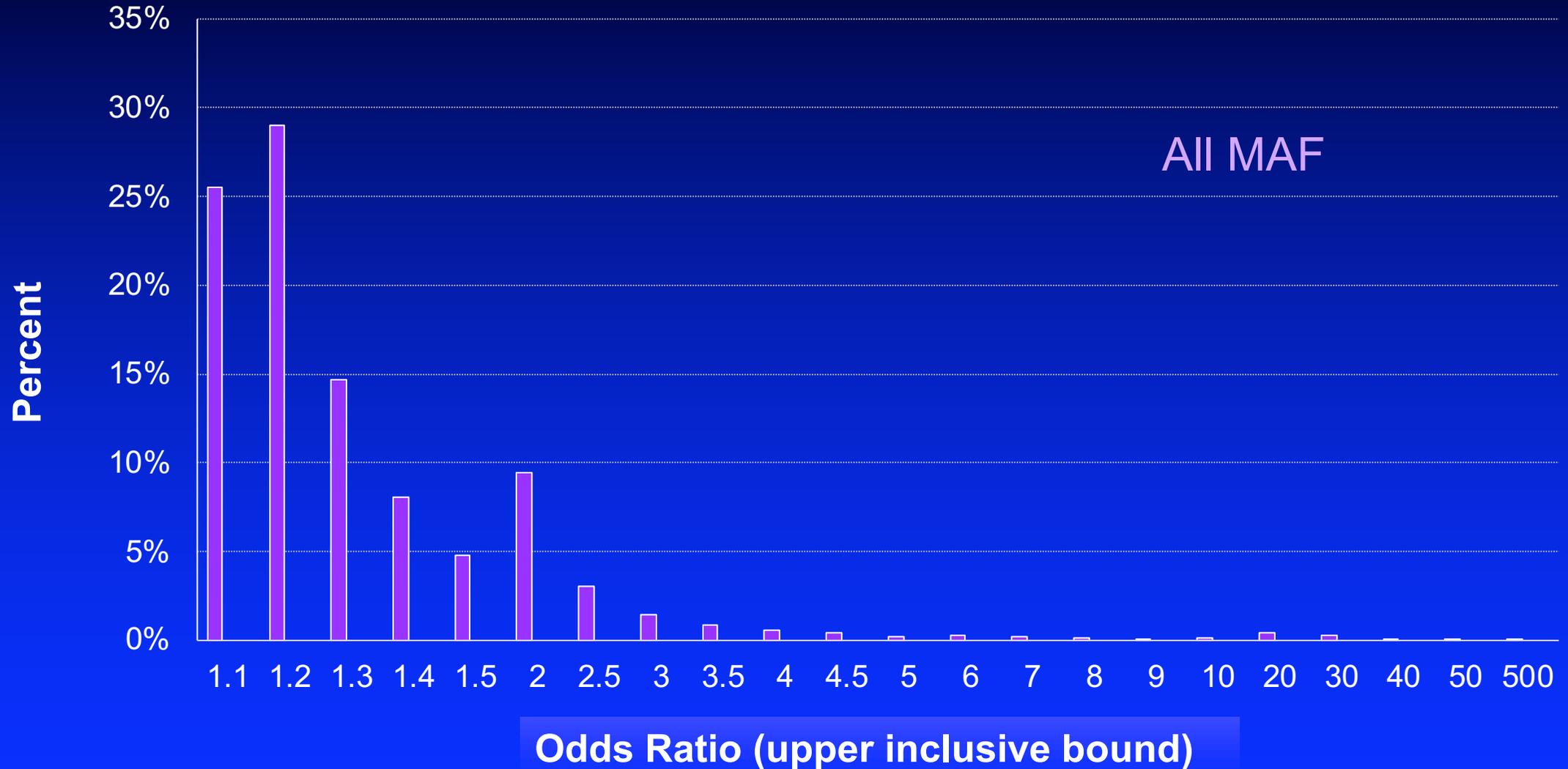
NHGRI-EBI Catalog, 323 discrete trait OR for $MAF < 0.05$, 4/26/18

Histogram of Odds Ratios, $MAF \leq 0.01$

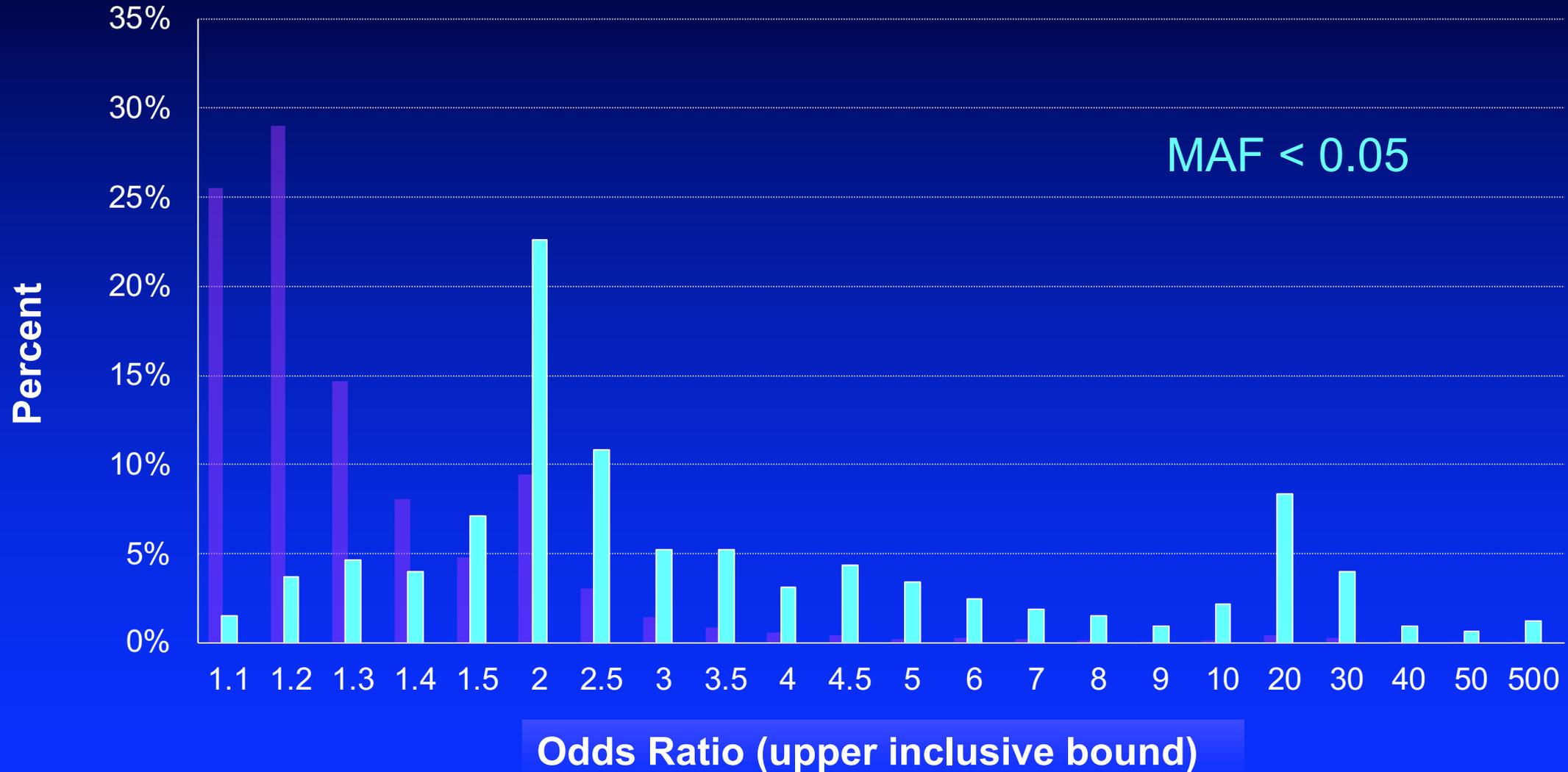


NHGRI-EBI Catalog, 86 discrete trait OR for $MAF < 0.01$, 4/26/18

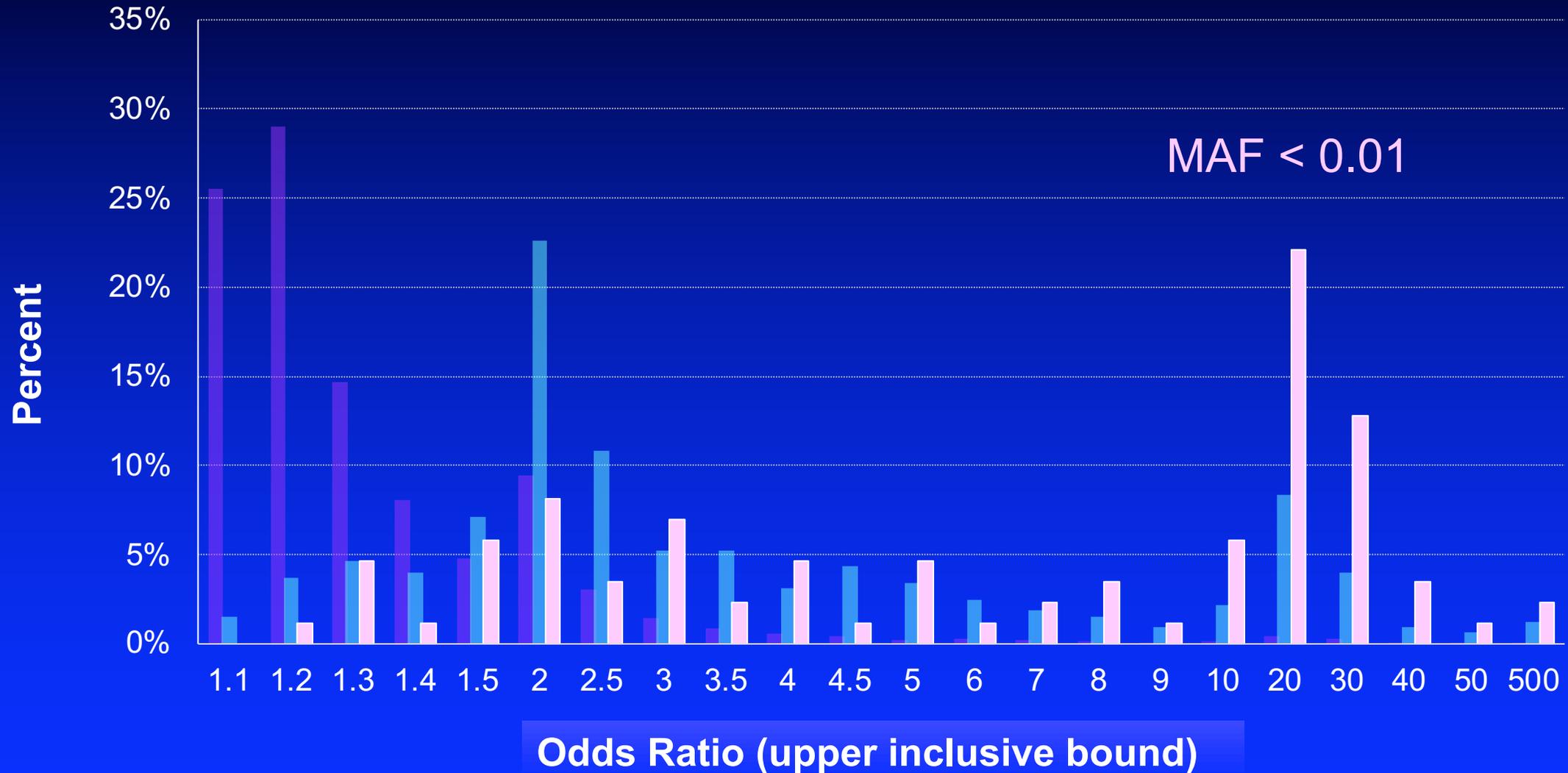
Histogram of Odds Ratios, by MAF



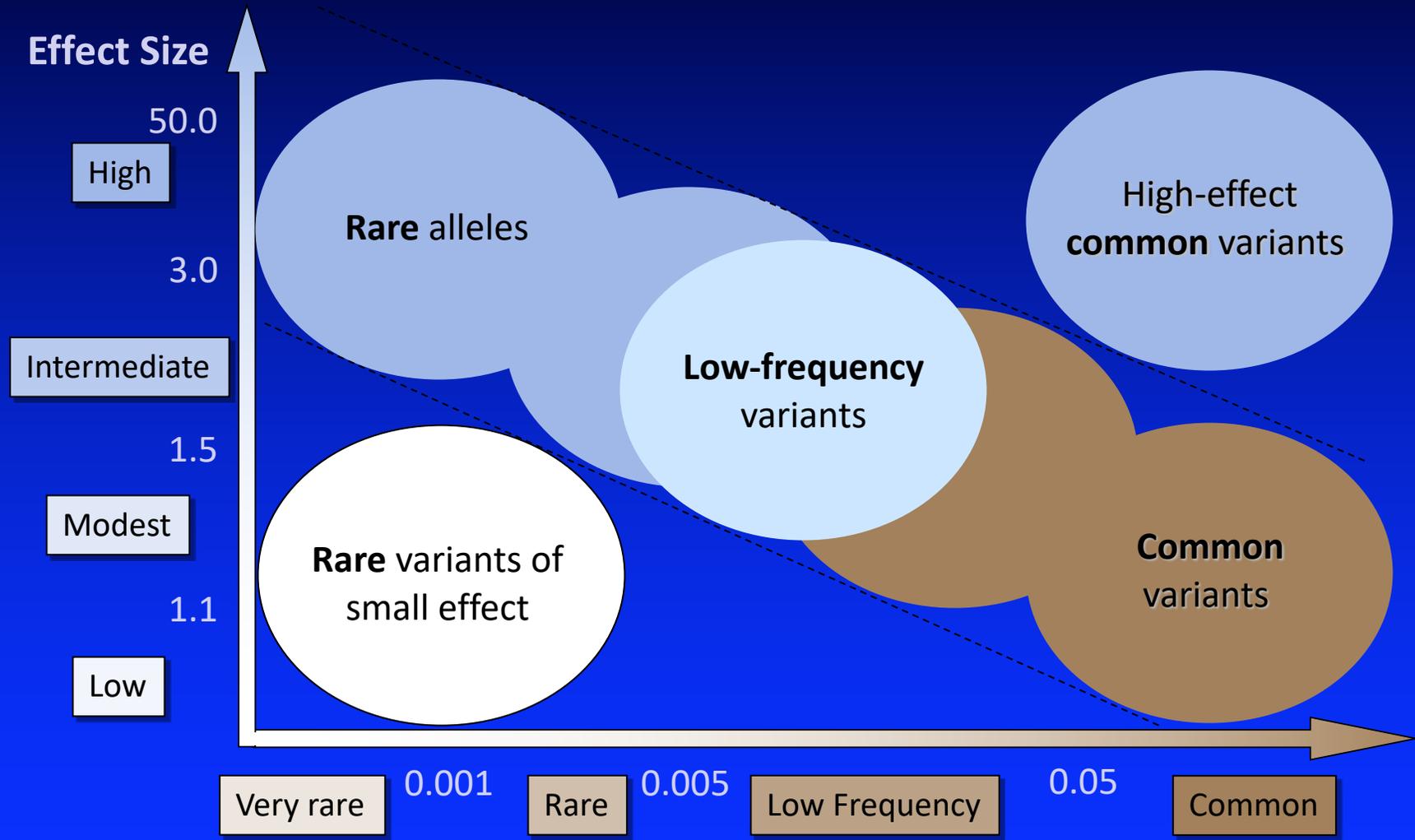
Histogram of Odds Ratios, by MAF



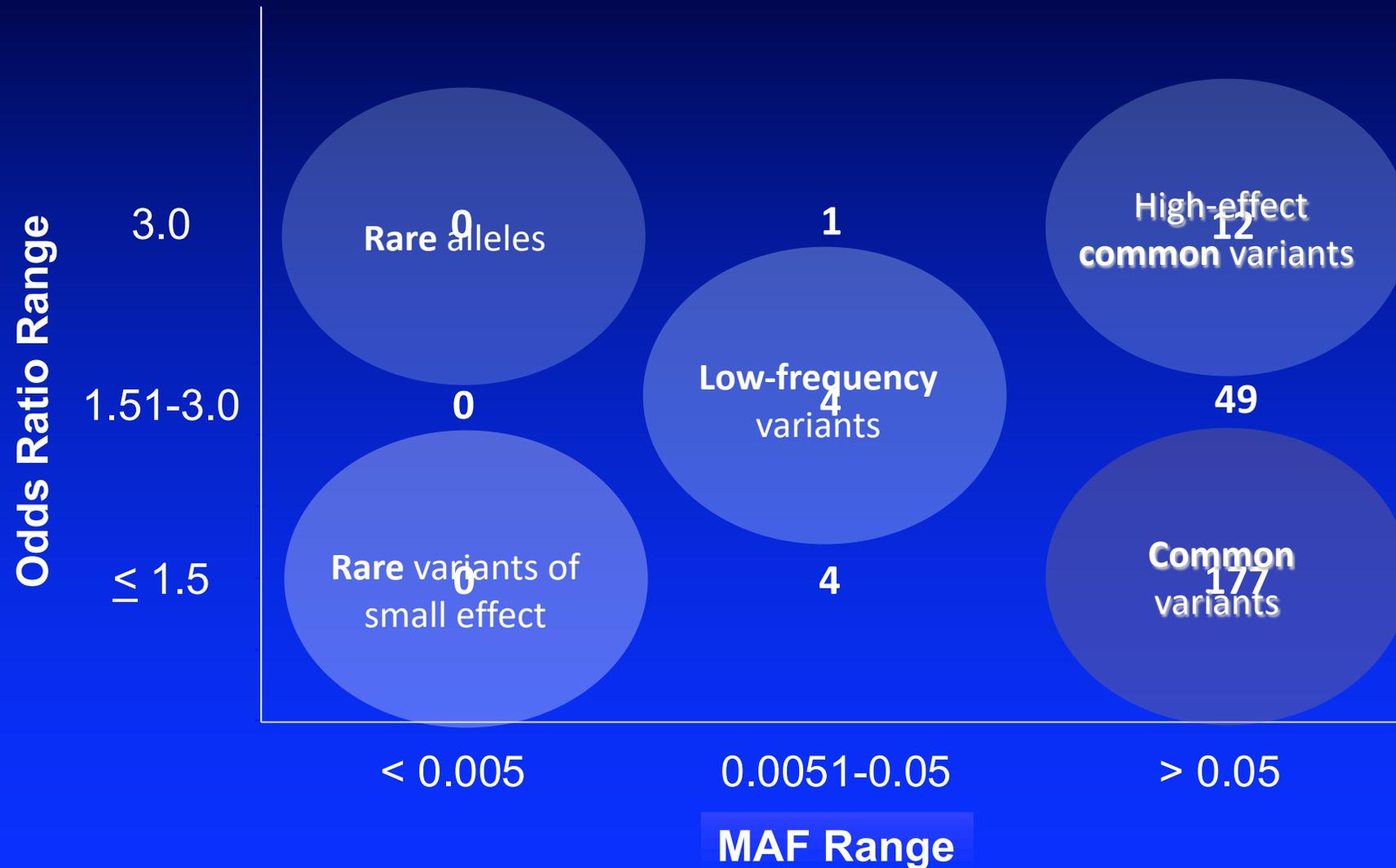
Histogram of Odds Ratios, by MAF



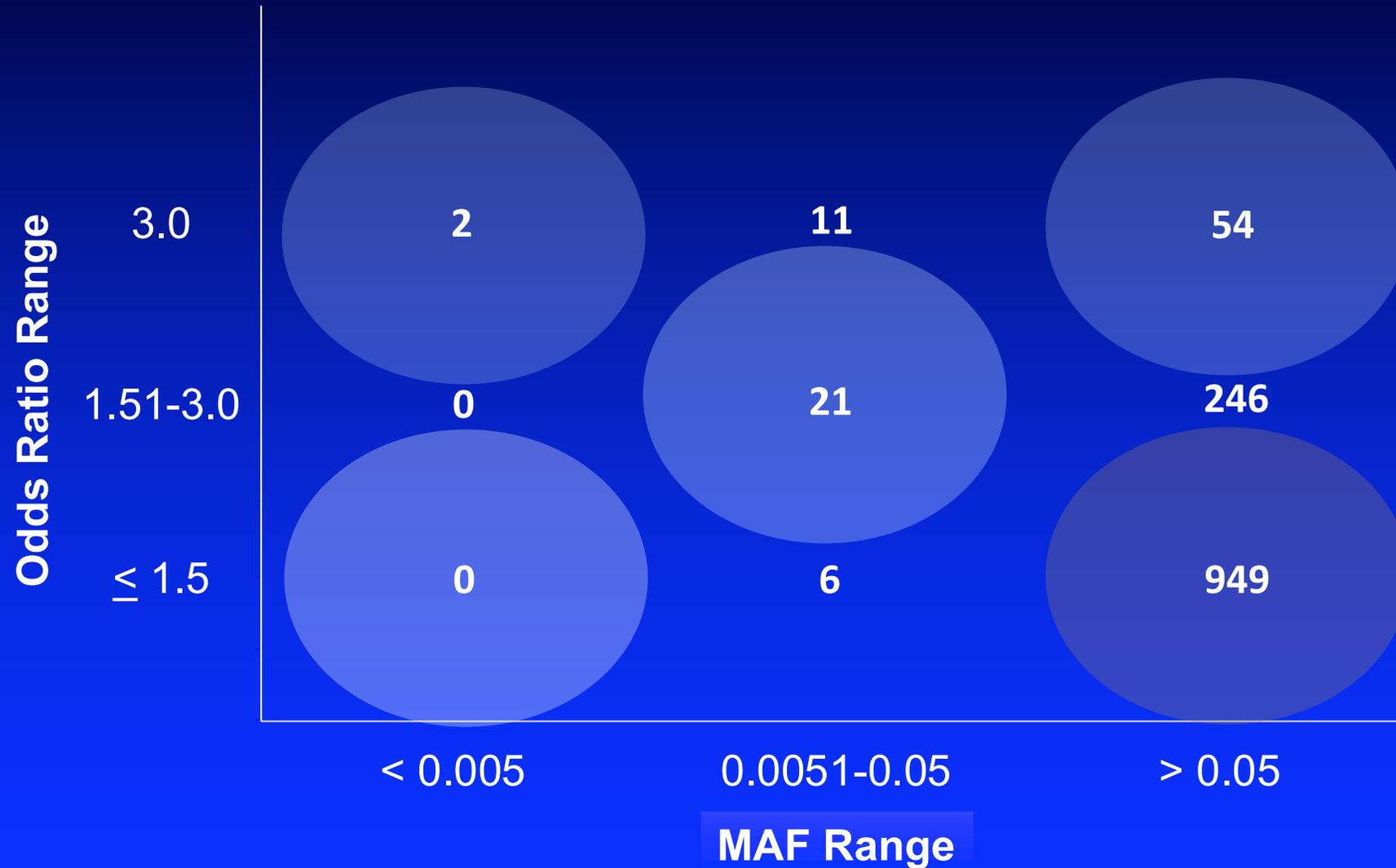
Odds Ratios by MAF



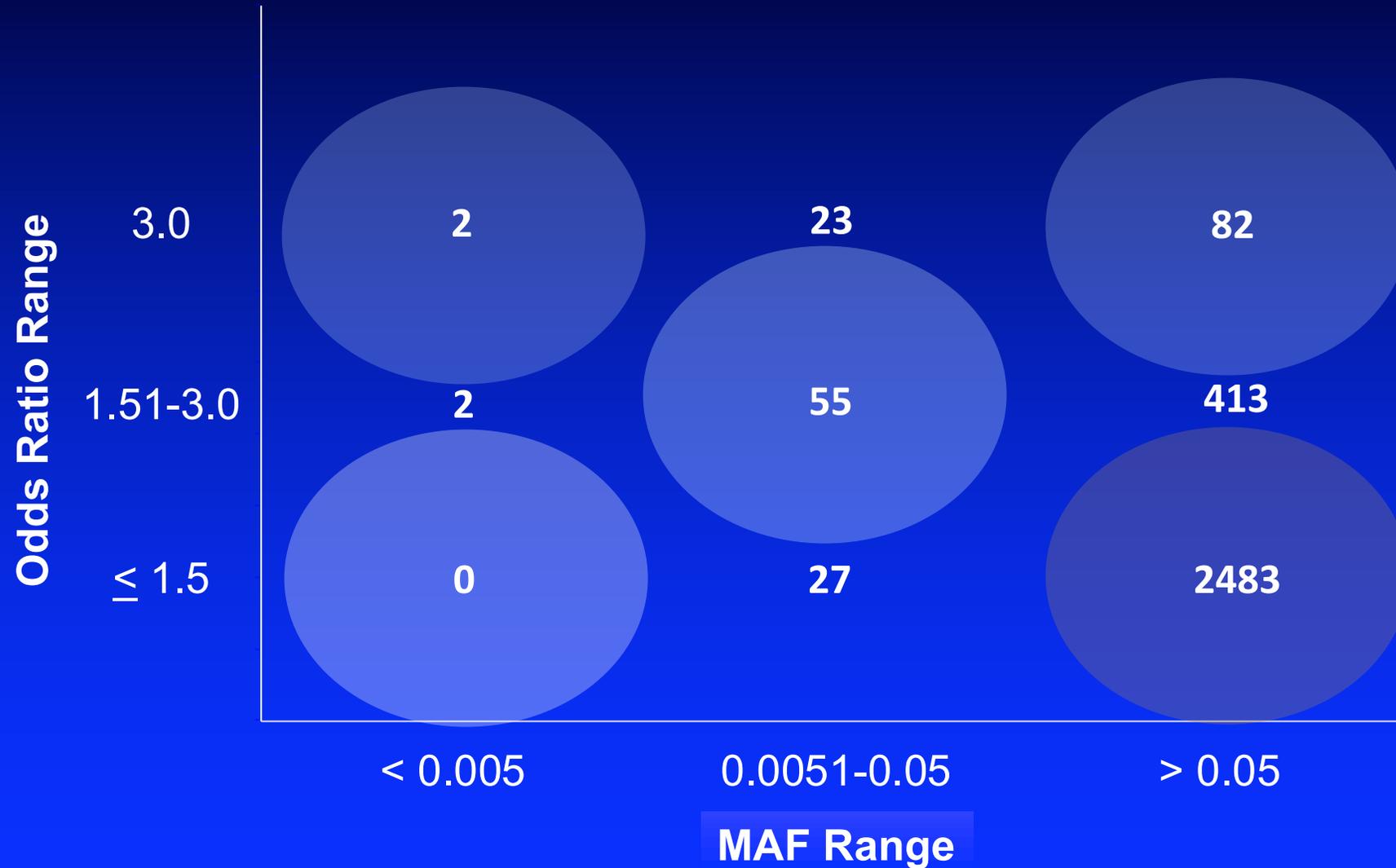
Odds Ratios by MAF, through 2008



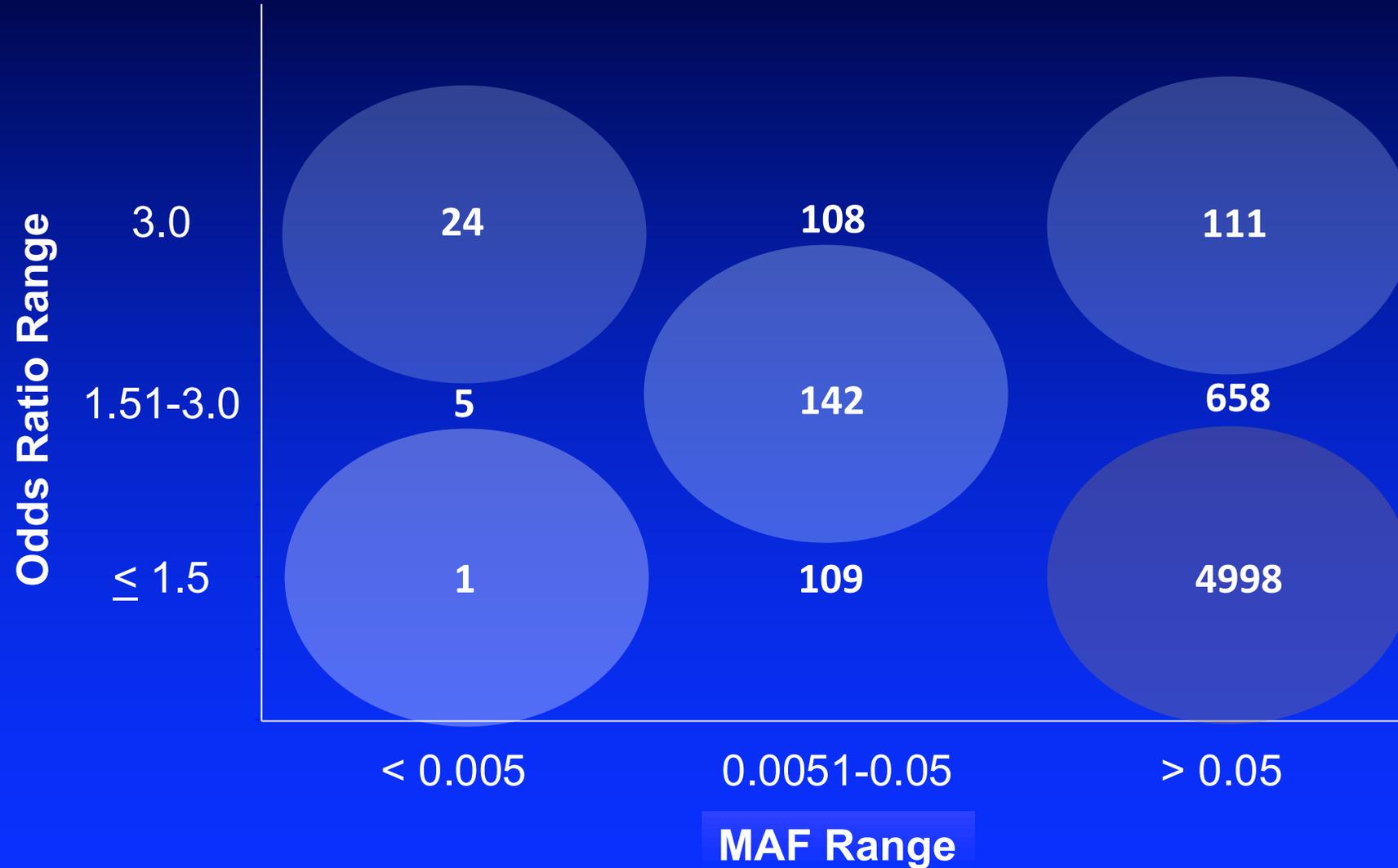
Odds Ratios by MAF, through 2011



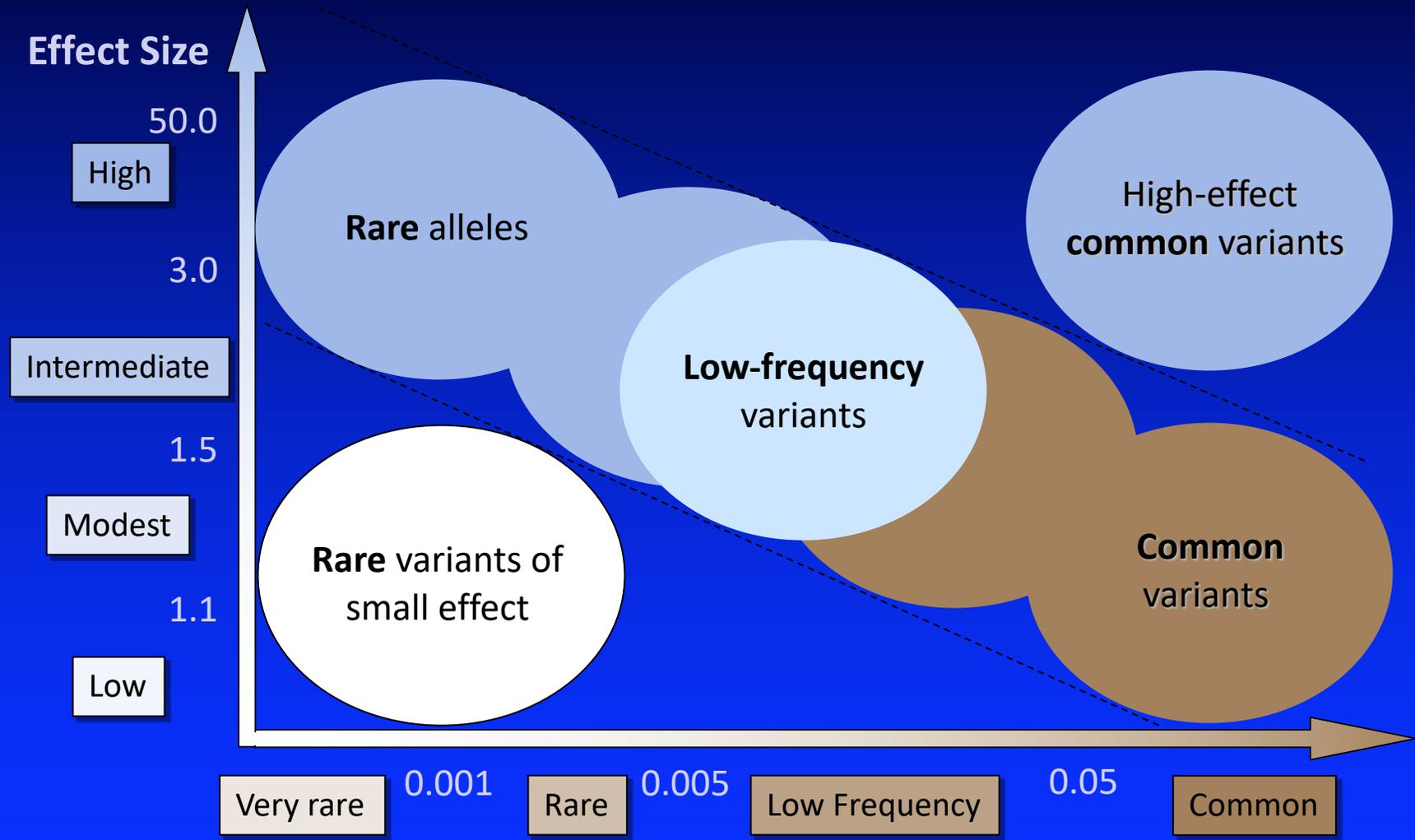
Odds Ratios by MAF, through 2014



Odds Ratios by MAF, through 2017



Odds Ratios by MAF



Workshop Objectives

To review scientific progress in the area of missing heritability and answer:

- What have we learned since 2008?
- What has been and/or will be the value of identifying the sources of missing heritability?
- What research can and/or should be pursued to determine these sources?





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