Novel sequencing-based framework for non-invasive fetal genotyping

Dayne L Filer^{1,2}, Kirk C Wilhelmsen^{1,2,3}, Bradford C Powell^{1,2}, Kelly L Gilmore⁴, Cynthia M Powell¹, Jonathan S Berg¹, Neeta L Vora⁴

1) Department of Genetics, UNC School of Medicine; 2) Renaissance Computing Institute; 3) Department of Obstetrics and Gynecology, UNC School of Medicine



Approach

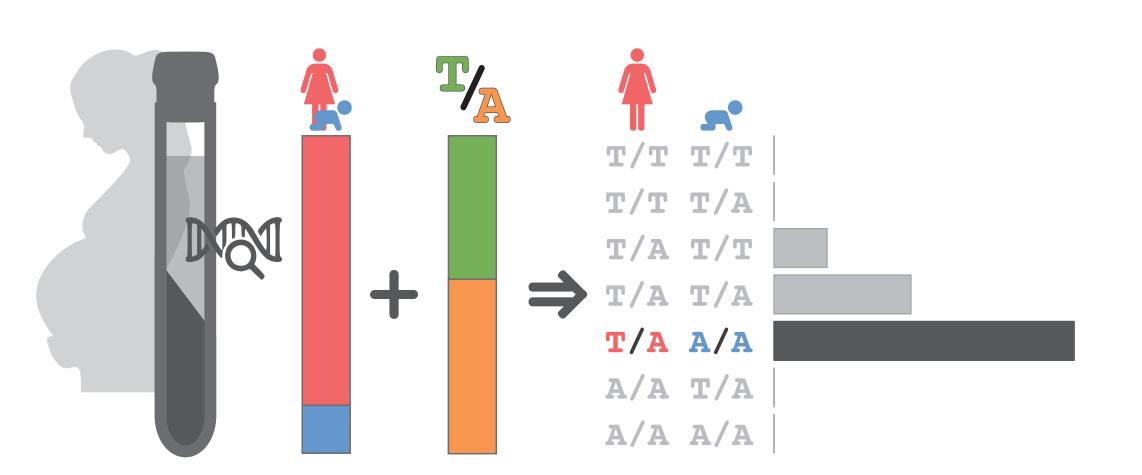


Figure 1: Using maternal cell-free DNA, make probabilistic genotype calls based on fetal fraction estimates and observed base-pair proportions. In theory, given the proportion of fetal to maternal DNA (fetal fraction), a true estimate of the allele frequency defines the maternal and fetal genotypes at that locus. We are employing two genotyping panels to interrogate selectively specific genetic variants: (1) an off-the-shelf panel of probes with even density throughout the genome to define the fetal fraction and detect chromosomal abnormalities; (2) a custom panel of probes covering the most common variants in diverse populations.

Notation & expected values

Represent maternal and fetal genotype pairs, given by the random variable G, with capital and lowercase letters, where 'A' and 'B' represent the major and minor alleles (e.g. 'AAab' represents the fetus uniquely heterozygous for the minor allele). Let X, Y be random variables for major and minor allele read counts. Define the fraction of fetal DNA and proportion of minor allele reads (PMAR) as the random variables F and M. Then, by definition, E[M] =E [Y/(X+Y)]. It's easily proven:

Binomial distribution bounds

0.2

$$E[M|G = AAab, F = f] = \frac{f}{2}$$

$$E[M|G = AAab, F = f] = \frac{f}{2}$$
 (1) $E[M|G = ABbb, F = f] = \frac{1+f}{2}$ (4)

$$E[M|G = ABaa, F = f] = \frac{1-f}{2}$$
 (2)

$$E[M|G = BBab, F = f] = \frac{2-f}{2}$$
 (5)

0.05 0.10 0.15 0.20 0.25

Fetal fraction

6000

Sequencing depth

8000 10000

$$\mathrm{E}[M|G=\mathrm{ABab},F=f]=\frac{1}{2}$$

25-30 30-40

Fetal fraction & gestational age (weeks)

10-15

Methodology

- Simulations performed based on user-defined values for the fetal fraction mean (μ_f) , fetal fraction variance (σ_f^2) , sequencing depth mean (μ_d) , sequencing depth dispersion (ϕ_d) , and the population minor allele frequency (q). Sequencing counts at each locus simulated as follows:
 - . Sample maternal-fetal genotype using Hardy-Weinberg assumptions.
 - 2. Draw the *true* fetal fraction, f, from $N(\mu_f, \sigma_f^2)$; $\sigma_f^2 := \mu_f/10$.
 - 3. Draw the sequencing depth, d, from NegativeBinomial(μ_d , ϕ_d); $\phi_d := \mu_d/200$.
 - 4. Draw y from Binomial(d, f); note x = d y.
- \hat{F} estimated using an empirical Bayesian approach to identify unique fetal alleles.
- \hat{G} estimated as:

$$\hat{g}_i = \underset{g \in G}{\operatorname{argmax}} \left\{ \mathcal{L}(g|m_g, x_i, y_i) \right\}, Y_i \sim \operatorname{Bin}(x_i + y_i, m_g)$$
(6)

Results & conclusions

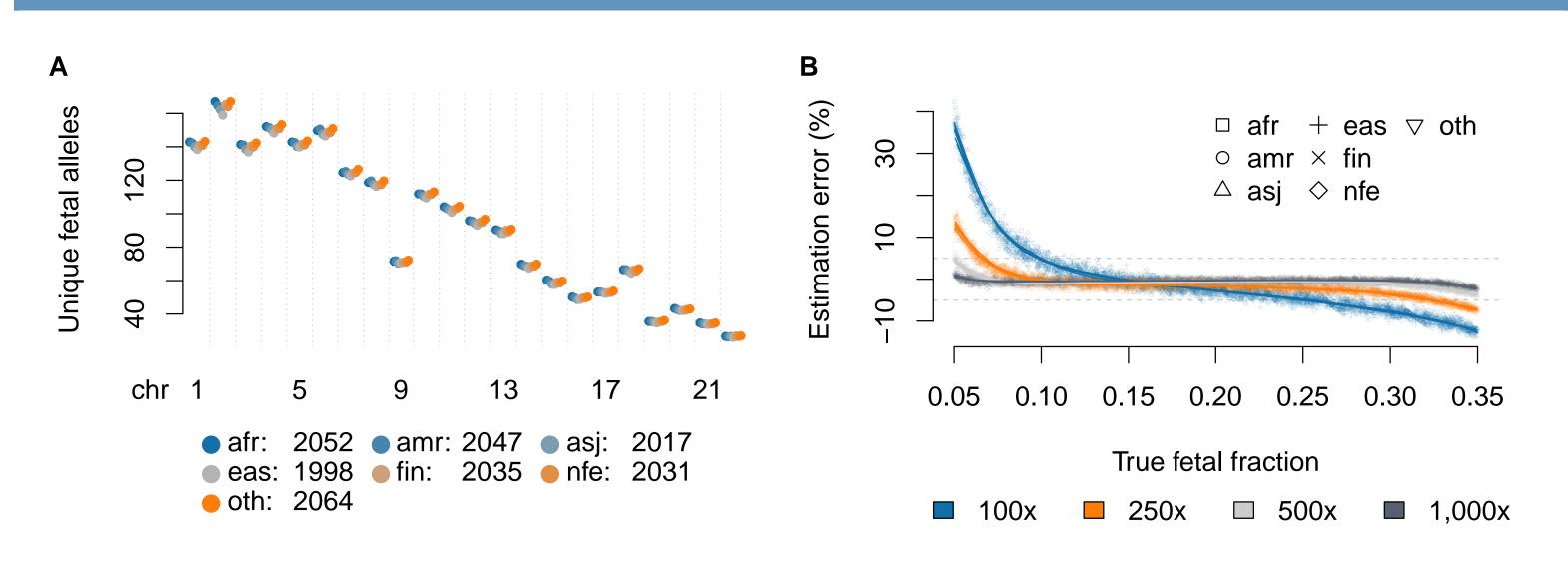


Figure 3: Fetal fraction estimation across diverse gnomAD populations. (A) Expected unique fetal alleles per chromosome in panel (1); expected genome totals given in legend. (B) Simulation results for fetal fraction estimation. Points represent individual simulations; lines show Friedman's super smoother for each population & depth.

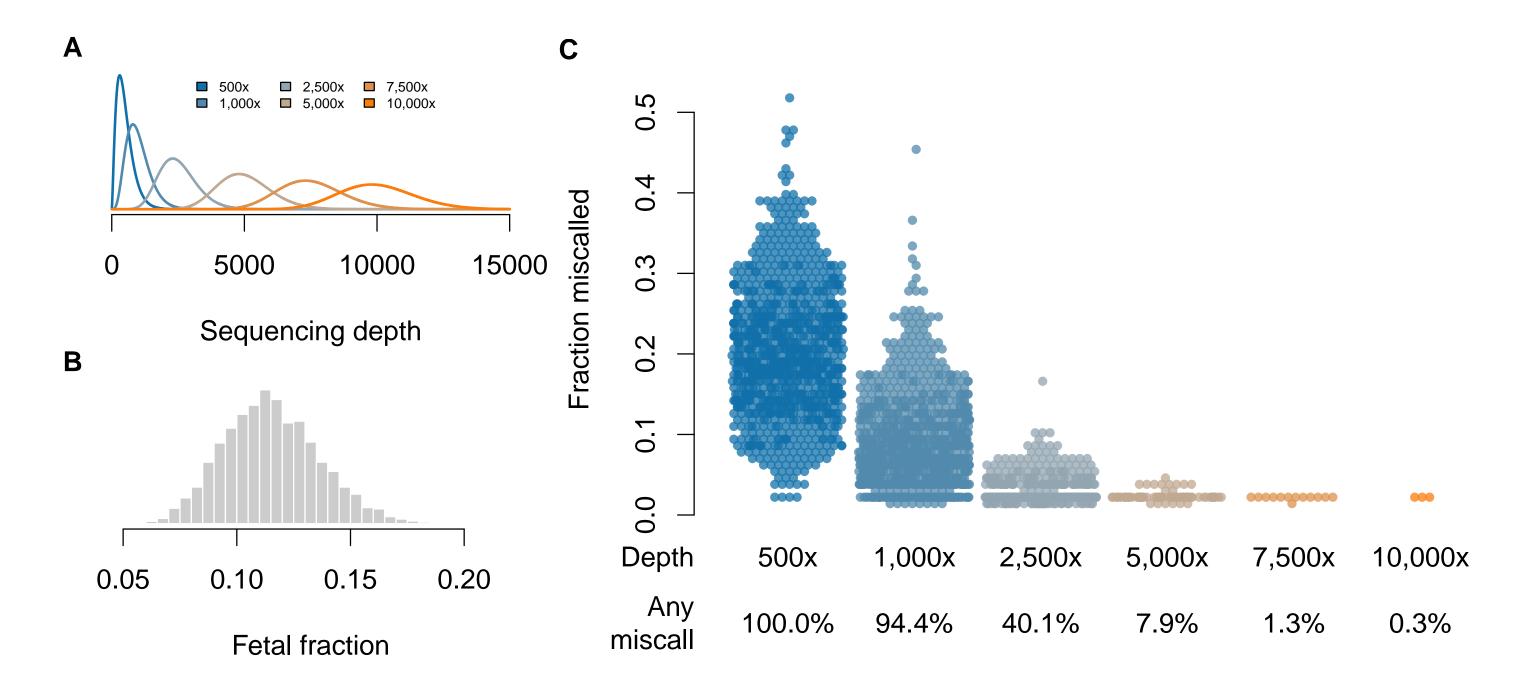
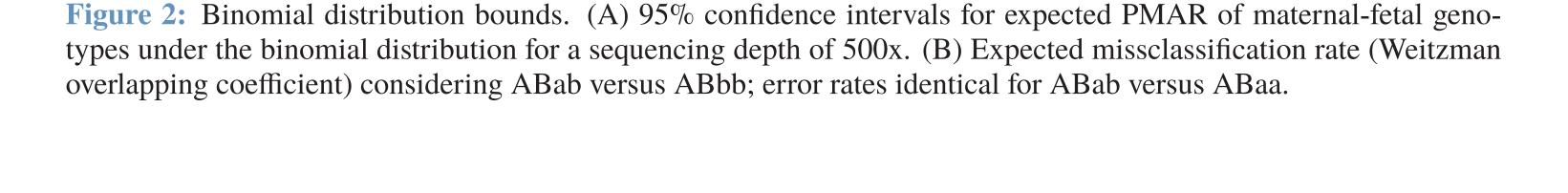


Figure 4: Genotyping accuracy by sequencing depth. (A) Read depth distributions used for simulations. (B) Fetal fraction distribution used for simulations. (C) Number of miscalled fetal genotypes when the mother is heterozygous. Each depth represents 1,0000 independent simulations.

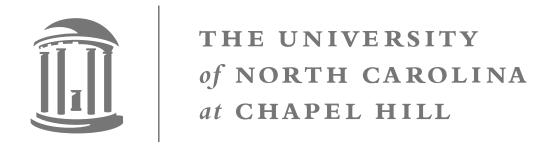
- Using an existing bait panel, simulations suggest we can reliably estimate the fetal fraction within 5% error across diverse genetic populations.
- Deep sequencing (>7,500x) coverage is necessary to accurately genotype the fetus at sites with maternal heterozygosity. Limiting the scope of variants interrogated, we expect to affordably achieve >99% fetal genotyping accuracy.
- Extending these simulation results to rare conditions (average homozygote incidence of 1:2500), we approximate the positive predictive value for fetal homozygosity to be >55%.

Simulations suggest we can genotype the fetus from maternal cell-free DNA.





AAab ABaa ABab ABbb









K23HD088742 (Vora)

0

0.0