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# GENPHEN: Genotype/Phenotype Association with Reference to Phylogeny

When genome sequences are obtained from organisms with different associated phenotypes, it should be possible to identify those sequence properties which confer a given phenotype. However, the evolutionary relationships between organisms lead to non-independence between the sequence properties. For example, the HIV-1 virus has a population structure reflecting both transmission between individuals and evolution of the HIV-1 quasispecies within each patient. This non-independence can introduce interdependence between unrelated mutations giving a false appearance of causation. These evolutionary relationships are an issue even in HIV-1 where recombination is rapid, and are pervasive in humans, where linkage disequilibrium is extensive. In human disease studies, this can sometimes be overcome by comparing siblings: alleles common only in sick siblings are likely true causative alleles. GENPHEN identifies, in a phylogenetic reconstruction, sibling lineages where the phenotype varies. Then, GENPHEN uses modified proportional hazard models to identify causal polymorphisms. GENPHENs advantages include: speed practical for high-throughput sequence data, estimates of relative strength or speed of different effects, and improved precision even vs. other tree-based methods: 50%-300% improvement in precision at same recall, either to predict experimental correlations (obtained from STRING: http://string-db.org/) or in simulations under biologically reasonable parameters on HIV quasispecies sequence trees.