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Genetic Fine-mapping with Dense Linkage Disequilibrium Blocks: genetics of nicotine dependence

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Fine-mapping is an analytical step for causal prioritization of the polymorphic variants in a traitassociated genomic region observed in genome-wide association studies (GWAS). Prioritization of causal variants can be challenging due to linkage disequilibrium (LD) patterns among hundreds to thousands of polymorphisms associated with a trait. Hence, we propose to disentangle LD patterns by a dense LD block structure. We developed an I_0 graph norm shrinkage algorithm to identify LD blocks consisting of highly correlated single nucleotide polymorphisms (SNPs). Then, we performed dense LD block guided regression shrinkage for selecting a parsimonious set of causal variants. Our approach is computationally efficient and allows fine-mapping of thousands of polymorphisms. We demonstrated its application using a large UK Biobank (UKBB) sample related to nicotine addiction. Our results suggested that polymorphic variances in both neighboring and distant variants can be consolidated into dense blocks of highly correlated loci. Using simulations to evaluate and compare the performance of this new algorithm with existing fine-mapping algorithms, we demonstrated that this method outperformed comparable finemapping methods with increased sensitivity and reduced false-positive error rate for causal variant selection. The application of this method to the smoking severity trait in the UKBB sample replicated previously reported loci and suggested the causal prioritization of genetic effects on nicotine dependency.