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### **Network biology algorithms identify biological pathways underlying cigarette smoking behaviors**

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Recent genome-wide association studies (GWAS) from the GWAS & Sequencing Consortium of Alcohol and Nicotine Use (GSCAN) have identified hundreds of genome-wide significant loci contributing to the heritability of cigarette smoking behaviors. However, the biological pathways reflected by the full repertoire of smoking-associated variants are poorly understood. To better understand the biological pathways underlying smoking behaviors, we applied the network biology algorithms GRIN and MENTOR to GSCAN GWAS summary statistics from European ancestry subjects for Smoking Cessation (SmkCess; 388,313 individuals) and Cigarettes Per Day (CigsPerDay; 326,497 individuals). We assigned genes from genome-wide significant ( $p < 5e^{-8}$ ) single nucleotide polymorphisms (SNPs) by using multiple methods, including SNP-nearest gene and H-MAGMA. Using a multiplex network of 10 gene-gene network layers from distinct types of biological experimental evidence including two dIPFC-specific layers, we applied GRIN to remove false positive genes based on the premise that correctly assigned genes would be highly interconnected in the networks, as determined by the random walk with restart (RWR) network traversal algorithm. We assigned 526 unique genes targeted by SNPs associated with CigsPerDay, and GRIN retained 235 genes based on high network interconnectivity. We assigned 310 unique genes targeted by SmkCess-associated SNPs, and GRIN retained 149 highly interconnected genes. We then used MENTOR to identify functional groupings of smoking-associated genes based on RWR-based network topology, followed by gene set enrichment of biological pathways. These systems biology approaches link these different GWAS-based genetic architectures to fundamental biological mechanisms, including fatty acid metabolism and microtubule dynamics.