

Submitter Name: Renato Polimanti  
Submitted email: [renato.polimanti@yale.edu](mailto:renato.polimanti@yale.edu)  
PI Name: Joel Gelernter  
PI email: [joel.gelernter@yale.edu](mailto:joel.gelernter@yale.edu)

## **Leveraging genome-wide data to investigate differences between opioid use vs. opioid dependence in 41,176 individuals from the Psychiatric Genomics Consortium**

Renato Polimanti<sup>1</sup>, Raymond K. Walters<sup>2</sup>, Emma C. Johnson<sup>3</sup>, Jeanette N. McClintick<sup>4</sup>, Amy E. Adkins<sup>5</sup>, Daniel E. Adkins<sup>6</sup>, Silviu-Alin Bacanu<sup>7</sup>, Laura J. Bierut<sup>3</sup>, Tim B. Bigdeli<sup>8</sup>, Sandra Brown<sup>9</sup>, Kathy Bucholz<sup>3</sup>, William E. Copeland<sup>10</sup>, E. Jane Costello<sup>11</sup>, Louisa Degenhardt<sup>12</sup>, Lindsay A Farrer<sup>13</sup>, Tatiana M. Foroud<sup>14</sup>, Louis Fox<sup>3</sup>, Alison M. Goate<sup>15</sup>, Richard Grucza<sup>3</sup>, Laura M. Hack<sup>16</sup>, Dana B. Hancock<sup>17</sup>, Sarah M. Hartz<sup>3</sup>, Andrew C. Heath<sup>3</sup>, John K. Hewitt<sup>18</sup>, Christian J. Hopfer<sup>19</sup>, Eric O. Johnson<sup>17</sup>, Kenneth S. Kendler<sup>20</sup>, Henry R. Kranzler<sup>21</sup>, Ken Krauter<sup>22</sup>, Dongbing Lai<sup>14</sup>, Pamela A. F. Madden<sup>3</sup>, Nicholas G. Martin<sup>23</sup>, Hermine H. Maes<sup>20</sup>, Elliot C. Nelson<sup>3</sup>, Roseann E. Peterson<sup>24</sup>, Bernice Porjesz<sup>8</sup>, Brien P. Riley<sup>7</sup>, Nancy Saccone<sup>25</sup>, Michael Stallings<sup>18</sup>, Tamara Wall<sup>9</sup>, Bradley T. Webb<sup>7</sup>, Leah Wetherill, the Psychiatric Genomics Consortium Substance Use Disorders Workgroup, Howard J. Edenberg<sup>4</sup>, Arpana Agrawal<sup>3</sup>, Joel Gelernter<sup>1</sup>

<sup>1</sup>Department of Psychiatry, Yale University School of Medicine; <sup>2</sup>Analytic and Translational Genetics Unit, Department of Medicine, Massachusetts General Hospital and Harvard Medical School; <sup>3</sup>Department of Psychiatry, Washington University School of Medicine; <sup>4</sup>Department of Biochemistry and Molecular Biology, Indiana University School of Medicine; <sup>5</sup>Department of Psychology, Virginia Commonwealth University; <sup>6</sup>Department of Psychiatry, University of Utah; <sup>7</sup>Virginia Commonwealth University Alcohol Research Center, Virginia Institute for Psychiatric and Behavioral Genetics; <sup>8</sup>Department of Psychiatry and Behavioral Sciences, State University of New York Downstate Medical Center; <sup>9</sup>Department of Psychiatry, University of California San Diego; <sup>10</sup>Department of Psychiatry, University of Vermont Medical Center; <sup>11</sup>Department of Psychiatry and Behavioral Sciences, Duke University Medical Center; <sup>12</sup>National Drug and Alcohol Research Centre, University of New South Wales; <sup>13</sup>Department of Medicine (Biomedical Genetics), Boston University School of Medicine; <sup>14</sup>Department of Medical and Molecular Genetics, Indiana University School of Medicine; <sup>15</sup>Department of Neuroscience, Icahn School of Medicine at Mount Sinai; <sup>16</sup>Department of Psychiatry and Behavioral Sciences, Stanford University; <sup>17</sup>Center for Omics Discovery and Epidemiology, RTI International; <sup>18</sup>Institute for Behavioral Genetics, University of Colorado Boulder; <sup>19</sup>Department of Psychiatry, University of Colorado Denver; <sup>20</sup>Virginia Institute for Psychiatric and Behavioral Genetics, Virginia Commonwealth University; <sup>21</sup>Center for Studies of Addiction, University of Pennsylvania Perelman School of Medicine; <sup>22</sup>Department of Molecular, Cellular, and Developmental Biology, University of Colorado Boulder; <sup>23</sup>QIMR Berghofer Medical Research Institute; <sup>24</sup>Department of Psychiatry, Virginia Commonwealth University; <sup>25</sup>Department of Genetics, Washington University School of Medicine

To provide novel insights into the biology of opioid dependence (OD) and opioid use (i.e., exposure, OE), we completed a genome-wide analysis comparing up to 4,503 OD cases, 4,173 opioid-exposed controls, and 32,500 opioid-unexposed controls. Among the variants identified, rs9291211 was associated with OE (a comparison of exposed vs. unexposed controls;  $z=-5.39$ ,

$p=7.2 \times 10^{-8}$ ). This variant regulates the transcriptomic profiles of SLC30A9 and BEND4 in multiple brain tissues and was previously associated with depression, alcohol consumption, and neuroticism. A phenome-wide scan of rs9291211 in the UK Biobank ( $N > 360,000$ ) found association of this variant with propensity to use dietary supplements ( $p=1.68 \times 10^{-8}$ ). With respect to the same OE phenotype in the gene-based analysis, we identified SDCCAG8 ( $z=4.69$ ,  $p=10^{-6}$ ), which was previously associated with educational attainment, risk-taking behaviors, and schizophrenia. In addition, rs201123820 showed a genome-wide significant difference between OD cases and unexposed controls ( $z=5.55$ ,  $p=2.9 \times 10^{-8}$ ) and a significant association with musculoskeletal disorders in the UK Biobank ( $p=4.88 \times 10^{-7}$ ). A polygenic risk score (PRS) based on a GWAS of risk-tolerance ( $N=466,571$ ) was positively associated with OD (OD cases vs. unexposed controls,  $p=8.1 \times 10^{-5}$ ; OD cases vs. exposed controls,  $p=0.054$ ) and OE (exposed controls vs. unexposed controls,  $p=3.6 \times 10^{-5}$ ). A PRS based on a GWAS of neuroticism ( $N=390,278$ ) was positively associated with OD (OD cases vs. unexposed controls,  $p=3.2 \times 10^{-5}$ ; OD cases vs. exposed controls,  $p=0.002$ ) but not with OE ( $p=0.671$ ). Our analyses highlight the difference between dependence and exposure and the importance of considering the definition of controls (exposed vs. unexposed) in studies of addiction.