# **RESEARCH ARTICLE**

Revised: 16 June 2021

# Polygenic risk for major depression is associated with lifetime suicide attempt in US soldiers independent of personal and parental history of major depression

Murray B. Stein<sup>1,2,3</sup> | Sonia Jain<sup>3</sup> | Laura Campbell-Sills<sup>1</sup> | Erin B. Ware<sup>4</sup> | Karmel W. Choi<sup>5</sup> | Feng He<sup>3</sup> | Tian Ge<sup>5</sup> | Joel Gelernter<sup>6</sup> | Jordan W. Smoller<sup>5</sup> | Ronald C. Kessler<sup>7</sup> | Robert J. Ursano<sup>8</sup>

<sup>1</sup>Department of Psychiatry, University of California, La Jolla, California

<sup>2</sup>VA San Diego Healthcare System, San Diego, California

<sup>3</sup>Herbert Wertheim School of Public Health and Human Longevity Science, University of California, La Jolla, California

<sup>4</sup>Institute for Social Research, University of Michigan, Ann Arbor, Michigan

<sup>5</sup>Psychiatric and Neurodevelopmental Genetics Unit, Center for Genomic Medicine, Massachusetts General Hospital, Boston, Massachusetts

<sup>6</sup>Departments of Psychiatry, Genetics, and Neuroscience, Yale University School of Medicine, New Haven, Connecticut

<sup>7</sup>Department of Health Care Policy, Harvard Medical School, Boston, Massachusetts

<sup>8</sup>Center for the Study of Traumatic Stress, Department of Psychiatry, Uniformed Services University of the Health Sciences, Bethesda, Maryland

## Correspondence

Murray B. Stein, Department of Psychiatry and School of Public Health, University of California San Diego, 9500 Gilman Drive, La Jolla, CA 92093-0855, USA. Email: mstein@health.ucsd.edu

## Funding information

National Institute of Mental Health, Grant/ Award Number: U01MH087981; U.S. Department of Defense, Grant/Award Number: HU0001-15-2-0004

# Abstract

Suicide is a major public health problem. The contribution of common genetic variants for major depressive disorder (MDD) independent of personal and parental history of MDD has not been established. Polygenic risk score (using PRS-CS) for MDD was calculated for US Army soldiers of European ancestry. Associations between polygenic risk for MDD and lifetime suicide attempt (SA) were tested in models that also included parental or personal history of MDD. Models were adjusted for age, sex, tranche (where applicable), and 10 principal components reflecting ancestry. In the first cohort, 417 (6.3%) of 6,573 soldiers reported a lifetime history of SA. In a multivariable model that included personal [OR = 3.83, 95% CI:3.09-4.75] and parental history of MDD [OR = 1.43, 95% CI:1.13-1.82 for one parent and OR = 1.64, 95% Cl:1.20-2.26 for both parents), MDD PRS was significantly associated with SA (OR = 1.22 [95% CI:1.10-1.36]). In the second cohort, 204 (4.2%) of 4,900 soldiers reported a lifetime history of SA. In a multivariable model that included personal [OR = 3.82, 95% CI:2.77-5.26] and parental history of MDD [OR = 1.42,95% CI:0.996-2.03 for one parent and OR = 2.21, 95% CI:1.33-3.69 for both parents) MDD PRS continued to be associated (at p = .0601) with SA (OR = 1.15 [95% CI:0.994-1.33]). A soldier's PRS for MDD conveys information about likelihood of a lifetime SA beyond that conveyed by two predictors readily obtainable by interview: personal or parental history of MDD. Results remain to be extended to prospective prediction of incident SA. These findings portend a role for PRS in risk stratification for suicide attempts.

## KEYWORDS

family history, major depression, polygenic risk, suicide, suicide attempt

# 1 | INTRODUCTION

Suicide is a serious societal and public health problem (Fazel & Runeson, 2020). In the United States, suicide is the 10th leading cause of death, and the second leading cause of death for individuals

between the ages of 10–34 (CDC, 2018), and rates continue to increase (Hedegaard, Curtin, & Warner, 2018). Predictions based on prior viral outbreaks and recent data suggest that suicide attempts (SAs; and, possibly, suicide deaths) will further increase as a result of the COVID-19 pandemic. Accordingly, whereas suicide has been on

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the radar of public health proponents for some time, its pervasiveness and impact on population health has been magnified of late.

Nowhere has this concern raised more alarms than in the United States military, where from 2014 to 2019, the suicide death rate for the Active Component increased from 20.4 to 25.9 suicides per 100,000 Service members (Defense, 2020). Despite a great deal of research into risk factors (Holliday et al., 2020) and substantial investments in suicide prevention (Curley et al., 2020; Stein, Kessler, & Ursano, 2019), it remains uncertain why suicidality has trended higher. These observations have called for the development of better risk prediction models that can help target those individuals at highest risk (Kessler, Bossarte, Luedtke, Zaslavsky, & Zubizarreta, 2020).

An emerging body of research has extended the search for suicide risk factors to genetic risk. Twin studies had initially set the stage for expecting to find specific genetic risk factors, providing heritability estimates of 30-55% (Tidemalm et al., 2011). It is now clear that suicidal behaviors are genetically complex—as are most neuropsychiatric traits (Wendt, Pathak, Tylee, Goswami, & Polimanti, 2020)-and the evidence suggests that many common variants each of small effect contribute to risk (with the possibility of rare variants conferring greater risk) (Sokolowski & Wasserman, 2020). Epidemiological studies have taught us that risk factors for various aspects of self-harm (i.e., ideation, attempts, and deaths) are only partially overlapping (Naifeh et al., 2020; Nock et al., 2013), and that a one-model-fits-all scenario is unlikely to be accurate. These lessons have filtered down to the genetic epidemiological study of self-harm where, increasingly, studies are each centered on one stage or type of self-harm (e.g., suicide ideation; SAs; violent SAs; and suicide deaths).

Early genetic studies of suicidality, including our own genomewide association study (GWAS) of SAs in US Army soldiers (Stein et al., 2017), tended to be underpowered (Mirkovic et al., 2016). More recent GWAS of SAs, which have achieved much larger sample sizes due to data-sharing within and across consortia, have emphasized a genetic correlation between MDD and SAs (Levey et al., 2019; Mullins et al., 2019). That is, genetic risk for depression is related to genetic risk for SAs. Similar conclusions were reached from a recent GWAS of death by suicide, which found a polygenic association with MDD (and several other behavioral traits phenotypically linked with suicide deaths) (Docherty et al., 2020).

In the present study, we used data from two cohorts evaluated in the Army Study to Assess Risk and Resilience in Servicemembers (STARRS) (Naifeh et al., 2019) to determine the extent to which polygenic risk for MDD was associated with a history of SA, over and above the robust risk associated with two depression-related characteristics that can be obtained without genetic data: personal history of MDD and parental history of MDD (Franklin et al., 2017; Ribeiro, Huang, Fox, & Franklin, 2018), asking the question: Do we get more (that could be applied clinically) from adding genetic data to what we could get from clinical observation alone? We reasoned that if personal and parental history accounted for most or all of the variance attributable to polygenic risk for MDD, then the former might serve as suitable proxies for the latter, which requires the collection of DNA and genotyping. On the other hand, if polygenic risk

for MDD conveyed information about risk for SA that could not be obtained by knowledge of personal and parental history of MDD, then it might emerge as a useful, independent (or additive) SA risk marker.

### **METHODS** 2

#### **Subjects** 2.1

Data come from two components of Army STARRS: the New Soldier Study (NSS) and the Pre/Post Deployment Study (PPDS). Detailed information about the design and conduct of STARRS is available in a separate report (Ursano et al., 2014). Soldiers from the respective studies described below are nonoverlapping as confirmed by genetic analysis.

### 2.1.1 New soldier study

The New Soldier Study (NSS) was carried out among new soldiers at the start of their basic training at three Army Installations between April 2011 and November 2012. Of 39,784 NSS respondents who completed the Self-Administered Questionnaire (SAQ), 33,088 (83.2%) provided blood samples. Funding constraints led us to genotype a subset of respondents that would be optimally informative for the aims of STARRS: All cases of reported lifetime SA and PTSD were genotyped, as were a set of controls stratum-matched on sex, service type (Regular Army vs. Guard/Reserve), and childhood adversity quartile (detailed description available on request from the authors). The NSS analyses described herein include 6.573 soldiers of European ancestry with available survey and genotype data (see below).

#### 2.1.2 Pre/post deployment study

The Pre/Post Deployment Study (PPDS) collected baseline data (also using a version of the SAQ) from U.S. Army soldiers in three Brigade Combat Teams (BCTs) during the first quarter of 2012, within approximately 6 weeks of their upcoming deployment to Afghanistan. A total of 9,949 Soldiers were present for duty in the 3 BCTs; 9,488 (95.3%) consented to participate in the survey with 8,558 (86.0%) providing complete baseline survey responses and consent to link their survey responses to their administrative records. The PPDS analyses described herein include 4,900 soldiers of European ancestry with available survey and genotype data (see below).

#### 2.2 Measures

The SAQ surveyed socio-demographic characteristics, lifetime and past-30-day mental disorders, and an array of potential risk and resilience factors.

# 2.2.1 | Suicidality assessment

Suicidal behaviors were assessed using an adaptation of the Columbia Suicidal Severity Rating Scale (C-SSRS) (Posner et al., 2011). Pertinent to the data presented here, all respondents were asked if they had a history of SA ("Did you ever make a suicide attempt [i.e., purposefully hurt yourself with at least some intention to die]?").

This information was available at baseline for NSS and PPDS, and at approximately 6- and 9-months postindex deployment for PPDS. It was also available at later dates for those NSS and PPDS soldiers who subsequently took part in a 6- to 8-year follow-up survey referred to as STARRS-LS (STARRS Longitudinal Survey), for which data collection began September 12, 2016 and ended April 10, 2018. The STARRS-LS survey was conducted using a mixed-mode design, with participants given the option of completing the interview as a self-administered survey on the web, or with an interviewer over the telephone. This selfreport information on suicidality was complemented by access to Army health records where SA(s) were recorded if medical attention was sought. For the analyses presented here, cases are soldiers with a lifetime history of SA (from either self-report or Army health records) and controls are those individuals with no lifetime history of SA.

# 2.2.2 | Personal lifetime history of major depressive disorder

The Army STARRS survey included a module, based on the Composite International Diagnostic Interview Screening Scales (CIDI-SC), for the ascertainment of a personal (lifetime) history of MDD (Kessler et al., 2013). This was determined at the baseline assessment for either NSS or PPDS.

# 2.2.3 | Parental history of major depressive disorder

The Army STARRS surveys queried parental history of MDD separately for the respondent's biological mother and father. The survey item ("Did any of them ever have times lasting two weeks or longer when they were so depressed they couldn't concentrate, felt worthless, or felt their life was not worth living?") was derived from the Family History Screen (Weissman et al., 2000).

# 2.3 | Genetic data collection and procedures

Samples were genotyped using either the Illumina OmniExpress + Exome array with additional custom content or the Illumina PsychChip. Quality control (QC) of genotype data used standard protocols as described elsewhere (Stein et al., 2016). Relatedness testing was carried out with PLINK v1.90 (Chang et al., 2015) and, for pairs of subjects with  $\pi$  of >0.2, one member of each relative pair was removed at random.

Genotype imputation was performed with a 2-step prephasing/ imputation approach with a reference multi-ethnic panel from 1000 Genomes Project (August 2012 phase 1 integrated release; 2,186 phased haplotypes with 40,318,245 variants). We removed SNPs that were not present in the 1,000 Genomes Project reference panel, had nonmatching alleles to 1000 Genome Project reference, or with ambiguous, unresolvable alleles (AT/GC SNPs with minor allele frequency [MAF] >0.1). A total of 664,457 SNPs for the Illumina OmniExpress array and 360,704 for the Illumina PsychChip entered the imputation.

We performed the following QC procedures to obtain the genotype data for population assignment and principal components analysis (PCA). We retained autosomal SNPs with missing rate <0.05; samples with individual-wise missing rate <0.02; SNPs with missing rate <0.02; and SNPs with missing rate difference between cases and controls <0.02. After QC, we merged our study samples with HapMap3 samples. We retained SNPs with MAF ≥0.01 and performed LD pruning at  $R^2$  >0.02. Finally, we excluded SNPs in MHC region (Chr 6:25–35 Mb) and Chr 8 inversion (Chr 8:7–13 Mb).

Population (ancestry) assignment was conducted using standard methods (see Stein et al., 2017) for details).

# 2.4 | Statistical analysis

# 2.4.1 | Polygenic risk scores

PRS analyses for the SA phenotype were conducted using PRS-CSauto, a method that uses a Bayesian regression framework and places a continuous shrinkage prior on the effects sizes of SNPs in the discovery GWAS summary statistics (Ge, Chen, Ni, Feng, & Smoller, 2019). PLINK 2.0 (Chang et al., 2015) was used to weight all SNPs by their effect sizes calculated using PRS-CS-auto and sum all SNPs into PRS for each individual in the target cohort. PRS analyses were conducted in the European ancestry subsamples only because of the unavailability of reference GWAS data for other populations (Choi, Mak, & O'Reilly, 2020; Peterson et al., 2019). PGC-MDD summary statistics (Howard et al., 2019) (N = 807,553; 246,363 cases, 561,190 controls) were used as the discovery GWAS; 1000 Genomes European was used as the LD reference panel. PRS were standardized within each study (NSS and PPDS) and entered into univariate or multivariable logistic models, controlling for 10 ancestral principal components, age, tranche (for NSS, which had been genotyped in two tranches) and sex. Odds ratios and confidence intervals are provided for these analyses, which build from univariate to multivariable and are therefore not independent; multiple testing correction was, accordingly, not applied.

# 3 | RESULTS

# 3.1 | Findings in NSS

The NSS sample consisted of 417 lifetime SA cases (6.3%) and 6,156 controls with no history of lifetime SA. The sample was 15% female.

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Mean age of the sample was 20.8 (SD 3.3) years; median = 20 years, interquartile range: 19-22 years. Lifetime history of MDD was positive in 1086 (17.0% of) soldiers; 1,532 (23.3%) and 575 (8.8%) reported a family history for one or both parents, respectively (Table 1).

In univariate analyses, the MDD PRS was significantly associated with lifetime history of SA (OR = 1.29 [95% CI: 1.16-1.43]). MDD PRS continued to be significantly associated with SA (OR = 1.23 [95% CI: 1.11–1.37) in a multivariable model that included personal history of MDD (OR = 4.01 [95% CI: 3.24-4.97]); there was no significant interaction between these two variables. Similarly, MDD PRS was significantly associated with SA (OR = 1.27 [95% CI: 1.15-1.41) in a multivariable model that included parental history of MDD (OR = 1.57 [95% CI: 1.24-1.98] for one parent and OR = 2.00 [95% CI: 1.47-2.73] for both parents).

In a multivariable model that included all the aforementioned predictors (personal history of MDD [OR = 3.83, 95% CI: 3.09-4.75]; parental history of MDD [OR = 1.43, 95% CI: 1.13-1.82 for one parent and OR = 1.64, 95% CI 1.20-2.26 for both parents) MDD PRS continued to be significantly associated with SA (OR = 1.22 [95% CI: 1.10-1.36] (Table 2).

### 3.2 Replication in PPDS

The PPDS sample consisted of 204 lifetime SA cases (4.2%) and 4,696 controls with no history of lifetime SA. The sample was 4% female, reflecting the overwhelming male majority being deployed to combat at the time of the survey. Mean age of the sample was 25.9 (SD 5.9) years; median = 24 years, interguartile range: 21–29 years. Lifetime history of MDD was positive in 551 (11.2% of) soldiers; 764 (15.6%) and 194 (4.0%) reported a family history for one or both parents. respectively (Table 1).

In univariate analyses, the MDD PRS was significantly associated with lifetime history of SA (OR = 1.18 [95% CI: 1.03-1.36]). MDD PRS continued to be associated (at p = .0533) with SA (OR = 1.15 [95% CI: 0.998-1.33) in a multivariable model that included personal history of MDD (OR = 4.32 [95% CI: 3.17-5.88]); there was no significant interaction between these two variables. Similarly, MDD PRS was significantly associated with SA (OR = 1.17 [95% CI: 1.02–1.35) in a multivariable model that included parental history of MDD (OR = 1.79 [95% CI: 1.27–2.53] for one parent and OR = 3.18 [95% Cl: 1.95-5.18] for both parents).

In a multivariable model that included all the aforementioned predictors (personal history of MDD [OR = 3.82, 95% CI: 2.77-5.26]; parental history of MDD [OR = 1.42, 95% CI: 0.996-2.03 for one parent and OR = 2.21, 95% CI 1.33–3.69 for both parents) MDD PRS continued to be associated (at p = .0601) with SA (OR = 1.15 [95% CI: 0.994-1.33] (Table 3).

#### 4 DISCUSSION

Recent studies have shown that genetic liability for MDD is associated with risk for SA (Levey et al., 2019; Mullins et al., 2014; Mullins et al., 2019; Ruderfer et al., 2020) as well as for suicide death (Docherty et al., 2020). What has not, to the best of our knowledge, been shown is the extent to which genomic information about MDD risk-conveyed through PRS-is associated with SA risk above and beyond other more readily collected sources of information about MDD risk such as personal and parental history of MDD.

In this study of United States Army soldiers, we found polygenic risk for MDD was associated with lifetime risk of SA as determined by a combination of self-report and Army medical records. Importantly,

	Control	Case	Total	TABLE 1	Parental history of ma
New soldier study				depression	
Neither	4,235 (68.8%)	231 (55.4%)	4,466 (67.9%)		
One	1,405 (22.8%)	127 (30.5%)	1,532 (23.3%)		
Both	516 (8.4%)	59 (14.1%)	575 (8.8%)		
Total	6,156 (100.0%)	417 (100.0%)	6,573 (100%)		
Pre-post deployment study					
Neither	3,806 (81.0%)	136 (66.7%)	3,942 (80.4%)		
One	717 (15.3%)	47 (23.0%)	764 (15.6%)		
Both	173 (3.7%)	21 (10.3%)	194 (4.0%)		
Total	4,696 (100.0%)	204 (100.0%)	4,900 (100.0%)		

Predictor	Odds ratio (OR)	OR 95% CI	p-value
Lifetime major depression	3.83	3.09-4.75	<.0001
One parent with major depression	1.43	1.13-1.82	.0031
Both parents with major depression	1.64	1.20-2.26	.0021
Major depression polygenic risk score	1.22	1.10-1.36	.0002

TABLE 2 Multivariable model for lifetime suicide attempt in New Soldier Study (NSS)

TABLE 3 Multivariable model for Predictor Odds ratio (OR) OR 95% CI p-value prediction of lifetime suicide attempt in Lifetime major depression 3.82 2.77-5.26 <.0001 pre-post deployment study (PPDS) One parent with major depression 1.42 0.996-2.03 .0525 Both parents with major depression 2.21 1.33-3.69 .0023

1.15 0.994-1.33 .0601 Major depression polygenic risk score

we were able to show that MDD PRS added to the predictive utility of two readily obtainable self-report parameters of SA risk, personal (lifetime) and family history of MDD. Whereas it might have been expected that there would be a higher MDD PRS in those with a positive family history of MDD (Andlauer et al., 2021), it is noteworthy that MDD PRS added to the explanatory power of that self-report parameter alone. The same is true of personal history of MDD, on which MDD PRS is trained.

Strengths of the study are the relatively large sample sizes, the systematic ascertainment of SA through surveys and access to health records, and the ability to test for replication of findings across two cohorts. A weakness is the possibility of incomplete ascertainment (e.g., if soldiers who left the Army were not part of STARRS-LS, and they attempted suicide after leaving the Army, they would be misclassified as controls), which would have biased findings toward the null. Another potential weakness is that reports of SA by self-report and health record-reporting were not infrequently discordant, leaving open the possibility that additional reporting biases may have been operating. An additional potential shortcoming is that soldiers' reporting of parental history may be inaccurate. Another limitation is that the study was not able to test if MDD PRS would predict newonset SA among soldiers who did not report SA at baseline: the number of new-onset cases was insufficient to provide sufficient statistical power for that analysis. Nevertheless, it will be crucial to demonstrate, in future prospective studies, whether MDD (or other) PRS offer predictive value in this regard. Last, our analyses focused solely on individuals of European ancestry (Peterson et al., 2019), given the known limitations of extending PRS from European to other ancestral groups. New approaches that combine family history and PRS data hold promise as a solution to this limitation (Hujoel, Loh, Neale, & Price, 2021), and could be applied to this and other samples in the future.

Recent work from our group has shown that parental history of SA is associated with increased risk of pre-enlistment SA among new soldiers in the US Army (Wang et al., 2021). Twin and other genetically informative studies suggest that SA is moderately (17%) heritable (Fu et al., 2002), and that parental psychiatric illness explains almost half of the genetic transmission of SA (Kendler, Ohlsson, Sundquist, Sundquist, & Edwards, 2020). The largest GWAS of SA to date has found a SNP-based heritability of approximately 7% (Mullins et al., 2020). As genomic studies of SAs increase in size and power, we expect that PRS for SA will become available and offer predictive utility over and above personal and family history, and perhaps even other sociodemographic and life (and combat) stress measures that frequently enter into SA predictive models (Kessler et al., 2020). In the interim, consideration could be given to using available PRS, such

as the MDD PRS used here (for which future iterations will no doubt become more powerful), in instances where GWAS data are available. Although we have shown this additional information to be useful in this specific context, much work needs to be done to demonstrate the utility of PRS outside of the military setting and, importantly, in studies that use prospective longitudinal designs to determine if PRS can contribute to the prediction of new (or recurrent) SAs.

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# ACKNOWLEDGMENTS

The Army STARRS Team consists of Co-Principal Investigators: Robert J. Ursano, MD (Uniformed Services University of the Health Sciences) and Murray B. Stein, MD, MPH (University of California San Diego and VA San Diego Healthcare System); Site Principal Investigators: Steven Heeringa, PhD (University of Michigan), James Wagner, PhD (University of Michigan) and Ronald C. Kessler, PhD (Harvard Medical School): Army liaison/consultant: Kenneth Cox. MD. MPH (US Army Public Health Center): and Other team members: Pablo A. Aliaga, MA (Uniformed Services University of the Health Sciences); COL David M. Benedek, MD (Uniformed Services University of the Health Sciences); Laura Campbell-Sills, PhD (University of California San Diego); Carol S. Fullerton, PhD (Uniformed Services University of the Health Sciences): Nancy Gebler, MA (University of Michigan): Robert K. Gifford, PhD (Uniformed Services University of the Health Sciences); Meredith House, BA (University of Michigan); Paul E. Hurwitz, MPH (Uniformed Services University of the Health Sciences); Sonia Jain, PhD (University of California San Diego); Tzu-Cheg Kao, PhD (Uniformed Services University of the Health Sciences); Lisa Lewandowski-Romps, PhD (University of Michigan); Holly Herberman Mash, PhD (Uniformed Services University of the Health Sciences); James E. McCarroll, PhD, MPH (Uniformed Services University of the Health Sciences); James A. Naifeh, PhD (Uniformed Services University of the Health Sciences); Tsz Hin Hinz Ng, MPH (Uniformed Services University of the Health Sciences); Matthew K. Nock, PhD (Harvard University); Nancy A. Sampson, BA (Harvard Medical School); CDR Patcho Santiago, MD, MPH (Uniformed Services University of the Health Sciences); LTC Gary H. Wynn, MD (Uniformed Services University of the Health Sciences); and Alan M. Zaslavsky, PhD (Harvard Medical School). Army STARRS was sponsored by the Department of the Army and funded under cooperative agreement number U01MH087981 (2009-2015) with the U.S. Department of Health and Human Services, National Institutes of Health, National Institute of Mental Health (NIH/NIMH). Subsequently, STARRS-LS was sponsored and funded by the Department of Defense (USUHS grant number HU0001-15-2-0004). The contents are solely the responsibility of the authors and do not necessarily represent

the views of the Department of Health and Human Services, NIMH, the Department of the Army, the Department of Veterans Affairs, or the Department of Defense.

## CONFLICT OF INTEREST

Dr. Kessler has in the past 3 years received support for his epidemiological studies from Sanofi Aventis; and was a consultant for Datastat, Inc, Sage Pharmaceuticals, and Takeda. Dr. Stein has in the past 3 years been a paid consultant for Actelion, Aptinyx, atai Life Sciences, Bionomics, Boehringer-Ingelheim, EmpowerPharm, Engrail Therapeutics, Genentech/Roche, GW Pharma, Janssen, Jazz Pharmaceuticals, Nobilis Therapeutics, and Oxeia Biopharmaceuticals. Dr. Smoller is an unpaid member of the Scientific Advisory Board of PsyBrain Inc. and the Bipolar/Depression Research Community Advisory Panel of 23andMe. The remaining authors have no disclosures.

## AUTHOR CONTRIBUTIONS

Murray B. Stein, Laura Campbell-Sills, Karmel W. Choi, Robert J. Ursano: conception or design of the work. Murray B. Stein, Ronald C. Kessler, Robert J. Ursano: Data collection. Murray B. Stein, Sonia Jain, Karmel W. Choi, Feng He, Tian Ge: Data analysis and interpretation. Murray B. Stein, Laura Campbell-Sills, Karmel W. Choi, Erin B. Ware, Robert J. Ursano: Drafting the article. All authors: Critical revision of the article. All authors: Final approval of the version to be published.

## DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available on request from the corresponding author. The data are not publicly available due to privacy or ethical restrictions.

# ORCID

Murray B. Stein () https://orcid.org/0000-0001-9564-2871

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How to cite this article: Stein, M. B., Jain, S., Campbell-Sills, L., Ware, E. B., Choi, K. W., He, F., Ge, T., Gelernter, J., Smoller, J. W., Kessler, R. C., & Ursano, R. J. (2021). Polygenic risk for major depression is associated with lifetime suicide attempt in US soldiers independent of personal and parental history of major depression. *American Journal of Medical Genetics Part B: Neuropsychiatric Genetics*, 186B:469–475. <u>https://doi.org/10.</u> 1002/ajmg.b.32868

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