Fog of War? The Role of Combat, Selection, and Policy in Veterans' Long-Run Outcomes.¹

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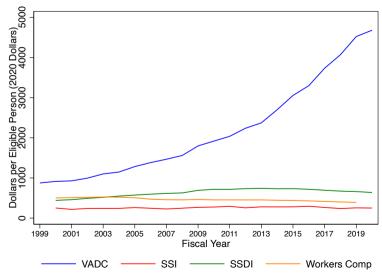
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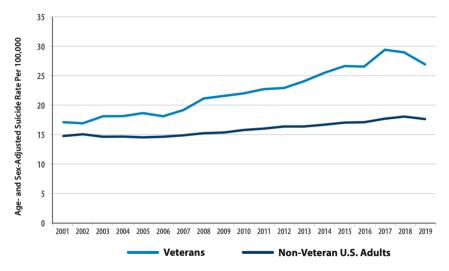


VA Disability Compensation: \$23 billion in 2000 to \$99 billion in 2021





Over this same time-frame, veteran suicide nearly doubled



Source: "2021 National Veteran Suicide Prevention Annual Report" (VA, 2021)

What has changed over this period?

Wartime deployments to Iraq and Afghanistan

- "A lot of our veterans and their families have gone through hell—deployment after deployment, months and years away from their families; missed birthdays, anniversaries; empty chairs at holidays; financial struggles; divorces; loss of limbs; traumatic brain injury; posttraumatic stress. We see it in the struggles many have when they come home... The cost of war they will carry with them their whole lives" – President Joe Biden

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Composition of servicemembers

- Changing test scores and high school graduation rates among new recruits (DoD, 2020)
- From 2005-2008, Army enlisted more recruits with criminal histories (Murphy, 2019)

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Policies also changed (e.g. 2010 relaxation of standards to receive disability for PTSD)

This paper: assess causal role of deployment in explaining outcomes

- 1. Exploit the quasi-random assignment of U.S. Army soldiers to Brigade Combat Teams (BCTs) to isolate the impact of deployments to Iraq and Afghanistan on:
 - Disability receipt
 - Mortality (incl. deaths of despair and suicide)
 - Other long run outcomes associated with health and well-being
- 2. Leverage variation in combat intensity across BCTs to explore whether more violent deployments deal a different blow
- 3. Decompose trends in recent Army veterans' outcomes attributable to combat deployments, compositional changes, and all other factors

Summary of Key Results

Deployment increases VADC, but has limited effects on deaths outside of combat

- 10-month dep \implies \$2602 (42%) \uparrow in annual VADC pay

 \implies 0.05pp (4%) \uparrow in noncombat death, but noisy (CI: -24% to 32%)

→ More precise 0 effects on criminal/credit/education outcomes

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More dangerous deployments increase trauma and VADC, but not noncombat deaths

- $1\sigma\uparrow$ in peer casualties \implies 0.27pp (54%) \uparrow in combat death
 - \implies \$414 (7%) \uparrow in VADC pay
 - \implies 0.01pp (1%) \downarrow in noncombat death (CI: -9% to 7% of mean)
 - ⇒ 0 effects on criminal, credit, and education outcomes

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Deployment does not explain recent growth in VADC or trends in noncombat deaths

- Deployment explains some growth in VADC through 2012, but \approx 0% since 2012
- Selection into service on obs. chars. does not explain growth in VADC
- Selection into service on obs. chars. explains 35% of trend in noncombat deaths

Contribution

Complements research related to

- Military Service (Barr, 2019; Wilson and Kizer, 1997; Breznitz, 2005; Borgschulte and Martorell, 2018; Greenberg et al., 2022; Angrist, 1990, 1998; Angrist et al., 2010; Conley and Heerwig, 2012; Loughran and Heaton, 2013; Bingley et al., 2010; Hjalmarsson and Lindquist, 2019)
- Combat deployments specifically (Anderson and Rees, 2015; Cesur et al., 2013, 2016, 2020; Cesur and Sabia, 2016; Gade and Wenger, 2011; Hoge et al., 2006; Lyle, 2006; Negrusa et al., 2014; Rohlfs, 2010; Sabia and Skimmyhorn, 2018; Stiglitz and Bilmes, 2008; Tanielian et al., 2008)
- Exposure to violence and conflict (Bauer et al., 2016, 2018; Blattman and Annan, 2010; Brown et al., 2019; Callen et al., 2014; Jakiela and Ozier, 2019; Lupa and Peisakhin, 2017; Moya, 2018; Voors et al., 2012)
- Federal disability programs (Autor and Duggan, 2003, 2006; Armour, 2018; Black et al., 2002; Bound, 1989; Burkhauser and Daly, 2012; Chen and van der Klaauw, 2003; Deshpande, 2016; Deshpande and Lockwood, 2021; Deshpande and Mueller-Smith, 2022; Duggan and Imberman, 2009; French and Song, 2014; Gelber et al., 2017; Liebman, 2015; Maestas et al., 2013; Mueller et al., 2016; Von Wachter et al., 2011; and many others), with few papers on VADC (Duggan et al., 2010; Autor et al., 2016; Coile et al., 2021; Silver and Zhang, 2022)

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What do we add?

- Use admin data to study combat's effect on in/post-service outcomes
- Novel identification for estimating causal effect of deployment
- Explore the drivers of recent trends in VADC and veteran mortality

Research design and empirical framework

Sample and data

Instrument validity

The causal effect of deployment

Explaining trends in veteran outcomes

Conclusion

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Even within occupations and cohorts, soldiers are not randomly sent to war:

- Soldiers unable to deploy may be assigned to nondeployable training/support units
- Commanders have some ability to influence who deploys
- While difficult, soldiers can take steps to prevent deployment (e.g. going AWOL)

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For these reasons, we still need a source of exogenous variation in deployment propensity

How are soldiers assigned to military units?

Since 2005, Brigade Combat Teams (BCTs) have been the Army's primary fighting force

- 4,000 military personnel
- Brigade > Battalion > Company
- BCTs deploy to combat zones as self-sustaining, interchangeable units

The Army projects job openings at the brigade-by-occupation level

Army Career Managers match soldiers to job vacancies (i.e. "faces-to-spaces") while considering:

- Soldier occupation and qualifications
- Soldier preferences for location (NOT preferences for specific brigades)
- First term soldiers have virtually no influence on their assigned brigade

Isolating exogenous variation in deployment

We want to compare outcomes of first term enlisted soldiers who:

- Are in the same occupation (e.g. Infantry);
- Arrive at the same duty station (e.g. Fort Drum, NY);
- Arrive at around the same time;
- Have the same initial enlistment contract term-length;
- But assigned to different brigades with different near-term deployment probabilities

A stylized example

- PVT Berman and PVT Wright enlist as Water Treatment Specialists
- They complete training in Nov05, and both arrive at Fort Drum, NY in Dec05
- PVT Berman is assigned to 1st BCT which deploys to Iraq from Jan06-Mar07
- PVT Wright is assigned to 2nd BCT, which does not deploy during 1st enlistment

Accounting for other forms of selection into deployment

Rich admin data allow us to account for nonrandom assignment to brigades:

- Exclude soldiers assigned to training or support brigades
- Exclude soldiers with documented assignment considerations
- Exclude women because we cannot observe all cases of pregnancy

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Instrument for a soldier's own deployment with average deployment lengths of peers

- Fixes bias due to soldier selection into deployment within BCTs
- Fixes survivor bias from surveys or retrospective comparisons

Empirical implementation – two stage least squares

$$Y_i = \delta_{k(i)} + \beta D_i + \epsilon_i \tag{1}$$

$$D_i = \omega_{k(i)} + \pi Z_i + u_i \tag{2}$$

Where:

- *Y_i*: outcome of soldier *i*
- D_i : # months i deploys w/in 3 yrs (most common term-length) of arrival at first BCT
- Z_i : Average months deployed among peers in same BCT x Arrival Quarter
- $\delta_{k(i)}$ and $\omega_{k(i)}$: (job)× (duty-station)×(year of arrival)×(term-length) fixed effects
- β : Causal effect of 1-month deployed (scaled to reflect impact of 10-mo deployment)

Heteroskedasticity-robust standard errors

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Sample and data

Sample: First-term enlisted male soldiers assigned to BCTs between 2005 and 2015

- Median age is 21 years; 14% Black; 13% Hispanic Summary Stats Table
- Predominately high school graduates
- Median AFQT is 56th percentile of 18-23 y/o national verbal/math ability
- Disproportionately in combat occupations (e.g. Infantry)
- 63% deployed to Iraq / Afghanistan w/in 3 years (64% w/in 4 years)

Link to outcomes observed during and after service (mostly through 2019)

- VA and SSA disability data
- National Death Index mortality data
- Army and LexisNexis criminal and misconduct outcomes
- Experian® credit data
- National Student Clearinghouse college attendance and completion

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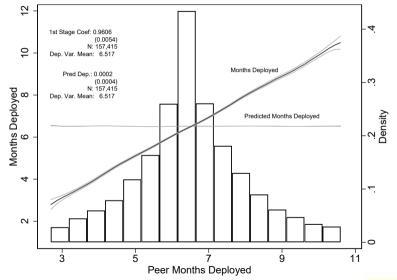
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First stage: $1mo \uparrow in peers' depl. \implies 0.96mo \uparrow in own depl.$



Note: First stage is nearly identical if endog. var. is months deployed in 2yrs, 4yrs, etc. First Stage Over Time

Balance: Instrument is balanced, OLS-equivalent is not

	Black (1)	Hispanic (2)	Other Race (3)	Married (4)	Dep. Children (5)	HSGplus (6)	Init Approx Age (7)	Init AFQSC
	Panel (a): Deployment Instrument Balance Tests							
Deployment Instrument	0.0055 (0.0043)	-0.0038 (0.0046)	0.0002 (0.0029)	0.0013 (0.0047)	0.0017 (0.0027)	0.0048 (0.0042)	0.0822* (0.0459)	-0.2817 (0.2232)
Covariate Mean Observations P-value on Joint Test	0.140 157415 0.342	0.130 157415	0.052 157415	0.146 157415	0.044 157415	0.868 157415	21.800 157415	58.011 157415
	Panel (b): Balance Table OLS with FE							
10 Months Deployed	-0.0139*** (0.0020)	0.0151*** (0.0020)	0.0076*** (0.0013)	-0.0140*** (0.0022)	-0.0067*** (0.0015)	0.0335*** (0.0022)	-0.0590*** (0.0220)	0.8290*** (0.1022)
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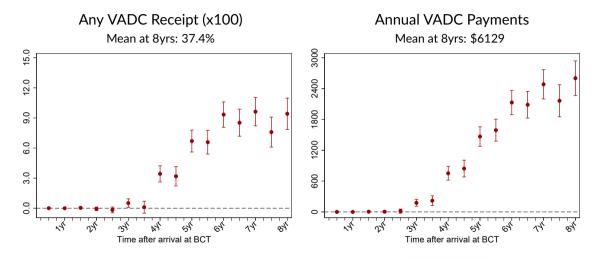
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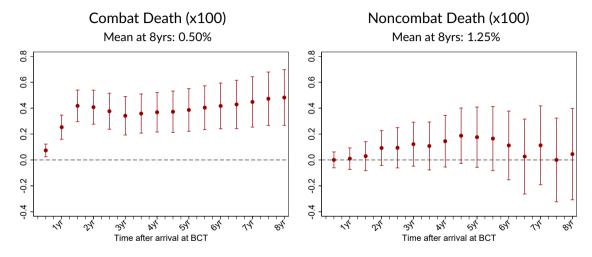
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Within 8 years, depl ↑ any VADC (9.5pp) & annual VADC pay (\$2600)



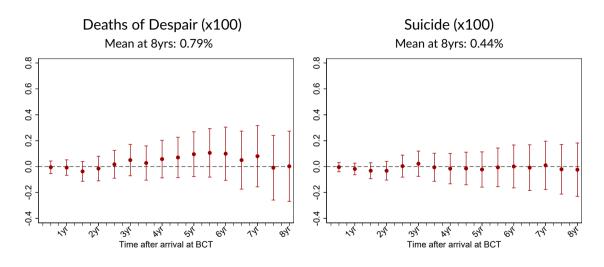
Deployment \(\gamma\) separation from Army by 2.6pp (3% of mean) within 8 years Separation From Army

Deployment increases mortality, but mostly through combat deaths



W/in 8 years, deployment ↑ all-cause mortality by 0.53pp (30%)—combat deaths explain 90% of overall effect

Limited evidence deployment causes deaths of despair (incl. suicide)



The challenge with effects on noncombat mortality

Mortality is rare—imprecision makes it difficult to rule out moderate effect sizes:

- Upper bound of 95% CI for non-combat death is 32% of the mean

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Address this challenge through two additional analyses:

- 1. We find precise null effects on several other measures of well-being
- 2. Explore whether more dangerous deployments produce different outcomes

Deployment does not impact misconduct, credit, education outcomes

	Effect of 10 Mths	95% CI				
<u>Outcome</u>	Deployed (at 8yrs)	as % of Mean	Mean (8yrs)			
	Panel (a): Misconduct					
Separated for Misconduct (x100)	-1.02	[-10%, 1%]	25.05			
	(0.70)					
Ever Incarcerated (x100)	0.10	[-16%, 24%]	2.41			
	(0.25)					
	Panel (b): Credit Scores					
Credit Score in 2020 (Vantage)	1.32	[-0%, 1%]	656			
	(1.58)					
	Panel (c): College Enroll/Grad					
College Enrollment (x100)	1.09	[-1%, 5%]	55.70			
	(0.81)					
Associate's Deg+ (x100)	0.66	[-3%, 18%]	8.69			
	(0.47)					

Note: Separated for Misconduct includes being barred from reenlistment

We find similar effects on other misconduct/criminal, credit, and education outcomes





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	Deployed	$ imes$ (1 σ Peer Cas)	as % of Mean	(8yrs)
	Par	nel (a): Combat De	ath and VADC	
Combat Death (x100)	0.01	0.27***	[37%, 71%]	0.50
	(0.12)	(0.04)		
Annual Amt VADC	1876***	414***	[5%, 8%]	6129
	(190)	(48)		
	Pa	anel (b): Non-Com	bat Mortality	
Noncombat Death (x100)	0.07	-0.01	[-9%, 7%]	1.25
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	Deployed	\times (1 σ Peer Cas)	as % of Mean	(8yrs)
	Par	el (a): Combat De	ath and VADC	
Combat Death (x100)	0.01	0.27***	[37%, 71%]	0.50
	(0.12)	(0.04)		
Annual Amt VADC	1876***	414***	[5%, 8%]	6129
	(190)	(48)		
	Pa	nel (b): Non-Com	bat Mortality	
Noncombat Death (x100)	0.07	-0.01	[-9%, 7%]	1.25
	(0.20)	(0.05)		
Death of Despair (x100)	0.10	-0.06	[-18%, 3%]	0.79
	(0.16)	(0.04)		
	Panel	(c): Misconduct, (Credit, Education	1
Separated for Misconduct (x100)	-0.90	-0.07	[-2%, 1%]	25.05
	(0.77)	(0.18)		
Ever Incarcerated (x100)	-0.07	0.10	[-1%, 9%]	2.41
	(0.28)	(0.07)		
Credit Score in 2020 (Vantage)	1.34	-0.01	[-0%, 0%]	656
_	(1.74)	(0.41)		
Associate's Deg+ (x100)	0.41	0.14	[-1%, 4%]	8.69
	(0.52)	(0.12)		

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Research design and empirical framework

Sample and data

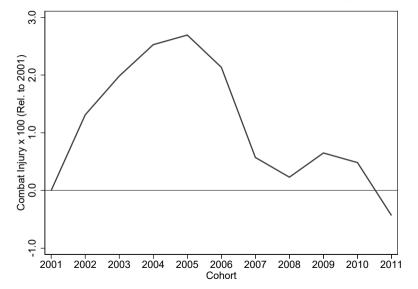
Instrument validity

The causal effect of deployment

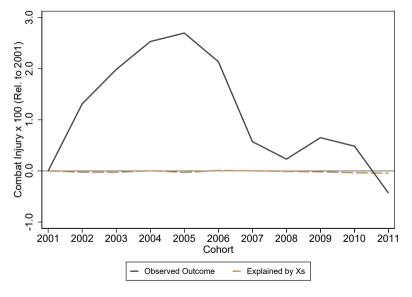
Explaining trends in veteran outcomes

Conclusion

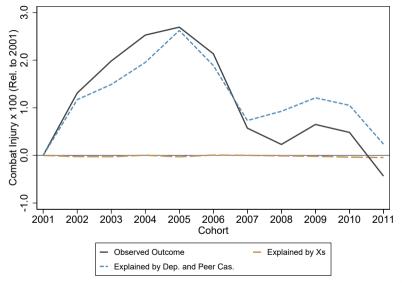
Validation Exercise: Decompose trends in combat injuries (8 yrs out)



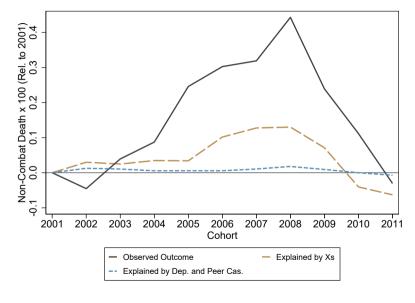
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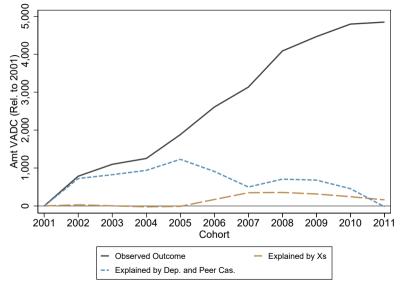
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Selection explains much of the trend in noncombat deaths



Since 2012, policy is the most likely explanation for rising VADC



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Conclusion

Combat deployments ↑ VADC, ↑ deaths due to combat

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...but explain little of the rapid growth in VADC over the last decade

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Limited evidence deployment increases noncombat deaths

- No evidence noncombat deaths increase as deployments become more dangerous
- Corroborated by precise null effects on criminal, credit, and education outcomes
- Changes in who was allowed to serve explain much of the trend in noncombat deaths

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Thank you!



Peer Casualty Balance Table

	Black (1)	Hispanic (2)	Other Race (3)	Married (4)	Dep. Children (5)	HSGplus (6)	Init Approx Age (7)	Init AFQSC (8)
Deployment Instrument	0.0051	-0.0052	0.0008	0.0005	0.0009	0.0052	0.0746	-0.2793
	(0.0044)	(0.0047)	(0.0030)	(0.0048)	(0.0027)	(0.0042)	(0.0471)	(0.2279)
P-value on Joint Test	0.381							
(DEP INST.) X (Peer Casualties)	0.0005 (0.0011)	0.0017 (0.0012)	-0.0008 (0.0008)	0.0010 (0.0013)	0.0010 (0.0010)	-0.0005 (0.0015)	0.0098 (0.0133)	-0.0031 (0.0643)
P-value on Joint Test	0.817	(0.0012)	(0.0000)	(0.0013)	(0.0010)	(0.0013)	(0.0100)	(0.0043)
Observations	157415	157415	157415	157415	157415	157415	157415	157415

Return

Education Outcomes

Panel (a): Dynamic Outcomes

Enroll Post-arrival (x100)	2 yrs -1.48*** (0.40)	4 yrs 0.66 (0.58)	6 yrs 1.59** (0.73)	8 yrs 1.09 (0.81)	8 yrs mean 55.70
Assc Deg+ Post-arrival (x100)	-0.08	-0.16	0.01	0.66	8.69
Bach Deg+ Post-arrival (x100)	(0.07) -0.02	(0.13) -0.08	-0.12	(0.47) -0.05	3.99
N	(0.06) 157415	(0.09) 157415	(0.16) 129176	(0.33) 101387	101387

Panel (b): Outcomes by 2017/2020

	Jun 2017	Avg(Y ₂₀₁₇)	Dec 2020	Avg(Y ₂₀₂₀)
Enrolled (Post-Arrival) (x100)	1.59**	49.98	1.75***	60.01
	(0.662)		(0.667)	
Associates Deg+ (Post-Arrival) (x100)	0.21	8.99	0.01	15.62
	(0.418)		(0.521)	
Bachelors Deg+ (Post-Arrival) (x100)	0.13	4.66	-0.15	9.18
	(0.312)		(0.421)	

Return

Financial Health Outcomes

	(1)	(2)	(3)	(4)
	Jun 2017	$Avg(Y_{2017})$	Dec 2020	$Avg(Y_{2020})$
		Panel (a): C	redit Scores	
Vantage Score	0.520	622.102	1.910	655.201
	(1.322)		(1.329)	
FICO Score			0.792	652.1
			(1.488)	
	Ē	anel (b): Deb	t Compositio	<u>on</u>
Total debt	3529.2***	44407.3	4793.0**	83783.1
iotal debt	(1194.2)	44407.0	(1862.0)	00700.1
Mortage debt	2759.3***	27044.3	3985.0**	61122.7
	(1059.1)		(1699.1)	
Auto debt	488.9**	11059.7	738.5***	13064.5
	(220.9)		(264.3)	
Student debt	-138.7	1435.6	-375.4**	2478.2
	(105.8)		(171.7)	
		Panel (c):	Bad Debt	
Derogatory debt	52.48	1105.6	-95.06	663.1
Delogatory debt	(90.72)	1105.0	(75.28)	000.1
Debt in colleciton	33.04	983.9	-69.03	1127.0
	(56.33)		(49.81)	
Any bankruptcy	0.134	1.37	0.346*	1.81
	(0.170)		(0.191)	
		Panel (d):	GI Bill Use	
Any post 9/11 GI bill use			3.044***	49.038
,, post // 11 of bill use			(0.700)	47.000
N	146763		148304	

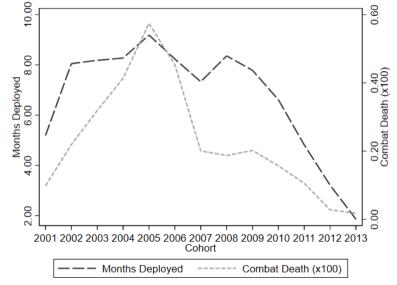
Crime Outcomes

	(1) 2 yrs	(2) 4 yrs	(3) 6 yrs	(4) 8 yrs	(5) 8 yrs mean
	Pane	el (a): Crimi	nal Investig	ations (In	Service)
Ever Non-Violent Felony (x100)	-2.18*** (0.43)	-0.39 (0.51)	-0.39 (0.57)	-0.56 (0.66)	21.10
Ever Violent Felony (x100)	-0.31** (0.13)	-0.14 (0.17)	-0.13 (0.20)	-0.07 (0.23)	2.24
Ever Misdemeanor (Non-traffic) (x100)	-2.10*** (0.33)	-1.27*** (0.41)	-1.33*** (0.46)	-1.37** (0.54)	13.43
Ever Other Crime (Meta-category) (x100)	-0.38* (0.23)	0.10 (0.26)	0.09 (0.29)	-0.03 (0.35)	5.33
N	157415	157415	129176	101387	101387
Ever Demoted (x100)	Panel -1.99*** (0.44)	(b): Admin 0.14 (0.52)	0.20 (0.58)	-0.04 (0.68)	Service) 22.20
Separated for Misconduct/Barred (x100)	-3.92*** (0.38)	-0.63 (0.53)	-0.52 (0.60)	-1.02 (0.70)	25.05
N	157415	157415	129176	101387	101387
		Panel (c): National	Outcomes	
Ever Incarcerated (x100)	-0.09 (0.07)	0.05 (0.14)	0.12 (0.19)	0.10 (0.25)	2.41
Any Arrest (Lexis-Nexis) (x100)	-0.49** (0.19)	0.03 (0.28)	0.39 (0.35)	0.46 (0.43)	7.38
Any Foreclosure (Lexis-Nexis) (x100)	-0.04 (0.22)	0.25 (0.29)	0.31 (0.35)	0.20 (0.42)	7.51
N	156247	156247	128120	100381	100381

The causal effect of deployment by occupation

	Combat Occupation		Noncombat Occupation			
	Mean	10 Mths Dep	Mean	10 Mths Dep	P-value of diff	
		Panel (a):	VADC and	Trauma of War		
Combat Death (x100)	0.68	0.65***	0.18	0.17	0.0214	
		(0.15)		(0.15)		
Annual Amt VADC	6202.92	3033.76***	6001.09	1821.98***	0.0007	
		(210.51)		(295.91)		
		Panel (b): No	n-combat N	Nortality Outcor	nes	
Noncombat Death (x100)	1.41	0.02	0.97	0.09	0.8380	
		(0.23)		(0.30)		
Death of Despair (x100)	0.92	-0.05	0.56	0.10	0.5607	
		(0.18)		(0.20)		
		Panel (c): Mis	conduct, Cı	edit, and Educa	tion	
Separated for Misconduct/Barred (x100)	24.93	-1.58*	25.27	-0.02	0.2858	
		(0.87)		(1.19)		
Ever Incarcerated (x100)	2.45	0.18	2.36	-0.06	0.6445	
		(0.30)		(0.44)		
Credit Score in 2020 (Vantage)	657.49	0.40	652.78	3.00	0.4264	
		(1.95)		(2.67)		
Assc Deg+ by 2020 (Post-Arrival) (x100)	18.29	-0.59	21.64	1.08	0.2275	
		(0.80)		(1.14)		

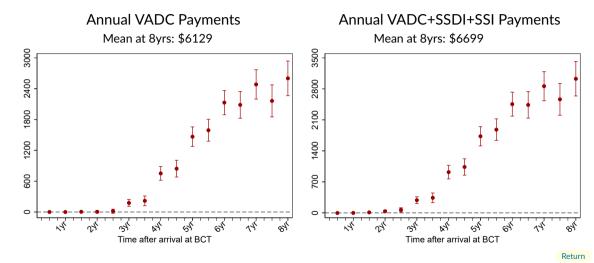
Deployment and Combat Death Trends by Cohort



Summary Statistics

	Full Sample (1)	Estimation Sample (2)	Never Deployed (3)	Ever Deployed (4)				
		Panel (a): Demographics						
Age	21.86	21.80	21.65	21.88				
Black	0.189	0.140	0.181	0.119				
Hispanic	0.129	0.130	0.141	0.125				
Female	0.152	0.000	0.000	0.000				
HS dropout or GED	0.119	0.129	0.087	0.151				
Some college+	0.116	0.104	0.098	0.107				
AFQT score	58.86	58.01	56.36	58.86				
	Panel (b): Service Experience							
Combat occupation	0.366	0.643	0.622	0.654				
Mths deployed w/in 3 yrs	5.98	6.52	0.00	9.87				
Combat Injury w/in 3 yrs	0.016	0.022	0.000	0.034				
Combat death w/in 3 yrs	0.002	0.003	0.000	0.004				
N	782,232	157,415	53,381	104,034				

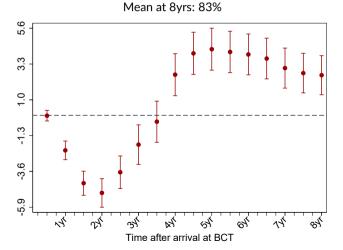
Most of deployment's effect on disability is through VADC



Deployment increases separation from the Army in the long run

Separated from Army (x100)

Mean at 2yrs (24m): 13% Mean at 4yrs (48m): 57%



Exclusion

Exclusion requires potential outcomes to be identical if a soldier deploys for the same length of time but with a different BCT

Many good reasons to think this is a reasonable approximation to reality:

- 1. The stateside experience of soldiers in BCTs (esp. within duty stations) are similar
- 2. BCTs are also designed to be "interchangeable" fighting units within a combat theater
- 3. BCTs were on 2-4 year staggered deployment cycles (training \Rightarrow deployment \Rightarrow rest)
- 4. We find similar (albeit noisier) results when we directly control for BCT fixed effects

We also develop an argument in the spirit of Kolesar et al. (2015) that allows for violations where potential outcomes are mean independent of BCTs' deployment propensity (next)

Denote solider i's potential outcomes when deployed for d months with BCT k as $Y_i(d, k)$

The standard exclusion restriction requires that:

$$Y_i(d,k) = Y_i(d,j) \ \forall d,k,j$$

Now suppose we have many BCTs, and let \bar{D}_i be the deployment propensity of i's BCT

Likewise, let D_i and B_i be the RVs denoting deployment (binary for simplicity) and the identity of the BCT assigned; we assume that there are many BCTs with the same deployment propensity

Our approach is built up of many comparisons of the type:

$$E[Y_i(D_i, B_i)|\bar{D}_i = z] - E[Y_i(D_i, B_i)|\bar{D}_i = z']$$

$$= E[Y_i(D_i(z), B_i(z))|\bar{D}_i = z] - E[Y_i(D_i(z'), B_i(z'))|\bar{D}_i = z']$$

where now we allow both potential deployment D_i and BCT assignment to be functions of the instruments \bar{D}_i

To accommodate exclusion restrictions, we need to enforce independence between how the BCTs affect potential outcomes through deployment and directly

One way to do so is to assume that potential outcomes are mean independent of assigned BCTs' deployment propensity conditional on compliance type, i.e.,

$$E[Y_i(d, B_i)|D_i(z), D_i(z'), \bar{D}_i] = E[Y_i(d, B_i)|D_i(z), D_i(z')]$$

where the expectation is taken over the population of soldiers and BCTs

This assumption means, for example, that the *average* outcomes of soldiers who would deploy whether assigned to BCTs with propensity z or z' (i.e., the always takers) is the same regardless of the instrument, and hence which actual BCTs they are assigned to

But individual potential outcomes can change because $B_i(z) \neq B_i(z')$ (e.g., due to the fancy ice cream maker in some BCTs), which is a violation of exclusion

One simple way for it to hold is to assume that B_i is independent of \bar{D}_i ; this is implausible in judge setting, where there is a surjective mapping of judges to \bar{D}_i , but not in our setting due to the staggered deployment cycle

With these assumptions in hand, the mean difference on the previous slide becomes:

$$E[Y_i(1, B_i)|D_i(z) > D_i(z')]Pr(D_i(z) > D_i(z')) - E[Y_i(0, B_i)|D_i(z) > D_i(z')]Pr(D_i(z) > D_i(z'))$$

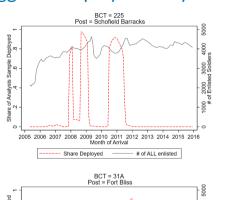
In the standard case, this would collapse to the normal causal effect expression for compliers

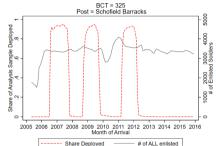
But here can estimate effects of deployment with the "average" BCT for individuals whose deployment status is affected by the instruments (the compliers)

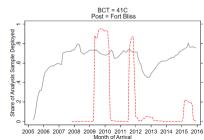
This ensures that effects reflect differences in outcomes due to the manipulation of deployment, not other influences of BCTs

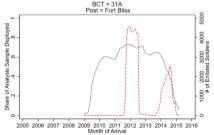
Return

BCT Staggered Deployment Cycles





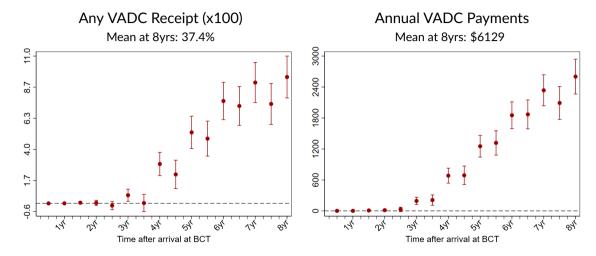




VADC Payment Amounts

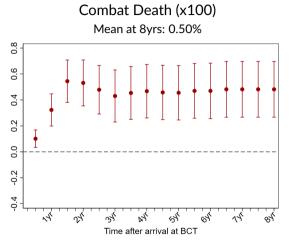
Combat	Monthly	Annual
Disability Rating	Payment	Payment
10%	\$152.64	\$1,831.68
20%	\$301.74	\$3,620.88
30%	\$563.39	\$6,760.68
40%	\$801.28	\$9,615.36
50%	\$1,118.44	\$13,421.28
60%	\$1,407.03	\$16,884.36
70%	\$1,754.95	\$21,059.40
80%	\$2,035.43	\$24,425.16
90%	\$2,287.52	\$27,450.24
100%	\$3,653.89	\$43,846.68

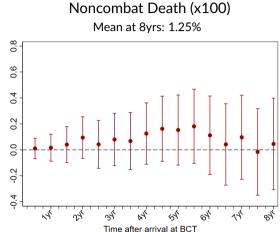
Effects on VADC: Balanced Sample (2005 - 2011 enlistees)





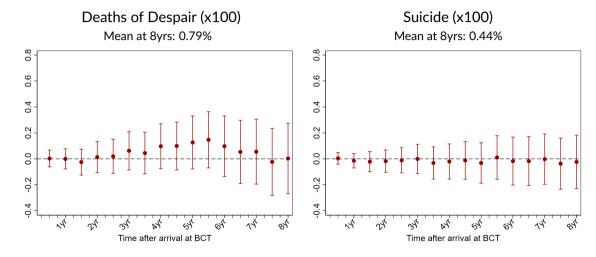
Effects on Mortality: Balanced Sample (2005 - 2011 enlistees)







Effects on Mortality: Balanced Sample (2005 - 2011 enlistees)





First stage defined over different time horizons

