College Enrollment and Earnings: Examining the Impact of Two Federal Drug Acts

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Brown University, Honors Thesis
April 8, 2023

Abstract

I examine the impact of two federal drug acts on college enrollments and earnings among black males by using a variety of counterfactual groups. The Anti-Drug Act of 1986 transformed the formerly rehabilitation-focused justice system into a punitive one, imposed sentencing minimums and disparities. The Fair Sentencing Act of 2010 undid many of these policies. I construct estimates of the impact of these two acts on black males aged 18-24 using three unique counterfactual groups: 1) white males, 2) black females, and 3) black men aged 28-34. I also leverage the variation between high and low drug arrest states. I find that

^{*}Contact: ray_huang@brown.edu. I thank Peter Hull at Brown University for serving as my advisor and for providing me with fantastic feedback and guidance. I would also like to thank Alison Lodermeier and Francesco Ferlenga for their generous comments and support. A replication archive with instructions is available at https://github.com/rayhuang11/EconSeniorThesisRH.

1 Introduction

Anti-Drug Act of 1986:

- Created minimum sentencing laws re possession of many drugs.
- Crack/powdered cocaine was particularly relevant (significantly harder rules on crack, which was cheaper and used by minorities much more, 100-1 ratio)
- The law led to an increase in the average time imprisoned for drug crimes from 22 months to 33 months (Shewan)

Fair Sentencing Act of 2010:

- Reduced the disparity between the amount of crack cocaine and powder cocaine needed to trigger certain federal criminal penalties from a 100:1 weight ratio to an 18:1 weight ratio
- Elimated minimum sentencing for crack cocaine
- Congressional Budget Office has estimated that implementing the Fair Sentencing Act of 2010 will reduce the prison population by 1,550 person-years over the period from 2011–2015, creating a monetary savings of \$42 million during that period

Existing literature:

- The Labor Market Consequences of Incarceration- Western, Kling, Weiman (2016)
- Juvenile Incarceration, Human Capital, and Future Crime: Evidence from Randomly Assigned Judges Aizer, Doyle (2015)
- Evan Rose papers: The Impact of Incarceration on Employment and Earnings, etc

2 Empirical Strategy

I take three discrete approaches to my empirical strategy, establishing three unique counterfactual groups for identifying the impact of the Anti-Drug Abuse Act of 1986 and the Fair Sentencing Act of 2010 on college enrollment rates.

My first empirical approach looks at changes in college enrollment rates in high drug arrest states relative to the low drug arrest states before and after the passage of both the 1986 and 2010 acts where high drug arrest states are defined as states above the 75th percentile two years before the passage of the federal law. I also utilize both the adult and juvenile arrest rates in two parallel analyses. I examine both the first-stage impact where the outcome is the change in drug-related arrest rates and the reduced-form impact where the outcome is college-enrollment. The first stage is evaluated using an event-study model that allows me to assess the evolution of relative outcomes while controlling for fixed differences across states and national trends over time. Using data at the state (s) by year (t) level, I estimate:

$$y_{st} = \alpha_s + \gamma_t + X'_{st}\phi + \sum_{m=-G}^{M} \beta_m z_{s,t-m} + \epsilon_{st}$$
(1)

where α_s and γ_t are individual and time fixed effects, X'_{st} is a vector of control variables, and ϵ_{st} represents a shock uncorrelated with the policy. The coefficients $\{\beta_m\}_{m=-G}^M$ summarize the magnitude of the dynamic effects and are summarized in an event-study plot.

In addition to the event study analyses, I also include traditional difference-in-differences estimates as a summary of the effect across all post-expansion years using the following regression specification at the individual (i) by year (t) level:

$$y_{it} = \alpha + \delta D_i + \gamma Post_t + \beta D_i Post_t + X'_{it} \phi + \epsilon_{it}$$
(2)

where D_i is an indicator for belonging to the treatment group (in this case, states with high drug arrests), $Post_t$ is a time indicator for belonging to the post-period, D_iPost_t is the interaction term where β is potentially the causal effect of the federal policy if the identifying assumptions are satisfied, and X'_{it} is a vector of control variables.

My second and third empirical approaches mirror the approach taken in Britton (2022). In my second empirical strategy, I look at changes in college enrollment rates in black males aged 18-24 at the time of the federal law passage relative to white males aged 18-24 at the time of the federal law passage.

My third approach is very similar to the second approach, where I look at the change in college enrollment rates in black males aged 18-24 at the time of the federal law passage relative to female blacks aged 18-24 at the time of the federal law passage.

Finally, I also include a triple difference-differences specification, where I compare

In all the regression specifications, I follow the recommendations outlined in Bertrand, Duflo, and Mullainathan (2004) and use robust standard errors clustered at the state level.

Counterfactual groups

- Black males vs white males
 - Identifying assumption: absent of the Anti-Drug Abuse Act of 1986, black and white male educational outcomes would have trended similarly.
- Black males vs black females
- Black males aged 18-24 vs black males aged 28-34 at the time of the act
- High vs low drug use

Empirical tools:

- DiD / DDD / Event study.
- — Using Roth's pretrend & honest did suggestions
- DDIV

3 Data and Descriptive Statistics

3.1 Data

To conduct my analysis, I use data from three sources. My primary data source is the Current Population Survey (CPS) October Education Supplement from 1980-2016, which I accessed via the IPUMS-CPS database (Flood et al., 2022). The Current Population Survey Education Supplement (CPS) is an annual cross-sectional survey conducted by the United States Census Bureau and the Bureau of Labor Statistics, collecting data from a nationally representative sample of approximately 60,000 households. Focused on educational attainment, enrollment status, and related socio-economic factors, the CPS provides a snapshot of the U.S. population's educational landscape, which is instrumental in shaping educational policies and understanding trends, and the CPS is commonly used in the social sciences. Following the approach in Britton (2022), I excluded observations missing relevant data such as family income and educational attainment, which reduced the sample by about five percent. I defined college enrollment to be persons who had 1 year or more of higher education, and I limited my analysis to persons aged 18-24 in the year the federal law was passed (1986 and 2010). One notable limitation of the CPS is that it excludes the currently incarcerated population, which would result in an underestimate of the impact of both the Anti-Drug Abuse Act of 1986 and the Fair Sentencing Act of 2010. The CPS also does not account for movement across state lines.

For data on arrests, I used the Uniform Crime Reporting (UCR) Program Data from the United States Department of Justice. Federal Bureau of Investigation (1980-2016). The UCR Program is a data collection initiative led by the FBI, which amasses crime statistics from local law enforcement agencies throughout the United States, and the UCR data is commonly used for crime-related social science research topics. The UCR Program has data at the county-year level and includes information on the number of arrests for each arrest type (e.g. drug possession, drug distribution, assault, robbery, etc) and also records data on the age ¹ and race of the arrested. In my analysis, I use black adult arrests and black juvenile arrests related to all drug crimes ². Since I needed arrest data at the state and year level, I constructed a normalized arrest rate per 100,000 by averaging the counties in a state together and dividing by the state's population in a given year ³. In any analysis where I used both UCR and CPS data, I merged the two datasets at the state and year level.

It is important to note that the UCR data has several limitations. First and foremost, many counties failed to report their arrest rates for certain years. Secondly, the UCR's hierarchical reporting system requires that only the most severe crime be recorded in cases of multiple offenses, which may skew the data. Finally, variations in reporting practices among different law enforcement agencies, as well as changes in reporting standards over time, can affect the consistency and

 $^{^1{\}rm The~UCR}$ data is broken down into a dult and juvenile arrests.

²The UCR includes data on drug offenses at a more granular level, such as type of drug, weight, and sale to a minor

³The population in each state-year was taken from the CPS.

comparability of the data. Notably, in the my sample, in certain years, one state failed to report any arrest data, which resulted in all persons living in said state being dropped from the analysis ⁴. Further, arrest data from Florida is missing from many years, particularly in years relevant to the Fair Sentencing Act of 2010. This is likely to bias our estimates downwards, as Florida has high rates of drug use and sales ⁵. What does the criminology literature have to say on the matter? Gove, Hughes, and Geerken (1985) conclude that the personal characteristics of the offender have minor effects on whether the crime is reported and that the UCR is a valid indicator for serious crimes. Lynch and Jarvis (2008) conclude that "missing data are substantial in the UCR program and certainly worthy of attention. They are not randomly distributed and cannot, therefore, simply be ignored. Much of the work done with the unimputed UCR data has overrepresented the experience of larger urban places and underrepresented smaller and less urban places (LaFree, 1998). It is difficult to determine if this overrepresentation has substantial effects on conclusions based on these data. The imputation strategies employed by the UCR program are reasonable and appear to reduce the overrepresentation of larger places. However, these methodologies can clearly be improved upon."

Finally, I used unemployment data at the state by year level from the U.S. Bureau of Labor Statistics (BLS) (1980 - 2018). For analysis at the state by year level, I simply collapse the dataset.

3.2 Descripitive Statistics

Tables 1 and 2 report sample means separately for the pre and post-periods of both the Anti-Drug Abuse Act of 1986 and the Fair Sentencing Act of 2010. Table 1 uses the CPS-UCR linked dataset (which drops unmerged observations), while Table 2 uses the CPS dataset only. Comparing Table 1 to Table 2 provides a rough test for evaluating whether the state-years with missing UCR data are substantially different from the state-years without missing data. The number of observations is slightly smaller in the CPS-UCR merged dataset, except for the 2010-2016 period which is much smaller (likely due to the missing UCR data from Florida). The "enrolled in college" row is approximately identical between Table 1 and Table 2, and the proportion of blacks and males is also largely the same.

Looking at Table 1, in all periods, about 15% of the sample is black.

Overall, my summary statistics table is similar to the one presented in Britton (2022), but there are some minor differences.

⁴Approximately 10,000 observations per year were dropped, which was less than 10% of the total sample.

⁵Florida is the epicenter of the recent prescription drug epidemic in the United States (Lee et al., 2014), and most Colombian cocaine was initially transported to the United States through the Caribbean and Florida (Williams, 1998).

4 Results

4.1 First Stage Estimates

4.2 Placebo Tests

5 Conclusion

estimates are downards biased -cps and ucr missing key data

5.1 Future Research

synthetic control methods, etc other datasets e.g. ACA better arrest data, county/metropolitan level other outcomes

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Figure 1: College Enrollment Around 1984

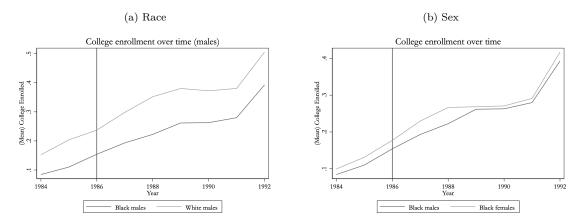
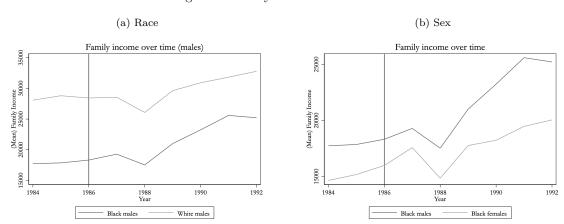


Figure 2: Family Income Around 1984



Note: These figures report the outcomes for various subgroups plotted over time using CPS data from 1984-1992. Figure 1 reports the proportion enrolled in college, while figure 2 reports the average family income. A vertical line is drawn to denote the passage of the Anti-Drug Abuse Act of 1986. The universe of samples is defined as participants aged 18-24 in 1986 who were not incarcerated at the time of the survey.

Figure 3: College Enrollment Around 2010

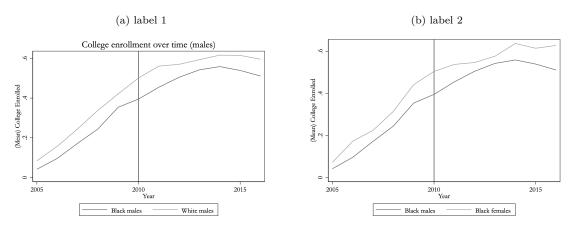
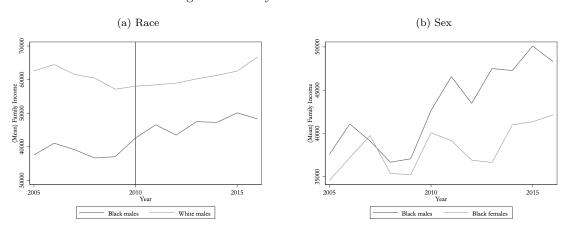


Figure 4: Family Income Around 2010



Note: These figures report the outcomes for various subgroups plotted over time using CPS data from 2005-2016. Figure 3 reports the proportion enrolled in college, while figure 4 reports the average family income. A vertical line is drawn to denote the passage of the Fair Sentencing Act of 2010. The universe of samples is defined as participants aged 18-24 in 2010 who were not incarcerated at the time of the survey.

Figure 5: College Enrollment By States with High vs Low Black Adult Drug Arrest Rates

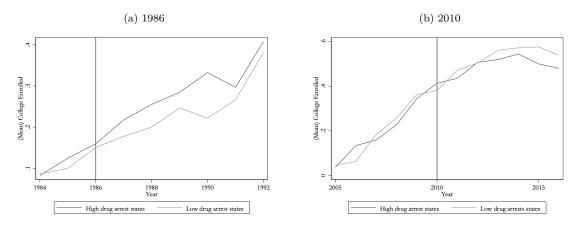
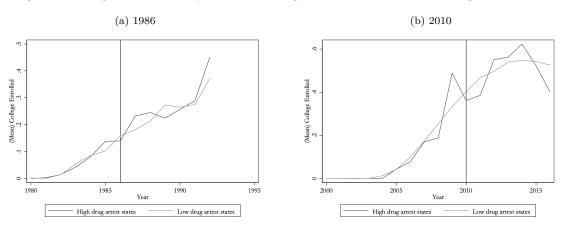
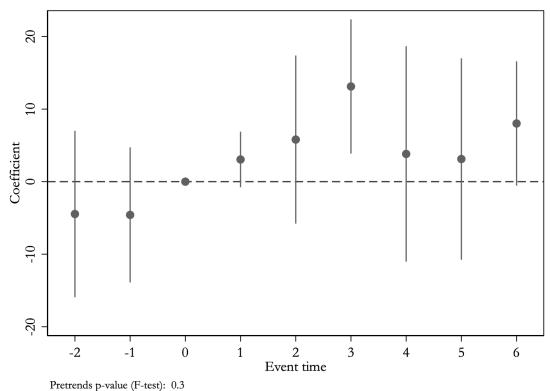


Figure 6: College Enrollment By States with High vs Low Black Juvenile Drug Arrest Rates



Note: These figures report the proportion enrolled in college plotted over time using CPS data from 1984-1992 and 2005-2016 for high black adult/juvenile drug arrest states and low black adult/juvenile drug arrest states, where high black adult/juvenile drug arrest states are defined to be those above the 75th percentile in 1984 and 2008. A vertical line is drawn to denote the passage of the Anti-Drug Abuse Act of 1986s and the Fair Sentencing Act of 2010. The sample is defined as black males aged 18-24 in 1986 and 2010 who were not incarcerated at the time of the survey.

Figure 7: Effect of Anti-Drug Abuse Act on Drug-related Arrest Rate of Black Men, Comparing States with High and Low Black Adult Drug-Related Arrest Rates

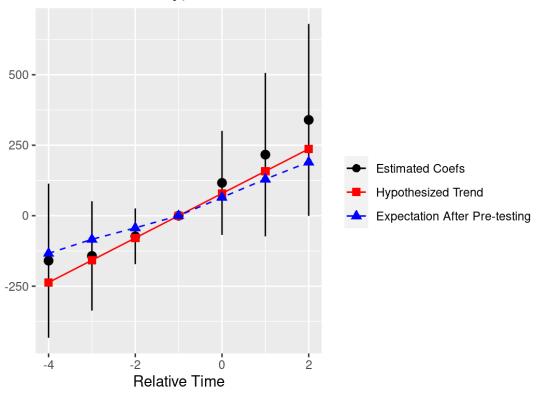


1

Note: This figure reports coefficients from the estimation of equation ?? evaluating the impact of the Anti-Drug Abuse Act of 1986 on arrest rates per 100,000 related to drug violations using CPS and UCR data from 1982-1992. Event time 0 := 1986. The coefficients represent the change in outcomes for high-drug arrest states relative to non-high-drug arrest states, where high black adult drug arrest states are defined to be those above the 75th percentile in 1984. The sample is defined as black males aged 18-24 in 1986 who were not incarcerated at the time of the survey. Control variables include population and unemployment rates at the state-year level.

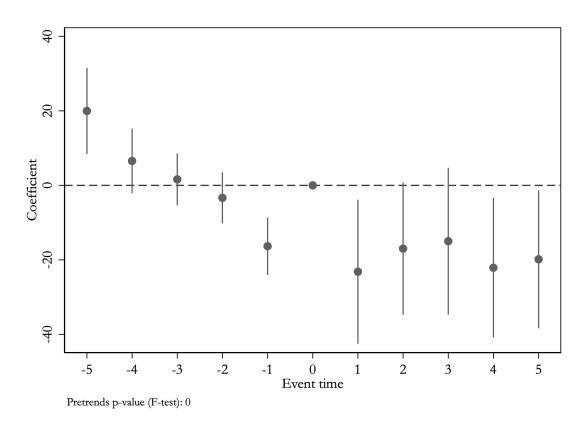
Figure 8: Pretrends for Event study 1986, AB arrest rate $18\mathrm{F}$

Event Plot and Hypothesized Trends



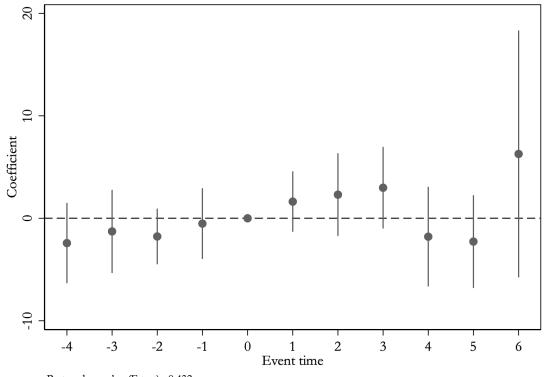
Power: 0.499. Bayes.Factor: 0.550. Likelihood.Ratio: 2.024

Figure 9: Effect of Fair Sentencing Act on Drug-related Arrest Rate of Black Men, Comparing States with High and Low Black Adult Drug-Related Arrest Rate



Note: This figure reports coefficients from the estimation of equation $\ref{equation}$ evaluating the impact of the Fair Sentencing Act of 2010 on arrest rates per 100,000 related to drug violations using CPS and UCR data from 2005-2015. Event time 0 := 2010. The coefficients represent the change in outcomes for high black adult drug arrest states relative to non-high-drug arrest states, where high-drug arrest states are defined to be those above the 75th percentile in 2008. The sample is defined as black males aged 18-24 in 2010 who were not incarcerated at the time of the survey. Control variables include population and unemployment rates at the state-year level.

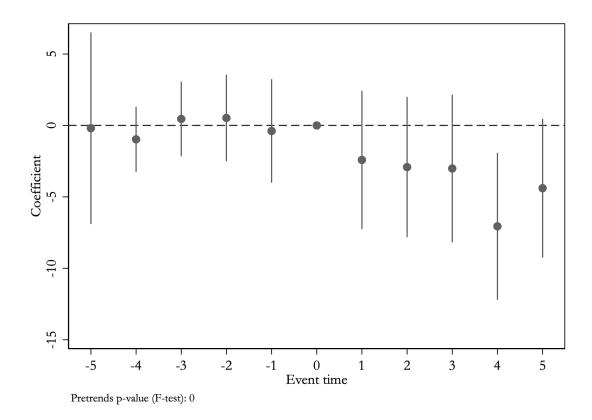
Figure 10: Effect of Anti-Drug Abuse Act on Drug-related Arrest Rate of Black Men, Comparing States with High and Low Black Juvenile Drug-Related Arrest Rate



Pretrends p-value (F-test): 0.432

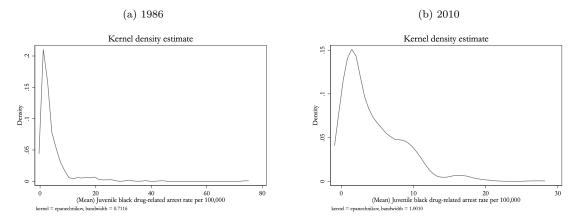
Note: This figure reports coefficients from the estimation of equation ?? evaluating the impact of the Anti-Drug Abuse Act of 1986 on arrest rates per 100,000 related to drug violations using CPS and UCR data from 1982-1992. Event time 0 := 1986. The coefficients represent the change in outcomes for high black juvenile drug arrest states relative to non-high-drug arrest states, where high-drug arrest states are defined to be those above the 75th percentile in 1984. The sample is defined as black males aged 18-24 in 1986 who were not incarcerated at the time of the survey. Control variables include population and unemployment rates at the state-year level.

Figure 11: Effect of Fair Sentencing Act on Drug-related Arrest Rate of Black Men, Comparing States with High and Low Black Juvenile Drug-Related Arrest Rate



Note: This figure reports coefficients from the estimation of equation $\ref{equation}$ evaluating the impact of the Fair Sentencing act of 2010 on arrest rates per 100,000 related to drug violations using CPS and UCR data from 2005-2015. Event time 0 := 2010. The coefficients represent the change in outcomes for high black juvenile drug arrest states relative to non-high-drug arrest states, where high-drug arrest states are defined to be those above the 75th percentile in 2008. The sample is defined as black males aged 18-24 in 2010 who were not incarcerated at the time of the survey. Control variables include population and unemployment rates at the state-year level.

Figure 12: Distribution of Black Juvenile Drug-Related Arrest Rates By State / Year



Note: The sample is defined as black males aged 18-24 in 1986 and 2010 who were not incarcerated at the time of the survey.

Table 1: CPS-UCR Merged Summary Statistics

	(1)	(2)	(3)	(4)
	1984-86	1987-92	2005-09	2010 - 16
Male	0.49	0.49	0.51	0.50
	(0.500)	(0.500)	(0.500)	(0.500)
Black	0.14	0.13	0.15	0.15
	(0.348)	(0.335)	(0.353)	(0.355)
HS Graduate	0.71	0.85	0.51	0.90
	(0.452)	(0.356)	(0.500)	(0.296)
Enrolled in college	0.19	0.38	0.29	0.62
	(0.396)	(0.486)	(0.455)	(0.485)
Enrolled in college (Black males)	0.02	0.04	0.03	0.08
	(0.132)	(0.187)	(0.181)	(0.271)
Enrolled in college (Non-black males)	0.18	0.34	0.26	0.54
- ,	(0.381)	(0.475)	(0.438)	(0.498)
Observations	41761	75097	43517	70273

mean coefficients; sd in parentheses

Note: Sample means (with education weights) are displayed from the CPS October supplement merged with the UCR dataset from 1984-1992 and 2000-2016. The sample in columns 1 and 2 are defined as persons aged 18-24 in 1986, and the sample in columns 3 and 4 are defined as persons aged 18-24 in 2010, who were not incarcerated at the time of the survey. This table is partially replicated from Britton (2022).

Table 2: CPS Summary Statistics

	(1)	(2)	(3)	(4)
	1984-86	1987-92	2005-09	2010 - 16
Male	0.49	0.49	0.51	0.50
	(0.500)	(0.500)	(0.500)	(0.500)
Black	0.14	0.13	0.15	0.15
	(0.349)	(0.336)	(0.354)	(0.355)
HS Graduate	0.71	0.85	0.51	0.92
	(0.452)	(0.353)	(0.500)	(0.277)
Enrolled in college	0.19	0.38	0.29	0.64
Ŭ	(0.393)	(0.485)	(0.454)	(0.479)
Enrolled in college (Black males)	0.02	0.04	0.03	0.08
<u> </u>	(0.131)	(0.185)	(0.179)	(0.277)
Enrolled in college (Non-black males)	0.17	0.34	0.26	0.56
,	(0.379)	(0.475)	(0.437)	(0.496)
Observations	46995	85648	49962	132783

mean coefficients; sd in parentheses

Table 3: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Black and White Males

	(1)	(2)	(3)
Post-1986	.1841***	.01337*	0
	(.006115)	(.0079287)	(.)
Black	08248***	02653**	02685**
	(.01061)	(.011097)	(.012049)
Post-1986 X Black	0317**	05143***	05298***
	(.012913)	(.013022)	(.012695)
Constant	.1983***	-3.082***	-3.461***
	(.0069464)	(.14111)	(.20293)
Observations	56237	56237	56237
Adjusted R^2	0.040	0.126	0.135
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black and white males aged 18-24 in 1986 who were not incarcerated at the time of the survey. This table is partially replicated from Britton (2022).

Table 4: Control Experiment Using Males 30-50. Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Black and White Males

	(1)	(2)	(3)
Post-1986	.02884***	008289	0
	(.0041672)	(.0090604)	(.)
Black	1628***	07694***	06961***
	(.013137)	(.012113)	(.011947)
Post-1986 X Black	004921	.01613	.01943*
	(.011887)	(.0097571)	(.0096506)
Constant	.4386***	08481	149***
	(.015945)	(.070365)	(.052218)
Observations	147007	147007	147007
Adjusted R^2	0.011	0.168	0.180
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Standard errors in parentheses

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black and white males aged 30-50 in 1986 who were not incarcerated at the time of the survey. This table is a control experiment for table 2 in Britton (2022).

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 5: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Black Males and Females

	(1)	(2)	(3)
Post-1986	.1542***	.003862	0
	(.017173)	(.016032)	(.)
Male	02038*	03215***	03178***
	(.011153)	(.010922)	(.011082)
Post-1986 X Male	001822	01618	01576
	(.018701)	(.01776)	(.018242)
Constant	.1362***	-1.914***	-2.168***
	(.0091741)	(.24275)	(.28931)
Observations	13208	13208	13206
Adjusted R^2	0.031	0.125	0.136
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black males and black females aged 18-24 in 1986 who were not incarcerated at the time of the survey. This table is partially replicated from Britton (2022).

Table 6: Control Experiment Using Blacks Aged 30-50. Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Black and Males and Females

	(1)	(2)	(3)
Post-1986	.02958***	.02658**	0
	(.0076405)	(.01105)	(.)
Male	.01855*	01645*	01817**
	(.0092547)	(.0093087)	(.0090099)
Post-1986 X Male	005661	004502	003871
	(.011042)	(.0099483)	(.0099319)
Constant	.2572***	.232	.2019
	(.011764)	(.16083)	(.17822)
Observations	29862	29862	29862
Adjusted R^2	0.001	0.139	0.150
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Standard errors in parentheses

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black males and black females aged 30-50 in 1986 who were not incarcerated at the time of the survey. This table is a control experiment for table 3 in Britton (2022).

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 7: Impact of the Fair Sentencing Act on College Enrollment: DiD Estimates Comparing Black and White Males

	(1)	(2)	(3)
Post-2010	.4353***	.118***	0
	(.009665)	(.009578)	(.)
Black	05246***	01656**	01744***
	(.006599)	(.006433)	(.005625)
Post-2010 X Black	03181**	04425**	04756**
	(.01573)	(.01828)	(.01787)
Constant	.1676***	7337***	4856***
	(.004781)	(.03113)	(.03253)
Observations	88097	88097	88097
Adjusted R^2	0.203	0.314	0.333
State_yr_FE	N	N	Y
Demographiccontrols	N	Y	Y

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black and white males aged 18-24 in 2010 who were not incarcerated at the time of the survey.

Table 8: Control Experiment Using Males 30-50. Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Black and White Males

	(1)	(2)	(3)
Post-2010	.02311***	009015***	0
	(.00322)	(.003125)	(.)
Black	07884***	02725**	022**
	(.01646)	(.01038)	(.01006)
Post-2010 X Black	.004482	.02143***	.02182***
	(.006885)	(.006876)	(.006938)
Constant	.5625***	.4458***	.3571***
	(.008551)	(.03948)	(.03413)
Observations	250249	250249	250249
Adjusted R^2	0.003	0.153	0.158
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Standard errors in parentheses

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black and white males aged 30-50 in 2010 who were not incarcerated at the time of the survey.

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 9: Impact of the Fair Sentencing Act on College Enrollment: DiD Estimates Comparing Black Males and Females

	(1)	(2)	(3)
Post-2010	.4314***	.1358***	0
	(.01188)	(.01639)	(.)
Male	0433***	04155***	04271***
	(.005242)	(.004334)	(.004167)
Post-2010 X Male	02798*	04462***	04651***
	(.01411)	(.01422)	(.01427)
Constant	.1584***	5973***	3868***
	(.005505)	(.04161)	(.05295)
Observations	21161	21161	21161
Adjusted R^2	0.202	0.310	0.324
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Weights used. SEs clustered at state level. Still missing some demographic controls.

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black males and females aged 18-24 in 2010 who were not incarcerated at the time of the survey.

Table 10: Control Experiment Using Black Males and Females 30-50. Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Black Males and Females

	(1)	(2)	(3)
Post-2010	.0445***	.01663	0
	(.01103)	(.0105)	(.)
Male	08054***	1045***	1055***
	(.007509)	(.007396)	(.00733)
Post-2010 X Male	01691	01575	01579
	(.01091)	(.0101)	(.01009)
Constant	.5642***	.3657***	.4503***
	(.01067)	(.05542)	(.05818)
Observations	53711	53711	53711
Adjusted R^2	0.009	0.123	0.129
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Standard errors in parentheses

Note: Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as black males and females aged 30-50 in 2010 who were not incarcerated at the time of the survey.

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 11: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Individuals from High and Low Black Adult Drug Arrest States

	(1)	(2)	(3)
Post-1986	.1812***	.006054	0
	(.005789)	(.007973)	(.)
High-drug arrest state (AB)	.03702***	.008256	0
	(.009572)	(.00992)	(.)
Post-1986 X High-drug arrest state	.003087	001695	003818
	(.01371)	(.01247)	(.01201)
Constant	.175***	-3.087***	-3.483***
	(.003803)	(.1458)	(.2027)
Observations	56237	56237	56237
Adjusted R^2	0.036	0.124	0.133
$State_yr_FE$	\mathbf{N}	\mathbf{N}	\mathbf{Y}
Demographic_controls	N	Y	Y

Note: Treated observations are defined as those living in states with a high-drug arrest rate for black adults, where high black adult drug arrest states are defined to be those above the 75th percentile in 1984. Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as males aged 18-24 in 1986 who were not incarcerated at the time of the survey.

Table 12: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Using Normalized Black Adult Drug Arrest Rate as Continuous Treatment

	(1)	(2)	(3)
Post-1986	.2018***	.01122	0
	(.006922)	(.007919)	(.)
Drug arrest rate per 100000	.001364***	.0003137	.0000647
	(.000185)	(.0002429)	(.0003182)
Post-1986 x Drug arrest rate per 100000	001218***	0002992	0001469
	(.0001583)	(.0002144)	(.0003047)
Constant	.163***	-3.094***	-3.483***
	(.0058)	(.1422)	(.2038)
Observations	56237	56237	56237
Adjusted R^2	0.035	0.124	0.133
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Standard errors in parentheses

Note: Treatment is continuous. Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as males aged 18-24 in 1986 who were not incarcerated at the time of the survey.

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 13: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Comparing Individuals from High and Low Juvenile Drug Arrest States

	(1)	(2)	(3)
Post-1986	.5028***	0589	0
	(.08815)	(.06804)	(.)
High-drug arrest state (JB)	.1933**	1024*	0
	(.08539)	(.05739)	(.)
Post-1986 X High-drug arrest state	.03728	.07949	.008017
	(.1171)	(.121)	(.09196)
Constant	12.57***	-5.588***	-7.29***
	(.04637)	(.7212)	(1.043)
Observations	53145	53145	53145
Adjusted R^2	0.008	0.072	0.087
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Note: Treated observations are defined as those living in states with a high-drug arrest rate for black juveniles, where high black juvenile drug arrest states are defined to be those above the 75th percentile in 1984. Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as males aged 18-24 in 1986 who were not incarcerated at the time of the survey.

Table 14: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Using Normalized Black Juvenile Drug Arrest Rate as Continuous Treatment

	(1)	(2)	(3)
Post-1986	.9472***	07305	0
	(.08494)	(.06033)	(.)
JB Drug arrest rate per 100000	.02351***	001597	.01487**
	(.004217)	(.006821)	(.006485)
Post-1986 x Drug arrest rate per 100000	00218	.01254*	004123
-	(.004072)	(.006722)	(.003289)
Constant	11.97***	-10.96***	-11.75***
	(.04425)	(.5024)	(.7209)
Observations	68669	68669	68669
Adjusted R^2	0.030	0.147	0.160
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 15: Control Experiment Using Females: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Using Normalized Black Juvenile Drug Arrest Rate as Continuous Treatment

	(1)	(2)	(3)
Post-1986	.4596***	1552**	0
	(.06968)	(.06106)	(.)
JB Drug arrest rate per 100000	.01351**	009207	.01713**
	(.005225)	(.006857)	(.006701)
Post-1986 x Drug arrest rate per 100000	.003457	.01603**	005583
	(.004826)	(.006985)	(.003327)
Constant	12.74***	-5.263***	-7.053***
	(.04734)	(.5142)	(.8156)
Observations	57425	57425	57425
Adjusted R^2	0.009	0.086	0.101
State_yr_FE	\mathbf{N}	N	Y
Demographic_controls	N	Y	Y

Table 16: Control Experiment Using Females: Impact of the Anti-Drug Abuse Act on College Enrollment: DiD Estimates Using Normalized Black Juvenile Drug Arrest Rate as Continuous Treatment

	(1)	(2)	(3)
Post-1986	.1501**	.3574***	0
	(.06483)	(.09751)	(.)
JB Drug arrest rate per 100000	003033	02963**	.01794**
	(.006785)	(.01399)	(.007515)
Post-1986 x Drug arrest rate per 100000	.01593**	.03185***	007682
	(.007642)	(.01044)	(.005986)
Constant	11.92***	14.21***	14.37***
	(.0588)	(.9072)	(.8076)
Observations	138566	138566	138566
Adjusted R^2	0.001	0.010	0.035
$State_yr_FE$	\mathbf{N}	N	Y
Demographic_controls	N	Y	Y

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 17: Impact of the Fair Sentencing Act on College Enrollment: DiD Estimates Comparing Individuals from High and Low Black Adult Drug Arrest States

	(1)	(2)	(3)
Post-2010	.07951***	.009631	0
	(.005554)	(.008421)	(.)
High-drug arrest state (AB)	007761	009208	0
	(.008853)	(.01089)	(.)
Post-2010 X High-drug arrest state	01963*	01355	01778**
	(.01024)	(.009783)	(.008734)
Constant	.1539***	-1.181***	7441***
	(.006186)	(.03982)	(.03472)
Observations	88097	88097	88097
Adjusted R^2	0.009	0.116	0.144
State_yr_FE	\mathbf{N}	N	Y
Demographic_controls	N	Y	Y

Note: Treated observations are defined as those living in states with a high-drug arrest rate for black adults, where high black adult drug arrest states are defined to be those above the 75th percentile in 2008. Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as males aged 18-24 in 1986 who were not incarcerated at the time of the survey.

Table 18: Impact of the Fair Sentencing Act on College Enrollment: DiD Estimates Using Normalized Black Adult Drug Arrest Rate as Continuous Treatment

	(1)	(2)	(3)
Post-2010	.04558**	004946	0
	(.01717)	(.01289)	(.)
Drug arrest rate per 100000	001156***	0008107**	-5.09e-06
	(.0003718)	(.0003128)	(.0000711)
Post-2010 x Drug arrest rate per 100000	.0002507	-5.69e-06	001341***
	(.0005835)	(.0004199)	(.0004249)
Constant	.1981***	-1.144***	7251***
	(.01459)	(.04018)	(.03573)
Observations	86842	86842	86842
Adjusted R^2	0.013	0.118	0.144
$State_yr_FE$	N	N	Y
Demographic_controls	N	Y	Y

Standard errors in parentheses

Note: Treatment is continuous. Estimates are weighted using CPS October supplement weights. Robust standard errors are clustered at the state level. Controls: age, age-squared, Latino ethnicity, yearly state average unemployment rates, and (binned) family income. The sample is defined as males aged 18-24 in 2010 who were not incarcerated at the time of the survey.

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 19: Impact of the Anti-Drug Abuse Act on College Enrollment: Triple DiD Using Black Adult Drug-Related Arrest Rate

	(1)	(2)	(3)	(4)
Post-1986	.01367	.01367	0	
	(.008326)	(.008326)	(.)	
Black	0148	0148	01012	
	(.01338)	(.01338)	(.01456)	
Lived in high black adult drug arrest state	.01624	.01624	0	
	(.01042)	(.01042)	(.)	
Post-1986 X Black	07104***	07104***	07444***	
	(.01765)	(.01765)	(.01733)	
Black X Lived in high AB	03287	03287	04229*	
<u> </u>	(.02027)	(.02027)	(.02237)	
Post-1986 X Lived in high AB	006417	006417	009561	
	(.01357)	(.01357)	(.01291)	
Triple DiD Coefficient	.04913**	.04913**	.05456**	.05934**
•	(.02231)	(.02231)	(.02238)	(.02264)
Constant	-3.069***	-3.069***	-3.461***	-3.455***
	(.1442)	(.1442)	(.2023)	(.203)
Observations	56237	56237	56237	56236
Adjusted R^2	0.126	0.126	0.135	0.137
State_yr_FE	N	N	Y	
Demographic_controls	N	Y	Y	

Note: CPS data from 1984-1992. The sample is defined as males aged 18-24 in 1986 who were not incarcerated at the time of the survey.

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 20: Impact of the Anti-Drug Abuse Act on College Enrollment: Triple DiD Using Black Juvenile Drug-Related Arrest Rate

	(1)	(2)	(3)	(4)
Post-1986	.01637*	.01637*	0	
	(.008297)	(.008297)	(.)	
Black	0289**	0289**	02849**	
	(.01161)	(.01161)	(.01279)	
Lived in high black adult drug arrest state	.006094	.006094	0	
	(.01355)	(.01355)	(.)	
Post-1986 X Black	05564***	05564***	05759***	
	(.01542)	(.01542)	(.01502)	
Black X Lived in high AB	03329	03329	0443	
	(.02816)	(.02816)	(.0322)	
Post-1986 X Lived in high AB	002857	002857	00666	
G	(.01825)	(.01825)	(.01782)	
Triple DiD Coefficient	.02763	.02763	.03134	.0398*
•	(.02635)	(.02635)	(.02591)	(.02232)
Constant	-3.055***	-3.055***	-3.419***	-3.413***
	(.154)	(.154)	(.211)	(.2125)
Observations	53145	53145	53145	53144
Adjusted R^2	0.110	0.110	0.119	0.121
State_yr_FE	N	N	Y	
Demographic_controls	N	Y	Y	

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

 $\hbox{ Table 21: Impact of the Fair Sentencing Act on College Enrollment: Triple DiD Using Black Adult Drug-Related Arrest Rate } \\$

	(1)	(2)	(3)	(4)
Post-2010	.00616	.00616	0	
	(.007427)	(.007427)	(.)	
Black	.02766*	.02766*	.03187**	
	(.015)	(.015)	(.01551)	
Lived in high black adult drug arrest state	01528	01528	0	
	(.01195)	(.01195)	(.)	
Post-2010 X Black	02415	02415	02296	
	(.01926)	(.01926)	(.01873)	
Black X Lived in high AB	06939***	06939***	08056***	
G	(.02283)	(.02283)	(.02274)	
Post-2010 X Lived in high AB	005498	005498	006709	
G	(.009052)	(.009052)	(.009094)	
Triple DiD Coefficient	.05284*	.05284*	.0518*	.05269*
•	(.02717)	(.02717)	(.02677)	(.0285)
Constant	1.21***	1.21***	.6905***	.698***
	(.2209)	(.2209)	(.2102)	(.1983)
Observations	87762	87762	87762	87762
Adjusted R^2	0.166	0.166	0.172	0.171
State_yr_FE	N	N	Y	
Demographic_controls	N	Y	Y	

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 22: Impact of the Fair Sentencing Act on College Enrollment: Triple DiD Using Black Juvenile Drug-Related Arrest Rate

	(1)	(2)	(3)	(4)
Post-2010	.00471	.00471	0	
	(.006697)	(.006697)	(.)	
Black	01225	01225	007122	
Diack	(.016)	(.016)	(.01628)	
	(.010)	(.010)	(.01020)	
Lived in high black adult drug arrest state	.01149	.01149	0	
0	(.01949)	(.01949)	(.)	
	,	,	()	
Post-2010 X Black	.005835	.005835	.006142	
	(.01708)	(.01708)	(.0169)	
D1 1 W I : 1 : 1 · 1 · 1 · 1	01070	01050	0050	
Black X Lived in high AB	.01978	.01978	.0253	
	(.02114)	(.02114)	(.02497)	
Post-2010 X Lived in high AB	003016	003016	003645	
1 050 2010 A Lived in high AD	(.01235)	(.01235)	(.01288)	
	(.01200)	(.01200)	(.01200)	
Triple DiD Coefficient	04266	04266	04347	03367
-	(.03011)	(.03011)	(.03036)	(.03512)
	,	,	,	,
Constant	1.211***	1.211***	.6929***	.6974***
	(.2242)	(.2242)	(.2089)	(.1981)
Observations	87762	87762	87762	87762
Adjusted R^2	0.166	0.166	0.171	0.171
$State_yr_FE$	N	N	Y	
Demographiccontrols	N	Y	Y	

^{*} p < 0.10, ** p < 0.05, *** p < 0.01

Table 23: Imitation of Panel A in Table 3 of Duflo (2001)

	Colle	ge enroll	ment		Fam inc	
		of drug a		Leve	Level of drug arrests	
	High	Low	Diff.	High	Low	Diff.
	(1)	(2)	(3)	(4)	(5)	(6)
Aged 18-24 in 1986 and black	-0.93	-0.93	0.00	62144.02	53493.93	8650.09
	(0.10)	(0.10)	(0.03)	(4519.83)	(5181.76)	(1359.73)
Aged 28-34 in 1986	-0.82	-0.89	0.06	70312.94	63625.58	6687.36
	(0.10)	(0.10)	(0.01)	(4861.23)	(5214.90)	(715.54)
Difference	-0.11	-0.04	-0.06	-8168.92	-1.0e + 04	1962.73
	(0.01)	(0.02)	(0.02)	(866.90)	(677.34)	(1036.55)

Clustered (state-year) robust standard errors in parentheses

 $\ensuremath{\mathsf{CPS}}$ education supplement weights used. Males only

Appendices

A Additional Results

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