

# Social Environment, Beliefs, and Outcomes

Does Teen's Social Environment Influence Beliefs and Outcomes?

Sergio Ernesto Barrera  
Virginia Tech

Acknowledgement: This research was conducted with restricted access to Bureau of Labor Statistics (BLS) data. The views expressed here do not necessarily reflect the views of the BLS.

## Motivation

- Differences in beliefs by SES lead to higher education gaps. Low SES youth underestimate
  - net returns to college ( $\Rightarrow$  lower **enrollment**).  
(Bettinger, Long, Oreopoulos & Sanbonmatsu 2012; Bleemer & Zafar 2018)
  - benefits or likelihood of attending elite institutions (  $\Rightarrow$  less **quality** schools).  
(Dynarski, Micheltmore, Libassi, & Owen 2021; Hoxby & Turner 2015) .

## Motivation

- Differences in beliefs by SES lead to higher education gaps. Low SES youth underestimate
  - net returns to college ( $\Rightarrow$  lower **enrollment**).  
(Bettinger, Long, Oreopoulos & Sanbonmatsu 2012; Bleemer & Zafar 2018)
  - benefits or likelihood of attending elite institutions (  $\Rightarrow$  less **quality** schools).  
(Dynarski, Micheltmore, Libassi, & Owen 2021; Hoxby & Turner 2015) .
- Explained by differences in social environment i.e. community adult and peers have less college completion or attended less selective colleges.  
(Hoxby and Avery 2013)

## Motivation: Continued

- If youth's social environment affects beliefs about college and application/enrollment decisions,
  - Then likely affects younger teen's perceptions of high school completion and labor market opportunities.
  - Since lower expected returns to school lead to declines in arrests/incarceration.  
(Lochner 2004; Lochner & Moretti 2005; Byron, Hyman, Vasquez 2022)
  - This may also affect beliefs about other outcomes like arrests or early parenthood.

## Questions to be Answered

1. How does a youths social environment influence their beliefs about school, work, arrests, and parenthood?

## Questions to be Answered

1. How does a youths social environment influence their beliefs about school, work, arrests, and parenthood?
  - **OLS:** Regress belief measures on peer, parent, neighborhood characteristics while controlling for wealth, human capital, demographics.

## Questions to be Answered

1. How does a youths social environment influence their beliefs about school, work, arrests, and parenthood?
  - **OLS:** Regress belief measures on peer, parent, neighborhood characteristics while controlling for wealth, human capital, demographics.
2. Are these beliefs related to future corresponding outcomes?

## Questions to be Answered

1. How does a youths social environment influence their beliefs about school, work, arrests, and parenthood?
  - **OLS:** Regress belief measures on peer, parent, neighborhood characteristics while controlling for wealth, human capital, demographics.
2. Are these beliefs related to future corresponding outcomes?
  - **OLS:** Regress outcomes on belief measures while controlling social environment, wealth, human capital, demographics.



## Questions to be Answered

1. How does a youths social environment influence their beliefs about school, work, arrests, and parenthood?
  - **OLS:** Regress belief measures on peer, parent, neighborhood characteristics while controlling for wealth, human capital, demographics.
2. Are these beliefs related to future corresponding outcomes?
  - **OLS:** Regress outcomes on belief measures while controlling social environment, wealth, human capital, demographics.
3. How much do differences in beliefs explain inequality in these outcomes?

## Questions to be Answered

1. How does a youths social environment influence their beliefs about school, work, arrests, and parenthood?
  - **OLS:** Regress belief measures on peer, parent, neighborhood characteristics while controlling for wealth, human capital, demographics.
2. Are these beliefs related to future corresponding outcomes?
  - **OLS:** Regress outcomes on belief measures while controlling social environment, wealth, human capital, demographics.
3. How much do differences in beliefs explain inequality in these outcomes?
  - **Oaxaca Blinder Decomposition:** report percent of explained outcome gaps attributable to beliefs, neighborhoods, parents, peers, human capital, etc.
  - In this presentation - racial and ethnic gaps, future work-SES gaps.

## Importance of Beliefs

- Beliefs are important to study for one or both of the following reasons.

## Importance of Beliefs

- Beliefs are important to study for one or both of the following reasons.
    1. Beliefs capture unobservables that **rationally** affect returns of different choices.
      - Experiencing negative shocks leads to pessimism.
- ( DeLuca, Papageorge, Boselovic, Gershenson, Gray, Nerenberg, Sausedo, & Young 2021)

## Importance of Beliefs

- Beliefs are important to study for one or both of the following reasons.
  1. Beliefs capture unobservables that **rationally** affect returns of different choices.
    - Experiencing negative shocks leads to pessimism.  
( DeLuca, Papageorge, Boselovic, Gershenson, Gray, Nerenberg, Sausedo, & Young 2021)
  2. Beliefs can reflect **information frictions** that suggest policy improvements.
    - Information-Education campaigns improve education outcomes.  
(Evans, Kearney, Perry & Sullivan 2020; Dynarski, Michelmore, Libassi, & Owen 2021, Hoxby & Turner 2013 )

## Importance of Beliefs

- Beliefs are important to study for one or both of the following reasons.
  1. Beliefs capture unobservables that **rationally** affect returns of different choices.
    - Experiencing negative shocks leads to pessimism.  
( DeLuca, Papageorge, Boselovic, Gershenson, Gray, Nerenberg, Sausedo, & Young 2021)
  2. Beliefs can reflect **information frictions** that suggest policy improvements.
    - Information-Education campaigns improve education outcomes.  
(Evans, Kearney, Perry & Sullivan 2020; Dynarski, Micheltmore, Libassi, & Owen 2021, Hoxby & Turner 2013 )
- This paper will not distinguish, but previous work has attempted this to evaluate policies designed to increase representation in higher ed. (Barrera 2021)

## Importance of Social Environment

- Social environment, i.e neighborhoods shown to be important determinant of economic inequality.

## Importance of Social Environment

- Social environment, i.e neighborhoods shown to be important determinant of economic inequality.
  - Radius of economic opportunity is primarily local but differs by race, ethnicity, and parental education/income.

(Hendrin, Porter, Sprung Keyser 2022)



## Importance of Social Environment

- Social environment, i.e neighborhoods shown to be important determinant of economic inequality.
  - Radius of economic opportunity is primarily local but differs by race, ethnicity, and parental education/income.  
(Hendrin, Porter, Sprung Keyser 2022)
  - Exposure effects on invention rates and intergenerational mobility.  
(Bell, Chetty, Jaravel, Petkova & Van Reenan 2019; Chetty, Hendrin, Jones & Porter 2019)

## Importance of Social Environment

- Social environment, i.e neighborhoods shown to be important determinant of economic inequality.
  - Radius of economic opportunity is primarily local but differs by race, ethnicity, and parental education/income.  
(Hendrin, Porter, Sprung Keyser 2022)
  - Exposure effects on invention rates and intergenerational mobility.  
(Bell, Chetty, Jaravel, Petkova & Van Reenan 2019; Chetty, Hendrin, Jones & Porter 2019)

## Importance of Social Environment

- Social environment, i.e neighborhoods shown to be important determinant of economic inequality.
  - Radius of economic opportunity is primarily local but differs by race, ethnicity, and parental education/income.  
(Hendrin, Porter, Sprung Keyser 2022)
  - Exposure effects on invention rates and intergenerational mobility.  
(Bell, Chetty, Jaravel, Petkova& Van Reenan 2019; Chetty, Hendrin, Jones & Porter 2019)
- **Contribution:** By linking neighborhood effects to potential mechanism (beliefs), can
  - Identify at risk youth but also design policies that don't require costly moves.

## Data Description

- Use Geocoded NLSY97 merged with Decennial Census Records. US cohort born 1980-1984, over-samples Black and Hispanic youth.

## Data Description

- Use Geocoded NLSY97 merged with Decennial Census Records. US cohort born 1980-1984, over-samples Black and Hispanic youth.
  1. See high school student, between 15-16 years old. Observe,
    - Household net worth, race, ethnicity, gender.
    - Human capital measures (ASVAB scores, risky behavior, grades, suspensions).
    - Self reported belief about school, arrests, military, parenthood, hours worked etc.
    - Social environment (parent and peer characteristics, neighborhood outcomes same race/gender adults).

## Data Description

- Use Geocoded NLSY97 merged with Decennial Census Records. US cohort born 1980-1984, over-samples Black and Hispanic youth.
  1. See high school student, between 15-16 years old. Observe,
    - Household net worth, race, ethnicity, gender.
    - Human capital measures (ASVAB scores, risky behavior, grades, suspensions).
    - Self reported belief about school, arrests, military, parenthood, hours worked etc.
    - Social environment (parent and peer characteristics, neighborhood outcomes same race/gender adults).
  2. See what happens to them. Able to answer,
    - Do they graduate high school or college?
    - When do they have children, are they arrested?
    - How many hours do they work?
    - Do they join the military?

## Covariates Used in Analysis

- **Demographics:** race, ethnicity, gender, state fixed effect, urban-rural, birth year.

## Covariates Used in Analysis

- **Demographics:** race, ethnicity, gender, state fixed effect, urban-rural, birth year.
- **Human Capital:** 8th grade GPA, HS GPA, suspensions and ASVAB scores, socio-behavioral controls (Hai & Heckman 2018).



## Covariates Used in Analysis

- **Demographics:** race, ethnicity, gender, state fixed effect, urban-rural, birth year.
- **Human Capital:** 8th grade GPA, HS GPA, suspensions and ASVAB scores, socio-behavioral controls (Hai & Heckman 2018).
- **Negative Shocks:**
  - **Family Shocks:** count of events that occurred in family: parent death, parent unemployment, parent divorce or absence, household hospitalization.
  - **Victim Shock:** count of events that occurred to individual: been bullied, seen shooting, been homeless, home break in, felt unsafe, victim of violence.  
( DeLuca, Papageorge, Boselovic, Gershenson, Gray, Nerenberg, Sausedo, & Young 2021)

## Covariates Used in Analysis

- **Parent Attributes:** education, military, jail, mother's age first birth, net worth.

## Covariates Used in Analysis

- **Parent Attributes:** education, military, jail, mother's age first birth, net worth.
- **Peer Activities:** percent of peers with college plans, who cut class, and had sex.

## Covariates Used in Analysis

- **Parent Attributes:** education, military, jail, mother's age first birth, net worth.
- **Peer Activities:** percent of peers with college plans, who cut class, and had sex.
- **Beliefs:** both short term (within next year) and long term (by certain age) beliefs of outcomes like military service, school, work, arrest, and parenthood.

## Covariates Used in Analysis

- **Parent Attributes:** education, military, jail, mother's age first birth, net worth.
- **Peer Activities:** percent of peers with college plans, who cut class, and had sex.
- **Beliefs:** both short term (within next year) and long term (by certain age) beliefs of outcomes like military service, school, work, arrest, and parenthood.
- **Neighborhood Attributes:**
  - Tract level outcomes from 2000 Decennial Census: schooling, unemployment, earnings, military service for adults of the same race/ethnicity and gender.
  - 1990 County level outcomes from NLSY97: crime rates and percent of births to young mothers.

## Covariates Used in Analysis

- **Parent Attributes:** education, military, jail, mother's age first birth, net worth.
- **Peer Activities:** percent of peers with college plans, who cut class, and had sex.
- **Beliefs:** both short term (within next year) and long term (by certain age) beliefs of outcomes like military service, school, work, arrest, and parenthood.
- **Neighborhood Attributes:**
  - Tract level outcomes from 2000 Decennial Census: schooling, unemployment, earnings, military service for adults of the same race/ethnicity and gender.
  - 1990 County level outcomes from NLSY97: crime rates and percent of births to young mothers.
- Sample restricted to those not missing any of the covariates.

## Question to be answered

- How does a youths social environment influence their beliefs about school, work, crime, and parenthood?

## Question to be answered

- How does a youths social environment influence their beliefs about school, work, crime, and parenthood?
- **Method:** OLS, regress beliefs on forementioned covariates.



## Question to be answered

- How does a youths social environment influence their beliefs about school, work, crime, and parenthood?
- **Method:** OLS, regress beliefs on forementioned covariates.
- For short term beliefs whole sample is available, for long term beliefs cohort born 1980-1981 is available. Restricted to sample answered ages 15-16 of survey year.

## Question to be answered

- How does a youths social environment influence their beliefs about school, work, crime, and parenthood?
- **Method:** OLS, regress beliefs on forementioned covariates.
- For short term beliefs whole sample is available, for long term beliefs cohort born 1980-1981 is available. Restricted to sample answered ages 15-16 of survey year.
- For ease of presentation only important covariates shown, but whole list of afore mentioned controls is used.

Table 1: School Beliefs

VARIABLES	Prob	Prob	Prob
	School Next Year	HS Grad by 20	Prob Deg by 30
Reported 8th grade GPA	0.5266 (0.4783)	2.0885** (0.9441)	8.4886*** (1.2227)
Tract: Pct HS Diploma Only	0.0301 (0.0671)	0.1179** (0.0515)	0.3311*** (0.1242)
Tract: Pct Some College	-0.0268 (0.0380)	-0.0217 (0.0475)	-0.0442 (0.1087)
Tract: Pct Bachelors +	-0.0196 (0.0470)	-0.0452 (0.0507)	0.1196 (0.1011)
Avg Years of Parents Schooling	0.9064*** (0.2466)	0.6023*** (0.2199)	2.5043*** (0.5624)
Pct Peers College Plans (25 ppts)	0.5155 (0.3344)	1.8272** (0.7117)	5.0087*** (0.7101)
County: Crime per 1k people	0.0211 (0.0224)	0.0262* (0.0144)	-0.0425** (0.0193)
Pct Peers had Sex (25 ppts)		0.5647* (0.3347)	-1.5043** (0.7058)
Parent Serve in Military	0.2564 (0.7118)	1.4814* (0.7644)	1.0971 (1.4788)
Constant	84.5800*** (5.3937)	65.4903*** (6.2247)	-22.5834 (14.3205)
Observations	2,742	1,528	1,528

Robust standard errors in parentheses

\*\*\* p&lt;0.01, \*\* p&lt;0.05, \* p&lt;0.1

- Optimism regarding school outcomes positively associated with more education, military service, less crime and sex at young ages.

Table 2: Beliefs Arrest &amp; Parenthood

VARIABLES	Prob Arrest Next Year	Prob Arrested   Stole Car	Prob Parent by 20
Ever had Sex by age 15	3.5279*** (0.6837)	-7.0346*** (2.2750)	8.9518*** (1.2952)
County: Crime per 1k people	0.0260* (0.0143)	-0.0945** (0.0410)	0.0490** (0.0227)
Parent Ever in Jail	3.6199** (1.7044)	-8.1541** (3.9747)	6.1406** (2.7823)
Pct Peers Cut Class (25 ppts)	0.8497*** (0.2280)	0.9114 (0.9678)	0.1987 (0.5654)
Pct Peers had Sex (25 ppts)		-0.1221 (0.8366)	1.7990*** (0.5620)
Victim Shocks	1.0885** (0.4286)	-1.0101 (1.3159)	0.0032 (0.9515)
Tract: Pct HS Diploma Only	-0.0070 (0.0568)	0.3675*** (0.1284)	0.0664 (0.0988)
Avg Years of Parents Schooling	0.1735 (0.1488)	-0.6275 (0.7961)	-0.6974* (0.3893)
Pct Peers College Plans (25 ppts)	0.4653 (0.3297)	2.8593** (1.2481)	-0.4499 (0.4952)
Constant	5.1618 (4.6997)	50.6843*** (15.0871)	21.9754** (9.3952)
Observations	2,742	1,528	1,528

Robust standard errors in parentheses

\*\*\* p&lt;0.01, \*\* p&lt;0.05, \* p&lt;0.1

- Being parent young, or actual arrest seem more likely with exposure to more crime, incarceration, risky peer behavior, victimization, less education.
- **However** exposed to **more** crime, jail and **less** education believe theft **less risky**.

Table 3: Work Beliefs

VARIABLES	Prob		Prob		Likelihood Serve Military
	Work	No School	Work	School	
Suspended 10-15 years old	0.9095 (1.1760)		4.7654*** (1.5484)		0.0006 (0.0827)
Tract: Unemployment Rate	-0.2843*** (0.1074)		-0.1379 (0.1297)		0.0145 (0.0095)
Tract: Pct HS Diploma Only	0.0290 (0.0978)		0.2238** (0.0923)		0.0112** (0.0052)
Tract: Pct Ever Military	0.1393** (0.0647)		0.1772** (0.0894)		0.0066 (0.0058)
Parent Serve in Military	1.6731 (1.0306)		2.9300** (1.4572)		0.0850 (0.0804)
County: Crime per 1k people	0.0307 (0.0288)		0.0362 (0.0324)		0.0028** (0.0013)
Pct Peers Cut Class (25 ppts)	0.9499** (0.4615)		1.4772*** (0.5172)		0.0315 (0.0326)
Pct Peers had Sex (25 ppts)					-0.0577* (0.0320)
Pct Births Mother Under 20 County	-0.2237 (0.1823)		-0.4036* (0.2261)		-0.0048 (0.0101)
Mom's Age at First Birth	-0.2722** (0.1236)		-0.3059* (0.1804)		-0.0139* (0.0083)
Avg Years of Parents Schooling	0.1249 (0.2665)		-1.5330*** (0.3490)		0.0010 (0.0232)
HH Net Worth (\$10k)	-0.0258 (0.0313)		-0.0922** (0.0382)		0.0009 (0.0019)
Family Shocks	-0.2702 (0.4541)		1.1885** (0.4812)		-0.0331 (0.0270)
Constant	83.0050*** (7.7853)		71.9101*** (7.9957)		2.4752*** (0.3841)
Observations	2,742		2,742		1,310

Robust standard errors in parentheses

\*\*\* p&lt;0.01, \*\* p&lt;0.05, \* p&lt;0.1

- Working as teen seems more likely with more military, employment, high school completion, cutting class, and less young births, family resources/stability.
- Military service more likely with HS completion crime, less with sex at young ages.

## How does Social Environment Influence Beliefs?

1. More exposure to positive education events like higher HS completion rates, parent's education, peer college aspirations associated with
  - more optimism towards schooling outcomes
  - theft perceived as more risky, and lower probability of parenthood.

## How does Social Environment Influence Beliefs?

1. More exposure to positive education events like higher HS completion rates, parent's education, peer college aspirations associated with
  - more optimism towards schooling outcomes
  - theft perceived as more risky, and lower probability of parenthood.
2. More exposure to adverse events like crime, sex at young ages, cutting class are associated with
  - theft perceived less risky, and actual arrest or parenthood deemed more likely.
  - more pessimism towards college completion.

## How does Social Environment Influence Beliefs?

1. More exposure to positive education events like higher HS completion rates, parent's education, peer college aspirations associated with
  - more optimism towards schooling outcomes
  - theft perceived as more risky, and lower probability of parenthood.
2. More exposure to adverse events like crime, sex at young ages, cutting class are associated with
  - theft perceived less risky, and actual arrest or parenthood deemed more likely.
  - more pessimism towards college completion.
3. Working as teen seems
  - more likely with higher employment rates, HS completion, military service, cutting class.
  - less likely with sex at young ages, less family stability, education and resources.



## How does Social Environment Influence Beliefs?

1. More exposure to positive education events like higher HS completion rates, parent's education, peer college aspirations associated with
  - more optimism towards schooling outcomes
  - theft perceived as more risky, and lower probability of parenthood.
2. More exposure to adverse events like crime, sex at young ages, cutting class are associated with
  - theft perceived less risky, and actual arrest or parenthood deemed more likely.
  - more pessimism towards college completion.
3. Working as teen seems
  - more likely with higher employment rates, HS completion, military service, cutting class.
  - less likely with sex at young ages, less family stability, education and resources.
4. Likelihood of military service has similar negative relation as work with crime, sex at young ages, and positive relation with HS completion.

## Next Question to be Answered

- Examined association of social network outcomes with beliefs, next answer
  - Are these beliefs correlated to future corresponding outcomes?

## Next Question to be Answered

- Examined association of social network outcomes with beliefs, next answer
  - Are these beliefs correlated to future corresponding outcomes?
- **Method:** Similar to last analysis, perform OLS, by regressing outcomes on beliefs and other covariates.

## Next Question to be Answered

- Examined association of social network outcomes with beliefs, next answer
  - Are these beliefs correlated to future corresponding outcomes?
- **Method:** Similar to last analysis, perform OLS, by regressing outcomes on beliefs and other covariates.
- Beliefs used are beliefs about high school completion, college degree, arrest next year, parenthood next year and military likelihood (only for military service)

## Next Question to be Answered

- Examined association of social network outcomes with beliefs, next answer
  - Are these beliefs correlated to future corresponding outcomes?
- **Method:** Similar to last analysis, perform OLS, by regressing outcomes on beliefs and other covariates.
- Beliefs used are beliefs about high school completion, college degree, arrest next year, parenthood next year and military likelihood (only for military service)
- For ease of presentation only important covariates shown, but whole list of controls is used. Only 1980-1981 cohort used since long term beliefs used.

Table 4: Outcomes

VARIABLES	HS Drop out	College Grad 30	Been Arrested	Parent by 20	Serve Military
Prob HS Grad by 20 (10 pts)	-0.0426*** (0.0086)	-0.0122** (0.0062)	0.0054 (0.0083)	-0.0050 (0.0090)	0.0052 (0.0045)
Prob Deg by 30 (10 pts)	-0.0057* (0.0034)	0.0177*** (0.0029)	-0.0024 (0.0038)	-0.0057* (0.0031)	0.0006 (0.0023)
Prob Parent by 20 (10 pts)	0.0132*** (0.0036)	-0.0013 (0.0037)	0.0109** (0.0051)	0.0128** (0.0052)	-0.0017 (0.0034)
Prob Arrest Next Year (10 pts)	0.0006 (0.0048)	-0.0060 (0.0057)	0.0242*** (0.0071)	-0.0019 (0.0065)	0.0022 (0.0038)
Military Likelihood: Likely					0.1057*** (0.0297)
Military Likelihood: Very Likely					0.1054** (0.0413)
HH Net Worth (\$10k)	0.0002 (0.0003)	0.0021*** (0.0007)	-0.0000 (0.0006)	-0.0004 (0.0003)	-0.0004 (0.0003)
Family Shocks	0.0024 (0.0062)	-0.0378*** (0.0085)	0.0145 (0.0108)	0.0005 (0.0067)	-0.0038 (0.0042)
Victim Shocks	-0.0011 (0.0113)	-0.0121 (0.0084)	0.0456*** (0.0144)	0.0021 (0.0120)	-0.0005 (0.0097)
Suspended 10-15 years old	0.0446 (0.0351)	-0.0450* (0.0242)	0.1167*** (0.0245)	0.0357 (0.0303)	0.0021 (0.0190)
ASVAB AFQT	-0.0012*** (0.0004)	0.0031*** (0.0006)	-0.0003 (0.0005)	-0.0003 (0.0004)	0.0007** (0.0003)
Constant	1.0987*** (0.1352)	-0.7328*** (0.1649)	0.4017*** (0.1259)	0.4741*** (0.1444)	0.0151 (0.1126)
Observations	1,528	1,528	1,528	1,528	1,310

Robust standard errors in parentheses

\*\*\* p&lt;0.01, \*\* p&lt;0.05, \* p&lt;0.1

- Strong positive relation Beliefs and corresponding outcomes, all else constant.
- Positive correlation belief parent by 20, and actual HS dropout, arrests. Negative correlation between belief college grad and actual HS dropout, parent by 20.

## Summary Outcomes and Beliefs

- Beliefs seem to strongly predict future outcomes, especially corresponding beliefs and outcomes

## Summary Outcomes and Beliefs

- Beliefs seem to strongly predict future outcomes, especially corresponding beliefs and outcomes
- Magnitude sizes are fairly large compared to other variables deemed important by literature like human capital, household net worth, adverse shocks.



## Summary Outcomes and Beliefs

- Beliefs seem to strongly predict future outcomes, especially corresponding beliefs and outcomes
- Magnitude sizes are fairly large compared to other variables deemed important by literature like human capital, household net worth, adverse shocks.
- Next we see how much differences in beliefs explain racial and ethnic gaps,
  - since Black and Hispanic youth more likely to come from households and neighborhoods with lower SES and education rates (hence different beliefs).
  - some research has claimed pessimism explains racial wealth gaps.

(Boerma & Karabarbounis 2021)

## Question to be answered

- How much do differences in beliefs explain inequality in these outcomes?

## Question to be answered

- How much do differences in beliefs explain inequality in these outcomes?
- **Method:** Oaxaca Blinder Analysis to decompose racial/ethnic gaps by beliefs, neighborhood, household, peer, human capital, and other characteristics.

## Question to be answered

- How much do differences in beliefs explain inequality in these outcomes?
- **Method:** Oaxaca Blinder Analysis to decompose racial/ethnic gaps by beliefs, neighborhood, household, peer, human capital, and other characteristics.
- Report coefficients of explained portion by type of covariate, shows statistical significance.

## Question to be answered

- How much do differences in beliefs explain inequality in these outcomes?
- **Method:** Oaxaca Blinder Analysis to decompose racial/ethnic gaps by beliefs, neighborhood, household, peer, human capital, and other characteristics.
- Report coefficients of explained portion by type of covariate, shows statistical significance.
- Also report percent of explained gap by type of covariate, to show importance of magnitude.

## Question to be answered

- How much do differences in beliefs explain inequality in these outcomes?
- **Method:** Oaxaca Blinder Analysis to decompose racial/ethnic gaps by beliefs, neighborhood, household, peer, human capital, and other characteristics.
- Report coefficients of explained portion by type of covariate, shows statistical significance.
- Also report percent of explained gap by type of covariate, to show importance of magnitude.
- **Caveat:** Important to note that these groups of covariates can differ because of structural inequities and should not be identified with "culture."

# Oaxaca Blinder: Black vs White Outcomes

Table 5: Black vs White Outcomes

VARIABLES	Arrest	Parent by 20	HS Dropout	College
Beliefs	0.0152**	0.0018	0.0146*	0.0018
% of Explained Gap	13.01	0.97	7.97	0.61
Neighborhood	-0.0062	0.0438	0.0179	-0.0058
% of Explained Gap	-5.31	23.51	9.77	-1.96
HH Environment	0.0259*	0.0257**	0.0048	0.0893***
% of Explained Gap	22.17	13.79	2.62	30.20
Peers	-0.0051	0.0206**	0.0145	0.0098
% of Explained Gap	-4.37	11.06	7.91	3.31
Academic	0.0434**	0.0265**	0.0773***	0.1588***
% of Explained Gap	37.16	14.22	42.17	53.70
Socio-behavioral	0.0420***	0.0316***	0.0296***	0.0216***
% of Explained Gap	35.96	16.96	16.15	7.30
Other	0.0016	0.0362***	0.0245**	0.0203
% of Explained Gap	1.37	19.43	13.37	6.87
White Outcome	0.2655***	0.1096***	0.0987***	0.4007***
Black Outcome	0.3394***	0.2668***	0.2176***	0.2694***
explained	0.1168***	0.1863***	0.1833***	0.2957***
unexplained	-0.0429	-0.0291	-0.0643*	-0.1644***
N White	821	821	821	821
N Black	386	386	386	386

Robust standard errors in parentheses

\*\*\* p&lt;0.01, \*\* p&lt;0.05, \* p&lt;0.1

# Oaxaca Blinder: Hispanic vs White Outcomes

Table 6: Hispanic vs White Outcomes

VARIABLES	Parent by 20	HS Dropout	College
Beliefs	0.0061	0.0389***	0.0021
% of Explained	3.92	39.25	1.20
Neighborhood	0.0915**	-0.0097	-0.0671*
% of Explained	58.80	-9.79	-38.41
HH Environment	0.0331**	0.0107	0.1228***
% of Explained	21.27	10.80	70.29
Peers	0.0152***	0.0029	0.0028
% of Explained	9.77	2.93	1.60
Academic	0.0249***	0.0499***	0.0983***
% of Explained	16.00	50.35	56.27
Socio-behavioral	0.0078*	0.0030	0.0040
% of Explained	5.01	3.03	2.29
Other	-0.0231	0.0035	0.0118
% of Explained	-14.85	3.53	6.75
White Outcome	0.1096***	0.0987***	0.4007***
Hispanic Outcome	0.2208***	0.2013***	0.1851***
explained	0.1556***	0.0991**	0.1747***
unexplained	-0.0444	0.0035	0.0410
N White	821	821	821
N Hispanic	308	308	308

Robust standard errors in parentheses

\*\*\* p &lt; 0.01, \*\* p &lt; 0.05, \* p &lt; 0.1



## Summary of Oaxaca Blinder Decomposition

- Differences in beliefs have very limited explanatory value in explaining racial and ethnic inequality.
  - Beliefs explain 13% and 8% Black-White Arrest, HS dropout gap respectively.
  - Beliefs explain 40% Hispanic-White High School dropout gap.

## Summary of Oaxaca Blinder Decomposition

- Differences in beliefs have very limited explanatory value in explaining racial and ethnic inequality.
  - Beliefs explain 13% and 8% Black-White Arrest, HS dropout gap respectively.
  - Beliefs explain 40% Hispanic-White High School dropout gap.
- These differences in beliefs may reflect incomplete information but also rational responses to unobservables, i.e. discrimination, binding legal barriers.

## Summary of Oaxaca Blinder Decomposition

- Differences in beliefs have very limited explanatory value in explaining racial and ethnic inequality.
  - Beliefs explain 13% and 8% Black-White Arrest, HS dropout gap respectively.
  - Beliefs explain 40% Hispanic-White High School dropout gap.
- These differences in beliefs may reflect incomplete information but also rational responses to unobservables, i.e. discrimination, binding legal barriers.
- HH environment, peer composition, neighborhood, and human capital differences are still important on their own.

## Summary of Oaxaca Blinder Decomposition

- Differences in beliefs have very limited explanatory value in explaining racial and ethnic inequality.
  - Beliefs explain 13% and 8% Black-White Arrest, HS dropout gap respectively.
  - Beliefs explain 40% Hispanic-White High School dropout gap.
- These differences in beliefs may reflect incomplete information but also rational responses to unobservables, i.e. discrimination, binding legal barriers.
- HH environment, peer composition, neighborhood, and human capital differences are still important on their own.
- Results consistent with Barrera JMP 2021, find no significant role beliefs in Black/White college gaps, but important role for family wealth, human capital.

## Conclusion

- Beliefs about variety of future outcomes related to social environment, suggests social learning, incomplete information, or unobservables.

## Conclusion

- Beliefs about variety of future outcomes related to social environment, suggests social learning, incomplete information, or unobservables.
- These beliefs are strongly correlated with outcomes, especially so with corresponding outcomes.

## Conclusion

- Beliefs about variety of future outcomes related to social environment, suggests social learning, incomplete information, or unobservables.
- These beliefs are strongly correlated with outcomes, especially so with corresponding outcomes.
- These results seem to suggests
  - perceived complementarities between crime and early parenthood, HS completion and military service,
  - perceived trade offs between risky behavior, completing HS, and enrolling in college.

## Conclusion

- Beliefs about variety of future outcomes related to social environment, suggests social learning, incomplete information, or unobservables.
- These beliefs are strongly correlated with outcomes, especially so with corresponding outcomes.
- These results seem to suggests
  - perceived complementarities between crime and early parenthood, HS completion and military service,
  - perceived trade offs between risky behavior, completing HS, and enrolling in college.
- **However:** These beliefs don't explain racial/ethnic gaps in these outcomes, exception being HS dropout, arrests.
  - But Work still needs to be done if explains SES gaps in outcomes.



## Future Work

- Disentangle between what is incomplete information that is incorrect and what reflects unobservables agents are rationally responding to.

## Future Work

- Disentangle between what is incomplete information that is incorrect and what reflects unobservables agents are rationally responding to.
- Perhaps capture information frictions through information experiments that provide information.
  - Does a salient information campaign about benefits of school, affect risky behavior at young ages?

## Future Work

- Disentangle between what is incomplete information that is incorrect and what reflects unobservables agents are rationally responding to.
- Perhaps capture information frictions through information experiments that provide information.
  - Does a salient information campaign about benefits of school, affect risky behavior at young ages?
- Think of exogenous changes to policies to get at rationally internalized observables.