

# Human Capital Investments and Expectations about Career and Family

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ZEW Summercourse Revealed Preferences

July 7, 2020

# Summary I

## Research questions and design

- What do students believe about the consequences of their education choices?
- How do students sort into majors?
- Novel: what role do family variables play in such choices?
- Survey with undergraduate students at NYU on perceptions about consequences of educational choices
- Specifically: choice of a major
- Follow-up survey after six years

# Summary II

## Results

- Students believe in importance of consequences for own earnings and family life
- Particularly for females, major choice corresponds to different rates and timing of marriage and fertility
- Belief about marriage market "return" to higher earning majors
- Ex-ante beliefs are systematically related to educational choices and ex-post realized outcomes

# Model I

## Human capital investment under uncertainty

- Expected utility for human capital choice at time  $\tau$ :

$$E_{i,\tau}(V_k) = \sum_{t=\tau+1}^T \beta^{t-\tau} \int u_t(X) dG_{i,\tau}(X|k, t)$$

- with discount rate *beta* and outcome  $X$  for all subsequent periods given a human capital investment  $k$
- $G_{i,\tau}(X|k, t)$  is the belief distribution about the outcome given human capital investments  $k$

# Model II

Belief distribution  $G_{i,\tau}(X|k, t)$

- Survey design elicits beliefs  $G_{i,\tau}(X|k, t)$  about the choice of a major
- Belief distributions have four characteristics:
  - reflect individual *uncertainty*
  - are *heterogenous*
  - can be *incorrect*
  - can evolve over time due to *learning*
- Natural limitation: elicitation of degree of uncertainty

# Model III

## Different effects of human capital choices

- Ex-ante individual differences in beliefs

$$\Delta_{G,i}(k, k') = G_i(X|k, t) - G_i(X|k', t)$$

- Ex-post individual differences in potential outcomes

$$\Delta_{F,i}(k, k') = F_i(X|k, t) - F_i(X|k', t)$$

- Ex-post individual differences realized outcomes

$$\Delta_H(k, k') = H(X|k, t) - H(X|k', t)$$

with  $H(X|k, t) = \frac{1}{M_k} \sum_{t \in \Omega_k} F_i(k = k^*, t)$

# Data

- Survey among NYU undergraduate students in 2010
- Beliefs about earnings, earnings growth, earnings uncertainty, marriage, spousal earnings, fertility and labor supply
- Questions conditioned on ages 23, 30 and 45
- Sample consists of 493 individuals
- Main sources of variation in the data: gender, major choice, age
- Follow-up survey 6 years later

# Current Population Characteristics

- Earnings, employment, and marriage data for the US population using the 2009 ACS data
- Not suited for causal inference; needs not reflect the student's beliefs
- Data from older cohort; includes not only high-ability participants
- But data is suited to document that career and family outcomes differ by educational choices in observational data



# Earnings Beliefs

## Earnings Levels

- Male students believe to earn more than female students at each age
- Perceived gender gap is largest in science/business and at later stages
- Higher expected earnings for a science/business degree (\$54.000) than for humanities degree (\$40.000)
- Are these beliefs accurate and reasonable? Expectations and realizations are positively correlated
- Expected earnings are much higher than what ACS data suggests

# Earnings Beliefs

## Earnings Returns, Growth, Uncertainties

- Both female and male students perceive an approximately 30% higher return to completing a degree in science/business relative to humanities and an approximately 60% higher return to graduating relative to no degree
- Expected returns grow over time, with higher expected returns for male students at the later ages
- There is considerable variation in the expected returns
- Students believe to see larger earning growth in the early parts of their careers
- Earnings growth is believed to be higher for science/business relative to humanities
- Uncertainty in earnings is much higher in the no degree scenario

# Beliefs about Marriage and Spousal Characteristics

- Recent theory predicts that investment in education generates returns in the marriage market
- Probabilities:
  - Women believe they are slightly more likely to be married at younger ages, but no difference at age 45
  - Students believe they are less likely to be married without a degree
- Potential Spouse's Earnings
  - Men expect lower, women expect higher earnings for their potential Spouse
  - Students believe graduating in science or business relative to humanities or no degree will result in a higher earning spouse
  - There is evidence for assortative mating by education

# Beliefs about Fertility

- Conditioned on ages 30 and 45
- Men and women believe that completing a science or business degree rather than a degree in the humanities would reduce their expected number of children at age 30
- In contrast, completing a degree relative to no degree doubles expected number of children
- Students believe major choice has a larger effect on the timing of fertility rather than on the level

# Beliefs about Future Labor Supply

- Students believe their human capital choice will substantially affect their future employment
- Beliefs about working full-time is higher for males and higher for science/business degree relative to a degree in humanities
- Students' beliefs about their age 30 labor supply conditional on future expected marital status
- Male students beliefs about future labor supply vary little by marital status, female students believe to work less when married

# Beliefs and Human Capital Choices I

- Until now: evidence that students hold beliefs that educational choices matter for career and family outcomes
- Natural next question: Does this translate to intended and actual educational decisions?
- Intended major and actual major are now the outcome variables in the analysis with career and family variables as explanatory variables

# Beliefs and Human Capital Choices II

Table 14: (Intended and Actual) Major Choice and Expectations about Career and Family

|  | Intended Major       |                      |                      |                      | Actual Major        |                     |
|--|----------------------|----------------------|----------------------|----------------------|---------------------|---------------------|
|  | OLS                  |                      | LAD                  |                      | Multinomial Logit   |                     |
|  | (1)                  | (2)                  | (3)                  | (4)                  | (5)                 | (6)                 |
| <b>Panel A: Females</b>                |                      |                      |                      |                      |                     |                     |
| Age 30 Earnings (\$10,000s)            | 0.146***<br>(0.047)  | 0.099**<br>(0.048)   | 0.230***<br>(0.065)  | 0.183**<br>(0.078)   | 0.084***<br>(0.019) | 0.037<br>(0.026)    |
| Ability Rank                           | 0.029***<br>(0.004)  | 0.029***<br>(0.004)  | 0.035***<br>(0.005)  | 0.039***<br>(0.004)  | 0.021***<br>(0.004) | 0.022***<br>(0.004) |
| Prob Marriage by Age 30                |                      | -0.251<br>(0.706)    |                      | -0.171<br>(0.713)    |                     | 1.444**<br>(0.690)  |
| Spousal Earnings (\$10,000s)           |                      | 0.087***<br>(0.028)  |                      | 0.083<br>(0.059)     |                     | 0.110***<br>(0.036) |
| Exp num of children by 30              |                      | 0.306*<br>(0.188)    |                      | 0.603***<br>(0.202)  |                     | 0.575***<br>(0.143) |
| Constant                               | -1.473***<br>(0.206) | -1.266***<br>(0.250) | -1.445***<br>(0.188) | -0.878***<br>(0.262) |                     |                     |
| Pvalue (Family variables) <sup>a</sup> |                      | 0.0124               |                      | 0.0088               |                     | 0.000               |
| Number of Individuals                  | 317                  | 317                  | 317                  | 317                  | 185                 | 185                 |
| Observations                           | 634                  | 634                  | 634                  | 634                  | 555                 | 555                 |
| (Pseudo) R-squared                     | 0.192                | 0.219                | 0.1323               | 0.1484               | 0.157               | 0.2399              |

Cols (1)-(2) show OLS estimates. Cols (3)-(4) show Least Absolute Deviation estimates. The dep. variable is the intended likelihood of choosing a major.

Cols (5)-(6) show estimates from a multinomial logit regression, where the dependent variable is the actual major at graduation.

Robust standard errors in parentheses. \*\* p<0.01, \* p<0.05, \* p<0.1.

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| <b>Panel B: Males</b>                  |                     |                     |                     |                     |                     |                     |
| Age 30 Earnings (\$10,000s)            | 0.095***<br>(0.026) | 0.093***<br>(0.026) | 0.105**<br>(0.047)  | 0.102**<br>(0.051)  | 0.407***<br>(0.074) | 0.410***<br>(0.080) |
| Ability Rank                           | 0.024***<br>(0.005) | 0.025***<br>(0.005) | 0.018***<br>(0.006) | 0.018***<br>(0.006) | 0.002<br>(0.006)    | 0.002<br>(0.007)    |
| Prob Marriage by Age 30                |                     | 0.704<br>(1.049)    |                     | 1.513<br>(1.517)    |                     | 0.569<br>(1.383)    |
| Spousal Earnings (\$10,000s)           |                     | 0.029<br>(0.029)    |                     | 0.018<br>(0.081)    |                     | -0.010<br>(0.046)   |
| Exp num of children by 30              |                     | 0.202<br>(0.234)    |                     | 0.242<br>(0.225)    |                     | 0.211<br>(0.234)    |
| Constant                               | -0.423*<br>(0.235)  | -0.243<br>(0.290)   | -0.178<br>(0.138)   | -0.018<br>(0.223)   |                     |                     |
| Pvalue (Family variables) <sup>a</sup> |                     | 0.5248              |                     | 0.6978              |                     | 0.8005              |
| Number of Individuals                  | 176                 | 176                 | 176                 | 176                 | 88                  | 88                  |
| Observations                           | 352                 | 352                 | 352                 | 352                 | 264                 | 264                 |
| (Pseudo) R-squared                     | 0.159               | 0.167               | 0.0744              | 0.0803              | 0.39                | 0.3953              |

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Cols (1)-(2) show OLS estimates. Cols (3)-(4) show Least Absolute Deviation estimates. The dep. variable is the intended likelihood of choosing a major.

Cols (5)-(6) show estimates from a multinomial logit regression, where the dependent variable is the actual major at graduation.

Robust standard errors in parentheses. \*\* p<0.01, \* p<0.05, \* p<0.1.

<sup>a</sup> P-value of a F-test that coefficients on prob of marriage, spousal earnings, and exp number of children are jointly zero.

# Beliefs and Realized Outcomes I

## Follow-up survey

- Follow-up survey six years after the initial survey
- 274 out of the initial 493 respondents participated
- Average age of respondent is 25
- Provides some evidence for the "quality" of the expectations data
- Respondents are not reminded of their initial answers

# Beliefs and Realized Outcomes II

## Population descriptive statistics

- No statistically significant differences for earnings: expected \$73.500 vs \$75.000
- working part-time: 18% of females expected to work part-time, but only 9% in reality
- Large significant differences for likelihood of marriage



# Beliefs and Realized Outcomes III

## Individual-level relationship - career variables

Table 16: The Link between Expectations and Outcomes

|   | All                 | Males             | Females             |
|---|---------------------|-------------------|---------------------|
| Panel A, dependent variable: Log (current earnings)<br>Log(Exp Earnings, Age Weighted)  | 0.386***<br>(0.131) | 0.167<br>(0.207)  | 0.521***<br>(0.125) |
| Observations  | 201                 | 64                | 137                 |
| $R^2$   | 0.092               | 0.018             | 0.153               |
| Mean of Dependent Variable  | 10.99               | 11.18             | 10.90               |
| Panel B, dependent variable: Employed Full-time<br>Expected Prob of full-time emp at 30 | 0.165<br>(0.148)    | -0.189<br>(0.220) | 0.358*<br>(0.187)   |
| Observations  | 273                 | 88                | 185                 |
| $R^2$   | 0.005               | 0.007             | 0.023               |
| Mean of Dependent Variable  | 0.740               | 0.740             | 0.740               |
| Panel C, dependent variable: Employed Part-time<br>Expected Prob of part-time Emp at 30 | 0.272*<br>(0.161)   | 0.0203<br>(0.263) | 0.392**<br>(0.196)  |
| Observations  | 273                 | 88                | 185                 |
| $R^2$   | 0.015               | 0.000             | 0.032               |
| Mean of Dependent Variable  | 0.0900              | 0.0900            | 0.0900              |

# Beliefs and Realized Outcomes III

## Individual-level relationship - career variables

Table 16: The Link between Expectations and Outcomes

|   | All                 | Males             | Females             |
|---|---------------------|-------------------|---------------------|
| Panel A, dependent variable: Log (current earnings)<br>Log(Exp Earnings, Age Weighted)  | 0.386***<br>(0.131) | 0.167<br>(0.207)  | 0.521***<br>(0.125) |
| Observations  | 201                 | 64                | 137                 |
| $R^2$   | 0.092               | 0.018             | 0.153               |
| Mean of Dependent Variable  | 10.99               | 11.18             | 10.90               |
| Panel B, dependent variable: Employed Full-time<br>Expected Prob of full-time emp at 30 | 0.165<br>(0.148)    | -0.189<br>(0.220) | 0.358*<br>(0.187)   |
| Observations  | 273                 | 88                | 185                 |
| $R^2$   | 0.005               | 0.007             | 0.023               |
| Mean of Dependent Variable  | 0.740               | 0.740             | 0.740               |
| Panel C, dependent variable: Employed Part-time<br>Expected Prob of part-time Emp at 30 | 0.272*<br>(0.161)   | 0.0203<br>(0.263) | 0.392**<br>(0.196)  |
| Observations  | 273                 | 88                | 185                 |
| $R^2$   | 0.015               | 0.000             | 0.032               |
| Mean of Dependent Variable  | 0.0900              | 0.0900            | 0.0900              |

# Beliefs and Realized Outcomes IV

## Individual-level relationship - family variables

- Marriage variable is distorted due to young age of respondents
- Significant if approximated by actual outcome "in a relationship"
- Beliefs about spousal income are predictive for actual spousal income
- Overall beliefs compare favorably to actual outcomes
- Indication that students can anticipate career and family outcomes of educational choices to some degree

# Policy Implications

- Beliefs about earnings and family variables matter and play an important role in degree choice
- Male students believe family variables to influence their career less than female students
- Suggests that society wide belief systems have to change to affect gender pay gap and gender gap in major choices
- Students who choose a humanities degree still expect higher returns to a science/business degree

# Limitations

- Representativeness of sample
- Timing of follow-up survey
- Due to time restrictions, the authors did not ask about reasons for participant's beliefs
- General survey limitation

# Future Research

- Choice of participants casts doubt on external validity: extend the sample to elicit possible heterogeneity
- Run follow-up surveys when students realize outcomes at ages 30 and 45
- Ask for reasons for beliefs
- Stated beliefs are not consequential
- Experimental intervention necessary to uncover causal link between family variables and major choice

# Appendix

# Current Population Characteristics

Table 2: Descriptive Statistics of 2009 ACS Data

|  | Age 23         |                   | Age 30         |                   | Age 45          |                     |
|--|----------------|-------------------|----------------|-------------------|-----------------|---------------------|
|  | Male           | Female            | Male           | Female            | Male            | Female              |
| <b>Earnings (in \$10,000s)</b>         |                |                   |                |                   |                 |                     |
| Science/Business                       | 3.33<br>(2.15) | 3.22<br>(2.19)    | 6.74<br>(4.81) | 5.48+++<br>(3.15) | 11.61<br>(9.79) | 7.46+++<br>(6.49)   |
| Humanities                             | 2.51<br>(1.33) | 2.57<br>(1.88)    | 5.40<br>(4.20) | 4.47+++<br>(2.71) | 9.07<br>(8.48)  | 5.93+++<br>(5.67)   |
| No Degree                              | 2.54<br>(1.52) | 2.15+++<br>(1.41) | 4.21<br>(2.50) | 3.08+++<br>(1.59) | 5.70<br>(4.13)  | 3.88+++<br>(2.57)   |
| p-value <sup>a</sup>                   | 0              | 0                 | 0              | 0                 | 0               | 0                   |
| <b>Spousal Earnings (in \$10,000s)</b> |                |                   |                |                   |                 |                     |
| Science/Business                       | 3.41<br>(2.09) | 4.75+++<br>(3.11) | 5.26<br>(3.44) | 8.25+++<br>(5.79) | 7.44<br>(6.69)  | 12.68+++<br>(10.15) |
| Humanities                             | 2.27<br>(1.33) | 3.49+++<br>(1.93) | 4.30<br>(2.61) | 6.66+++<br>(5.64) | 5.71<br>(4.72)  | 9.85+++<br>(9.42)   |
| No Degree                              | 2.21<br>(1.13) | 3.50+++<br>(1.93) | 3.24<br>(1.86) | 4.82+++<br>(2.92) | 3.76<br>(2.59)  | 6.36+++<br>(4.81)   |
| p-value                                | 0              | 0.003             | 0              | 0                 | 0               | 0                   |
| <b>Full-time Employed (%)</b>          |                |                   |                |                   |                 |                     |
| Science/Business                       | 38.5           | 42.4+++           | 80.86          | 64.40+++          | 82.68           | 58.42+++            |
| Humanities                             | 30.9           | 36.2+++           | 72.96          | 57.92+++          | 75.86           | 52.07+++            |
| No Degree                              | 40.1           | 34.4+++           | 66.53          | 46.51+++          | 67.88           | 52.44+++            |
| p-value                                | 0              | 0                 | 0              | 0                 | 0               | 0                   |
| <b>Married (%)</b>                     |                |                   |                |                   |                 |                     |
| Science/Business                       | 8.2            | 15.9+++           | 61.72          | 67.49+++          | 80.79           | 76.14+++            |
| Humanities                             | 11.5           | 15.3+++           | 55.7           | 64.94+++          | 76.58           | 74.51+              |
| No Degree                              | 15.2           | 26.4+++           | 54.86          | 59.29+++          | 69.3            | 69.65               |
| p-value                                | 0              | 0                 | 0              | 0                 | 0               | 0                   |

Earnings and spousal earnings shown in \$10,000s.

Mean (standard deviation) shown for the continuous outcomes.

+++, ++, + gender differences statistically significant at the 1, 5, and 10% levels, respectively. Symbols denoted on female column.

<sup>a</sup> p-value of a F-test of the joint equality of means across majors. p-value of zero implies p-value < 0.001.



# Earnings Beliefs: Earnings Levels

Table 3: Self Earnings

|   | Age 23            |                   | Age 30             |                     | Age 45            |                     |
|---|-------------------|-------------------|--------------------|---------------------|-------------------|---------------------|
|   | Male              | Female            | Male               | Female              | Male              | Female              |
| Panel A: Levels (in 10,000s of dollars) |                   |                   |                    |                     |                   |                     |
| Science/Business                        | 5.93<br>(7.32)    | 5.39<br>(4.66)    | 13.74<br>(16.61)   | 10.86++<br>(9.31)   | 19.00<br>(22.38)  | 13.81+++<br>(14.12) |
| Humanities                              | 4.71<br>(7.38)    | 3.94<br>(3.51)    | 6.87<br>(5.51)     | 6.86<br>(7.4)       | 11.03<br>(13.53)  | 9.60<br>(11.75)     |
| No Degree                               | 3.50<br>(7.54)    | 2.45++<br>(1.16)  | 5.07<br>(11.0)     | 3.27++<br>(4.56)    | 8.97<br>(15.95)   | 5.86+++<br>(10.22)  |
| Overall                                 | 5.60<br>(7.36)    | 4.68+<br>(3.81)   | 12.95<br>(16.35)   | 9.21+++<br>(8.45)   | 18.44<br>(22.52)  | 12.33+++<br>(13.90) |
| Panel B: Individual Log Differences     |                   |                   |                    |                     |                   |                     |
| Sci/Business versus. Humanities         | .267***<br>(.019) | .304***<br>(.017) | .523***<br>(.048)  | .425***++<br>(.025) | .446***<br>(.051) | .347***+<br>(.026)  |
| Graduate versus. No Degree              | .594***<br>(.033) | .642***<br>(.026) | 1.022***<br>(.055) | 1.038***<br>(.037)  | .829***<br>(.054) | .833***<br>(.038)   |

Panel A shows the mean and standard deviations of expected earnings (in \$10,000s). +++, ++, + denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

Panel B shows the avg. log differences and standard deviations in parentheses. \*\*\*, \*\*, \* denote the means are statistically different from zero at the 1, 5, and 10% levels, respectively. +++, ++, + (shown on the female column) denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

# Earnings Growth

Table 4: Earnings growth beliefs

|  | Age 23-30       |                    | Age 30-45        |                  |
|--|-----------------|--------------------|------------------|------------------|
|  | Male            | Female             | Male             | Female           |
| <b>Panel A: Levels (in %)</b>          |                 |                    |                  |                  |
| Science/Business                       | .67<br>(.72)    | .63<br>(.65)       | .25<br>(.47)     | .19<br>(.54)     |
| Humanities                             | .41<br>(.56)    | .51+<br>(.53)      | .32<br>(.45)     | .27<br>(.52)     |
| No Degree                              | .23<br>(.78)    | .21<br>(.55)       | .47<br>(.74)     | .43<br>(.58)     |
| Overall                                | .66<br>(.73)    | .6<br>(.58)        | .29<br>(.48)     | .23<br>(.52)     |
| <b>Panel B: Individual differences</b> |                 |                    |                  |                  |
| Sci/Business versus. Humanities        | .26***<br>(.05) | .12***+++<br>(.03) | -.08*<br>(.04)   | -.08***<br>(.03) |
| Graduate versus. No Degree             | .42***<br>(.06) | .39***<br>(.03)    | -.19***<br>(.06) | -.2***<br>(.03)  |

Panel A shows the mean and standard dev of beliefs about earnings growth (in %).  
 +++, ++, + denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

Panel B shows average log differences and standard deviations in parentheses.

\*\*\*, \*\*, \* denote means are statistically different from zero at the 1, 5, and 10% levels, respectively. +++, ++, + (shown on the female column) denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

# Earnings Uncertainty

Table 5: Age 30 Earnings Uncertainty - Std deviations from fitting a Beta Distribution

|  | Male               | Female                |
|--|--------------------|-----------------------|
| <b>Panel A: Levels (in \$10,000)</b>   |                    |                       |
| Science/Business                       | 9.17<br>(1.44)     | 9.49<br>(2.48)        |
| Humanities                             | 10.34<br>(27.44)   | 10.01<br>(2.32)       |
| No Degree                              | 14.73<br>(7.34)    | 15.27<br>(7.53)       |
| Overall                                | 9.71<br>(2.02)     | 9.68<br>(2.01)        |
| <b>Panel B: Individual differences</b> |                    |                       |
| Sci/Business versus. Humanities        | -.11***<br>(.014)  | -.057***+++<br>(.012) |
| Graduate versus. No Degree             | -.305***<br>(.052) | -.335***<br>(.043)    |

Panel A shows the mean and std dev of age 30 earnings uncertainty beliefs (in \$10,000). Uncertainty is the standard deviation of the individual-specific (beta-) fitted earnings distribution.

+++, ++, + denote gender differences statistically different at the 1, 5, and 10% levels, respectively.

Panel B shows average log differences and standard deviations in parentheses. \*\*\*, \*\*, \* denote means are statistically diff from 0 at the 1, 5, and 10% levels, respectively. +++, ++, + (shown on female column) denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

# Beliefs about Marriage

Table 6: Beliefs about Marriage

| Prob Marriage:                             | Age 23          |                     | Age 30           |                      | Age 45           |                   |
|--|-----------------|---------------------|------------------|----------------------|------------------|-------------------|
|  | Male            | Female              | Male             | Female               | Male             | Female            |
| <b>Panel A: Levels (0-1 scale)</b>         |                 |                     |                  |                      |                  |                   |
| Science/Business                           | .148<br>(.207)  | .167<br>(.214)      | .593<br>(.286)   | .594<br>(.271)       | .804<br>(.248)   | .778<br>(.253)    |
| Humanities                                 | .152<br>(.214)  | .182<br>(.229)      | .601<br>(.291)   | .66++<br>(.268)      | .797<br>(.253)   | .800<br>(.246)    |
| No Degree                                  | .153<br>(.219)  | .221+++<br>(.26)    | .535<br>(.329)   | .605++<br>(.29)      | .727<br>(.302)   | .743<br>(.287)    |
| Overall                                    | .149<br>(.213)  | .179<br>(.225)      | .589<br>(.288)   | .634+<br>(.266)      | .797<br>(.25)    | .793<br>(.242)    |
| <b>Panel B: Individual Log Differences</b> |                 |                     |                  |                      |                  |                   |
| Sci/Business versus. Humanities            | -.008<br>(.046) | -.096*<br>(.053)    | -.024<br>(.042)  | -.147***++<br>(.039) | .013<br>(.014)   | -.020<br>(.024)   |
| Graduate versus. No Degree                 | .075<br>(.099)  | -.192***+<br>(.091) | .354***<br>(.11) | .127***++<br>(.054)  | .317***<br>(.09) | .161***<br>(.054) |

Panel A shows the mean and standard deviations of marriage beliefs. +++, ++, + denote gender diffs are statistically significant at the 1, 5, and 10% levels, respectively.

Panel B shows the average log differences and standard deviations in parentheses.

\*\*\*, \*\*, \* denote the means are statistically different from zero at the 1, 5, and 10% levels, respectively. +++, ++, + (shown on the female column) denote gender differences are statistically significant at the 1, 5, and 10% levels, respectively.

# Beliefs about Potential Spousal Earnings

Table 7: Beliefs about Potential Spousal Earnings, Conditional on Own Major (and Own Age)

|   | Age 23            |                   | Age 30            |                   | Age 45            |                     |
|---|-------------------|-------------------|-------------------|-------------------|-------------------|---------------------|
|   | Male              | Female            | Male              | Female            | Male              | Female              |
| Panel A: Levels (in 10,000s of dollars) |                   |                   |                   |                   |                   |                     |
| Science/Business                        | 5.06<br>(4.12)    | 5.74+<br>(3.92)   | 9.00<br>(7.72)    | 10.76++<br>(9.14) | 11.29<br>(13.25)  | 13.68+<br>(13.67)   |
| Humanities                              | 4.52<br>(7.35)    | 4.75<br>(3.75)    | 7.05<br>(8.93)    | 7.86<br>(7.69)    | 8.02<br>(7.95)    | 11.07+++<br>(12.90) |
| No Degree                               | 4.58<br>(11.99)   | 3.46<br>(2.26)    | 4.57<br>(5.56)    | 5.54<br>(9.11)    | 6.25<br>(9.89)    | 7.76<br>(12.03)     |
| Overall                                 | 5.02<br>(5.90)    | 5.30<br>(3.88)    | 8.42<br>(7.60)    | 9.74+<br>(8.91)   | 10.77<br>(13.20)  | 12.73<br>(13.61)    |
| Panel B: Individual Log Differences     |                   |                   |                   |                   |                   |                     |
| Sci/Business versus. Humanities         | .185***<br>(.019) | .198***<br>(.015) | .282***<br>(.044) | .292***<br>(.024) | .241***<br>(.04)  | .221***<br>(.026)   |
| Graduate versus. No Degree              | .432***<br>(.048) | .481***<br>(.028) | .687***<br>(.05)  | .741***<br>(.041) | .587***<br>(.054) | .632***<br>(.039)   |

Panel A shows the mean and standard dev of beliefs about spouse's expected earnings (in \$10,000s) conditional on own major.

+++, ++, + denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

Panel B shows avg. log differences and standard deviations in parentheses. \*\*\*, \*\*, \* denote means are statistically different from zero at the 1, 5, and 10% levels, respectively. ++, + (shown on the female column) denote gender differences are statistically different at the 1, 5, and 10% levels, respectively.

# Beliefs and Realized Outcomes

## Population descriptive statistics - career variables

Table 15: Descriptive Statistics - Expectations (Weighted by Major Probs) and Outcomes

|  | Expectations in 2010 |         |          | Realizations in 2016 |         |         |
|--|----------------------|---------|----------|----------------------|---------|---------|
|  | All                  | Males   | Females  | All                  | Males   | Females |
| Panel A: Earnings   Full-time (age-weighted expectation)         |                      |         |          |                      |         |         |
| Mean   | 7.35                 | 9.90    | 6.16     | 7.49                 | 10.18   | 6.24    |
| SD   | (8.19)               | (13.52) | (3.06)   | (7.74)               | (12.39) | (3.46)  |
| N  | 201                  | 64      | 137      | 201                  | 64      | 137     |
| Panel B: Likelihood of full-time employment (age 30 expectation) |                      |         |          |                      |         |         |
| Mean   | 77.61                | 82.28   | 75.38    | 73.99                | 73.86   | 74.05   |
| SD   | (19.15)              | (19.51) | (18.61)  | (43.95)              | (44.19) | (43.95) |
| N  | 273                  | 88      | 185      | 273                  | 88      | 185     |
| Panel C: Likelihood of part-time employment (age 30 expectation) |                      |         |          |                      |         |         |
| Mean   | 16.02***             | 11.71   | 18.08*** | 9.16                 | 9.09    | 9.19    |
| SD   | (13.1)               | (12.02) | (13.12)  | (28.9)               | (28.91) | (28.97) |
| N  | 273                  | 88      | 185      | 273                  | 88      | 185     |

# Beliefs and Realized Outcomes

## Population descriptive statistics - family variables

Table 15: Descriptive Statistics - Expectations (Weighted by Major Probs) and Outcomes

|   | Expectations in 2010 |          |          | Realizations in 2016 |         |         |
|---|----------------------|----------|----------|----------------------|---------|---------|
|   | All                  | Males    | Females  | All                  | Males   | Females |
| Panel D: Likelihood of Marriage   |                      |          |          |                      |         |         |
| Using expectation for 1-yr after graduation (and marriage for outcomes) |                      |          |          |                      |         |         |
| Mean  | 16.04***             | 13.62*   | 17.16*** | 5.56                 | 8.14    | 4.35    |
| SD  | (21.62)              | (19.83)  | (22.37)  | (22.95)              | (27.5)  | (20.45) |
| N   | 270                  | 86       | 184      | 270                  | 86      | 184     |
| Using age-weighted expectation (and marriage + cohab. for outcomes)     |                      |          |          |                      |         |         |
| Mean  | 34.36***             | 31.35*** | 35.77*** | 48.15                | 45.35   | 49.46   |
| SD  | (21.08)              | (21.97)  | (20.56)  | (50.06)              | (50.08) | (50.13) |
| N   | 270                  | 86       | 184      | 270                  | 86      | 184     |
| Panel E: Likelihood of partner working full-time (age 30 expectation)   |                      |          |          |                      |         |         |
| Mean  | 73.91                | 62.28    | 78.89    | 76.15                | 69.23   | 79.12   |
| SD  | (21.19)              | (23.28)  | (18.2)   | (42.78)              | (46.76) | (40.87) |
| N   | 130                  | 39       | 91       | 130                  | 39      | 91      |
| Panel F: Partner's Earnings (age-weighted expectation)                  |                      |          |          |                      |         |         |
| Mean  | 6.52*                | 6.84     | 6.4**    | 7.73                 | 5.68    | 8.5     |
| SD  | (2.84)               | (3.24)   | (2.69)   | (6.14)               | (3.53)  | (6.73)  |
| N   | 99                   | 27       | 72       | 99                   | 27      | 72      |

# Beliefs and Realized Outcomes

## Individual-level relationship - family variables

Table 16: The Link between Expectations and Outcomes

|  | All                 | Males               | Females             |
|--|---------------------|---------------------|---------------------|
| Panel D, dependent variable: Married<br>Age-Weighted Exp Probability of Being Married                        | 0.217**<br>(0.100)  | 0.378*<br>(0.217)   | 0.147<br>(0.0936)   |
| Observations   | 270                 | 86                  | 184                 |
| $R^2$  | 0.040               | 0.091               | 0.022               |
| Mean of Dependent Variable   | 0.0600              | 0.0800              | 0.0400              |
| Panel E, dependent variable: In Any relationship<br>Age-Weighted Exp Probability of Being Married            | 0.503***<br>(0.127) | 0.606***<br>(0.209) | 0.441***<br>(0.161) |
| Observations   | 270                 | 86                  | 184                 |
| $R^2$  | 0.045               | 0.071               | 0.033               |
| Mean of Dependent Variable   | 0.480               | 0.450               | 0.490               |
| Panel F, dependent variable: Spouse/Partner Working Full-time<br>Expected Prob of Spouse full-time Emp at 30 | 0.415**<br>(0.183)  | 0.458<br>(0.298)    | 0.339<br>(0.253)    |
| Observations   | 130                 | 39                  | 91                  |
| $R^2$  | 0.042               | 0.052               | 0.023               |
| Mean of Dependent Variable   | 0.760               | 0.690               | 0.790               |
| Panel G, dependent variable: Log(Spouse/Partner Earnings)<br>Log(Age-Weighted Expected Earnings of Spouse)   | 0.400**<br>(0.173)  | 0.598**<br>(0.233)  | 0.344*<br>(0.206)   |
| Observations   | 112                 | 31                  | 81                  |
| $R^2$  | 0.054               | 0.119               | 0.042               |
| Mean of Dependent Variable   | 1.690               | 1.420               | 1.790               |