# Beauty, Brains, and Bulges: Life Course Consequences Of Adolescent Attractiveness, Ability, and Obesity 

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#### Abstract

Across half a century, the Wisconsin Longitudinal Study (WLS) has obtained a rich record of educational attainment, family life, careers, and health among 10,317 female and male high school graduates. Using high school yearbook photographs, we have added measures of facial attractiveness and facial mass. Facial mass in late adolescence is associated with early morbidity and mortality. This paper compares women and men across a wider set of outcomes educational attainment, occupational standing, earnings, and marital choice. It compares effects of obesity in combination with those of two other key measures obtained from WLS participants in adolescence - academic ability and facial attractiveness. Biases in household interviewers’ ratings may have led to over-estimates of the advantages of facial attractiveness, but these are not a problem in our ratings of high school yearbook photos.


Across half a century, the Wisconsin Longitudinal Study (WLS) has obtained a rich record of educational attainment, family life, careers, and health among 10,317 female and male high school graduates (Sewell, Hauser, Springer, and Hauser 2004). Previous work with the WLS has analyzed and compared a wide-array of post-high school outcomes among women and men: college attendance (Sewell 1971), military service (MacLean 2004), occupational careers (Hauser, Warren, Huang, and Carter 2000; Portes, Haller, and Sewell 1968; Sewell, Haller, and Portes 1969; Sewell, Hauser, and Wolf 1980), earnings (Hauser and Daymont 1977; Sewell and Hauser 1975), health (Marks and Shinberg 1998; Marks and Shinberg 1997; Shinberg 1998; Shinberg 1995), retirement (Raymo, Ho, Sweeney, and Hauser 2006; Raymo and Sweeney 2006), and end-of-life planning (Carr 2006; Carr and Khodyakov 2007; Carr, Nesse, and Wortman 2006; Moorman, Hauser, and Carr 2007).

Most of this work has drawn at least in part on the social psychological model of adolescent academic performance, ambition, and later social and economic attainment that was developed by Sewell and his colleagues almost 40 years ago (Haller and Portes 1973; Sewell, Haller, and Ohlendorf 1970; Sewell, Haller, and Portes 1969). The model is displayed in Figure 1. The essential ideas of the model are as follows: Social background affects school performance. These two sets of variables affect social influences - the expectations and modeling behaviors of significant others. Social influences largely determine educational and occupational aspirations, thus carrying much of the influence of social background and school performance. Aspirations, in turn, have large effects on post-secondary schooling and occupational careers, and they carry much of the influence of social influences, school performance, and social background.

The key theoretical idea of the model is the importance of social psychological processes in mediating the connections between positions in the social structure across generations. This idea now seems simple because it is widely accepted among social scientists. The model is also simple in a second, more important sense, that it is a modified causal chain. Not every earlier variable affects every later variable in the scheme. Of fifteen possible paths from antecedent variables in Figure 1, only the seven paths marked with an asterisk (*) carry large effects. This paper also compares women and men across a wide set of outcomes - educational attainment, occupational standing, earnings, and marital choice. We expand the content of the model of adolescent ambition to include measures of facial mass and facial attractiveness that have been coded from recently collected high school yearbook photographs. Facial mass in late adolescence is associated with early morbidity and mortality (Reither, Hauser, and Swallen forthcoming), but its implications for education and labor market success are less clear. A widely accepted economic finding holds that facial attractiveness carries a large premium in the labor market (Biddle and Hamermesh 1998; Hamermesh and Biddle 1994). However, this conclusion is questionable in Hamermesh and Biddle's (1994) analyses of three household surveys because the attractiveness ratings were made by interviewers in the participants’ own homes. That is, they were very likely biased by situational factors, e.g., the dress, grooming, and manner of the respondent, the physical surroundings, and the performance of and rapport with the respondent in the interview.

## DATA

Our measures of facial mass and of facial attractiveness were obtained independently - in two completely separate coding operations by different sets of raters with different sets of
supervisors. Each set of ratings was carried out by several, independent coders using computerguided, photo-anchored scales of the same stimulus - a scanned, black-and-white headshot taken from the participant's high school yearbook. The photos provided minimal clues about the origins of the participant, and the coders were given no information about any participant other than the photograph. Thus, there is far less reason to think that contextual clues may have prejudiced judgments of the coders. Further, in the WLS data, it is possible to control some biases using measures of the social background and academic performance of the participants.

High school yearbooks from 1957 were collected over the past several years, at first mainly from public sources - high schools and public libraries - beginning with larger schools in larger places. This effort yielded approximately 7500 photos, from which a well-designed sample of 3000 was drawn and coded. A second round of collection and scanning was carried out during the first half of 2007 in conjunction with the distribution of respondent reports from the 2004-05 round of the WLS. Thus, the WLS collection of scanned yearbooks now covers almost all members of the sample. The full set of photos was coded during 2008, and these data will be used in the final version of this paper.

Each set of facial appearance codes was assigned independently by multiple coders using a detailed, computer-assisted protocol. The yearbook photograph is the only information about the target individual presented to the coder. In both cases, the target picture was presented in combination with a visual scale that is anchored by gender-specific photographs of high school seniors who were not in the WLS sample. For example, Figure 2 shows a display similar to that used to code men's facial mass.

In the case of facial mass, six graduate students independently coded facial mass following
these instructions.

1. Click on this internet site: (Suppressed)

You will be prompted for a name and password. This is highly confidential information, and you are responsible for safeguarding it. Do not share this information with anyone for any reason!

Username: *******
Password: **********
2. In each session, you will code approximately 300 photos, 150 for boys and 150 for girls. At this time, choose whether you want to code girls or boys first. In subsequent coding sessions, please alternate which gender you choose first.
3. You will be asked for your name, sex and birthday. Please respond to these questions consistently at each coding session. Follow the format in this illustration:

Name: Jane Doe

Sex: female
Birthday: October 22, 1970
4. Next, you will see a series of photos aligned at the top of the page with several triangle markers placed beneath them. These photos are a guide to coding the yearbook photos that appear at the bottom of the page. Also at the bottom of the page is a question: How heavy is this person? To answer this question, follow these instructions:
A. In 10 seconds or less, form an initial reaction about where you think this person fits on the scale. Click once on that point.
B. After you choose a particular point, the following question will appear: Does the red symbol indicate your choice? Do not answer this question immediately, but rather proceed to
step C.
C. Examine the person's neck. How wide is this person's neck relative to the other photos? Do you see evidence of a "double-chin" or other fat deposits around the neck?
D. Examine the person’s cheeks. Are this person’s cheeks "puffy," full or sunken? How does this compare to other photos in the scale?
E. After you examine the person's neck and cheeks, decide whether your initial reaction still seems appropriate. If so, click "yes."
F. If not, then (1) answer "no," (2) click on the new point that seems most appropriate and (3) immediately answer "yes."
G. Repeat steps A-F for all photos.
H. Once finished, choose the other gender and code those photos following these instructions (Reither 2005).

Very high reliability (Cronbach’s alpha $=0.91$ ) can be obtained in the ratings of facial mass with six independent codings of each photograph (Reither 2005). In the new round of rating, we each rater also recoded several hundred previously coded photos in order to calibrate the two rounds of coding.

A similar protocol was used to code facial attractiveness. In the initial round of coding, we obtained 12 independent ratings of each photo. Six ratings were obtained from college students, and six ratings were obtained from contemporaries of the graduates-seniors who were on campus during the summer for Elder Hostel. We used both older and younger coders because we were concerned that there might be changing standards of facial attractiveness. However, the only substantial difference in the ratings by older and younger coders was that the older coders
were more reliable, and older coders have been used consistently in all production coding. Again, we have obtained repeated ratings of several hundred previously coded photos in order to calibrate the two rounds of coding.

For the present analysis, each individual coder's ratings were standardized - that is, deviated from the coder's mean and divided by the standard deviation of that coder's ratings. Then, the mean of the standardized ratings of each student photo was calculated. However, in the case of the attractiveness ratings, the highest and lowest ratings of each photo were eliminated to reduce the occurrence of outliers.

## PRELIMINARY ANALYSIS

Regardless of gender, there is little evidence that either the ratings of facial mass or those of facial attractiveness are affected by social or economic background or by academic ability. As shown in Tables 1 and 2, regressions of the two average ratings on an array of social background variables yield negligible and inconsistent estimates. The background variables include father's educational attainment, mother's educational attainment, father's occupational status (Duncan SEI), a 4-year average of family income from tax records, number of siblings, and intact family, while the measures of academic ability are the Henmon-Nelson Test of Mental Ability (Froehlich 1941; Henmon and Holt 1931; Henmon and Nelson 1946; Henmon and Nelson 1954) and the student's rank in their high school graduating class.

Table 3 shows effects of social background, academic ability, facial attractiveness, and facial mass on educational attainment by gender. As one would expect, there are positive effects of social standing and negative effects of number of siblings on educational attainments of women and of men. Similarly, there are highly significant positive effects of test scores and of high
school rank on educational attainment for women and for men. While facial attractiveness and facial mass have no significant effects on the educational attainment of men, both variables have significant effects among women. Greater facial attractiveness increases women’s educational attainments, while greater facial mass decreases them. However, the effects of facial attractiveness are not significantly different between women and men; this may well change when the full sample ratings are analyzed.
[Analyses of occupational status, earnings, and spouse characteristics to be added]

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Table 1. Regressions of Facial Mass Ratings on Social Background and Academic Ability by Gender: Wisconsin Longitudinal Study.

| Source | SS | df | MS |  | Number of obs | $=1175$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  | F ( 6, 1168) | $=0.63$ |
| Model | 2.66482343 | 6.44 | 137238 |  | Prob > F | $=0.7090$ |
| Residual | 827.648419 | 1168.70 | 603098 |  | R-squared | $=0.0032$ |
| Tot |  |  |  |  | Adj R-squared | $=-0.0019$ |
|  |  |  |  |  |  |  |
| FACIAL MASS | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf | Interval] |
| bmfaedu | . 003114 | . 0088526 | 0.35 | $0.725$ | -. 0142547 | . 0204826 |
| bmmaedu | -. 0182793 | . 0099771 | -1.83 | $0.067$ | -. 0378544 | . 0012959 |
| bmfoclu | -1.80e-06 | . 0001305 | -0.01 | 0.989 | -. 0002578 | . 0002542 |
| bmpin1 | -. 0000424 | . 0004096 | -0.10 | 0.918 | -. 0008461 | . 0007613 |
| sibstt | -. 0041567 | . 0098749 | -0.42 | 0.674 | -. 0235313 | . 0152179 |
| bklvpr | -. 0385039 | . 1095774 | -0.35 | 0.725 | -. 2534944 | . 1764866 |
| cons | . 2379095 | . 1603267 | 1.48 | 0.138 | -. 0766509 | . 55247 |

. regress FACIAL MASS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr if sexrsp==2 (FEMALE)

| Source | SS | df | MS | Number of obs | $=$ | 1375 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | F ( 6, 1368) | $=$ | 5.88 |
| Model | 23.7958494 | 6 | 3.9659749 | Prob > F | = | 0.0000 |
| Residual | 922.450518 | 1368 | . 674305934 | R -squared | = | 0.0251 |
|  |  |  |  | Adj R-squared | = | 0.0209 |
| Total | 946.246367 | 1374 | . 688680034 | Root MSE | $=$ | . 82116 |


| FACIAL MASS | Coef. | Std. Err. |  | $\mathrm{P}>\|\mathrm{t}\|$ | [95\% Conf. Interval] |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmfaedu | -. 0149625 | . 0087078 | -1.72 | 0.086 | -. 0320445 | . 0021195 |
| bmmaedu | -. 0098238 | . 0091785 | -1.07 | 0.285 | -. 0278292 | . 0081816 |
| bmfoclu | -. 0003011 | . 00012 | -2.51 | 0.012 | -. 0005364 | -. 0000658 |
| bmpin1 | -. 0002921 | . 000459 | -0.64 | 0.525 | -. 0011926 | . 0006084 |
| sibstt | . 0051223 | . 0091461 | 0.56 | 0.576 | -. 0128197 | . 0230643 |
| bklvpr | . 0422833 | . 0852675 | 0.50 | 0.620 | -. 124986 | . 2095527 |
| cons | . 3107038 | . 131815 | 2.36 | 0.019 | . 0521222 | . 5692853 |

. regress FACIAL MASS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq
if $\operatorname{sexrsp=}=1$ (MALE)

| Source | SS | df MS |  |  | Number of obs$F(8,1074)$ | 1083 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | $=$ | 0.52 |
| Model | 2.97559742 | 8 | . 371949677 |  | Prob > F | $=$ | 0.8437 |
| Residual | 771.384307 | 1074 | . 718234923 |  | R -squared |  | 0.0038 |
|  |  |  |  |  | Adj R-squared | $=$ | -0.0036 |
| Total | 774.359904 | 1082 | . 715674588 |  | Root MSE | = | . 84749 |
| FACIAL MASS | Coef. | Std. | $r$ r | $P>\|t\|$ | [95\% Conf. | In | terval] |
| bmfaedu | . 0011152 | . 0093 | $12 \quad 0.12$ | 0.905 | -. 0171355 |  | 0193658 |
| bmmaedu | -. 0159132 | . 0104 | $44-1.53$ | 0.127 | -. 0363677 |  | 0045412 |


| bmfoclu | .000016 | .0001366 | 0.12 | 0.907 | -.000252 | .0002841 |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| bmpin1 | -.0000725 | .0004158 | -0.17 | 0.862 | -.0008884 | .0007434 |
| sibstt | -.0065192 | .0102788 | -0.63 | 0.526 | -.0266879 | .0136496 |
| bklvpr | -.0384333 | .1132952 | -0.34 | 0.735 | -.2607382 | .1838717 |
| gwiiq_bm | -.0018448 | .002182 | -0.85 | 0.398 | -.0061263 | .0024366 |
| hsrscorq | .0003171 | .0022389 | 0.14 | 0.887 | -.0040761 | .0047103 |
| cons | .3933119 | .2551429 | 1.54 | 0.123 | -.1073231 | .8939469 |

. regress FACIAL MASS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq
if sexrsp==2 (FEMALE)

| Source | SS | df MS |  |  | Number of obs$F(8, \quad 1231)$ | 1240 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | $=$ | 4.67 |
| Model | 25.0206626 | 83.1 | 58283 |  | Prob > F | $=$ | 0.0000 |
| Residual | 823.694484 | 1231.66 | 26307 |  | R-squared |  | 0.0295 |
|  |  |  |  |  | Adj R-squared | $=$ | 0.0232 |
| Total | 848.715147 | 1239.68 | 00118 |  | Root MSE | = | . 818 |
| FACIAL MASS | Coef | Std. Err. | t | $P>\|t\|$ | [95\% Conf. |  | nterval] |
| bmfaedu | -. 0081581 | . 009294 | -0.88 | 0.380 | -. 026392 |  | . 0100758 |
| bmmaedu | -. 0110167 | . 0098814 | -1.11 | 0.265 | -. 030403 |  | . 0083695 |
| bmfoclu | -. 0002635 | . 0001264 | -2.08 | 0.037 | -. 0005116 |  | . 0000155 |
| bmpin1 | -. 0002745 | . 0004732 | -0.58 | 0.562 | -. 0012028 |  | . 0006539 |
| sibstt | . 0025635 | . 0095555 | 0.27 | 0.789 | -. 0161833 |  | . 0213102 |
| bklvpr | . 0924301 | . 0886195 | 1.04 | 0.297 | -. 0814318 |  | . 266292 |
| gwiiq_bm | -. 0028583 | . 0021634 | -1.32 | 0.187 | -. 0071027 |  | . 001386 |
| hsrscorq | -. 0021156 | . 002166 | -0.98 | 0.329 | -. 0063652 |  | . 0021339 |
| cons | . 6939869 | . 2210251 | 3.14 | 0.002 | . 2603594 |  | 1.127614 |

key to variables: bmfaed $=$ father's years of schooling; bmmaed $=$ mother's years of schooling; bmfocl = father's occupational status; bmpin1 = parents' income; sibstt $=$ number of siblings; bklvpr $=$ intact family; gwiiq bm = Henmon-Nelson IQ; hsrscorq = rank in high school class; srbmi = facial mass.

Table 2. Regressions of Attractiveness Ratings on Social Background and Academic Ability
by Gender: Wisconsin Longitudinal Study.
regress ATTRACTIVENESS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr if sexrsp==1 (MALE)

| Source | SS | MS |  |  | Number of obs | 1156 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  | F ( 6, 1149) | 1.15 |
| Model | . 051902635 | 6.0 | 50439 |  | Prob > F | 0.3288 |
| Residual | 8.6128889 | 1149.0 | 95987 |  | R-squared | 0.0060 |
|  |  |  |  |  | Adj R-squared | 0.0008 |
| Total | 8.66479153 | 1155.0 | 01984 |  | Root MSE | . 08658 |
| ATTRACTIVENESS | Coef. | Std. Er | t | $P>\mid t$ | [95\% Con |  |
| Interval] |  |  |  |  |  |  |
| bmfaedu | . 0003812 | . 0009194 | 0.41 | 0.679 | -. 0014228 | . 0021852 |
| bmmaedu | . 0005624 | . 0010406 | 0.54 | 0.589 | -. 0014793 | . 0026041 |
| bmfoclu | -. 0000223 | . 0000135 | -1.65 | 0.100 | -. 0000488 | $4.25 \mathrm{e}-06$ |
| bmpin1 | -9.80e-06 | . 0000422 | -0.23 | 0.816 | -. 0000926 | . 000073 |
| sibstt | -. 0000342 | . 0010199 | -0.03 | 0.973 | -. 0020353 | . 0019668 |
| bklvpr | . 0211812 | . 0114474 | 1.85 | 0.065 | -. 0012789 | . 0436412 |
| cons | -. 0228257 | . 0167518 | -1.36 | 0.173 | -. 0556933 | . 0100419 |

. regress ATTRACTIVENESS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr if sexrsp==2 (FEMALE)

| Source | SS | df | MS | Number of obs | 1337 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | F ( 6, 1330) | 1.90 |
| Model | . 047954784 | 6 | . 007992464 | Prob > F | 0.0774 |
| Residual | 5.59056592 | 1330 | . 004203433 | R-squared | 0.0085 |
|  |  |  |  | Adj R-squared | 0.0040 |
| Total | 5.6385207 | 1336 | . 00422045 | Root MSE | . 06483 |


| ATTRACTIVENESS <br> Interval] | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmfaedu | -. 0002934 | . 0006998 | -0.42 | 0.675 | -. 0016663 | . 0010795 |
| bmmaedu | . 000908 | . 0007375 | 1.23 | 0.218 | -. 0005387 | . 0023547 |
| bmfoclu | -6.92e-06 | 9.62e-06 | -0.72 | 0.472 | -. 0000258 | . 0000119 |
| bmpin1 | -9.35e-07 | . 0000365 | -0.03 | 0.980 | -. 0000725 | . 0000706 |
| sibstt | . 0003689 | . 0007339 | 0.50 | 0.615 | -. 0010709 | . 0018087 |
| bklvpr | -. 0210822 | . 0068009 | -3.10 | 0.002 | -. 0344238 | -. 0077406 |
| cons | . 0136758 | . 0105615 | 1.29 | 0.196 | -. 0070433 | . 0343948 |

\footnotetext{
. regress ATTRACTIVENESS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq if sexrsp==1 (MALE)


| ATTRACTIVENESS\| | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. |
| :---: | :---: | :---: | :---: | :---: | :---: |


| bmfaedu | . 0005125 | . 0009832 | 0.52 | 0.602 | 0014167 | . 0024418 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmmaedu | . 0008599 | . 0011076 | 0.78 | 0.438 | -. 0013135 | . 0030332 |
| bmfoclu | -. 00002 | . 0000144 | -1.39 | 0.164 | -. 0000483 | 8.23e-06 |
| bmpin1 | -5.59e-06 | . 0000436 | -0.13 | 0.898 | -. 0000912 | . 00008 |
| sibstt | -. 0001155 | . 0010799 | -0.11 | 0.915 | -. 0022344 | . 0020035 |
| bklvpr | . 0244011 | . 0120483 | 2.03 | 0.043 | . 0007598 | . 0480425 |
| gwiiq bm | -. 0001988 | . 0002293 | -0.87 | 0.386 | -. 0006487 | . 0002512 |
| hsrscorq | -. 0001862 | . 0002373 | -0.78 | 0.433 | -. 0006518 | . 0002793 |
| cons | . 0072776 | . 0268965 | 0.27 | 0.787 | -. 0454992 | . 0600544 |

. regress ATTRACTIVENESS bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq
if sexrsp==2 (FEMALE)

| Source | SS | df | MS | Number of obs | 1202 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | F ( 8, 1193) | 1.69 |
| Model | . 055466834 | 8 | . 006933354 | Prob > F | 0.0956 |
| Residual | 4.88384793 | 1193 | . 004093754 | R -squared | 0.0112 |
|  |  |  |  | Adj R-squared | 0.0046 |
| Total | 4.93931476 | 1201 | . 004112668 | Root MSE | . 06398 |


| ATTRACTIVENESS <br> Interval] | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmfaedu | -. 0003426 | . 0007418 | -0.46 | 0.644 | -. 0017981 | . 0011128 |
| bmmaedu | . 0007413 | . 0007864 | 0.94 | 0.346 | -. 0008015 | . 0022842 |
| bmfoclu | -6.61e-06 | . 0000101 | -0.66 | 0.511 | -. 0000263 | . 0000131 |
| bmpin1 | -2.72e-06 | . 0000373 | -0.07 | 0.942 | -. 0000758 | . 0000704 |
| sibstt | . 000373 | . 0007607 | 0.49 | 0.624 | -. 0011195 | . 0018655 |
| bklvpr | -. 0211613 | . 0070076 | -3.02 | 0.003 | -. 0349098 | -. 0074127 |
| gwiiq_bm | . 0000172 | . 0001714 | 0.10 | 0.920 | -. 0003191 | . 0003534 |
| hsrscorq | . 0002158 | . 0001726 | 1.25 | 0.212 | -. 0001229 | . 0005544 |
| cons | -. 008527 | . 0176448 | -0.48 | 0.629 | -. 0431454 | . 0260913 |

key to variables: bmfaed $=$ father's years of schooling; bmmaed $=$ mother's years of schooling; bmfocl = father's occupational status; bmpin1 = parents' income; sibstt $=$ number of siblings; bklvpr = intact family; gwiiq bm = Henmon-Nelson IQ; hsrscorq = rank in high school class; std_pa_rate_trunc = facial attractiveness.

Table 3. Regressions of Educational Attainment on Social Background, Academic Ability,

Facial Attractiveness, and Facial Mass by Gender: Wisconsin Longitudinal Study.
regress edeqyr bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr if sexrsp==1 (MALE)

| Source | SS | df | MS | Number of obs | 1155 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | F ( 6, 1148) | 27.57 |
| Model | 826.345149 | 6 | 137.724192 | Prob > F | 0.0000 |
| Residual | 5734.39424 | 1148 | 4.99511694 | R-squared | 0.1260 |
|  |  |  |  | Adj R-squared | 0.1214 |
| Total | 6560.73939 | 1154 | 5.68521611 | Root MSE | 2.235 |


| edeqyr | Coef | Std. Err. | t | $P>\|t\|$ | [95\% Conf. Interval] |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmfaedu | 152475 | . 0237363 | 6.42 | 0.000 | . 1059037 | . 1990463 |
| bmmaedu | . 0517487 | . 0269086 | 1.92 | 0.055 | -. 0010469 | . 1045442 |
| bmfoclu | . 0012207 | . 0003493 | 3.50 | 0.000 | . 0005355 | . 001906 |
| bmpin1 | . 0022388 | . 00109 | 2.05 | 0.040 | . 0001002 | . 0043773 |
| sibstt | -. 05544 | . 0263288 | -2.11 | 0.035 | -. 1070979 | -. 003782 |
| bklvpr | -. 2125225 | . 2955211 | -0.72 | 0.472 | -. 7923445 | . 3672994 |
| cons | 11.63139 | . 4325198 | 26.89 | 0.000 | 10.78277 | 12.48001 |

regress edeqyr bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr if sexrsp==2 (FEMALE)

| Source | SS | df | MS | Number of obs | 1337 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | F ( 6, 1330) | 54.88 |
| Model | 858.874735 | 6 | 143.145789 | Prob > F | 0.0000 |
| Residual | 3469.34366 | 1330 | 2.60852907 | R-squared | 0.1984 |
|  |  |  |  | Adj R-squared | 0.1948 |
| Total | 4328.2184 | 1336 | 3.23968443 | Root MSE | 1.6151 |


| edeqyr | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. Interval] |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmfaedu | . 0748851 | . 0174334 | 4.30 | 0.000 | . 0406851 | . 109085 |
| bmmaedu | . 1038563 | . 0183709 | 5.65 | 0.000 | . 0678173 | . 1398953 |
| bmfoclu | . 0012108 | . 0002395 | 5.05 | 0.000 | . 0007409 | . 0016808 |
| bmpin1 | . 0030824 | . 0009082 | 3.39 | 0.001 | . 0013007 | . 004864 |
| sibstt | -. 0704071 | . 0182832 | -3.85 | 0.000 | -. 1062742 | -. 0345401 |
| bklvpr | -. 0738077 | . 1694183 | -0.44 | 0.663 | -. 406164 | . 2585486 |
| cons | 10.97177 | . 2631006 | 41.70 | 0.000 | 10.45563 | 11.48791 |

regress edeqyr bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq if sexrsp==1 (MALE)

| Source | SS | df | MS | Number of obs | 1063 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | F ( 8, 1054) | 77.54 |
| Model | 2264.43584 | 8 | 283.05448 | Prob > F | 0.0000 |
| Residual | 3847.44563 | 1054 | 3.65032792 | R-squared | 0.3705 |
|  |  |  |  | Adj R-squared | 0.3657 |
| Total | 6111.88147 | 1062 | 5.7550673 | Root MSE | 1.9106 |


| edeqyr | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. Interval] |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| bmfaedu | . 1305231 | . 0211838 | 6.16 | 0.000 | . 0889559 | . 1720902 |
| bmmaedu | . 0469793 | . 0239053 | 1.97 | 0.050 | . 000072 | . 0938866 |
| bmfoclu | . 0008554 | . 0003106 | 2.75 | 0.006 | . 000246 | . 0014649 |


| bmpin1 | . 0011057 | . 0009396 | 1.18 | 0.240 | -. 0007379 | . 0029494 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| sibstt | -. 0222694 | . 0232654 | -0.96 | 0.339 | -. 0679211 | . 0233823 |
| bklvpr | -. 275829 | . 2595838 | -1.06 | 0.288 | -. 7851888 | . 2335308 |
| gwiiq bm | . 0291555 | . 0049405 | 5.90 | 0.000 | . 019461 | . 0388499 |
| hsrscorq | . 0638467 | . 0051139 | 12.48 | 0.000 | . 0538121 | . 0738812 |
| cons | 2.875094 | . 5798091 | 4.96 | 0.000 | 1.737382 | 4.012805 |

. regress edeqyr bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq if sexrsp==2 (FEMALE)

| Source | SS | df MS |  |  | Number of obs | $=1202$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  | F ( 8, 1193) | = | 62.25 |
| Model | 1115.14115 | 8139 | 92644 |  | Prob > F | = | 0.0000 |
| Residual | 2671.23489 | 11932.2 | 09043 |  | R-squared |  | 0.2945 |
|  |  |  |  |  | Adj R-squared | $=$ | 0.2898 |
| Total | 3786.37604 | 12013.1 | 68613 |  | Root MSE | = | 1.4964 |
| edeqyr | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. |  | terval] |
| bmfaedu | . 056732 | . 0173492 | 3.27 | 0.001 | . 0226935 |  | . 0907704 |
| bmmaedu | . 0698168 | . 018391 | 3.80 | 0.000 | . 0337345 |  | . 1058991 |
| bmfoclu | . 000958 | . 0002353 | 4.07 | 0.000 | . 0004964 |  | . 0014196 |
| bmpin1 | . 0022236 | . 0008712 | 2.55 | 0.011 | . 0005143 |  | . 0039329 |
| sibstt | -. 0554735 | . 0177913 | -3.12 | 0.002 | -. 0903793 |  | . 0205677 |
| bklvpr | . 0573044 | . 1638863 | 0.35 | 0.727 | -. 264233 |  | . 3788418 |
| gwiiq_bm | . 0082936 | . 0040077 | 2.07 | 0.039 | . 0004307 |  | . 0161566 |
| hsrscorq | . 0368569 | . 0040366 | 9.13 | 0.000 | . 0289371 |  | . 0447766 |
| cons | 6.738918 | . 4126601 | 16.33 | 0.000 | 5.929298 |  | 7.548538 |

. regress edeqyr bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq std_pa_rate trunc srbmi if sexrsp==1 (MALE)

| Source | SS | MS |  |  | Number of obs$F(10,1052)$ | 1063 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 62.38 |
| Model | 2275.06407 | $10 \quad 227$ | 06407 |  | Prob > F | 0.0000 |
| Residual | 3836.8174 | 10523.6 | 16483 |  | R -squared | 0.3722 |
|  |  |  |  |  | Adj R-squared | 0.3663 |
| Total | 6111.88147 | 10625. | 50673 |  | Root MSE | 1.9098 |
| edeqyr | Coef | Std. Err. | t | $P>\|t\|$ | [95\% Conf | nterval] |
| bmfaedu | . 1299311 | . 0211774 | 6.14 | 0.000 | . 0883763 | 171486 |
| bmmaedu | . 0460144 | . 0239262 | 1.92 | 0.055 | -. 0009341 | . 0929628 |
| bmfoclu | . 0008785 | . 0003108 | 2.83 | 0.005 | . 0002687 | . 0014883 |
| bmpin1 | . 0011131 | . 0009392 | 1.19 | 0.236 | -. 0007298 | . 0029559 |
| sibstt | -. 0221086 | . 0232591 | -0.95 | 0.342 | -. 0677481 | . 0235309 |
| bklvpr | -. 3033512 | . 2599718 | -1.17 | 0.244 | -. 8134734 | . 206771 |
| gwiiq bm | . 0293899 | . 0049423 | 5.95 | 0.000 | . 0196919 | . 0390878 |
| hsrscorq | . 0640513 | . 0051131 | 12.53 | 0.000 | . 0540183 | . 0740843 |
| ATTRACTIVE . | 1.13561 | . 6669711 | 1.70 | 0.089 | -. 1731353 | 2.444355 |
| FACIAL MASS | . 0041245 | . 0694871 | 0.06 | 0.953 | -. 1322245 | . 1404736 |
| cons | 2.865989 | . 5802364 | 4.94 | 0.000 | 1.727437 | 4.004542 |

. regress edeqyr bmfaed bmmaed bmfocl bmpin1 sibstt bklvpr gwiiq_bm hsrscorq std_pa_rate trunc srbmi
if sexrsp==2 (FEMALE)
Source | SS Mf Number of obs = 1202

| Model <br> Residual | $\begin{aligned} & 1147.46067 \\ & 2638.91537 \end{aligned}$ | $\begin{array}{rr} 10 & 114 \\ 1191 & 2.2 \end{array}$ | 46067 |  | $\begin{aligned} & \text { F( 10, 1191) } \\ & \text { Prob > F } \\ & \text { R-squared } \end{aligned}$ | $\begin{aligned} & =\quad 51.79 \\ & =\quad 0.0000 \\ & =0.3030 \end{aligned}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Total | 3786.37604 | 12013.1 | 68613 |  | Adj R-squared Root MSE | $\begin{aligned} & =0.2972 \\ & =\quad 1.4885 \end{aligned}$ |
| edeqyr | Coef. | Std. Err. | t | $P>\|t\|$ | [95\% Conf. | Interval] |
| bmfaedu | . 05517 | . 0172702 | 3.19 | 0.001 | . 0212866 | . 0890535 |
| bmmaedu | . 0668829 | . 0183114 | 3.65 | 0.000 | . 0309566 | . 1028091 |
| bmfoclu | . 0009214 | . 0002345 | 3.93 | 0.000 | . 0004613 | . 0013814 |
| bmpin1 | . 0021877 | . 0008667 | 2.52 | 0.012 | . 0004872 | . 0038882 |
| sibstt | -. 0551751 | . 0177015 | -3.12 | 0.002 | -. 0899047 | -. 0204456 |
| bklvpr | . 1009063 | . 1637321 | 0.62 | 0.538 | -. 2203291 | . 4221417 |
| gwiiq bm | . 0077488 | . 0039898 | 1.94 | 0.052 | -. 0000791 | . 0155767 |
| hsrscorq | . 0363147 | . 004019 | 9.04 | 0.000 | . 0284296 | . 0441998 |
| ATTRACTIVE . | 1.322106 | . 6739667 | 1.96 | 0.050 | -. 0001881 | 2.6444 |
| FACIAL MASS | -. 1767291 | . 0528628 | -3.34 | 0.001 | -. 2804437 | -. 0730144 |
| cons | 6.865842 | . 4120122 | 16.66 | 0.000 | 6.057492 | 7.674193 |

key to variables: edeqyr = educational attainment; bmfaed = father's years of schooling; bmmaed = mother's years of schooling; bmfocl = father's occupational status; bmpin1 = parents' income; sibstt $=$ number of siblings; bklvpr = intact family; gwiiq bm = Henmon-Nelson IQ; hsrscorq = rank in high school class; std_pa_rate_trunc = facial attractiveness; srbmi = facial mass.

Figure 1 The Wisconsin Model


Figure 2. Model of Relative Body Mass (RBM) Scale Used to Code Yearbook
Photographs of Male Participants in the Wisconsin Longitudinal Study (WLS)


