Practice with Fixed Effects Interactions: COMPLETED version Example Outcome = Income (in 1000s) Predicted from Sex (MW) and Years Education (ed12)

Everything's significant in this simulated data, so no *p*-values are provided.

TITLE "First Model: Fixed Quadratic Time, Time1=0 and Men=0 and Ed12=0"; PROC MIXED DATA=example COVTEST NOCLPRINT NOITPRINT METHOD=ML; CLASS ID; MODEL income = t1 t1*t1 MW ed12 MW*ed12 / SOLUTION DDFM=Satterthwaite; RANDOM INTERCEPT / SUBJECT=ID TYPE=UN; * In ESTIMATE statements, first entry is the effect you are estimating (so first is always 1); * Example of asking for predicted values at specific levels of predictors; * Here, "t1" is replaced with actual time value; ESTIMATE "Intercept at T1 for Men Ed=12" Int 1 t1 0 t1*t1 0 MW 0 ed12 0 MW*ed12 0; ESTIMATE "Intercept at T1 for Men Ed=16" Int 1 t1 0 t1*t1 0 MW 0 ed12 4 MW*ed12 0; ESTIMATE "Intercept at T1 for Women Ed=12" Int 1 t1 0 t1*t1 0 MW 1 ed12 0 MW*ed12 0; ESTIMATE "Intercept at T1 for Women Ed=16" Int 1 t1 0 t1*t1 0 MW 1 ed12 4 MW*ed12 4;

 ESTIMATE
 "Intercept at T6 for Men
 Ed=12"
 Int 1 t1 5 t1*t1 25 MW 0 ed12 0 MW*ed12 0;

 ESTIMATE
 "Intercept at T6 for Men
 Ed=16"
 Int 1 t1 5 t1*t1 25 MW 0 ed12 4 MW*ed12 0;

 ESTIMATE "Intercept at T6 for Women Ed=12" Int 1 t1 5 t1*t1 25 MW 1 ed12 0 MW*ed12 0; ESTIMATE "Intercept at T6 for Women Ed=16" Int 1 t1 5 t1*t1 25 MW 1 ed12 4 MW*ed12 4; * Example of asking for slopes at particular occasions; * Here one of the "t1"=1, the other t1=actual time; ESTIMATE "Linear Slope (for anyone) at T1" t1 1 t1*t1 0; ESTIMATE "Linear Slope (for anyone) at T6" t1 1 t1*t1 10; * Remember, quad*2; * Example of asking for simple main effects of an interaction; ESTIMATE "Sex Diff (at any time) for Ed=12" MW 1 MW*ed12 0; ESTIMATE "Sex Diff (at any time) for Ed=16" MW 1 MW*ed12 4; ESTIMATE "Ed Slope (at any time) for Men" ed12 1 MW*ed12 0; ESTIMATE "Ed Slope (at any time) for Women" ed12 1 MW*ed12 1; run; * Can check estimates by re-centering predictors; TITLE "First Model: Time6=0 and Women=0 and Ed16=0 Instead"; PROC MIXED DATA=example COVTEST NOCLPRINT NOITPRINT METHOD=ML; CLASS ID; MODEL income = t6 t6*t6 WM ed16 WM*ed16 / SOLUTION DDFM=Satterthwaite;

RANDOM INTERCEPT / SUBJECT=ID TYPE=UN;

run;

WHAT SAS GIVES YOU BY DEFAULT IF TIME1=0, MEN=0, AND ED12=0:

| Solution for Fixed Effects | | | |
|----------------------------|----------|----------|--|
| | | Standard | |
| Effect | Estimate | Error | |
| | | | |
| Intercept | 49.0432 | 0.07535 | expected income of 49k at T1 for Man with Ed=12 |
| t1 | 4.1689 | 0.05904 | at T1, income increases 4.2k/time for all |
| t1*t1 | -0.1929 | 0.01133 | linear rate of change/time decreases by .4/time for all |
| MW | -8.4099 | 0.06495 | if ed=12, women make 8.4k less than men |
| ed12 | 2.2751 | 0.02523 | in men, income increases by 2.3k/year of ed |
| MW*ed12 | -0.3983 | 0.03269 | gender gap grows by .4/year OR ed slope is .4 smaller in women |

WHAT EXTRA CONDITIONAL PREDICTIONS AND EFFECTS WE ASKED FOR:

| Estimate | Estimates | |
|----------|---|--|
| | Standard | |
| Estimate | Error | |
| | | |
| 49.0432 | 0.07535 | |
| 58.1438 | 0.1241 | |
| 40.6333 | 0.06944 | |
| 48.1407 | 0.1092 | |
| | | |
| 65.0664 | 0.07535 | |
| 74.1670 | 0.1241 | |
| 56.6565 | 0.06944 | |
| 64.1639 | 0.1092 | |
| | | |
| 4.1689 | 0.05904 | |
| 2.2403 | 0.05904 | |
| | | |
| -8.4099 | 0.06495 | |
| -10.0031 | 0.1451 | |
| | | |
| 2.2751 | 0.02523 | |
| 1.8768 | 0.02078 | |
| | Estimate 49.0432 58.1438 40.6333 48.1407 65.0664 74.1670 56.6565 64.1639 4.1689 2.2403 -8.4099 -10.0031 2.2751 | |

WHAT YOU GET IF YOU RE-CENTER AT TIME6=0, WOMEN=0, AND ED16=0 INSTEAD:

| Solution for Fixed Effects | | | |
|----------------------------|----------|----------|---|
| | | Standard | |
| Effect | Estimate | Error | |
| | | | |
| Intercept | 64.1639 | 0.1092 | expected income of 64k at T6 for women with ed=16 |
| t6 | 2.2403 | 0.05904 | at T6, income increases by 2.2k/time for all |
| t6*t6 | -0.1929 | 0.01133 | linear rate of change/time decreases by .4/time for all |
| WM | 10.0031 | 0.1451 | if ed=16, men make 10k more than women |
| ed16 | 1.8768 | 0.02078 | in women, income increases by 1.9k/year of ed |
| WM*ed16 | 0.3983 | 0.03269 | gender gap grows by .4/year or ed slope is .4 bigger in men |

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TITLE "Second Model: Fixed Quadratic Time, Time1=0 and Men=0 and Ed12=0";
PROC MIXED DATA=example COVTEST NOCLPRINT NOITPRINT METHOD=ML;
      CLASS ID;
      MODEL income = t1 t1*t1 MW ed12 MW*ed12
                      MW*t1 MW*t1*t1 ed12*t1 / SOLUTION DDFM=Satterthwaite;
      RANDOM INTERCEPT / SUBJECT=ID TYPE=UN;
* Example of asking for slopes at particular occasions for particular people;
* Here one of the "t1" = 1, the other t1=actual time;
ESTIMATE "Linear at T1 for Men Ed=12" t1 1 t1*t1 0 MW*t1 0 MW*t1*t1 0 ed12*t1 0;
ESTIMATE "Linear at T1 for Men Ed=16" t1 1 t1*t1 0 MW*t1 0 MW*t1*t1 0 ed12*t1 4;
ESTIMATE "Linear at T1 for Women Ed=12" t1 1 t1*t1 0 MW*t1 1 MW*t1*t1 0 ed12*t1 0;
ESTIMATE "Linear at T1 for Women Ed=16" t1 1 t1*t1 0 MW*t1 1 MW*t1*t1 0 ed12*t1 4;
ESTIMATE "Linear at T6 for Men Ed=12" t1 1 t1*t1 10 MW*t1 0 MW*t1*t1 0 ed12*t1 0;
ESTIMATE "Linear at T6 for Men Ed=16" t1 1 t1*t1 10 MW*t1 0 MW*t1*t1 0 ed12*t1 4;
ESTIMATE "Linear at T6 for Women Ed=12" t1 1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 0;
ESTIMATE "Linear at T6 for Women Ed=16" t1 1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 4;
* Example of asking for simple main effects of an interaction;
* Here, "t1" is actual time always;
ESTIMATE "Sex Diff at T1 if Ed=12"MW 1 MW*t1 0 MW*t1*t1 0 MW*ed12 0;ESTIMATE "Sex Diff at T1 if Ed=16"MW 1 MW*t1 0 MW*t1*t1 0 MW*ed12 4;
ESTIMATE "Sex Diff at T6 if Ed=12"
                                     MW 1 MW*t1 5 MW*t1*t1 25 MW*ed12 0;
ESTIMATE "Sex Diff at T6 if Ed=16"
                                      MW 1 MW*t1 5 MW*t1*t1 25 MW*ed12 4;
ESTIMATE "Ed Slope at T1 for Men"
                                     ed12 1 ed12*t1 0 MW*ed12 0;
ESTIMATE "Ed Slope at T1 for Women"
                                      ed12 1 ed12*t1 0 MW*ed12 1;
ESTIMATE "Ed Slope at T6 for Men" ed12 1 ed12*t1 5 MW*ed12 0;
ed12 1 ed12*t1 5 MW*ed12 0;
* Example of asking for simple two-way interactions of a three-way interaction;
ESTIMATE "Quadratic for Men"
                                t1*t1 1 MW*t1*t1 0;
ESTIMATE "Quadratic for Women" t1*t1 1 MW*t1*t1 1;
                             MW*t1 1 MW*t1*t1 0;
ESTIMATE "Sex by Time at T1"
ESTIMATE "Sex by Time at T6"
                               MW*t1 1 MW*t1*t1 10;
run;
* Can check estimates by re-centering predictors;
TITLE "Second Model: Time6=0 and Women=0 and Ed16=0 Instead";
PROC MIXED DATA=example COVTEST NOCLPRINT NOITPRINT METHOD=ML;
      CLASS ID;
      MODEL income = t6 t6*t6 WM ed16 WM*ed16
                      WM*t6 WM*t6*t6 ed16*t6 / SOLUTION DDFM=Satterthwaite;
      RANDOM INTERCEPT / SUBJECT=ID TYPE=UN;
run:
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WHAT SAS GIVES YOU BY DEFAULT IF TIME1=0, MEN=0, AND ED12=0 (same or different interpretation?):

| Solution for Fixed Effects Standard | | | |
|--|----------|----------|---|
| Effect | Estimate | Error | |
| Intercept | 49.9467 | 0.05817 | (same as before) |
| t1 | 4.0427 | 0.03066 | at T1, income increases 4k/time for men with ed=12 |
| t1*t1 | -0.2570 | 0.005886 | linear rate of change in income decreases by .5/time in men |
| MW | -9.9066 | 0.07503 | if ed=12, women make 9.9k less than men at T1 |
| ed12 | 0.9451 | 0.02614 | in men, income increases by .9/year of ed at T1 |
| MW*ed12 | -0.3983 | 0.03269 | (same as before) |
| t1*MW | 0.2074 | 0.03955 | gender gap reduced by .2/time at T1 (for all ed) |
| t1*t1*MW | 0.1067 | 0.007592 | quadratic change is .1 less negative in women |
| t1*ed12 | 0.5320 | 0.002741 | ed slope is more positive by .5/time (for both sexes) |

WHAT EXTRA CONDITIONAL PREDICTIONS AND EFFECTS WE ASKED FOR:

| | Estimates | |
|------------------------------|-----------|----------|
| | | Standard |
| Label | Estimate | Error |
| Linear at T1 for Men Ed=12 | 4.0427 | 0.03066 |
| Linear at T1 for Men Ed=16 | 6.1709 | 0.03248 |
| Linear at T1 for Women Ed=12 | 4.2501 | 0.02498 |
| Linear at T1 for Women Ed=16 | 6.3782 | 0.02734 |
| Linear at T6 for Men Ed=12 | 1.4727 | 0.03066 |
| Linear at T6 for Men Ed=16 | 3.6008 | 0.03248 |
| Linear at T6 for Women Ed=12 | 2.7473 | 0.02498 |
| Linear at T6 for Women Ed=16 | 4.8754 | 0.02734 |
| Sex Diff at T1 if Ed=12 | -9.9066 | 0.07503 |
| Sex Diff at T1 if Ed=16 | -11.4998 | 0.1498 |
| Sex Diff at T6 if Ed=12 | -6.2016 | 0.07503 |
| Sex Diff at T6 if Ed=16 | -7.7948 | 0.1498 |
| Ed Slope at T1 for Men | 0.9451 | 0.02614 |
| Ed Slope at T1 for Women | 0.5468 | 0.02188 |
| Ed Slope at T6 for Men | 3.6052 | 0.02614 |
| Ed Slope at T6 for Women | 3.2069 | 0.02188 |
| Quadratic for Men | -0.2570 | 0.005886 |
| Quadratic for Women | -0.1503 | 0.004796 |
| Sex by Time at T1 | 0.2074 | 0.03955 |
| Sex by Time at T6 | 1.2747 | 0.03955 |
| | | |

WHAT YOU GET IF YOU RE-CENTER AT TIME6=0, WOMEN=0, AND ED16=0 INSTEAD:

| Solution for Fixed Effects | | | |
|----------------------------|----------|----------|---|
| | | Standard | |
| Effect | Estimate | Error | |
| Intercept | 70.3613 | 0.1006 | (same as before) |
| t6 | 4.8754 | 0.02734 | at T6, income increases by 4.8k/time for women with ed=16 |
| t6*t6 | -0.1503 | 0.004796 | linear rate of change in income decreases by .3/time in women |
| WM | 7.7948 | 0.1498 | if ed=16, men make 7.8k more than women at T6 |
| ed16 | 3.2069 | 0.02188 | in women, income increases by 3.2k/year of ed at T6 |
| WM*ed16 | 0.3983 | 0.03269 | (same as before) |
| t6*WM | -1.2747 | 0.03955 | gender gap reduced by 1.3k/time at T6 (for all ed) |
| t6*t6*WM | -0.1067 | 0.007592 | quadratic change is .1 more negative in men |
| t6*ed16 | 0.5320 | 0.002741 | ed slope is more positive by .5/time (for both sexes) |

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TITLE "Third Model: Fixed Quadratic Time, Time1=0 and Men=0 and Ed12=0";
PROC MIXED DATA=example COVTEST NOCLPRINT NOITPRINT METHOD=ML;
         CLASS ID;
         MODEL income = t1 t1*t1 MW ed12 MW*ed12 MW*t1 MW*t1*t1 ed12*t1
                                 MW*ed12*t1 / SOLUTION DDFM=Satterthwaite;
          RANDOM INTERCEPT / SUBJECT=ID TYPE=UN;
* Example of asking for slopes at particular occasions for particular people;
* Here one of the "t1"=1, the other t1=actual time;

      ESTIMATE "Linear T1 M Ed=12"
      t1 1 t1*t1 0
      MW*t1 0 MW*t1*t1 0
      ed12*t1 0 MW*ed12*t1 0;

      ESTIMATE "Linear T1 M Ed=16"
      t1 1 t1*t1 0
      MW*t1 0 MW*t1*t1 0
      ed12*t1 4 MW*ed12*t1 0;

ESTIMATE "Linear T1 W Ed=12" t1 1 t1*t1 0 MW*t1 1 MW*t1*t1 0 ed12*t1 0 MW*ed12*t1 0;
ESTIMATE "Linear T1 W Ed=16" t1 1 t1*t1 0 MW*t1 1 MW*t1*t1 0 ed12*t1 4 MW*ed12*t1 4;

      ESTIMATE "Linear T6 W Ed=16"
      t1 t1*t1 10 MW*t1 0 MW*t1*t1 0 ed12*t1 0 MW*ed12*t1 0;

      ESTIMATE "Linear T6 W Ed=16"
      t1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 0 MW*ed12*t1 0;

      t1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 0 MW*ed12*t1 0;

      t1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 0 MW*ed12*t1 0;

      t1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 0 MW*ed12*t1 0;

      t1 t1*t1 10 MW*t1 1 MW*t1*t1 10 ed12*t1 0

* Example of asking for simple main effects of an interaction;
* Here, "t1" is actual time always;
ESTIMATE "Sex Diff at T1 if Ed=12"
                                                         MW 1 MW*ed12 0 MW*t1 0 MW*t1*t1 0 MW*ed12*t1 0;
ESTIMATE "Sex Diff at T1 if Ed=16"
                                                        MW 1 MW*ed12 4 MW*t1 0 MW*t1*t1 0 MW*ed12*t1 0;
ESTIMATE "Sex Diff at T6 if Ed=12"
                                                       MW 1 MW*ed12 0 MW*t1 5 MW*t1*t1 25 MW*ed12*t1 0;
ESTIMATE "Sex Diff at T6 if Ed=16"
                                                        MW 1 MW*ed12 4 MW*t1 5 MW*t1*t1 25 MW*ed12*t1 20;
                                                       ed12 1 MW*ed12 0 ed12*t1 0 MW*ed12*t1 0;
ESTIMATE "Ed Slope at T1 for Men"
ESTIMATE "Ed Slope at T1 for Women"
                                                       ed12 1 MW*ed12 1 ed12*t1 0 MW*ed12*t1 0;
                                                         ed12 1 MW*ed12 0 ed12*t1 5 MW*ed12*t1 0;
ESTIMATE "Ed Slope at T6 for Men"
ESTIMATE "Ed Slope at T6 for Women"
                                                         ed12 1 MW*ed12 1 ed12*t1 5 MW*ed12*t1 5;
* Example of asking for simple two-way interactions of a three-way interaction;
ESTIMATE "Quadratic for Men" t1*t1 1 MW*t1*t1 0;
ESTIMATE "Quadratic for Women"
                                                         t1*t1 1 MW*t1*t1 1;
ESTIMATE "Sex by Ed at T1"
                                                        MW*ed12 1 MW*ed12*t1 0;
ESTIMATE "Sex by Ed at T6"
                                                        MW*ed12 1 MW*ed12*t1 5;
ESTIMATE "Ed by Time for Men"
                                                       ed12*t1 1 MW*ed12*t1 0;
ESTIMATE "Ed by Time for Women"
                                                        ed12*t1 1 MW*ed12*t1 1;

      ESTIMATE "Sex by Time (at T1) for Ed=12"
      MW*t1
      1 MW*ed12*t1
      0 MW*t1*t1
      0;

      ESTIMATE "Sex by Time (at T1) for Ed=16"
      MW*t1
      1 MW*ed12*t1
      4 MW*t1*t1
      0;

      ESTIMATE "Sex by Time (at T6) for Ed=12"
      MW*t1
      1 MW*ed12*t1
      0 MW*t1*t1
      1;

      ESTIMATE "Sex by Time (at T6) for Ed=16"
      MW*t1
      1 MW*ed12*t1
      0 MW*t1*t1
      1;

      ESTIMATE "Sex by Time (at T6) for Ed=16"
      MW*t1
      1 MW*ed12*t1
      4 MW*t1*t1
      10;

run;
* Can check estimates by re-centering predictors;
TITLE "Third Model: Time6=0 and Women=0 and Ed16=0 Instead";
PROC MIXED DATA=example COVTEST NOCLPRINT NOITPRINT METHOD=ML;
         CLASS ID;
         MODEL income = t6 t6*t6 WM ed16 WM*ed16 WM*t6 WM*t6*t6 ed16*t6
                                 WM*ed16*t6 / SOLUTION DDFM=Satterthwaite;
         RANDOM INTERCEPT / SUBJECT=ID TYPE=UN;
```

run;

WHAT SAS GIVES YOU BY DEFAULT IF TIME1=0, MEN=0, AND ED12=0 (same or different interpretation?):

| Solution for Fixed Effects | | | |
|----------------------------|-----------------|------------|---|
| | | Standard | |
| Effect | Estimate | Error | |
| Intercept | 49.9393 | 0.05803 | (same as before) |
| t1 | 4.0457 | 0.03036 | (same as before) |
| t1*t1 | -0.2570 | 0.005828 | (same as before) |
| MW | -9.9023 | 0.07484 | (same as before) |
| ed12 | 1.0275 | 0.02739 | (same as before) |
| MW*ed12 | -0.5367 | 0.03549 | gender gap grows by .5/year of ed at T1 OR ed slope is .5 less in W atT1 |
| t1*MW | 0.2056 | 0.03916 | gender gap reduced by .2/time at T1 for ed=12 |
| t1*t1*MW | 0.1067 | 0.007517 | (same as before) |
| t1*ed12 | 0.4991 | 0.004268 | ed slope is more positive by .5/time linearly for men |
| t1*MW*ed12 | 0.05536 | 0.005529 | reduction of gender gap of .2/time grows .05/year of ed OR increase in |
| ed | slope over time | is .05/tim | e larger in women OR bigger gender gap per year of ed lessens by .05/time |

WHAT EXTRA CONDITIONAL PREDICTIONS AND EFFECTS WE ASKED FOR:

| | Estimates | | |
|-------------------------------|-----------|----------|--|
| | | Standard | |
| Label | Estimate | Error | |
| Linear at T1 for Men Ed=12 | 4.0457 | 0.03036 | |
| Linear at T1 for Men Ed=16 | 6.0419 | 0.03464 | |
| Linear at T1 for Women Ed=12 | 4.2513 | 0.02473 | |
| Linear at T1 for Women Ed=16 | 6.4689 | 0.02855 | |
| Linear at T6 for Men Ed=12 | 1.4756 | 0.03036 | |
| Linear at T6 for Men Ed=16 | 3.4718 | 0.03464 | |
| Linear at T6 for Women Ed=12 | 2.7485 | 0.02473 | |
| Linear at T6 for Women Ed=16 | 4.9662 | 0.02855 | |
| Sex Diff at T1 if Ed=12 | -9.9023 | 0.07484 | |
| Sex Diff at T1 if Ed=16 | -12.0490 | 0.1595 | |
| Sex Diff at T6 if Ed=12 | -6.2060 | 0.07484 | |
| Sex Diff at T6 if Ed=16 | -7.2456 | 0.1595 | |
| Ed Slope at T1 for Men | 1.0275 | 0.02739 | |
| Ed Slope at T1 for Women | 0.4908 | 0.02256 | |
| Ed Slope at T6 for Men | 3.5228 | 0.02739 | |
| Ed Slope at T6 for Women | 3.2629 | 0.02256 | |
| Quadratic for Men | -0.2570 | 0.005828 | |
| Quadratic for Women | -0.1503 | 0.004748 | |
| Sex by Ed at T1 | -0.5367 | 0.03549 | |
| Sex by Ed at T6 | -0.2599 | 0.03549 | |
| Ed by Time for Men | 0.4991 | 0.004268 | |
| Ed by Time for Women | 0.5544 | 0.003515 | |
| Sex by Time (at T1) for Ed=12 | 0.2056 | 0.03916 | |
| Sex by Time (at T1) for Ed=16 | 0.4270 | 0.04489 | |
| Sex by Time (at T6) for Ed=12 | 1.2729 | 0.03916 | |
| Sex by Time (at T6) for Ed=16 | 1.4943 | 0.04489 | |

WHAT YOU GET IF YOU RE-CENTER AT TIME6=0, WOMEN=0, AND ED16=0 INSTEAD:

| Solut | tion for Fix | ed Effects Standard | |
|------------|--------------|------------------------|---|
| | | | |
| Effect | Estimate | Error | |
| Intercept | 70.5881 | 0.1030 | (same as before) |
| t6 | 4.9662 | 0.02855 | (same as before) |
| t6*t6 | -0.1503 | 0.004748 | (same as before) |
| WM | 7.2456 | 0.1595 | (same as before) |
| ed16 | 3.2629 | 0.02256 | (same as before) |
| WM*ed16 | 0.2599 | 0.03549 | gender gap grows by .26/year of ed at T6 OR ed slope is .26 more in M atT6 $$ |
| t6*WM | -1.4943 | 0.04489 | gender gap reduced by 1.5/time at T6 for ed=16 |
| t6*t6*WM | -0.1067 | 0.007517 | (same as before) |
| t6*ed16 | 0.5544 | 0.003515 | ed slope is more positive by .55/time linearly for women |
| t6*WM*ed16 | -0.05536 | 0.005529 | |