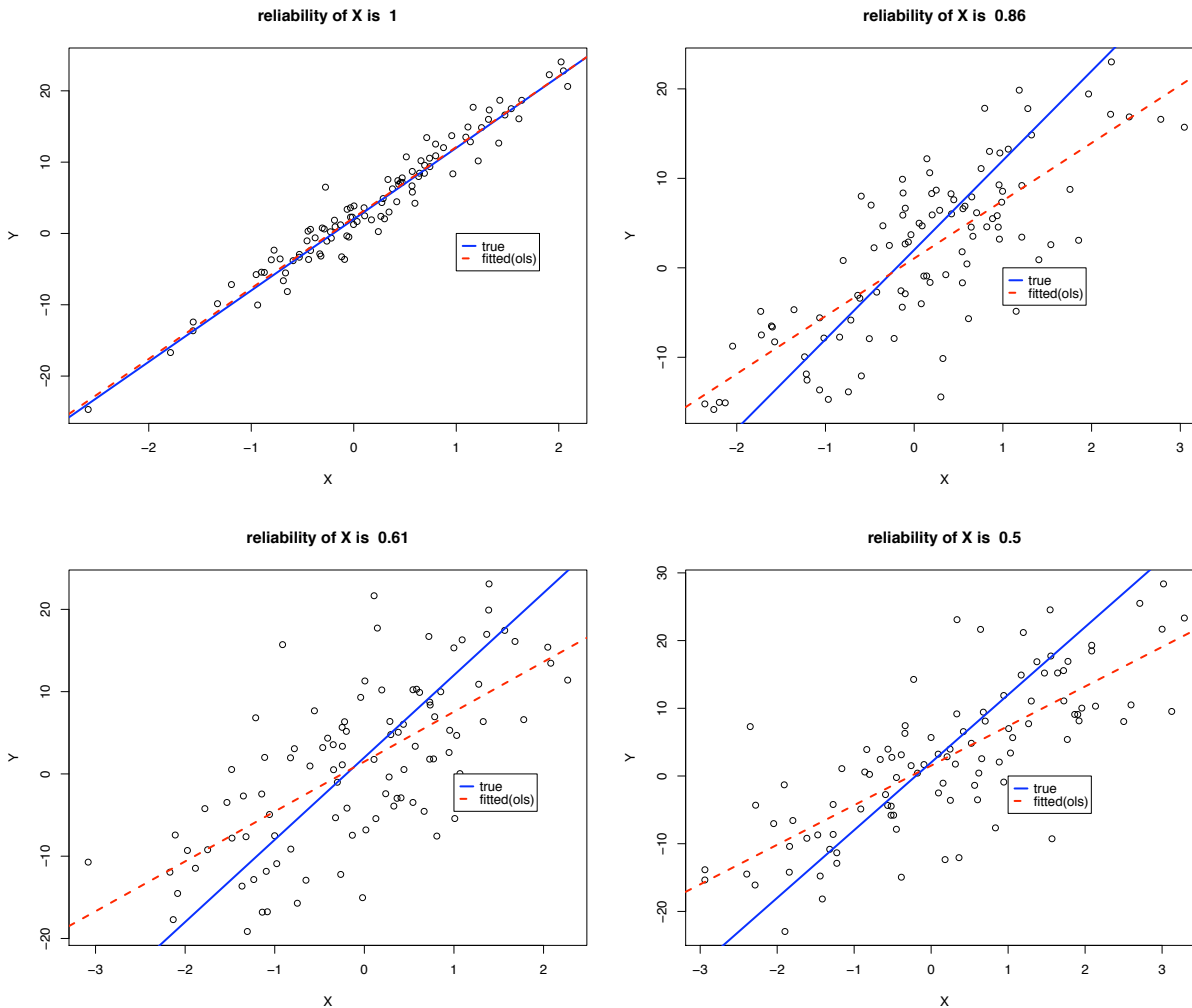


As examples of application of measurement error models [prenatal exposure](#) Consider the following illustration with simulated data: The model is

$$Y = 2 + 10X + e$$

$$X = x + u$$

In the measurement error model $X = x + u$, with x uncorrelated with u , $\text{var}(X) = \text{var}(x) + \text{var}(u)$. The reliability coefficient is defined as $\text{rel} = \text{var}(x)/\text{var}(X) = 1 - \text{var}(u)/\text{var}(X)$; i.e., it is a number between 0 and 1. In the simulation we consider sample size equal to 10, and different values for the reliability of the regressor.



where we see that there is an increasing attenuation with the decrease of the reliability.

Errors in variables regression

This is extracted from

[ucla web](#) One of the assumptions of regression is that the predictor variables are measured without error. The problem is that measurement error in predictor variables in OLS regression leads to under estimation of the regression coefficients. Errors-in-variables regression models are useful when one or more of the independent variables are measured with error. One can adjust for the biases if one knows the reliability of the variable,

$$r = 1 - (\text{variance of measurement error})/(\text{total variance})$$

The model we wish to estimate is

$$y = X^* \beta + e$$

where X^* are the true values and

$$X = X^* + U$$

the X are the observed values. The estimates b of β are obtained by

$$b = A^{-1} X'y, \text{ where}$$

$$A = X'X - S$$

S is a diagonal matrix with elements $N(1-r_i)s_i^2$, where the r_i are the reliability coefficients.

Stata's `eivreg` command uses user-specified reliability coefficients to compute the S matrix which, in turn, takes measurement error into account when

Stata's eivreg command

```
use http://www.ats.ucla.edu/stat/stata/webbooks/reg/hsb2
(highschool and beyond (200 cases))
```

```
. describe
```

```
Contains data from http://www.ats.ucla.edu/stat/stata/webbooks/reg/hsb2.dta
obs:                200                highschool and beyond (200
cases)
vars:                11                20 Jun 2000 14:13
size:                9,600 (99.1% of memory free)
```

variable name	storage type	display format	value label	variable label
id	float	%9.0g		
female	float	%9.0g	fl	
race	float	%12.0g	rl	
ses	float	%9.0g	sl	
schtyp	float	%9.0g	scl	type of school
prog	float	%9.0g	sel	type of program
read	float	%9.0g		reading score
write	float	%9.0g		writing score
math	float	%9.0g		math score
science	float	%9.0g		science score
socst	float	%9.0g		social studies score

```
use http://www.ats.ucla.edu/stat/stata/webbooks/reg/hsb2
```

```
regress write read female
```

Source	SS	df	MS	Number of obs =	200
Model	7856.32118	2	3928.16059	F(2, 197) =	77.21
Residual	10022.5538	197	50.8759077	Prob > F =	0.0000
				R-squared =	0.4394
				Adj R-squared =	0.4337
Total	17878.875	199	89.843593	Root MSE =	7.1327

write	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
read	.5658869	.0493849	11.459	0.000	.468496 .6632778
female	5.486894	1.014261	5.410	0.000	3.48669 7.487098
_cons	20.22837	2.713756	7.454	0.000	14.87663 25.58011

The predictor `read` is a standardized test score. Every test has measurement error. We don't know the exact reliability of `read`, but using `.9` for the

```
eivreg write read female, r(read .9)
```

variable	assumed reliability	errors-in-variables regression
read	0.9000	Number of obs = 200
*	1.0000	F(2, 197) = 83.41
		Prob > F = 0.0000
		R-squared = 0.4811
		Root MSE = 6.86268

write	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
read	.6289607	.0528111	11.910	0.000	.524813 .7331085
female	5.555659	.9761838	5.691	0.000	3.630548 7.48077
_cons	16.89655	2.880972	5.865	0.000	11.21504 22.57805

Note that the F-ratio and the R^2 increased along with the regression coefficient for `read`. Additionally, there is an increase in the standard error

Now, let's try a model with `read`, `math` and `socst` as predictors. First, we will run a standard OLS regression.

```
regress write read math socst female
```

Source	SS	df	MS	Number of obs =	200
Model	10173.7036	4	2543.42591	F(4, 195) =	64.37
Residual	7705.17137	195	39.5136993	Prob > F =	0.0000
				R-squared =	0.5690

```
-----+-----
Total | 17878.875 199 89.843593
Adj R-squared = 0.5602
Root MSE = 6.286
```

```
-----+-----
write |      Coef.  Std. Err.      t    P>|t|      [95% Conf. Interval]
-----+-----
read  |  .2065341  .0640006    3.227  0.001   .0803118   .3327563
math  |  .3322639  .0651838    5.097  0.000   .2037082   .4608195
socst |  .2413236  .0547259    4.410  0.000   .133393    .3492542
female|  5.006263  .8993625    5.566  0.000   3.232537   6.77999
_cons |  9.120717  2.808367    3.248  0.001   3.582045  14.65939
```

Now, let's try to account for the measurement error by using the following reliabilities: read - .9, math - .9, socst - .8.

```
eivreg write read math socst female, r(read .9 math .9 socst .8)
```

```
-----+-----
variable      assumed      errors-in-variables regression
reliability
-----+-----
read          0.9000          Number of obs = 200
math          0.9000          F( 4, 195) = 70.17
socst        0.8000          Prob > F = 0.0000
*            1.0000          R-squared = 0.6047
                          Root MSE = 6.02062
```

```
-----+-----
write |      Coef.  Std. Err.      t    P>|t|      [95% Conf. Interval]
-----+-----
read  |  .1506668  .0936571    1.609  0.109   -.0340441   .3353776
math  |  .350551  .0850704    4.121  0.000   .1827747   .5183273
socst |  .3327103  .0876869    3.794  0.000   .159774    .5056467
female|  4.852501  .8730646    5.558  0.000   3.13064    6.574363
_cons |  6.37062  2.868021    2.221  0.027   .7142973  12.02694
```

Note that the overall F and R2 went up, but that the coefficient for read is no longer statistically significant.

Last modified: Wed Feb 7 16:24:16 CET 2007