

# Partial Identification of a Classical Measurement-Error Model

## TheoryGuru applications

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### Load Economicreasoning package only if it is not already loaded

```
If[Length@Names["PLTools`*"] < 10,  
  Get["http://economicreasoning.com"]]
```

Load other tools by clicking on extras and/or evaluating below

```
If[Not@MemberQ[$ContextPath, "OtherTools`"],  
  Get["http://othertools.economicreasoning.com"]]
```

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## Background

### Some history of classical measurement error

This analysis originated with Frisch (1934). The classic measurement error model is a workhorse in applied econometrics, including Milton Friedman's Nobel Prize winning book Friedman (1957). See Tamer (2010) for a brief exposition of this model from the perspective of "partial identification."

### Dot products and vectors in *Mathematica*

Interpret all vector variables ( $x$ ,  $y$ ,  $\epsilon$ ) as demeaned.

In the Wolfram Language,  $x.y$  refers to the tensor DOT PRODUCT, NOT scalar multiplication. For TheoryGuru purposes, tensor means vector, so that the result of  $x.y$  is a scalar.

## ? SymbolicRegression

`SymbolicRegression[depvar, indvar1, indvar2, ...]`

interprets each argument as a symbolic vector and returns the formula, expressed in terms of dot products, for the least-squares coefficient vector. The computation time and formula complexity is exponential in the number of regressors. E.g., 8 regressors is about 426,000 times more complicated than 2.

## Setup

```
Clear[y, x];
```

```
OLSSlopeForward = First@SymbolicRegression[y, x]
```

$$\frac{x \cdot y}{x \cdot x}$$

```
x.x
```

```
OLSSlopeReverse =  $\frac{1}{\text{First@SymbolicRegression}[x, y]}$ 
```

$$\frac{y \cdot y}{y \cdot x}$$

```
y.x
```

```
y = xtrue  $\beta$  +  $\epsilon$ y;
```

```
x = xtrue +  $\epsilon$ x;
```

```
ClassicalMeasurementError = {xtrue. $\epsilon$ x == 0, xtrue. $\epsilon$ y == 0,  $\epsilon$ x. $\epsilon$ y == 0};
```

```
YandxtrueAreCorrelated = xtrue.y  $\neq$  0;
```

```
xHasVariation = x.x > 0;
```

## Results

Frisch's identified set:

the regression parameter  $\beta$  is bounded by the forward and reverse regression slopes

```
TheoryGuru[{YandxtrueAreCorrelated, ClassicalMeasurementError},
```

$$0 < \text{OLSSlopeForward} \leq \beta \leq \text{OLSSlopeReverse}$$

∨

$$\text{OLSSlopeReverse} \leq \beta \leq \text{OLSSlopeForward} < 0]$$

```
True
```

TheoryPossibilities discovers the hypothesis -- i.e., the above formula for the identified set -- on its own

```
DefineShortVariableNames = {for == 0LSSlopeForward, rev == 0LSSlopeReverse};
```

```
TheoryPossibilities[
  {YandxtrueAreCorrelated, ClassicalMeasurementError, DefineShortVariableNames},
  {β, for, rev}(* variables to appear in discovered formula *),
  True(* the variables can appear simultaneously *)]
```

You are in vector mode: include the hypothesis if it is necessary for classifying your assumption symbols as scalars vs. vectors.

```
(for < 0 && rev < 0 && β ≤ for && rev ≤ β && β < 0) ||
(for > 0 && rev > 0 && for ≤ β && β ≤ rev && β > 0)
```

Confirm that the two formulas above are equivalent

```
TheoryOverlap[{}, %,
```

```
0 < for ≤ β ≤ rev
```

```
∨
```

```
rev ≤ β ≤ for < 0]
```

```
{ (for > 0 ∧ rev > 0 ∧ β > 0 ∧ for ≤ β ∧ β ≤ rev) ∨
  (for < 0 ∧ rev < 0 ∧ β < 0 ∧ rev ≤ β ∧ β ≤ for),
  (0 < for ∧ for ≤ β ∧ β ≤ rev) ∨ (for < 0 ∧ rev ≤ β ∧ β ≤ for) }
```

are equivalent

The slope inferred from reverse regression has at least as much magnitude

```
TheoryGuru[{YandxtrueAreCorrelated, ClassicalMeasurementError},
```

```
0LSSlopeReverse2 ≥ 0LSSlopeForward2]
```

```
True
```

```
ImperfectMeasurement = εx.εx > 0;
```

```
TheoryGuru[{xHasVariation, YandxtrueAreCorrelated,
  ClassicalMeasurementError, ImperfectMeasurement},
```

```
0LSSlopeReverse2 > 0LSSlopeForward2]
```

```
True
```

Note that the correlation and classical assumptions guarantee that  $x$  has variation

i.e., the forward regression will not divide by zero

```
TheoryGuru[{YandxtrueAreCorrelated, ClassicalMeasurementError},  
  
  xHasVariation]  
True
```

## Variable interpretations