# <u>Title</u>

 ${f tmo}$  — Estimating standard errors via the Thresholding Multiple Outcomes (TMO) method.

## <u>Syntax</u>

tmo,  $cmd(cmdline) \ x(\underline{varname}) \ ylist(\underline{varlist}) \ \underline{i}dvar(\underline{varname}) \ [options]$ 

options	Description
<pre>cmd(cmdLine)</pre>	<pre>cmdline is the command that produces the regression of interest - tmo currently supports regressions using regress, reghdfe, ivreg2, or ivreghdfe</pre>
x( <u>varname</u> )	regressor of interest in $\mathit{cmd}$ for which to estimate TMO standard errors - $\mathit{tmo}$ estimates the standard error for only this declared independent variable
ylist( <u>varlist</u> )	list of auxiliary outcomes to use in <b>tmo</b>
<u>i</u> dvar( <u>varname</u> )	location identifier variable; must be unique (within each $t$ for panel case)
<pre>misslimit(#)</pre>	<pre>limit for proportion of observations allowed to be missing for auxiliary outcomes - auxiliary outcomes missing more than misslimit are not used - misslimit must be between [0,1]; default is 0.1</pre>
Panel setting	
<u>t</u> imevar( <u>varname</u> )	time identifier variable; must be declared for panel case
Distance-based set	tings
<u>lat</u> itude( <u>varname</u> )	latitude variable in signed decimal degrees
<u>longitude(varname</u> )	longitude variable in signed decimal degrees
<u>distthres</u> hold(#)	<pre>distance threshold in miles to allow for arbitrary correlation between pairs of locations that are distthreshold or fewer miles apart - setting distthreshold combines tmo with a Conley adjustment using a uniform kernel - requires setting latitude and longitude</pre>
Saving figures and	tables
<pre>filesuffix(str)</pre>	folder path and base filename for saving figures and results - required for <b>plot</b> or <b>save</b> options below
savedyad	save Stata data file with correlation and contribution to standard error for each location pair
plotq	save plot of optimal threshold estimator
<pre>plothist plothistnbins(#)</pre>	save plot for histogram of correlations between locations number of bins for histogram of correlations (default 10000)
plotse saveplotseest	save plot for standard error estimates across thresholds save Stata data file with standard error estimates across thresholds

saveest	save results in <b>r()</b> to Stata data file
Custom threshold	1
<u>thres</u> hold(#)	set custom threshold instead of using the optimal threshold from the interquartile range method - threshold must be between [0,1]
thresholdoff	turns off the <b>tmo</b> adjustment entirely
SCPC options	
<pre>scpc_cmd(cmdline)</pre>	command for regression of interest before applying <u>scpc</u> adjustment - setting <i>scpc_cmd</i> combines <b>tmo</b> with the SCPC method from <u>Müller and Watson (2022)</u>
scpc_uncond	turns on the unconditional SCPC Inference setting

## **Description**

This Stata package implements the Thresholding Multiple Outcomes (TMO) method for estimating standard errors in <u>DellaVigna et al. (2025)</u>. The TMO method accounts for spatial correlation between locations by using a set of auxiliary outcomes to estimate the correlation of errors between locations. TMO allows pairs of locations with correlations above the optimal threshold to have correlated error terms in the standard error estimate.

To use the tmo package, enter the Stata command that produces the regression of interest in the cmd() option. tmo calculates the TMO standard error for the independent variable specified in x().

#### **Examples**

```
Load US county dataset
```

. use "https://raw.githubusercontent.com/wjnkim/tmo/master/example/county\_differences.dta",

Define list of auxiliary outcomes

- . qui ds fips stfips PIN\_persincpc\_d EDU\_college\_d, not
- . local ylist `r(varlist)'

Regression of interest: change in per capita income on change in college educated with state fixed effects

. reg PIN\_persincpc\_d EDU\_college\_d i.stfips, r

Run TMO

. tmo, cmd(reg PIN\_persincpc\_d EDU\_college\_d i.stfips, r) x(EDU\_college\_d) ylist(`ylist')
i(fips)

Run TMO and save figures

. tmo, cmd(reg PIN\_persincpc\_d EDU\_college\_d i.stfips, r) x(EDU\_college\_d) ylist(`ylist')
i(fips) file(./example) plotq plothist plotse

Panel example

- . use "https://raw.githubusercontent.com/wjnkim/tmo/master/example/county\_panel.dta", clear
- . qui ds fips stfips EMN\_farm EDU\_publicenroll year, not
- . local ylist `r(varlist)'
- . tmo, cmd(reghdfe EMN\_farm EDU\_publicenroll i.year, absorb(stfips) cluster(fips))
  x(EDU\_publicenroll) ylist(`ylist') i(fips) t(year) file(./example\_panel) plotq plothist

#### Stored results

tmo stores the following in r():

```
Scalars
  r(beta)
                        coefficient on x()
                        TMO standard error estimate
  r(tmo_se)
  r(orig_se)
                        original standard error from cmd()
  r(1b)
                       lower bound of 95% confidence interval
                        upper bound of 95% confidence interval
  r(ub)
  r(threshold)
                        optimal threshold (using interquartile range method)
  r(pct_ge_thres)
                        % of location pairs with correlations above the optimal threshold
  r(pct_ge_thres_nocl) % of inter-cluster location pairs with correlations above the optimal
                         threshold
  r(T)
                        number of time periods
                        number of observations
  r(N)
                        number of locations
  r(N_loc)
  r(N_clust)
                        number of clusters
  r(N_outcomes)
                        number of outcomes used to estimate correlations between locations
                        degrees of freedom for estimating correlations between locations
  r(dof)
  r(finite_sample_dof) finite sample adjustment for variance calculation
```

#### **Dependencies**

tmo requires the gtools package. Please run ssc install gtools to install.

tmo has been tested on the following versions of <u>reghdfe</u>, <u>ivreghdfe</u>, and <u>ivreg2</u>. Earlier versions of these packages may run into errors.

- <u>reghdfe</u> version 6.12.3<u>ivreghdfe</u> version 1.1.3
- ivreg2 version 4.1.12

#### <u>Disclaimer</u>

This package is in beta/testing mode. Please use cautiously and feel free to report any errors to wjnkim@stanford.edu.

### <u>References</u>

DellaVigna, Stefano, Guido Imbens, Woojin Kim, and David Ritzwoller. (2025). "Using Multiple Outcomes to Adjust Standard Errors for Spatial Correlation." <a href="https://arxiv.org/abs/2504.13295">https://arxiv.org/abs/2504.13295</a>

Müller, Ulrich K. and Mark W. Watson "Spatial Correlation Robust Inference", Econometrica 90 (2022), 2901–2935. <a href="https://www.princeton.edu/~umueller/SHAR.pdf">https://www.princeton.edu/~umueller/SHAR.pdf</a>.