Tables from simulations presented in lrd paper

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General dependencies.

```
library('knitr')
if(!require('lrd')){
  source("lrd/R/functions.r")
  source("lrd/R/simulations.r")
  source("lrd/R/displaySim.r")
}
```

Initialization. Note that nreps=0 corresponds to no simulations, just print results from previously saved simulations. In order to re-run the simulations, the nreps variable should have been set to a positive integer before initiating this script.

```
if (!exists('nreps') ) nreps <- 0</pre>
nreps
## [1] 5000
if (nreps) {
library('robustbase')
library('rdd')
library('RItools')
library('sandwich')
library('nnet')
source("lrd/R/ddsandwich.R")
set.seed(201609)
st <- system.time(outcomeSim <- lrd:::totalOutcomeSim(nreps))</pre>
save(outcomeSim, file="dataResults/outcomeSim.RData")
cat(paste0(date(), ', nreps=', nreps, '\n'),
    paste(c(names(st),'\n', collapse=T)),
    file='dataResults/fullOutcomeSim-runtime.txt', append=TRUE)
} else load('dataResults/outcomeSim.RData')
levTab <- lrd:::levels(outcomeSim)</pre>
powTab <-lrd:::power(outcomeSim)</pre>
```

```
cat('
\\begin{table}
\\footnotesize
\\begin{tabular}{cc|cccccc}
\\hline
&&& \\multicolumn{ 2 }{c}{Permutation}&\\multicolumn{ 2 }{c}{\`\`Limitless\'\'}&\\multicolum
$n$& Error &&', paste(rep('Level&Power',ncol(levTab)),collapse='&'),'\\\
\\hline \n')
for(i in 1:nrow(levTab)){
    spec <- strsplit(rownames(levTab)[i],' ')[[1]]</pre>
    if(spec[1] == 'norm'){
        cat('\\hline \n')
        cat('\m (2){*}{',round(as.numeric(spec[2])),'} & \m (0,1) & \&')
    } else cat(' & $t_3$ &&')
    cat(paste(paste(round(levTab[i,]*100),round(powTab[i,]*100),sep='&'),collapse='&'),'\\\'
}
cat('\\hline
\\end{tabular}
\\caption{Proportion of ',ncol(outcomeSim[[1]]),' simulations resulting in a p-value below S
\\label{tab:level}',sep='')
cat('\\end{table}\n')
},file="tab-levelSimulation.tex")
kable(levTab,caption = 'Empirical size for hypothesis tests',digits = 2)
                                       ik
                              \operatorname{cft}
                                  _{
m sh}
                                      0.07
                                            0.07
                     norm 50
                                 0.14
                     t 50
                                 0.10
                                      0.07 \quad 0.06
                     norm 250
                                 0.48
                                      0.05
                                            0.05
                     t 250
                                 0.34
                                      0.05
                                            0.05
                                1.00
                                            0.05
                     norm 2500
                                      0.05
                     t 2500
                                 1.00
                                      0.05 \quad 0.05
kable(powTab,caption = 'Empirical power for hypothesis tests, treatment effect =0.2',digits
                                       ik
                              cft
                                  ^{
m sh}
                     norm 50
                                 0.32
                                      0.08
                                            0.08
                     t 50
                                 0.22
                                      0.08 \quad 0.07
```

0.93

0.79

1.00

norm 250

norm 2500

t 250

 $0.12 \quad 0.12$

 $0.10 \quad 0.08$

 $0.67 \quad 0.66$

capture.output({

•	cft	sh	ik	
t 2500	1	.00	0.50	0.29

The polynomial sim was run in two parts: first for robust regression and OLS, and next for local linear regression with the IK bandwidth.

```
if (!exists('nreps') ) nreps <- 0</pre>
nreps
## [1] 5000
if (nreps) {
library('robustbase')
library('rdd')
library('RItools')
library('sandwich')
library('nnet')
source("lrd/R/ddsandwich.R")
set.seed(201609)
st2 <- system.time(totalPoly <- lrd:::totalPolySim(nreps))</pre>
st3 <- system.time(ikp <- lrd:::totalPolySimIK(nreps))</pre>
save(totalPoly,file="dataResults/totalPolySim.RData")
save(ikp,file="dataResults/ikp.RData")
cat(paste0(date(), ', nreps=', nreps, '\n'),
    paste(c(names(st),'\n', collapse=T)),
    file='dataResults/totalPolySim-runtime.txt', append=TRUE)
} else{
    load('dataResults/totalPolySim.RData')
    load('dataResults/ikp.RData')
    }
## lin
         TRUE
## [1] "2017-10-19 01:46:50 CDT"
## lin FALSE
## [1] "2017-10-19 01:49:07 CDT"
## antiSym
            TRUE
## [1] "2017-10-19 01:51:37 CDT"
## antiSym
            FALSE
## [1] "2017-10-19 01:53:55 CDT"
## oneSide
            TRUE
## [1] "2017-10-19 01:56:25 CDT"
## oneSide
           FALSE
## [1] "2017-10-19 01:58:43 CDT"
```

The following gives the results in Table 4 of the paper, in addition to the

break-down of RMSE into bias and variance, and analogous results for normally-distributed errors.

capture.output(

lrd:::prntTab(totalPoly,ikp,full=FALSE,caption=paste0('Results from ',ncol(totalPoly[[1]]),
file="lrd/inst/tab-polynomialSimulation.tex")

kable(prntTab(totalPoly,ikp,full=TRUE,md=TRUE),

caption='Full results for polynomial simulation',digits=2)

	Rob,	Rob,	Rob,	Rob,	OLS,	OLS,	OLS,	OLS,	
	deg =								
	1	2	3	4	1	2	3	4	Loc.Lin
lin t err level	0.37	0.38	0.05	0.05	0.40	0.29	0.07	0.06	0.08
lin t err RMSE	0.36	0.36	0.25	0.25	0.36	1.08	2.88	13.12	0.29
lin t err bias	-0.31	-0.31	0.00	0.00	-0.31	0.88	0.83	-4.29	0.00
$ \lim_{sd} t \operatorname{err} $	0.19	0.18	0.25	0.25	0.18	0.64	2.76	12.40	0.29
antiSym t err level	0.92	0.92	0.06	0.06	0.93	0.77	0.10	0.11	0.06
antiSym t err RMSE	0.64	0.64	0.25	0.25	0.66	1.83	3.23	15.63	0.29
antiSym t err bias	-0.62	-0.62	-0.02	-0.02	-0.63	1.71	1.76	-9.21	0.01
antiSym t	0.18	0.18	0.25	0.25	0.19	0.64	2.71	12.63	0.29
oneSide t err level	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.08
oneSide t err RMSE	0.18	0.18	0.24	0.24	0.18	0.64	2.72	12.70	0.28
oneSide t err bias	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.16	0.00
$\begin{array}{c} \text{oneSide t} \\ \text{err sd} \end{array}$	0.18	0.18	0.24	0.24	0.18	0.64	2.72	12.70	0.28
lin norm err level	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.06
lin norm err RMSE	0.22	0.22	0.30	0.30	0.31	1.09	4.75	21.85	0.48
lin norm err bias	0.00	0.00	0.01	0.01	0.00	0.02	-0.08	-0.24	0.01
lin norm err sd	0.22	0.22	0.30	0.30	0.31	1.09	4.75	21.85	0.48

	Rob,	Rob,	Rob,	Rob,	OLS,	OLS,	OLS,	OLS,	
	deg =								
	1	2	3	4	1	2	3	4	Loc.Lin
antiSym	0.79	0.79	0.06	0.06	0.54	0.37	0.06	0.07	0.07
norm err									
level									
antiSym	0.64	0.64	0.30	0.30	0.70	2.10	5.16	25.45	0.49
norm err									
RMSE									
antiSym	-0.60	-0.60	-0.02	-0.02	-0.63	1.73	1.70	-9.08	0.00
norm err									
bias									
antiSym	0.20	0.20	0.30	0.30	0.31	1.20	4.88	23.77	0.49
norm err									
sd									
oneSide	0.29	0.30	0.05	0.05	0.19	0.13	0.06	0.05	0.07
norm err									
level									
oneSide	0.39	0.39	0.30	0.30	0.45	1.41	4.88	22.49	0.49
norm err									
RMSE									
oneSide	-0.32	-0.32	-0.01	-0.01	-0.32	0.87	0.93	-4.52	0.00
norm err									
bias									
oneSide	0.23	0.23	0.30	0.30	0.31	1.11	4.79	22.03	0.49
norm err									
sd									

Session information

sessionInfo()

```
## R version 3.3.1 (2016-06-21)
## Platform: x86_64-apple-darwin13.4.0 (64-bit)
## Running under: OS X 10.12.6 (Sierra)
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/c/en_US.UTF-8
## attached base packages:
## [1] stats
            graphics grDevices utils
                                           datasets methods base
##
## other attached packages:
## [1] nnet_7.3-12 RItools_0.2-0
                                         SparseM_1.77
## [4] rdd_0.57
                        Formula_1.2-1
                                         AER_1.2-4
```

```
## [7] survival_2.40-1
                          car_2.1-4
                                            lmtest_0.9-34
## [10] zoo_1.7-13
                          sandwich_2.3-4
                                            robustbase_0.92-7
## [13] knitr_1.15.1
                          lrd_0.0.0.9000
##
## loaded via a namespace (and not attached):
##
   [1] Rcpp_0.12.8
                           DEoptimR_1.0-8
                                               nloptr_1.0.4
##
    [4] highr_0.6
                           tools_3.3.1
                                               lme4_1.1-12
   [7] evaluate_0.10
                           nlme_3.1-128
                                               lattice_0.20-33
##
## [10] mgcv_1.8-15
                           Matrix_1.2-6
                                               parallel_3.3.1
## [13] stringr_1.1.0
                           MatrixModels_0.4-1 grid_3.3.1
## [16] minqa_1.2.4
                           magrittr_1.5
                                              MASS_7.3-45
## [19] splines_3.3.1
                           rsconnect_0.5
                                               svd_0.4
## [22] abind_1.4-5
                           pbkrtest_0.4-6
                                              xtable_1.8-2
## [25] quantreg_5.29
                           stringi_1.1.1
```