1 Description of DGP

$$\begin{aligned} W_1 \sim Normal(\mu = 0, \sigma^2 = 1) \\ W_2, W_3, W_4 \sim \mathcal{N}(\boldsymbol{\mu} = \begin{bmatrix} 0 \\ 0 \end{bmatrix}, \boldsymbol{\Sigma} = \begin{bmatrix} 1.0 & 0.3 & 0.7 \\ 0.3 & 1.0 & 0.8 \\ 0.7 & 0.8 & 1.0 \end{bmatrix}) \\ A \sim Bernoulli(p = 0.5) \\ Y \sim Bernoulli(p) \ . \end{aligned}$$

True blip function is:

$$B_0(W) = 0.5[logit^{-1}(1 - W_1^2 + 3W_2 + 5W_3^2 - 4.45) + logit^{-1}(-0.5 - W_3 + 2W_1W_2 + 3|W_2| - 1.5) - logit^{-1}(1 - W_1^2 + 3W_2) + logit^{-1}(-0.5 - W_3 + 2W_1W_2)].$$

2 Library legend

- Simple GLMs
 - QAW.SL.library = linear model with W_i and A as main terms and W_i *A interaction for each j
 - blip.SL.library = linear model with main terms $\boldsymbol{W}_{\!j}$ for each j
- Medium ML + GLMs not aggressive
 - QAW.SL.library = GLMs library AND SL.glm, SL.mean, SL.glm.interaction, SL.earth, SL.nnet, SL.svm, SL.rpart
 - blip.SL.library = GLMs library AND SL.glm, SL.mean, SL.glm.interaction, SL.earth, SL.nnet, SL.svm, SL.rpart
- Aggressive ML + GLMs not aggressive
 - QAW.SL.library = ML + GLMs aggressive library AND SL.randomForest
 - blip.SL.library = ML + GLMs aggressive library AND SL.randomForest

2.1 Table EnYd0 for E0Yd0

##	Library Estimator	Bias	Variance	MSE
## Psi_gcomp	GLMs G-comp.	-0.0917	0.0002	0.0086
## Psi_IPTW	GLMs IPTW	0.0032	0.0007	0.0007
## Psi_IPTW_DR	GLMs IPTW-DR	0.0029	0.0004	0.0004
## Psi_TMLE	GLMs TMLE	0.0030	0.0004	0.0004
## Psi_CV.TMLE	GLMs CV-TMLE	0.0031	0.0004	0.0004
## Psi_gcomp1 ML + GLMs not a	aggressive G-comp.	-0.0954	0.0012	0.0103
## Psi_IPTW1 ML + GLMs not a	aggressive IPTW	0.0037	0.0008	0.0008
## Psi_IPTW_DR1 ML + GLMs not a	aggressive IPTW-DR	0.0035	0.0005	0.0005
## Psi_TMLE1 ML + GLMs not a	aggressive TMLE	0.0034	0.0005	0.0005

```
## Psi_CV.TMLE1 ML + GLMs not aggressive CV-TMLE 0.0037 0.0005 0.0005
## Psi_gcomp2
                 ML + GLMs aggressive
                                        G-comp. -0.0875
                                                       0.0008 0.0085
## Psi_IPTW2
                 ML + GLMs aggressive
                                      IPTW 0.0031 0.0008 0.0008
                 ML + GLMs aggressive
## Psi_IPTW_DR2
                                        IPTW-DR -0.0041 0.0005 0.0005
## Psi_TMLE2
                  ML + GLMs aggressive
                                       TMLE -0.0033 0.0005 0.0005
## Psi_CV.TMLE2 ML + GLMs aggressive
                                        CV-TMLE 0.0034 0.0005 0.0005
              Coverage
## Psi_gcomp
## Psi_IPTW
                 95.4%
## Psi_IPTW_DR
                 97.1%
## Psi_TMLE
                 96.8%
## Psi_CV.TMLE
                 96.2%
## Psi_gcomp1
## Psi_IPTW1
                 94.8%
## Psi_IPTW_DR1
               95.2%
## Psi_TMLE1
                 95.9%
## Psi_CV.TMLE1
                 95.2%
## Psi_gcomp2
## Psi_IPTW2
                 94.3%
## Psi_IPTW_DR2
               92.7%
## Psi_TMLE2
               92.9%
## Psi_CV.TMLE2
               94.2%
```

2.2 Table EnYdn for E0Yd0

```
##
                             Library Estimator Bias Variance MSE
## Psi_gcomp
                                GLMs
                                      G-comp. -0.0720 0.0004 0.0055
## Psi_IPTW
                                GLMs
                                      IPTW -0.0527 0.0009 0.0036
                                      IPTW-DR -0.0531 0.0007 0.0035
## Psi_IPTW_DR
                                GLMs
## Psi_TMLE
                                GLMs
                                      TMLE -0.0531 0.0007 0.0035
## Psi_CV.TMLE
                                GLMs
                                      CV-TMLE -0.0705 0.0010 0.0059
## Psi_gcomp1 ML + GLMs not aggressive
                                      G-comp. -0.0953 0.0013 0.0104
                                      IPTW 0.0227 0.0009 0.0014
IPTW-DR 0.0263 0.0007 0.0013
## Psi_IPTW_DR1 ML + GLMs not aggressive
## Psi_TMLE1 ML + GLMs not aggressive
                                      TMLE 0.0259 0.0006 0.0013
                                      CV-TMLE -0.0233 0.0007 0.0012
## Psi_CV.TMLE1 ML + GLMs not aggressive
## Psi_gcomp2
                ML + GLMs aggressive
                                      G-comp. -0.0848 0.0010 0.0082
## Psi_IPTW2
                ML + GLMs aggressive
                                        IPTW 0.1000 0.0095 0.0195
## Psi_IPTW_DR2
                ML + GLMs aggressive
                                      IPTW-DR 0.0860 0.0080 0.0154
                ML + GLMs aggressive TMLE 0.0938 0.0106 0.0194
## Psi_TMLE2
                                      CV-TMLE -0.0221 0.0006 0.0011
## Psi_CV.TMLE2
               ML + GLMs aggressive
              Coverage
## Psi_gcomp
## Psi_IPTW
                 49.1%
## Psi_IPTW_DR
                35.2%
## Psi_TMLE
                35.2%
## Psi_CV.TMLE
                19.3%
## Psi_gcomp1
## Psi_IPTW1
              86.7%
```

```
## Psi_IPTW_DR1 74.3%

## Psi_TMLE1 74.3%

## Psi_CV.TMLE1 77.2%

## Psi_gcomp2 -

## Psi_IPTW2 43%

## Psi_IPTW_DR2 38.9%

## Psi_TMLE2 37.8%

## Psi_CV.TMLE2 78.7%
```

2.3 Table EnYdn for E0Ydn

```
##
                                Library Estimator Bias Variance MSE
## Psi_gcomp
                                   GLMs
                                         G-comp. -0.0029
                                                           0.0004 0.0004
                                            IPTW 0.0164
## Psi_IPTW
                                   GLMs
                                                           0.0009 0.0011
## Psi_IPTW_DR
                                   GLMs
                                         IPTW-DR 0.0160
                                                         0.0007 0.0010
## Psi_TMLE
                                   GLMs
                                            TMLE 0.0160
                                                         0.0007 0.0010
## Psi_CV.TMLE
                                         CV-TMLE 0.0009
                                   GLMs
                                                           0.0010 0.0010
## Psi_gcomp1 ML + GLMs not aggressive
                                         G-comp. -0.0745
                                                          0.0013 0.0069
             ML + GLMs not aggressive
                                          IPTW 0.0435
## Psi_IPTW1
                                                          0.0009 0.0028
## Psi_IPTW_DR1 ML + GLMs not aggressive
                                         IPTW-DR 0.0472
                                                         0.0007 0.0029
## Psi_TMLE1
             ML + GLMs not aggressive
                                          TMLE 0.0467
                                                          0.0006 0.0028
## Psi_CV.TMLE1 ML + GLMs not aggressive
                                         CV-TMLE -0.0002
                                                          0.0007 0.0007
## Psi_gcomp2
                  ML + GLMs aggressive
                                         G-comp. -0.0602
                                                         0.0010 0.0046
                   ML + GLMs aggressive
## Psi_IPTW2
                                            IPTW 0.1246
                                                           0.0095 0.0251
## Psi_IPTW_DR2
                   ML + GLMs aggressive
                                         IPTW-DR 0.1106
                                                          0.0080 0.0202
## Psi_TMLE2
                   ML + GLMs aggressive
                                         TMLE 0.1184 0.0106 0.0246
## Psi_CV.TMLE2
                  ML + GLMs aggressive
                                         CV-TMLE 0.0008
                                                          0.0006 0.0006
##
               Coverage
## Psi_gcomp
## Psi_IPTW
                  96.1%
## Psi_IPTW_DR
                  91.2%
## Psi_TMLE
                    91%
## Psi_CV.TMLE
                  92.7%
## Psi_gcomp1
## Psi_IPTW1
                  69.3%
## Psi_IPTW_DR1
                  45.3%
## Psi_TMLE1
                  43.8%
## Psi_CV.TMLE1
                  94.5%
## Psi_gcomp2
                  29.6%
## Psi_IPTW2
## Psi_IPTW_DR2
                  25.6%
## Psi_TMLE2
                  24.7%
## Psi_CV.TMLE2
                  94.1%
```

3 Results

pdf

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