

1 Description of DGP

$$\begin{aligned} W_1, W_2, W_3, W_4 &\sim \text{Normal}(\mu = 0, \sigma^2 = 1) \\ A &\sim \text{Bernoulli}(p = 0.5) \\ Y &\sim \text{Bernoulli}(p) . \end{aligned}$$

$$p = 0.5 * \text{logit}^{-1}(1 - W_1^2 + 3W_2 + 5W_3^2 A - 4.45A) + 0.5 \text{logit}^{-1}(-0.5 - W_3 + 2W_1 W_2 + 3|W_2|A - 1.5A) ,$$

True blip function is:

$$\begin{aligned} B_0(W) = &0.5[\text{logit}^{-1}(1 - W_1^2 + 3W_2 + 5W_3^2 - 4.45) + \text{logit}^{-1}(-0.5 - W_3 + 2W_1 W_2 + 3|W_2| - 1.5) \\ &- \text{logit}^{-1}(1 - W_1^2 + 3W_2) + \text{logit}^{-1}(-0.5 - W_3 + 2W_1 W_2)] . \end{aligned}$$

2 Library legend

- Simple - GLMs
 - QAW.SL.library = linear model with W_j and A as main terms and $W_j * A$ interaction for each j
 - blip.SL.library = linear model with main terms 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 Simple Library

```
## $table_EnYdn_for_E0Yd0
##           Bias Variance    MSE Coverage
## Psi_gcomp  -0.0765    3e-04 0.0062      -
## Psi_IPTW   -0.0569    8e-04 0.0041    45.7%
## Psi_IPTW_DR -0.0565    7e-04 0.0038    29.8%
## Psi_TMLE   -0.0563    7e-04 0.0038    29.4%
## Psi_CV.TMLE -0.0752    9e-04 0.0066    14%
##
## $table_EnYd0_for_E0Yd0
##           Bias Variance    MSE Coverage
## Psi_gcomp  -0.0935    2e-04 9e-03      -
## Psi_IPTW   -0.0004    8e-04 8e-04    95.8%
## Psi_IPTW_DR 0.0002    4e-04 4e-04    95.8%
## Psi_TMLE   0.0004    4e-04 4e-04    95.8%
```

```
## Psi_CV.TMLE 0.0007 5e-04 5e-04 95.3%
##
## $table_EnYdn_for_E0Ydn
##          Bias Variance MSE Coverage
## Psi_gcomp -0.0035 3e-04 0.0004 -
## Psi_IPTW 0.0162 8e-04 0.0011 94.9%
## Psi_IPTW_DR 0.0166 7e-04 0.0009 90.6%
## Psi_TMLE 0.0167 7e-04 0.0009 90.5%
## Psi_CV.TMLE 0.0002 9e-04 0.0009 93.9%
```

2.2 Table Medium Library

```
## $table_EnYdn_for_E0Yd0
##          Bias Variance MSE Coverage
## Psi_gcomp -0.1248 0.0005 0.0161 -
## Psi_IPTW 0.0341 0.0011 0.0022 75.7%
## Psi_IPTW_DR 0.0352 0.0009 0.0021 64.2%
## Psi_TMLE 0.0331 0.0008 0.0019 64.5%
## Psi_CV.TMLE -0.0297 0.0008 0.0016 71.4%
##
## $table_EnYd0_for_E0Yd0
##          Bias Variance MSE Coverage
## Psi_gcomp -0.1235 5e-04 0.0157 -
## Psi_IPTW -0.0011 8e-04 0.0008 95.2%
## Psi_IPTW_DR -0.0011 5e-04 0.0005 94.8%
## Psi_TMLE -0.0009 5e-04 0.0005 94.9%
## Psi_CV.TMLE -0.0008 5e-04 0.0005 95.4%
##
## $table_EnYdn_for_E0Ydn
##          Bias Variance MSE Coverage
## Psi_gcomp -0.0977 0.0005 0.0101 -
## Psi_IPTW 0.0612 0.0011 0.0048 45.3%
## Psi_IPTW_DR 0.0623 0.0009 0.0048 29.1%
## Psi_TMLE 0.0602 0.0008 0.0044 30%
## Psi_CV.TMLE 0.0002 0.0008 0.0008 94.3%
```

2.3 Table Aggressive Library

```
## $table_EnYdn_for_E0Yd0
##          Bias Variance MSE Coverage
## Psi_gcomp -0.1165 0.0006 0.0142 -
## Psi_IPTW 0.1076 0.0104 0.0220 40.5%
## Psi_IPTW_DR 0.0995 0.0102 0.0201 36.6%
## Psi_TMLE 0.1004 0.0115 0.0216 36.9%
## Psi_CV.TMLE -0.0278 0.0007 0.0014 74.8%
##
## $table_EnYd0_for_E0Yd0
```

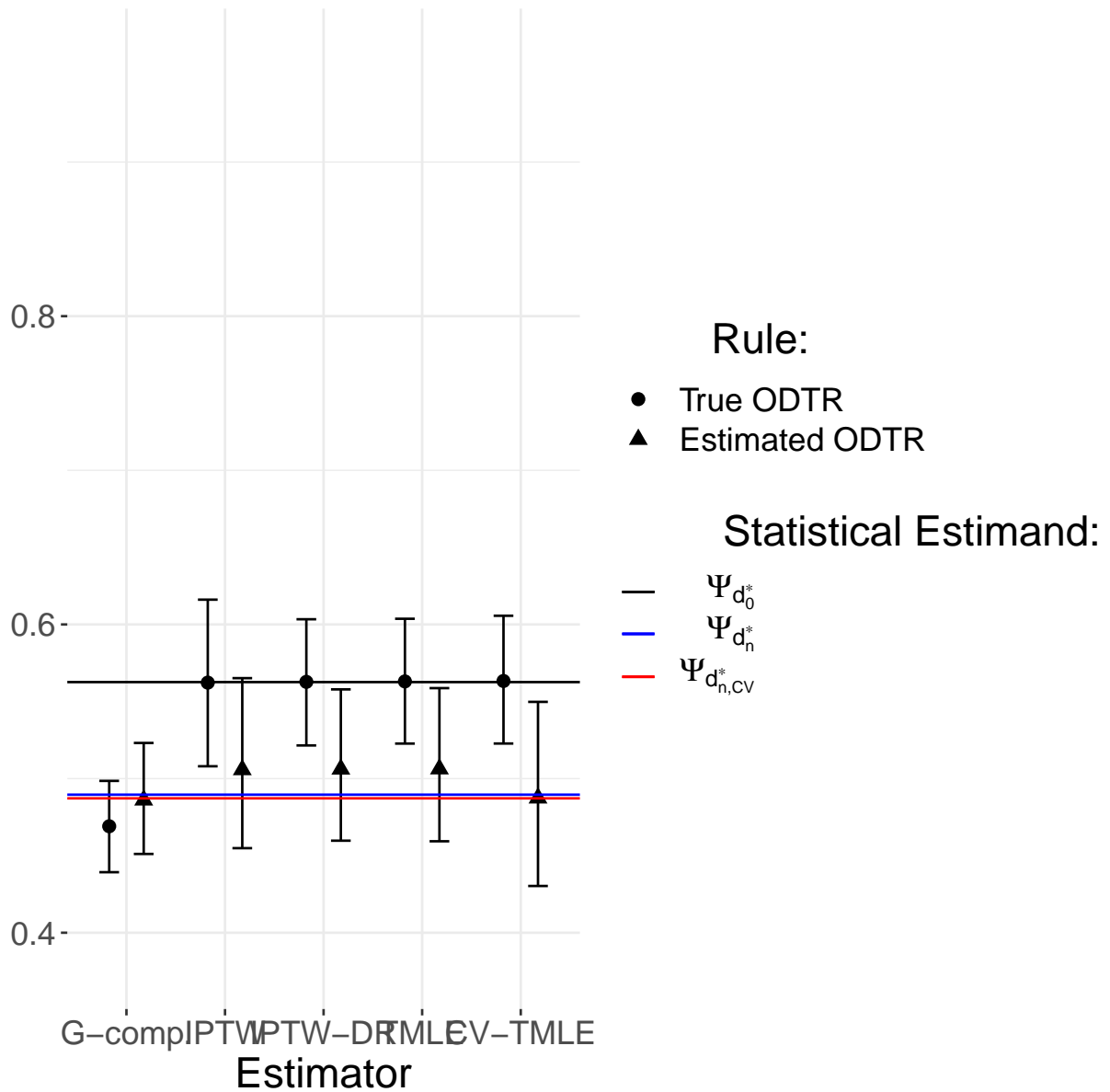
```

##          Bias Variance      MSE Coverage
## Psi_gcomp  -0.1170    6e-04 0.0142      -
## Psi_IPTW    0.0020    8e-04 0.0008    95.8%
## Psi_IPTW_DR -0.0036    5e-04 0.0005    93.9%
## Psi_TMLE    -0.0034    5e-04 0.0005    94.4%
## Psi_CV.TMLE 0.0011    5e-04 0.0005    95.7%
##
## $table_EnYdn_for_E0Ydn
##          Bias Variance      MSE Coverage
## Psi_gcomp  -0.0868    0.0006 0.0081      -
## Psi_IPTW    0.1373    0.0104 0.0292    25.4%
## Psi_IPTW_DR 0.1292    0.0102 0.0269    20.5%
## Psi_TMLE    0.1301    0.0115 0.0285     20%
## Psi_CV.TMLE 0.0003    0.0007 0.0007     95%

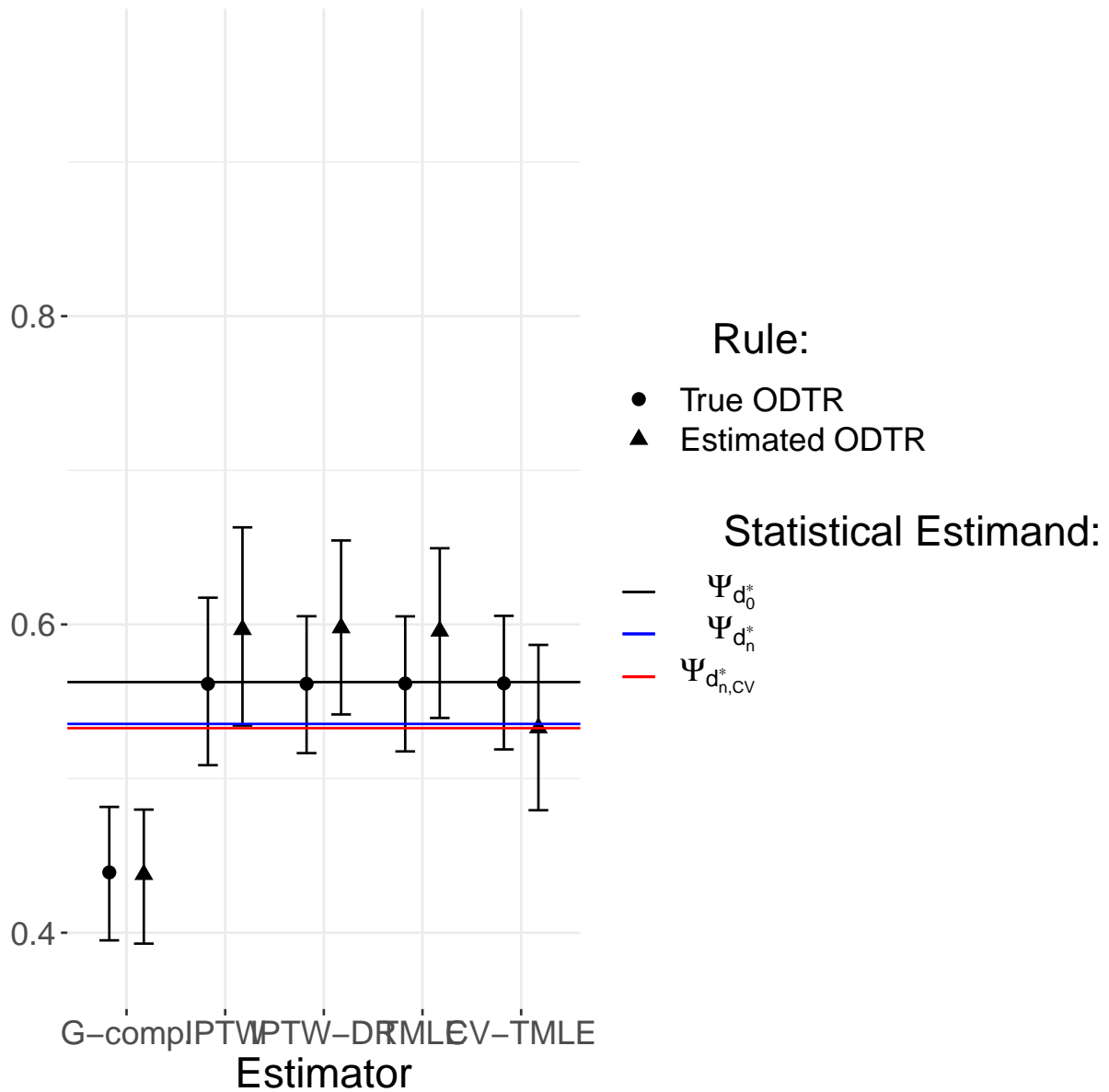
```

3 Results

GLMs – least data adaptive



ML + HAL + GLMs – medium data adaptive



ML + HAL + GLMs – most data adaptive

