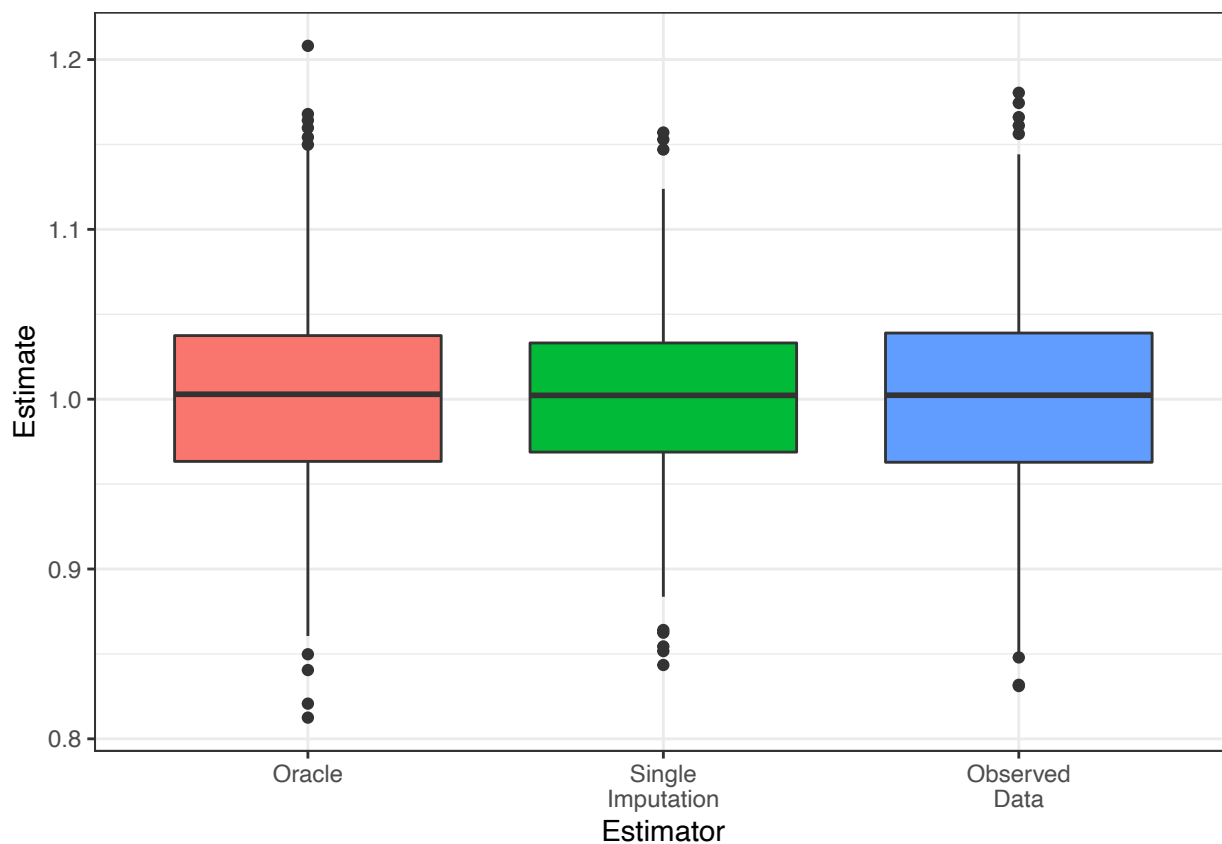


## Beta unkown and correctly specified



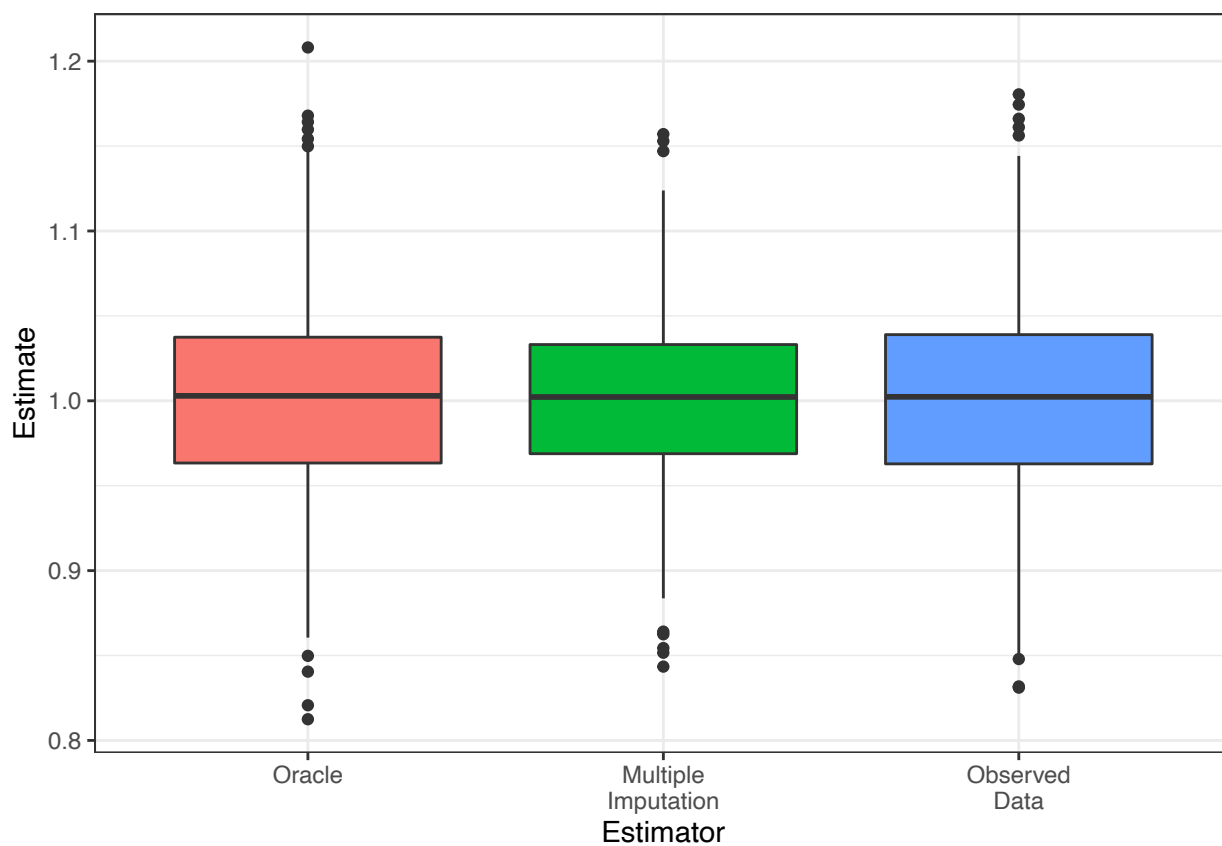
```
## # A tibble: 3 x 3
##   estimator  est    se
##   <chr>      <dbl> <dbl>
## 1 si         1.00 0.0570
## 2 obs         1.00 0.0578
## 3 oracle     1.00 0.0563

##           oracle  observed single imputation
## empirical 0.05603238 0.05706055      0.04802895
## estimated 0.05630954 0.05781393      0.05695516
```

## Beta unkown and incorrectly specified

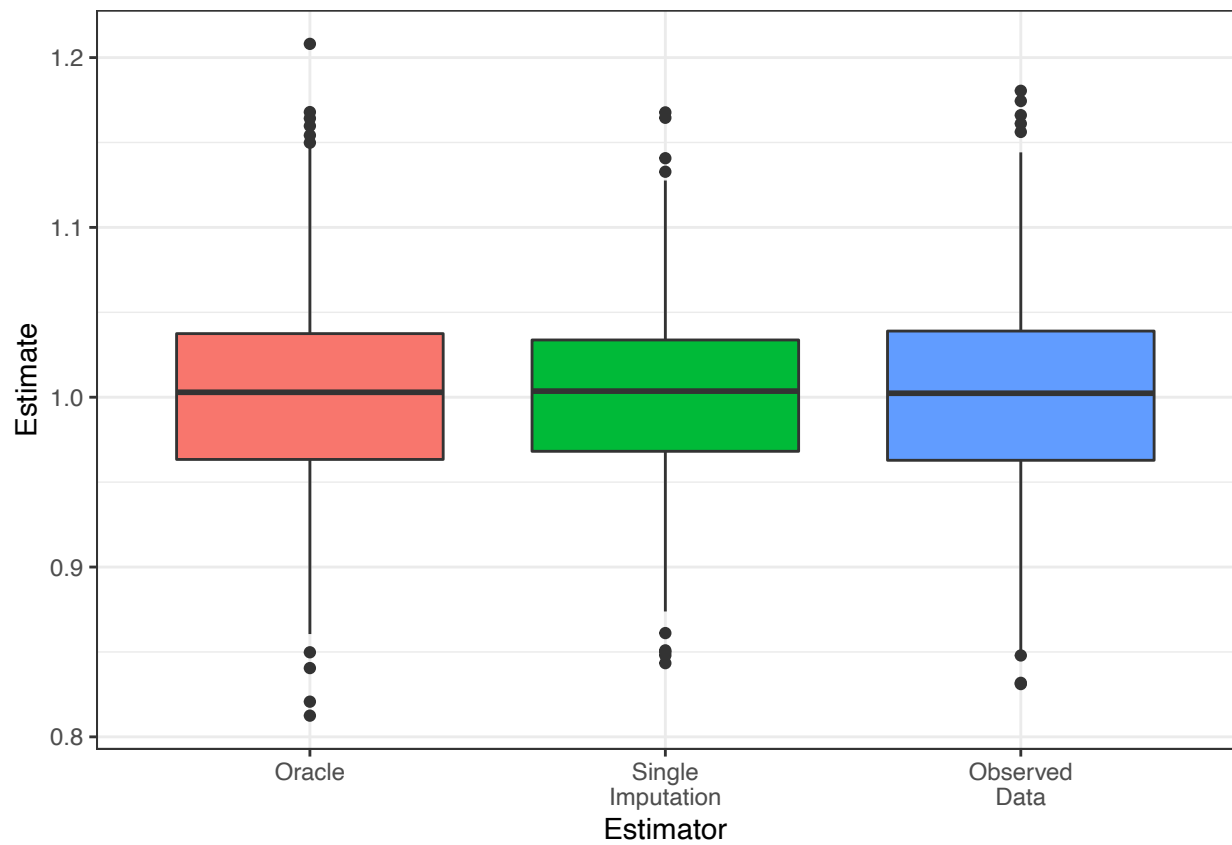
$$\hat{Y} \sim G, X$$

## Beta unknown, model correctly specified



```
## # A tibble: 3 x 3
##   estimator  est      se
##   <chr>      <dbl> <dbl>
## 1 mi         1.00 0.0570
## 2 obs         1.00 0.0578
## 3 oracle      1.00 0.0563

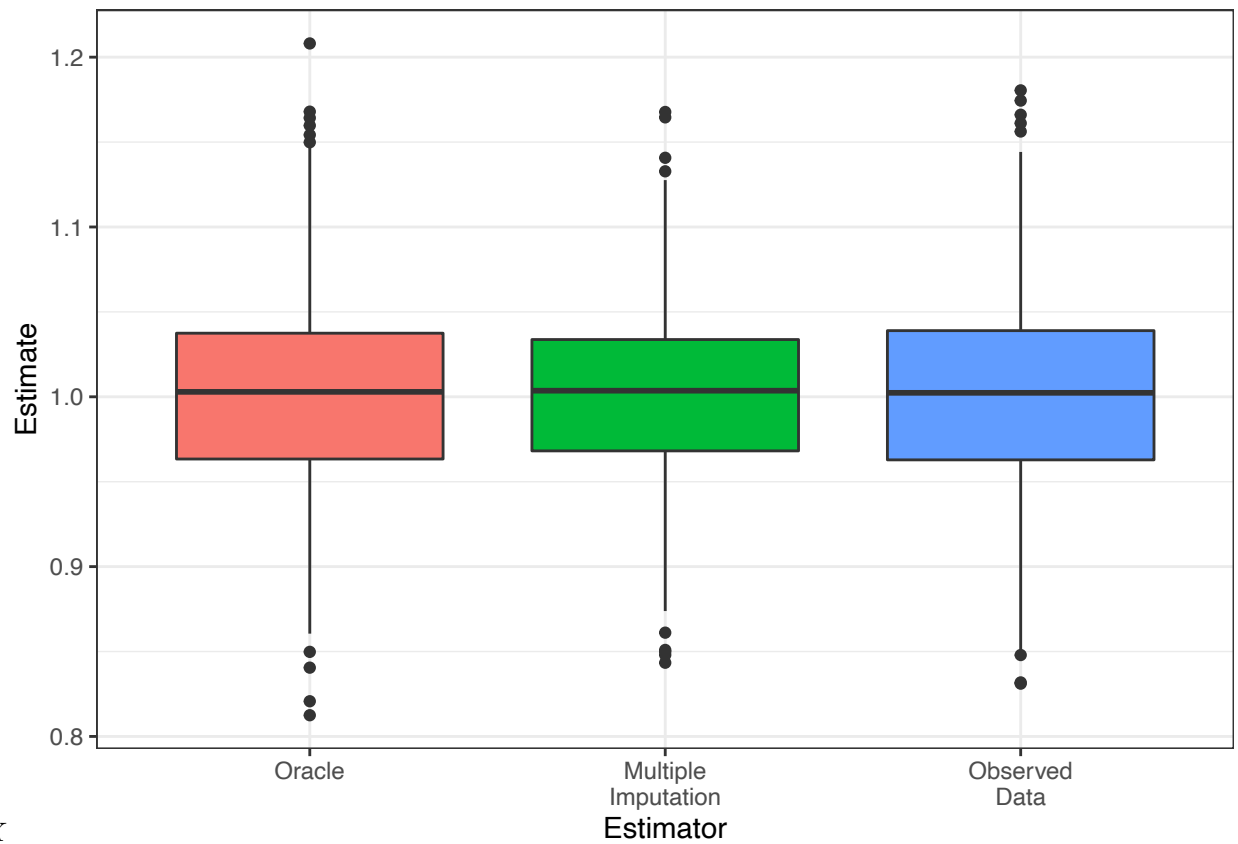
##           oracle_est  obs_est  mi_est
## empirical 0.05603238 0.05706055 0.04802895
## estimated 0.05630954 0.05781393 0.05695516
```



```
## # A tibble: 3 x 3
##   estimator  est    se
##   <chr>      <dbl> <dbl>
## 1 si         1.00 0.0595
## 2 obs        1.00 0.0578
## 3 oracle     1.00 0.0563

##           oracle  observed single imputation
## empirical 0.05603238 0.05706055      0.04890523
## estimated 0.05630954 0.05781393      0.05942240
 $\hat{Y} \sim X, Z$ 
```

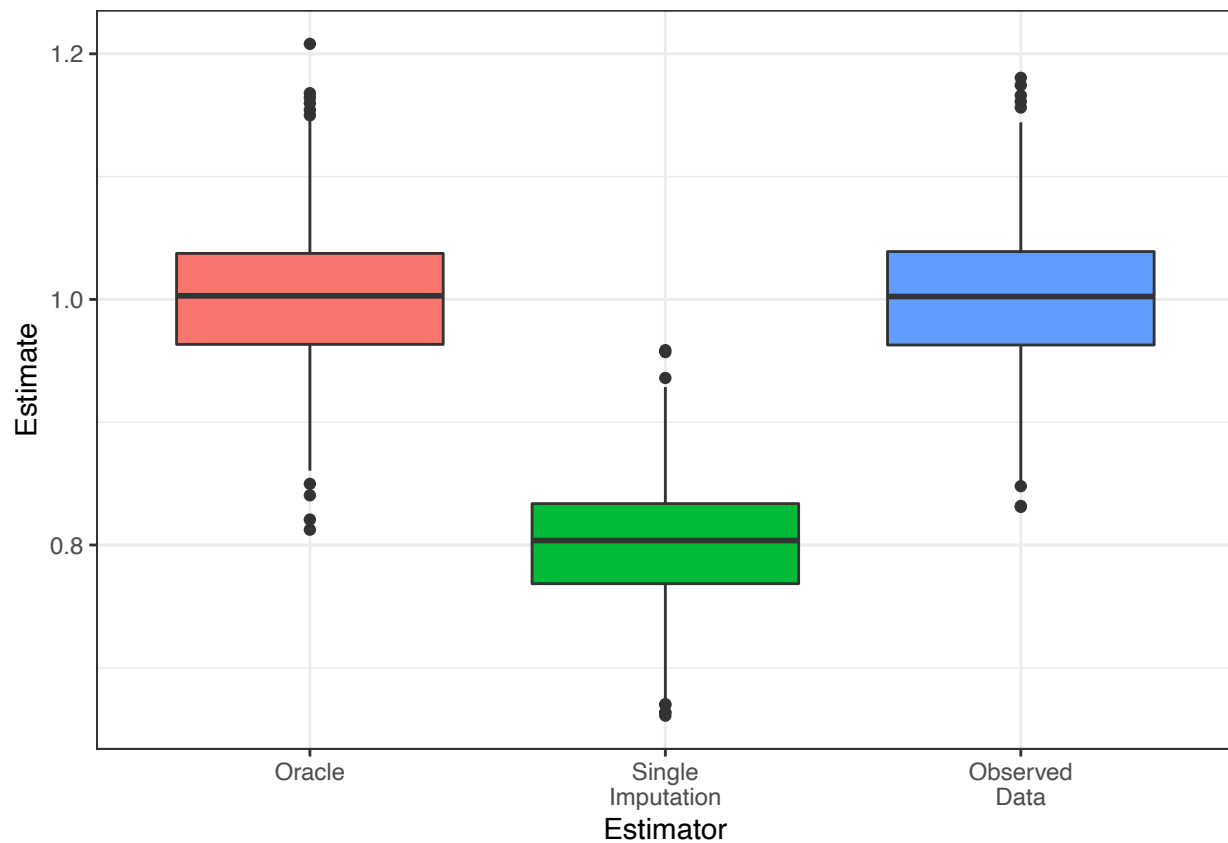
## Beta unknown, model incorrectly specified



$\hat{Y} \sim G+X$

```
## # A tibble: 3 x 3
##   estimator  est    se
##   <chr>      <dbl> <dbl>
## 1 mi         1.00 0.0595
## 2 obs         1.00 0.0578
## 3 oracle      1.00 0.0563

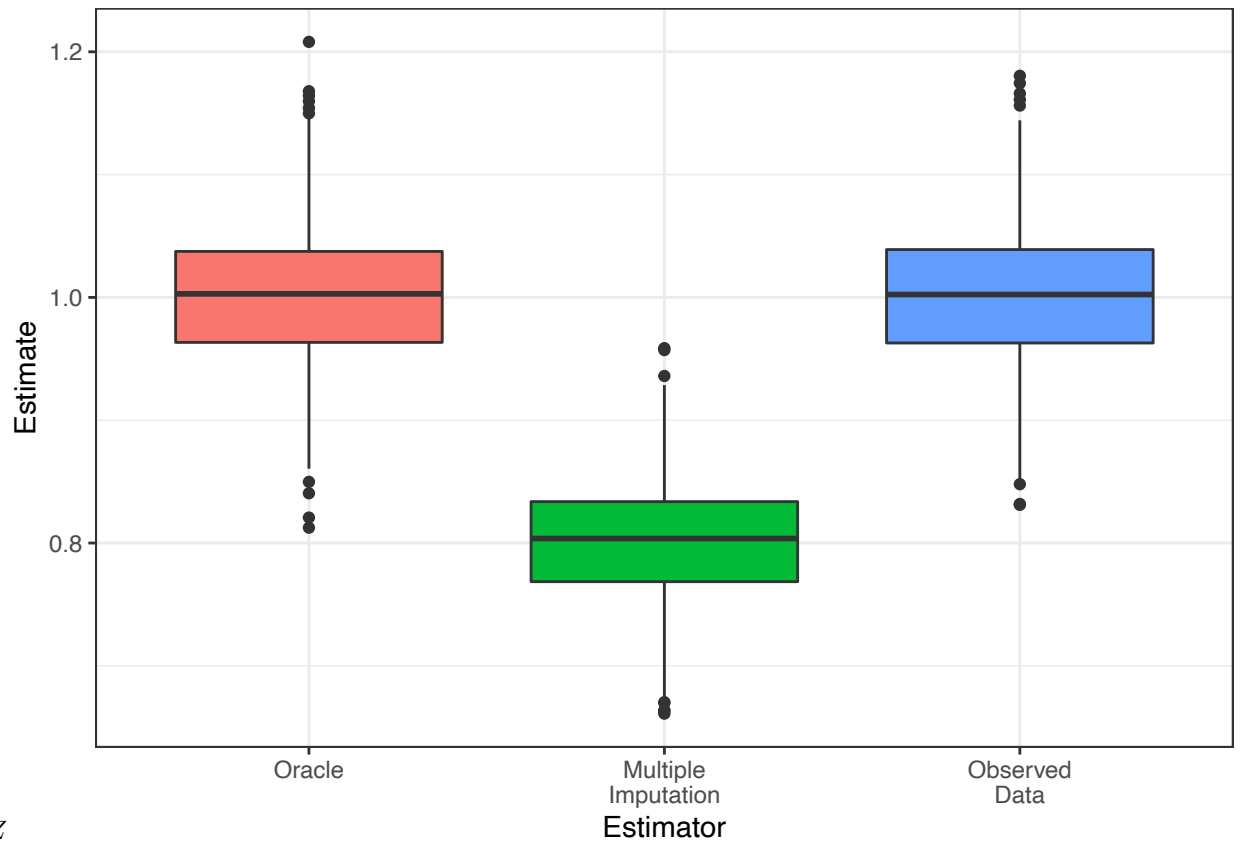
##       oracle_est  obs_est  mi_est
## empirical 0.05603238 0.05706055 0.04890523
## estimated 0.05630954 0.05781393 0.05942240
```



```
## # A tibble: 3 x 3
##   estimator  est    se
##   <chr>      <dbl> <dbl>
## 1 si        0.801 0.0619
## 2 obs       1.00  0.0578
## 3 oracle    1.00  0.0563

##           oracle  observed single imputation
## empirical 0.05603238 0.05706055      0.04947508
## estimated 0.05630954 0.05781393      0.06178609
```

## Multiple Imputation



$\hat{Y} \sim X+Z$

```
## # A tibble: 3 x 3
##   estimator  est    se
##   <chr>    <dbl> <dbl>
## 1 mi      0.801 0.0619
## 2 obs     1.00  0.0578
## 3 oracle  1.00  0.0563

##           oracle_est  obs_est  mi_est
## empirical 0.05603238 0.05706055 0.04947508
## estimated 0.05630954 0.05781393 0.06178609
```