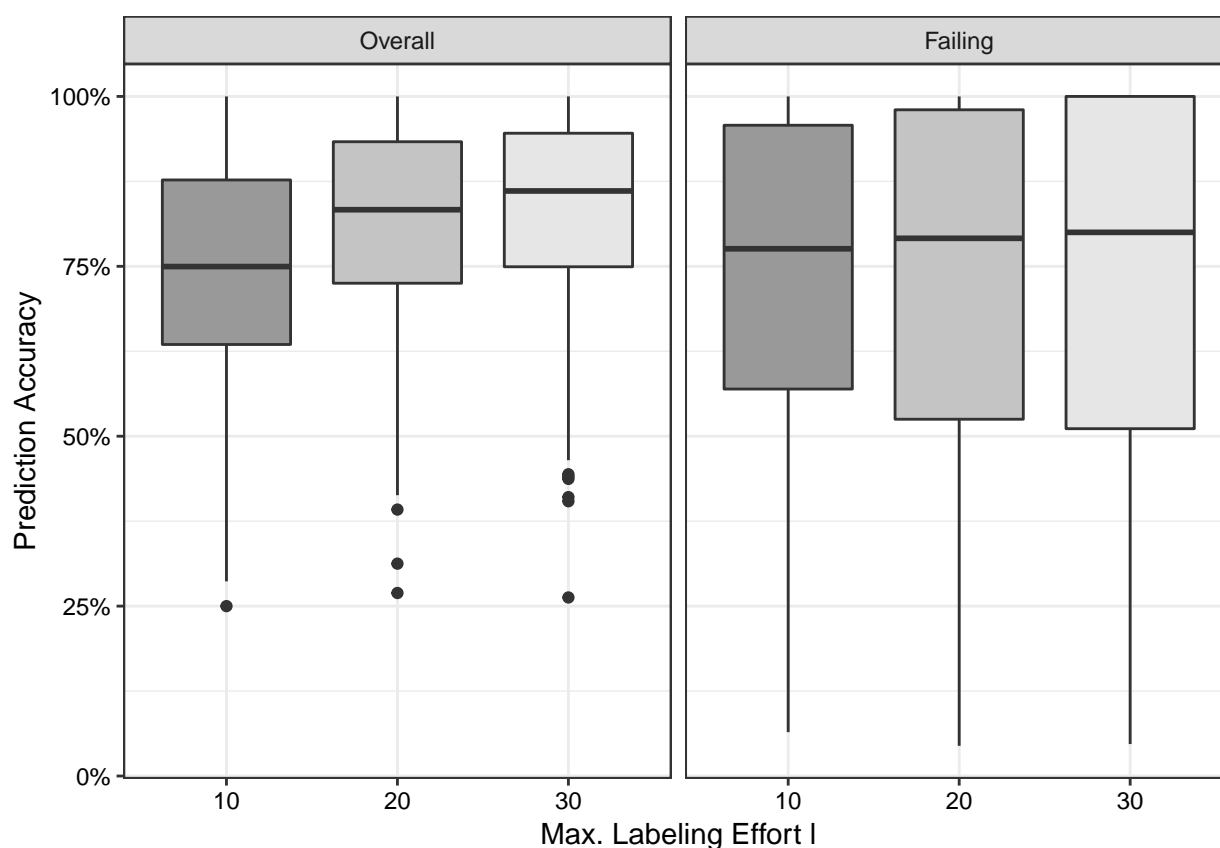


ICST

```
library(ggplot2)
library(scales)
theme_set(theme_bw())
```

Oracle Quality

```
## [1] "Subjects (-1 10): 552"
## [1] "Subjects (-1 20): 545"
## [1] "Subjects (-1 30): 544"
```

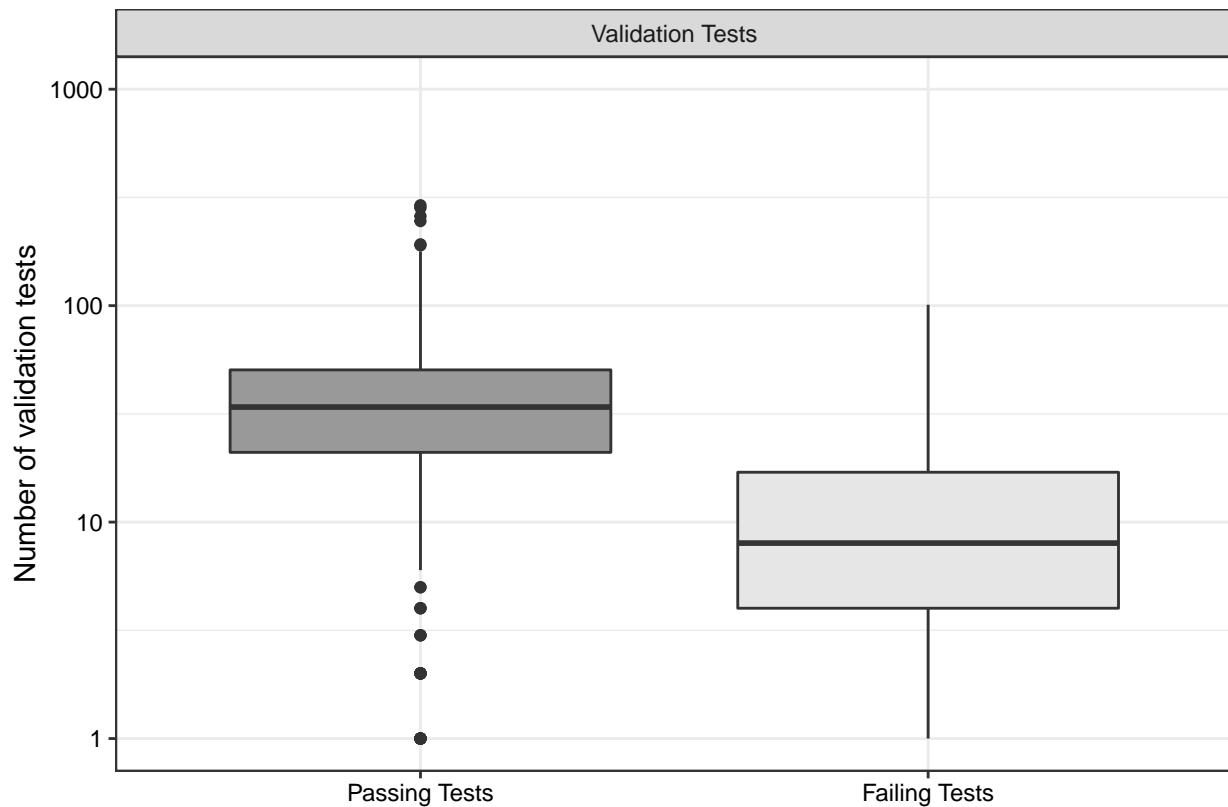


```
## Saving 5.6 x 3.6 in image
```

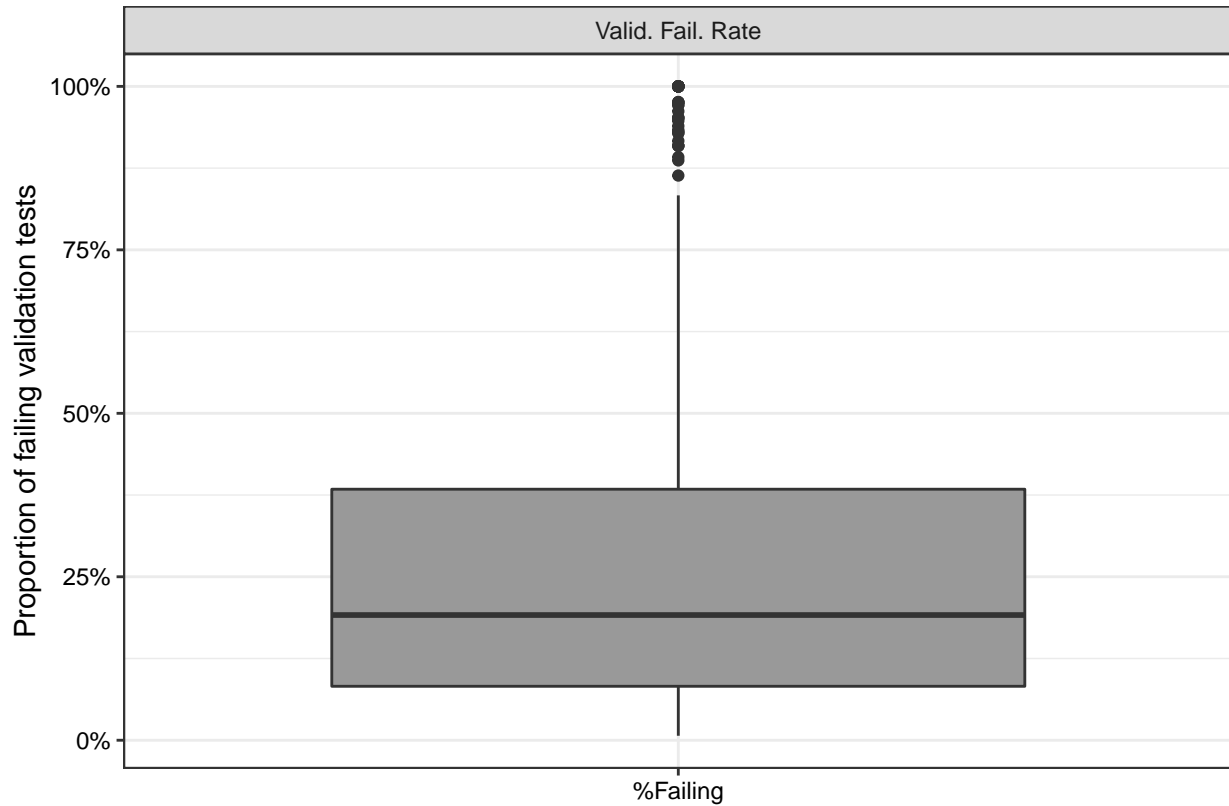
```
##           subject max_label category variable    value
## 1  1-A-bug-18353198-18353306      10 Accuracy Overall 0.8344828
## 3 104-A-bug-11691772-11691810      10 Accuracy Overall 0.9149425
## 5 104-A-bug-11691779-11691810      10 Accuracy Overall 0.9722222
## 7 104-A-bug-11691794-11691810      10 Accuracy Overall 0.6666667
## 9 104-A-bug-11939068-11939085      10 Accuracy Overall 0.9560284
## 11 104-A-bug-13139540-13139570      10 Accuracy Overall 0.6864583

##           0%          25%          50%          75%         100%
## 0.2500000 0.6349879 0.7496564 0.8771287 1.0000000
```

```
## [1] "Average/Median prediction accuracy (-1 10): 0.753890193684369 0.749656419529837"
## [1] "Average/Median prediction accuracy (-1 20): 0.815275237281484 0.833333333333333"
## [1] "Average/Median prediction accuracy (-1 30): 0.838733130775872 0.860903532608696"
## [1] "Average/Median conditional accuracy (-1 10): 0.739569856633927 0.775833333333333"
## [1] "Average/Median conditional accuracy (-1 20): 0.72899397780596 0.791228070175439"
## [1] "Average/Median conditional accuracy (-1 30): 0.73405715729944 0.8"
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Removed 17 rows containing non-finite values (stat_boxplot).
```



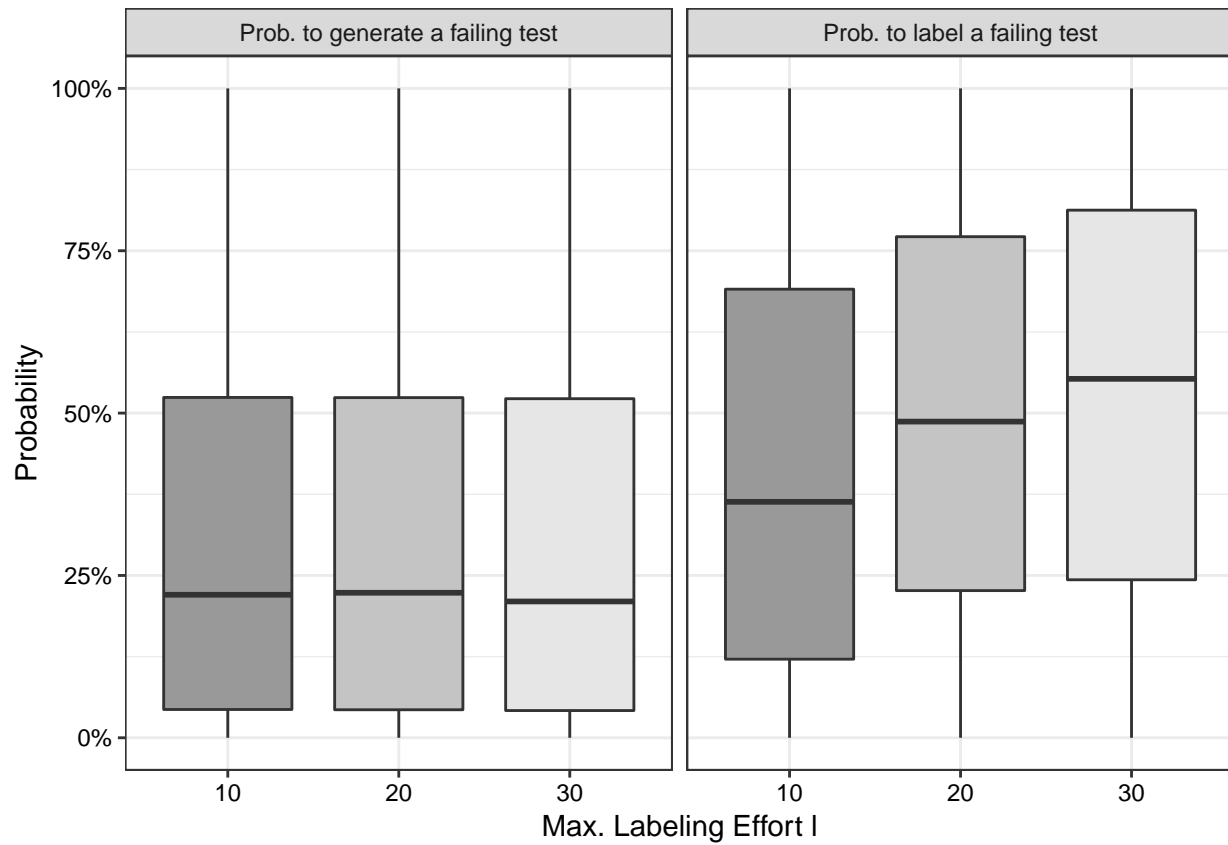
```
## Saving 2.4 x 3.6 in image
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Removed 17 rows containing non-finite values (stat_boxplot).
## [1] "Average number of passing tests: 41.5087285902503"
## [1] "Average number of failing tests: 13.0419960474308"
```



Saving 1.76 x 3.6 in image

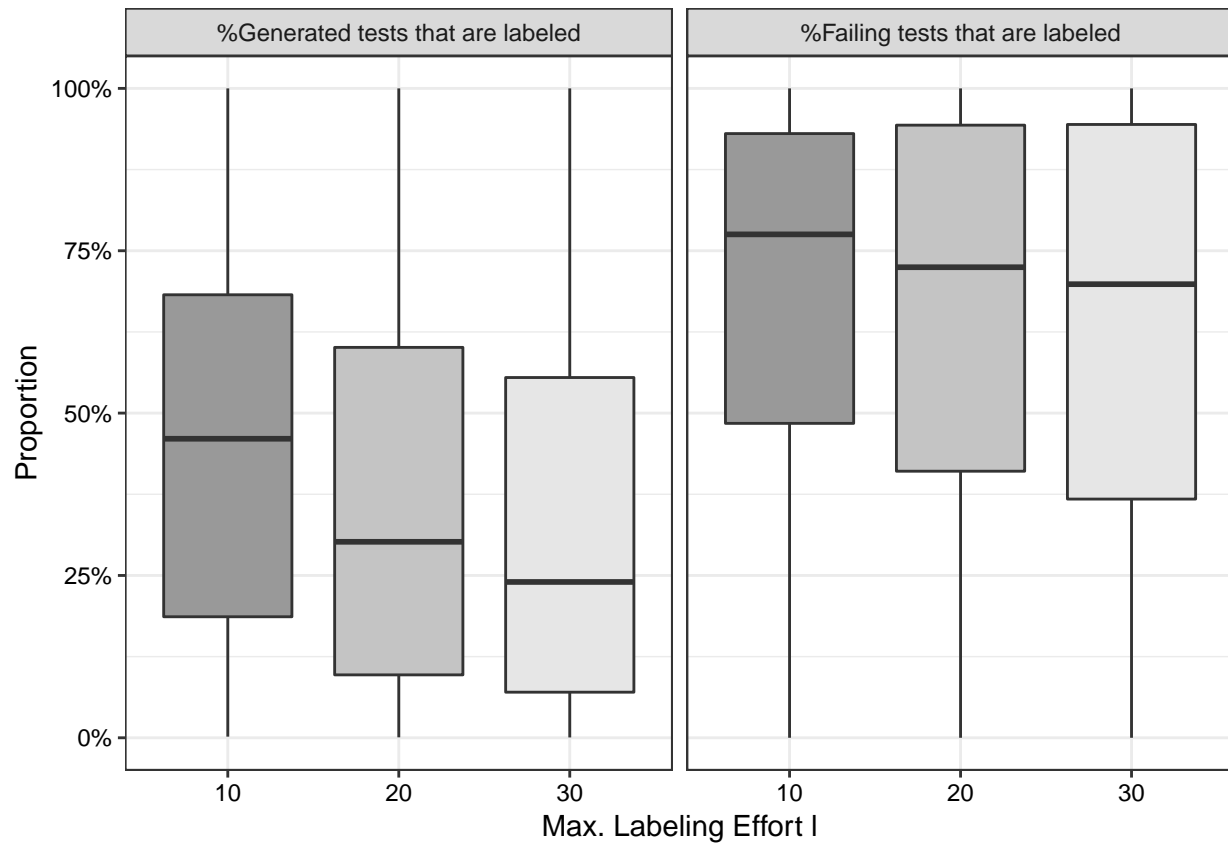
Human Effort

```
## [1] "Average/Median %Generated tests that are labeled (-l 10):  0.446983376546824 0.46047609623703"
## [1] "Average/Median %Generated tests that are labeled (-l 20):  0.364415420893335 0.301810865191147"
## [1] "Average/Median %Generated tests that are labeled (-l 30):  0.334512881418475 0.239959364919063"
## [1] "Average/Median %Failing tests that are labeled (-l 10):  0.67289962491367 0.77521186440678"
## [1] "Average/Median %Failing tests that are labeled (-l 20):  0.649864169641316 0.72463768115942"
## [1] "Average/Median %Failing tests that are labeled (-l 30):  0.634223708282012 0.698513111651798"
## [1] "Average/Median Improved (-l 10):  4.73989209702213 1.43816233936533"
## [1] "Average/Median Improved (-l 20):  9.40043022903786 1.77113543091655"
## [1] "Average/Median Improved (-l 30):  11.0075321600529 1.94688840121631"
## [1] "Average/Median Prob. to generate a failing test (-l 10):  0.302922018638272 0.220238124253577"
## [1] "Average/Median Prob. to generate a failing test (-l 20):  0.302967165125857 0.223314606741573"
## [1] "Average/Median Prob. to generate a failing test (-l 30):  0.301374546763708 0.209925373134328"
## [1] "Average/Median Prob. to label a failing test (-l 10):  0.414021378335148 0.363333333333333"
## [1] "Average/Median Prob. to label a failing test (-l 20):  0.488738809278124 0.486910994764398"
## [1] "Average/Median Prob. to label a failing test (-l 30):  0.523769581085046 0.55272774852991"
```

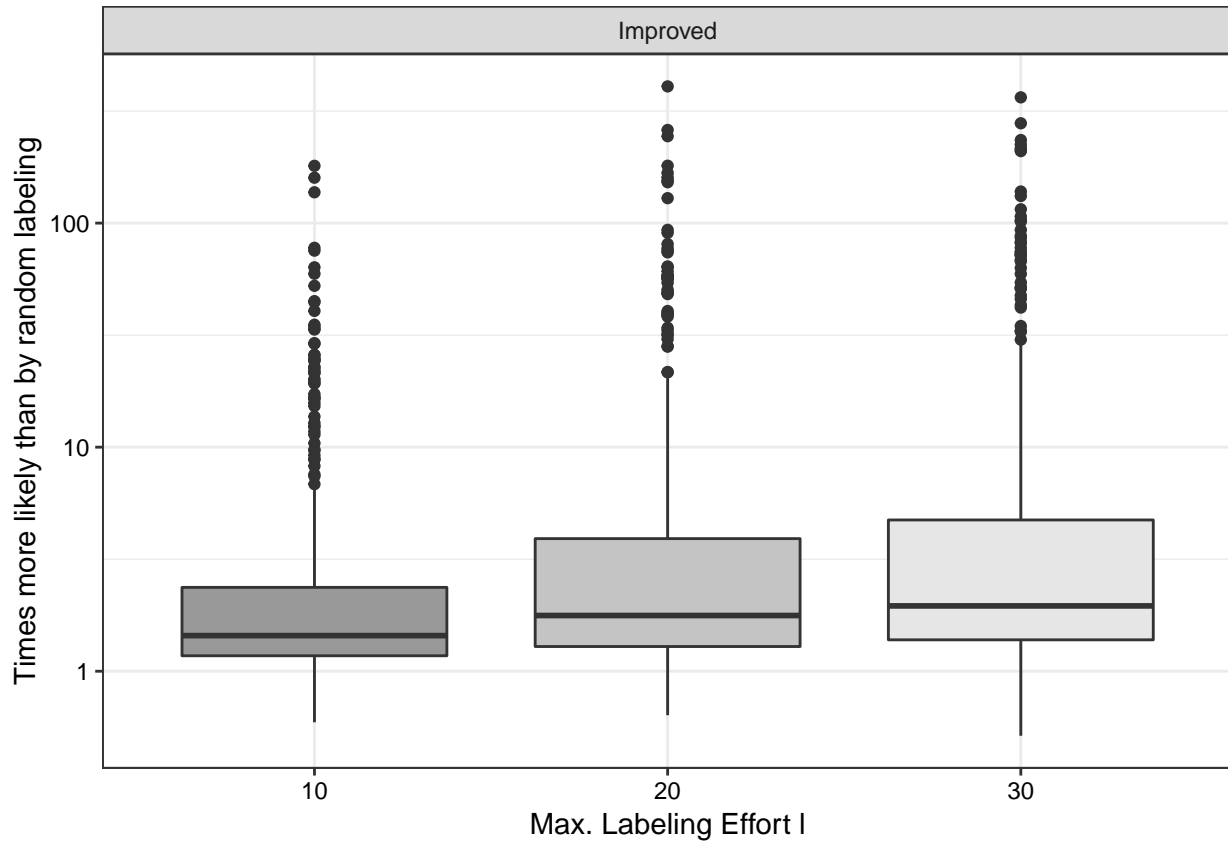


```
## Saving 5.2 x 3.6 in image
```

```
## Warning: Removed 12 rows containing non-finite values (stat_boxplot).
```



```
## Saving 5.2 x 3.6 in image
## Warning: Removed 12 rows containing non-finite values (stat_boxplot).
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Removed 22 rows containing non-finite values (stat_boxplot).
```



Patch Quality (Repairability)

```
## [1] "-1 10"
```

```
##           V1           V2           V3
## 1-A-bug-18353198-18353306 : 30   Min.   : 1.0   Min.   : 9.0
## 104-A-bug-11691772-11691810: 30   1st Qu.: 8.0   1st Qu.: 13.0
## 104-A-bug-11691779-11691810: 30   Median :16.0   Median : 19.0
## 104-A-bug-11691794-11691810: 30   Mean    :15.5   Mean    : 213.5
## 104-A-bug-11939068-11939085: 30   3rd Qu.:23.0   3rd Qu.: 40.0
## 104-A-bug-13139540-13139570: 30   Max.    :30.0   Max.    :8782.0
## (Other)                   :16110
##           V4           V5           V6           V7
## Min.   : 2.000   Min.   : 0.00   Min.   : 0.000   Min.   : 6.00
## 1st Qu.:10.000   1st Qu.: 2.00   1st Qu.: 1.000   1st Qu.: 35.00
## Median :10.000   Median : 6.00   Median : 4.000   Median : 46.00
## Mean    : 9.862   Mean    :11.51   Mean    : 4.115   Mean    : 54.83
## 3rd Qu.:10.000   3rd Qu.: 9.00   3rd Qu.: 7.000   3rd Qu.: 63.00
## Max.    :10.000   Max.    :3231.00 Max.    :10.000   Max.    :293.00
##
##           V8           V9           V10          V11
## Min.   : 0.00   Min.   : 1.00   Min.   : 0.000   manual:16290
## 1st Qu.: 23.00   1st Qu.: 4.00   1st Qu.: 2.000
## Median : 34.00   Median : 8.00   Median : 4.000
## Mean    : 41.13   Mean    :13.08   Mean    : 9.407
```

```

## 3rd Qu.: 47.00    3rd Qu.: 17.00    3rd Qu.: 11.000
## Max.    :292.00    Max.    :101.00    Max.    :101.000
##
##              V12              V13              V14
##  ????:          :1286    Min.    : 0.066    Min.    : 5.00
## NOREPAIR          :8804    1st Qu.: 3.469    1st Qu.: 26.00
## REPAIR            :4091    Median : 22.971    Median : 35.00
## TIMEOUT           :1900    Mean    :141.906    Mean    : 41.92
## VERIFICATIONFAILED: 209    3rd Qu.:209.204    3rd Qu.: 43.00
##                      Max.    :600.000    Max.    :178.00
##                      NA's    :12199
##
##      V15              V16              V17
## Min.    : 17.00    Min.    : 17.0    autogen:16290
## 1st Qu.: 34.00    1st Qu.: 34.0
## Median : 42.00    Median : 42.0
## Mean    : 49.09    Mean    : 49.3
## 3rd Qu.: 51.00    3rd Qu.: 51.0
## Max.    :178.00    Max.    :178.0
## NA's    :12199    NA's    :12199
##
##      V18              V19              V20
##  ????:          : 692    Min.    : 0.252    Min.    : 0.00
## NOREPAIR          :9826    1st Qu.: 28.464    1st Qu.: 25.00
## REPAIR            :3277    Median : 85.097    Median : 35.00
## TIMEOUT           :1418    Mean    :161.381    Mean    : 39.95
## VERIFICATIONFAILED:1077    3rd Qu.:217.908    3rd Qu.: 45.00
##                      Max.    :600.000    Max.    :178.00
##                      NA's    :13013
##
##      V21              V22
## Min.    : 0.00    Min.    : 10.00
## 1st Qu.: 34.00    1st Qu.: 34.00
## Median : 42.00    Median : 42.00
## Mean    : 45.67    Mean    : 46.55
## 3rd Qu.: 50.00    3rd Qu.: 51.00
## Max.    :178.00    Max.    :178.00
## NA's    :13013    NA's    :13013
##
## [1] "-1 20"
##
##              V1              V2              V3
## 1-A-bug-18353198-18353306 : 30    Min.    : 1.00    Min.    : 18.0
## 104-A-bug-11691772-11691810: 30    1st Qu.: 7.00    1st Qu.: 32.0
## 104-A-bug-11691779-11691810: 30    Median :15.00    Median : 58.0
## 104-A-bug-11691794-11691810: 30    Mean    :14.98    Mean    : 546.7
## 104-A-bug-11939068-11939085: 30    3rd Qu.:23.00    3rd Qu.: 162.0
## 104-A-bug-13139540-13139570: 30    Max.    :30.00    Max.    :19041.0
## (Other)                  :12952
##
##      V4              V5              V6              V7
## Min.    : 2.00    Min.    : 0.00    Min.    : 0.000    Min.    : 6.00
## 1st Qu.:20.00    1st Qu.: 8.00    1st Qu.: 4.000    1st Qu.: 35.00
## Median :20.00    Median : 15.00    Median :10.000    Median : 46.00
## Mean    :19.14    Mean    : 24.87    Mean    : 9.549    Mean    : 53.63
## 3rd Qu.:20.00    3rd Qu.: 19.00    3rd Qu.:15.000    3rd Qu.: 62.00
## Max.    :20.00    Max.    :3826.00    Max.    :20.000    Max.    :293.00
##
##      V8              V9              V10              V11

```

```

## Min. : 2.0 Min. : 1.00 Min. : 0.000 manual:13132
## 1st Qu.: 26.0 1st Qu.: 4.00 1st Qu.: 2.000
## Median : 37.0 Median : 8.00 Median : 4.000
## Mean : 43.7 Mean : 12.94 Mean : 9.389
## 3rd Qu.: 49.0 3rd Qu.: 17.00 3rd Qu.: 11.000
## Max. :291.0 Max. :101.00 Max. :101.000
##
## V12 V13 V14 V15
## Mode:logical Mode:logical Mode:logical Mode:logical
## NA's:13132 NA's:13132 NA's:13132 NA's:13132
##
##
##
##
## V16 V17 V18 V19
## Mode:logical autogen:13132 ???? : 745 Min. : 0.329
## NA's:13132 NOREPAIR:7741 1st Qu.: 77.397
## REPAIR :2162 Median :187.037
## TIMEOUT :2484 Mean :258.409
## 3rd Qu.:449.139
## Max. :600.000
##
## V20 V21 V22
## Min. : 0.00 Min. : 0.00 Min. : 15.00
## 1st Qu.: 26.00 1st Qu.: 34.00 1st Qu.: 34.00
## Median : 40.00 Median : 42.00 Median : 43.00
## Mean : 42.58 Mean : 46.64 Mean : 47.61
## 3rd Qu.: 51.00 3rd Qu.: 54.00 3rd Qu.: 54.00
## Max. :178.00 Max. :178.00 Max. :178.00
## NA's :10970 NA's :10970 NA's :10970
##
## [1] "-1 30"
##
## V1 V2 V3
## 1-A-bug-18353198-18353306 : 30 Min. : 1.00 Min. : 19.0
## 104-A-bug-11691772-11691810: 30 1st Qu.: 5.00 1st Qu.: 50.0
## 104-A-bug-11691779-11691810: 30 Median :14.00 Median : 107.0
## 104-A-bug-11691794-11691810: 30 Mean :14.17 Mean : 803.4
## 104-A-bug-11939068-11939085: 30 3rd Qu.:22.00 3rd Qu.: 360.2
## 104-A-bug-13139540-13139570: 30 Max. :30.00 Max. :16090.0
## (Other) :9636
##
## V4 V5 V6 V7
## Min. : 2.00 Min. : 0.00 Min. : 0.00 Min. : 6.00
## 1st Qu.:30.00 1st Qu.: 13.00 1st Qu.: 5.00 1st Qu.: 35.00
## Median :30.00 Median : 24.00 Median :16.00 Median : 46.00
## Mean :27.46 Mean : 34.87 Mean :14.86 Mean : 54.38
## 3rd Qu.:30.00 3rd Qu.: 29.00 3rd Qu.:25.00 3rd Qu.: 62.00
## Max. :30.00 Max. :3085.00 Max. :30.00 Max. :293.00
##
## V8 V9 V10 V11
## Min. : 2.00 Min. : 1.00 Min. : 0.000 manual:9816
## 1st Qu.: 28.00 1st Qu.: 3.00 1st Qu.: 2.000
## Median : 38.00 Median : 8.00 Median : 4.000
## Mean : 45.86 Mean : 13.14 Mean : 9.848

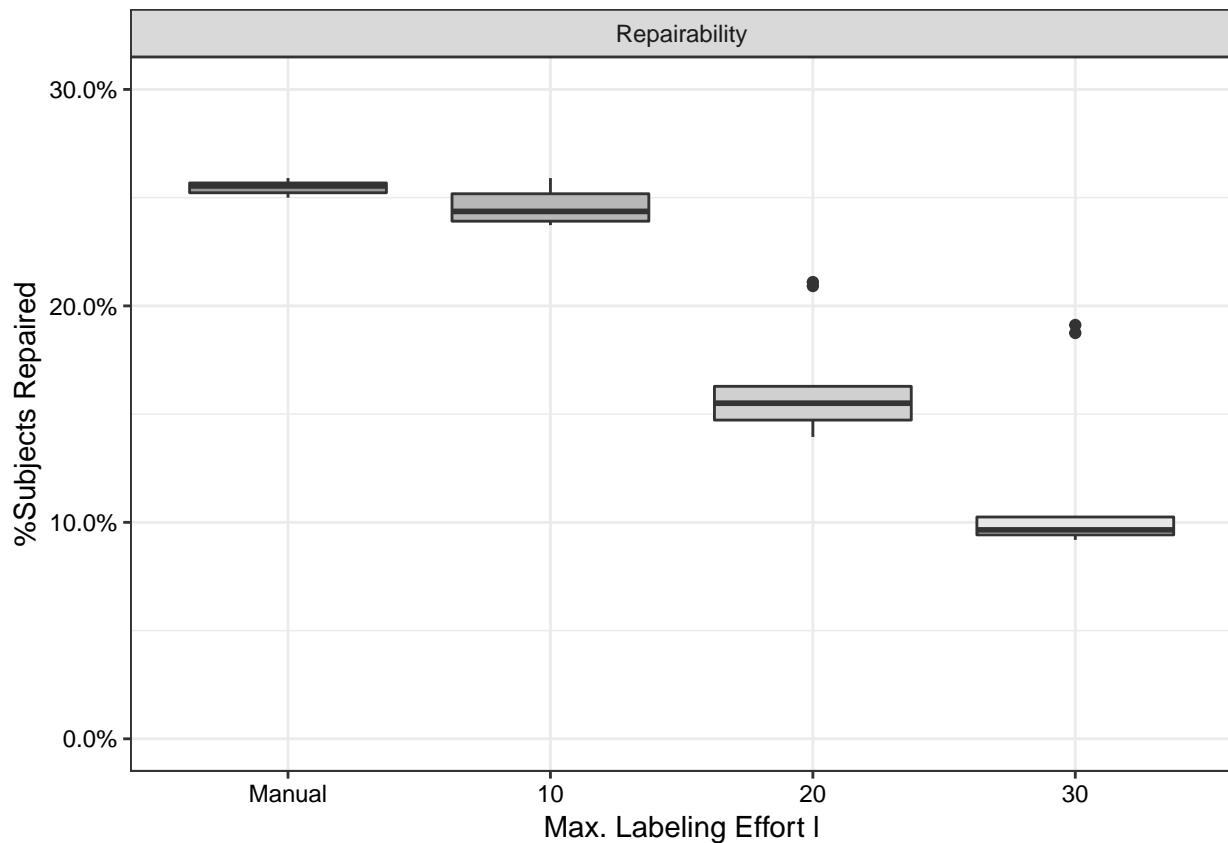
```



```

## 3rd Qu.: 50.00 3rd Qu.: 18.00 3rd Qu.: 12.000
## Max. :293.00 Max. :101.00 Max. :101.000
##
## V12 V13 V14 V15
## Mode:logical Mode:logical Mode:logical Mode:logical
## NA's:9816 NA's:9816 NA's:9816 NA's:9816
##
##
##
##
## V16 V17 V18 V19
## Mode:logical autogen:9816 ???? : 473 Min. : 0.29
## NA's:9816 NOREPAIR:5744 1st Qu.: 82.71
## REPAIR :1496 Median :184.92
## TIMEOUT :2103 Mean :270.42
## 3rd Qu.:505.71
## Max. :600.00
##
## V20 V21 V22
## Min. : 0.00 Min. : 0.00 Min. : 15.00
## 1st Qu.: 26.00 1st Qu.: 34.75 1st Qu.: 35.00
## Median : 40.00 Median : 42.00 Median : 43.00
## Mean : 42.11 Mean : 46.32 Mean : 47.41
## 3rd Qu.: 49.00 3rd Qu.: 53.00 3rd Qu.: 54.00
## Max. :178.00 Max. :178.00 Max. :178.00
## NA's :8320 NA's :8320 NA's :8320

```

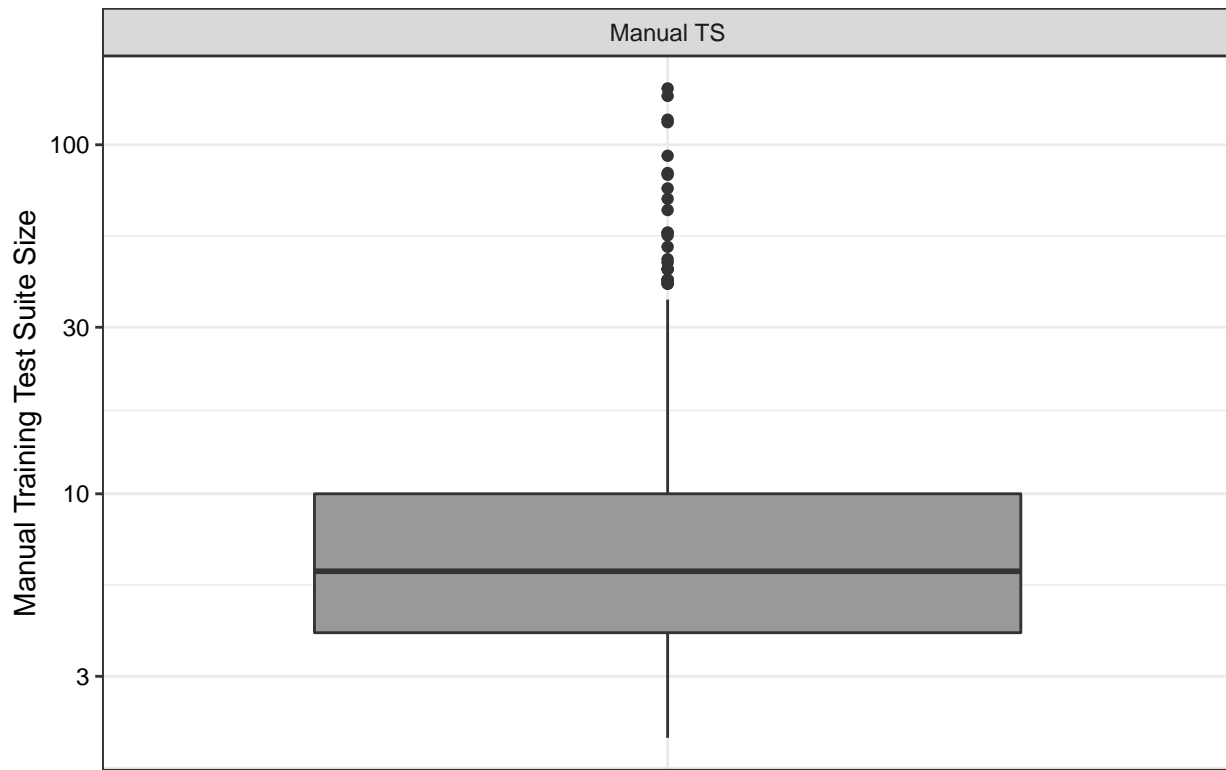


```
## Saving 4.55 x 3.15 in image
training = data.frame("subject"=character(), "max_label"=character(),
                      "variable"=character(), "value" = numeric())
d = read.table("manualTrainingTSsize.csv",sep=",",comment.char = "#")
for (Subject in levels(factor(d$V1))){
  specific = subset(d, V1 == Subject)
  training <- rbind (training, data.frame(subject = Subject, max_label="",
                                         variable = "Manual TS",
                                         value = specific$V2))
}

print(paste("Average/Median training test suite: ",
            mean(training$value, na.rm=TRUE),
            median(training$value, na.rm=TRUE)))
```

```
## [1] "Average/Median training test suite: 10.7608695652174 6"
```

```
ggplot(training, aes(max_label, value)) +
  geom_boxplot(aes(fill=max_label)) +
  scale_y_log10() +
  facet_grid(~ variable) +
  xlab("") + ylab("Manual Training Test Suite Size") +
  theme(legend.position="none", legend.title= element_blank(),
        axis.text.x = element_text(colour = "black"), axis.text.y = element_text(colour = "black")) +
  scale_fill_grey(start = 0.6, end = .9)
```



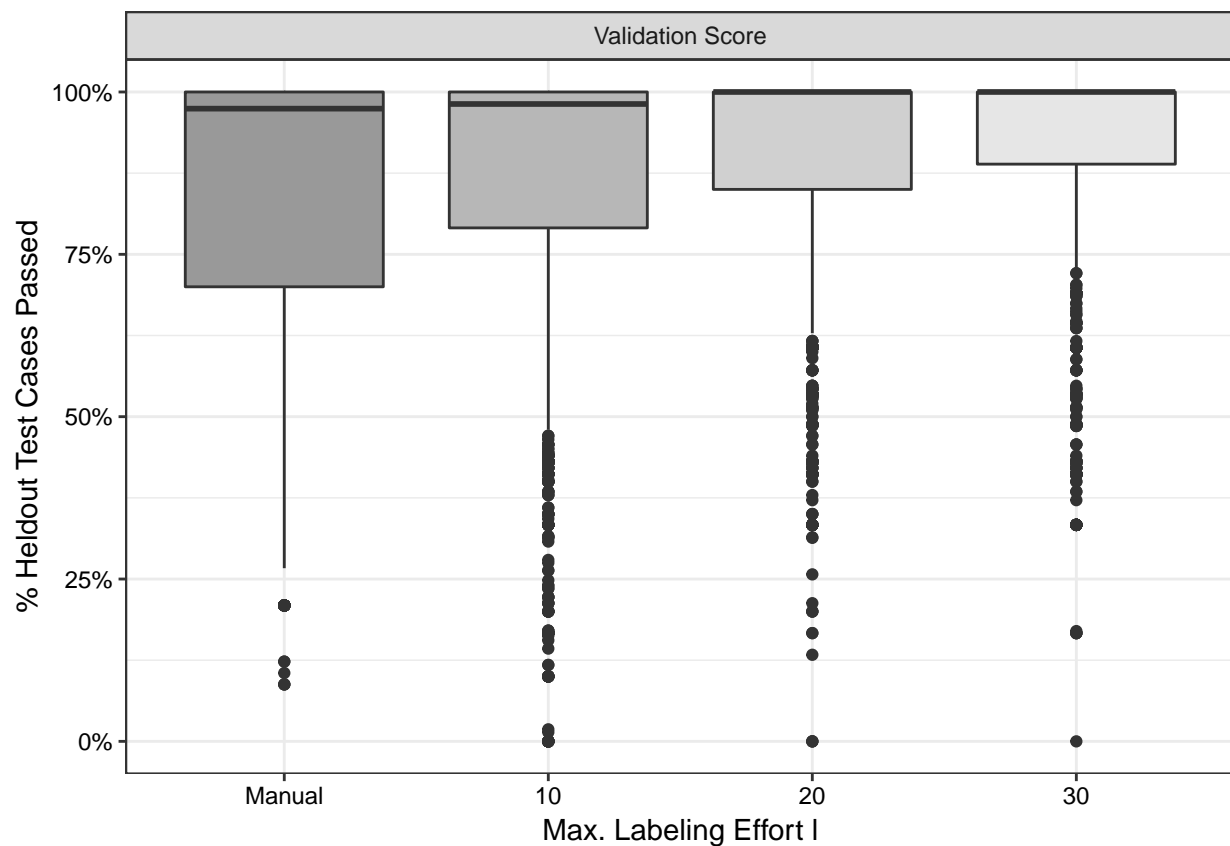
```
ggsave(filename = "training.pdf", width=2.2,scale=0.7)
```

```
## Saving 1.54 x 3.15 in image
```

Patch Quality (Validation Test Suite: Together)

Patch Quality (Validation Test Suite: Individually)

```
## [1] "l10 (manual): 4091"
## [1] "l10 (autogen): 3277"
## [1] "l20 (manual): 0"
## [1] "l20 (autogen): 2162"
## [1] "l30 (manual): 0"
## [1] "l30 (autogen): 1496"
## [1] "Average/Median Manual: 0.148537519535924 0.024390243902439"
## [1] "Average/Median -l 10: 0.138126389517177 0.015625"
## [1] "Average/Median -l 20: 0.101219289429628 0"
## [1] "Average/Median -l 30: 0.103172317158473 0"
## Warning: Removed 107 rows containing non-finite values (stat_boxplot).
```



```
## Saving 4.55 x 3.15 in image
## Warning: Removed 107 rows containing non-finite values (stat_boxplot).
```