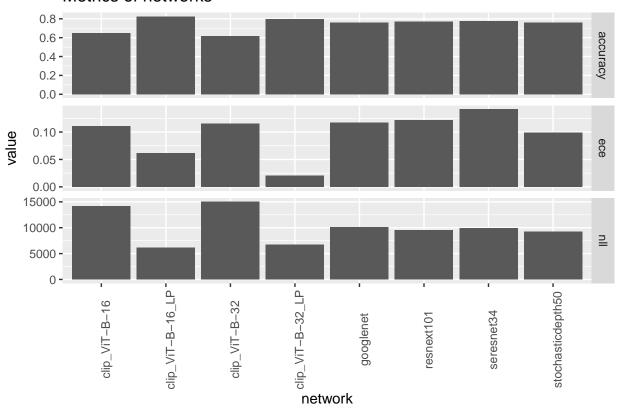
WeightedLinearEnsemble evaluation

```
library(ggplot2)
## Warning: package 'ggplot2' was built under R version 4.0.5
library(dplyr)
## Warning: package 'dplyr' was built under R version 4.0.5
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library(tidyr)
## Warning: package 'tidyr' was built under R version 4.0.5
library(comprehenr)
## Warning: package 'comprehenr' was built under R version 4.0.5
library(stringr)
library(ungeviz)
library(relayer)
## Note: The package "relayer" is highly experimental. Use at your own risk.
library(patchwork)
## Warning: package 'patchwork' was built under R version 4.0.3
```

```
base_dir <- "D:/skola/1/weighted_ensembles/tests/test_cifar_2021/data/data_tv_5000_c100/0/"
net_df <- read.csv(file.path(base_dir, "net_metrics.csv"))</pre>
ens_df_cal <- read.csv(file.path(base_dir, "ens_cal_metrics_temp.csv"))</pre>
ens_df_pwc <- read.csv(file.path(base_dir, "ens_pwc_metrics_temp.csv"))</pre>
net_long <- pivot_longer(net_df, cols=c("accuracy", "nll", "ece"),</pre>
 names_to="metric", values_to="value")
ens_cal_long <- pivot_longer(ens_df_cal, cols=c("accuracy", "nll", "ece"),</pre>
 names to="metric", values to="value")
ens_pwc_long <- pivot_longer(ens_df_pwc, cols=c("accuracy", "nll", "ece").</pre>
 names_to="metric", values_to="value")
networks <- net df$network</pre>
comb_stats_df = data.frame(matrix(ncol=14, nrow=0,
  dimnames=list(NULL, c(
    "combination_size", "combination_id",
    "acc_min", "acc_max", "acc_avg", "acc_var",
    "nll_min", "nll_max", "nll_avg", "nll_var",
    "ece_min", "ece_max", "ece_avg", "ece_var"))))
for (sss in unique(ens_df_cal$combination_size))
  for (ssi in unique(ens_df_cal %>%
                      filter(combination size == sss) %>%
                      pull(combination id)))
  {
    cur_nets_vec <- to_vec(</pre>
      for (net in networks)
      if (str_replace_all(net, "-", ".") %in% colnames(ens_cal_long) &&
          (ens_cal_long %>%
            filter(combination_size == sss & combination_id == ssi) %>%
            pull(str_replace_all(net, "-", ".")))[1] == "True")
    cur_nets <- net_df %>% filter(network %in% cur_nets_vec)
    comb_stats_df[nrow(comb_stats_df) + 1, ] = c(sss, ssi,
      min(cur_nets$accuracy), max(cur_nets$accuracy), mean(cur_nets$accuracy), var(cur_nets$accuracy),
      min(cur_nets$nll), max(cur_nets$nll), mean(cur_nets$nll), var(cur_nets$nll),
      min(cur_nets$ece), max(cur_nets$ece), mean(cur_nets$ece), var(cur_nets$ece))
 }
}
ens_df_cal <- merge(ens_df_cal, comb_stats_df)</pre>
ens_df_cal$acc_imp_avg = ens_df_cal$accuracy - ens_df_cal$acc_avg
ens_df_cal$acc_imp_max = ens_df_cal$accuracy - ens_df_cal$acc_max
ens_df_pwc <- merge(ens_df_pwc, comb_stats_df)</pre>
ens_df_pwc$acc_imp_avg = ens_df_pwc$accuracy - ens_df_pwc$acc_avg
ens_df_pwc$acc_imp_max = ens_df_pwc$accuracy - ens_df_pwc$acc_max
nets_plot <- ggplot(data=net_long) +</pre>
 geom_col(mapping=aes(x=network, y=value)) +
```

```
facet_grid(rows = vars(metric), scales="free") +
theme(axis.text.x = element_text(angle=90)) +
ggtitle("Metrics of networks")
nets_plot
```

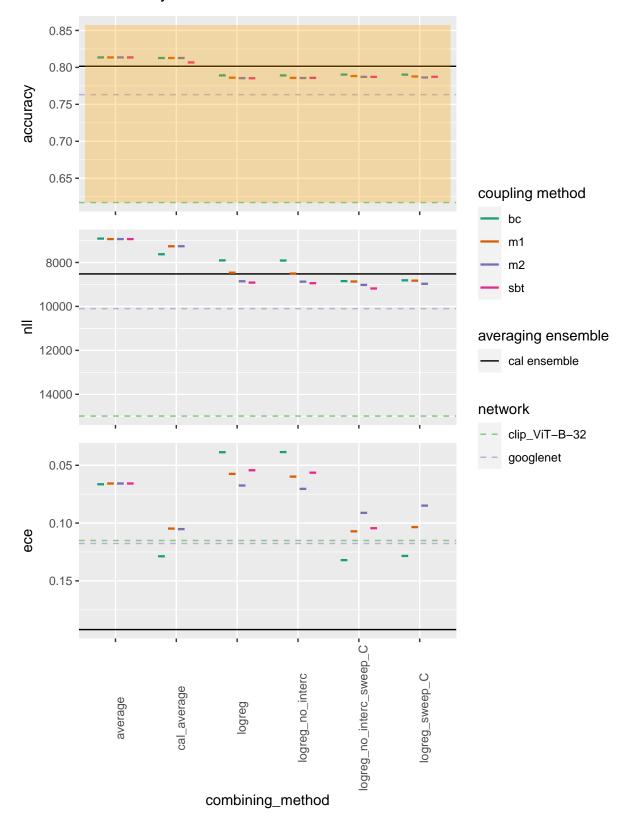
Metrics of networks

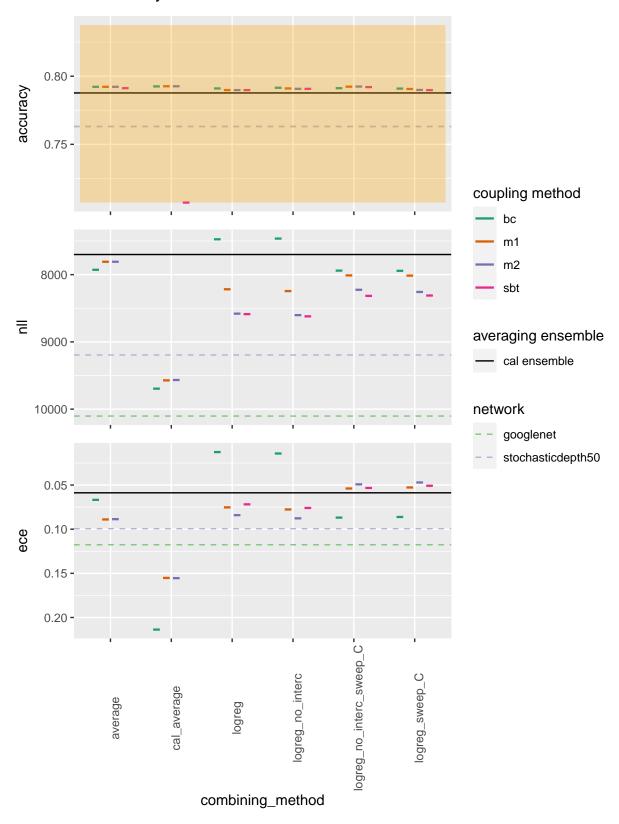


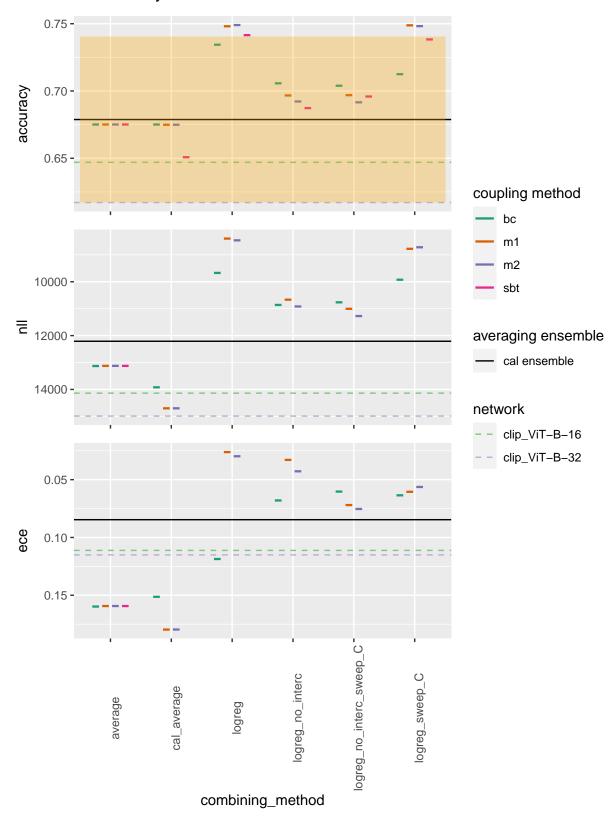
```
ens_pwc_plt_df <- ens_df_pwc %>% filter(combining_method != "lda")
ens_cal_plt_df <- ens_df_cal</pre>
for (sss in unique(ens_cal_plt_df$combination_size))
  for (ssi in unique(ens_cal_plt_df %>%
                      filter(combination_size == sss) %>%
                      pull(combination_id)))
  {
    cur_ens_cal <- ens_cal_plt_df %>% filter(combination_size == sss &
                                             combination_id == ssi)
    cur_ens_pwc <- ens_pwc_plt_df %>% filter(combination_size == sss &
                                             combination_id == ssi)
    cur_nets_vec <- to_vec(</pre>
      for (net in networks)
      if (str_replace_all(net, "-", ".") %in% colnames(cur_ens_cal) &&
            cur_ens_cal[[str_replace_all(net, "-", ".")]][1] == "True")
      net)
    cur_nets <- net_df %>% filter(network %in% cur_nets_vec)
```

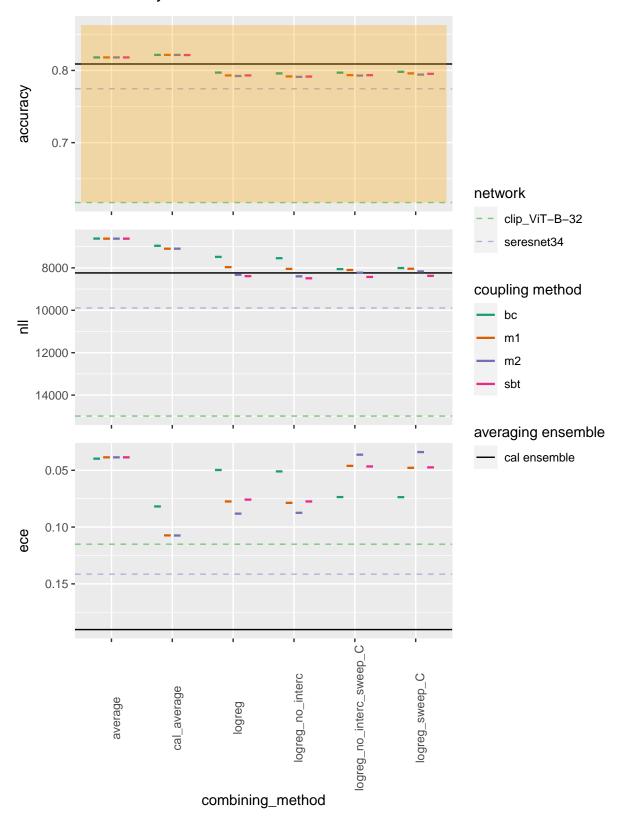
```
acc_plot <- ggplot() +</pre>
    geom_hline(
      data=cur nets,
      mapping=aes(yintercept=accuracy, colour1=network),
      linetype="dashed") %>%
    rename_geom_aes(new_aes = c("colour" = "colour1"))
  ) +
  geom_hline(
    data=cur_ens_cal,
    mapping=aes(yintercept=accuracy, color="cal ensemble")) +
    geom_hpline(
      data=cur_ens_pwc,
      mapping=aes(x=combining_method, y=accuracy,
                   colour2=coupling_method),
      size=0.8, width=0.11,
      position=position_dodge(width=0.65)) %>%
    rename_geom_aes(new_aes = c("colour" = "colour2"))
  scale colour brewer(aesthetics="colour1", palette=1,
    name="network", type="qual") +
  scale_colour_brewer(aesthetics="colour2", palette=2,
    name="coupling method", type="qual") +
  scale_color_manual(values=c("black"), name="averaging ensemble") +
  theme(
    axis.text.x = element_blank(),
    axis.title.x = element_blank())
y_limits <- layer_scales(acc_plot)$y$get_limits()</pre>
x_limits <- layer_scales(acc_plot)$x$get_limits()</pre>
all_y_lim <- c(y_limits[1], cur_ens_cal$all_cor)</pre>
acc_plot <- acc_plot +</pre>
  geom_rect(
    data=cur_ens_cal,
    mapping=aes(
      xmin=0.5,
      xmax=length(x_limits) + 0.5,
      ymin=max(all_cor, y_limits[1]), ymax=all_cor + err_incons),
      fill="orange",
      alpha=0.3, color=NA)
if (all_y_lim[1] < all_y_lim[2])</pre>
{
  acc_plot <- acc_plot +</pre>
    geom_rect(
      data=cur_ens_cal,
      mapping=aes(
        xmin=0.5,
        xmax = length(x_limits) + 0.5,
        ymin=all_y_lim[1], ymax=all_y_lim[2]), fill="green",
        alpha=0.3, color=NA)
```

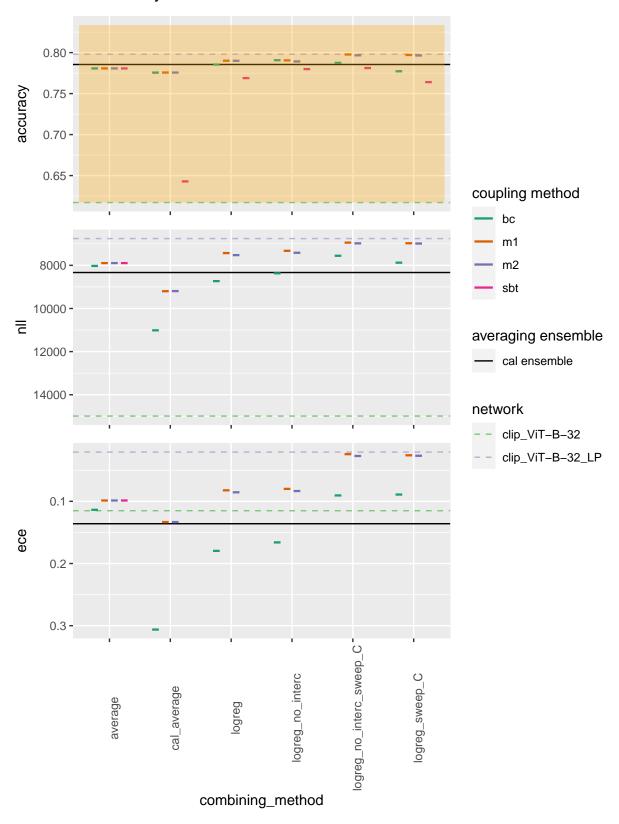
```
}
nll_plot <- ggplot() +</pre>
    geom_hline(
      data=cur_nets,
      mapping=aes(yintercept=nll, colour1=network),
      linetype="dashed") %>%
    rename_geom_aes(new_aes = c("colour" = "colour1"))
  geom_hline(
   data=cur_ens_cal,
    mapping=aes(yintercept=nll, color="cal ensemble")) +
    geom_hpline(
      data=cur_ens_pwc,
      mapping=aes(x=combining_method, y=nll,
                  colour2=coupling_method),
      size=0.8, width=0.11,
      position=position_dodge(width=0.65)) %>%
    rename_geom_aes(new_aes = c("colour" = "colour2"))
  scale_colour_brewer(aesthetics="colour1", palette=1,
    name="network", type="qual") +
  scale colour brewer(aesthetics="colour2", palette=2,
   name="coupling method", type="qual") +
  scale_color_manual(values=c("black"), name="averaging ensemble") +
  scale_y_reverse() +
  theme(
    axis.text.x = element_blank(),
    axis.title.x = element_blank())
ece_plot <- ggplot() +</pre>
    geom_hline(
      data=cur_nets,
      mapping=aes(yintercept=ece, colour1=network),
      linetype="dashed") %>%
    rename_geom_aes(new_aes = c("colour" = "colour1"))
  ) +
  geom_hline(
   data=cur_ens_cal,
    mapping=aes(yintercept=ece, color="cal ensemble")) +
    geom_hpline(
      data=cur_ens_pwc,
      mapping=aes(x=combining_method, y=ece,
                  colour2=coupling_method),
      size=0.8, width=0.11,
      position=position_dodge(width=0.65)) %>%
    rename_geom_aes(new_aes = c("colour" = "colour2"))
  ) +
  scale_colour_brewer(aesthetics="colour1", palette=1,
```

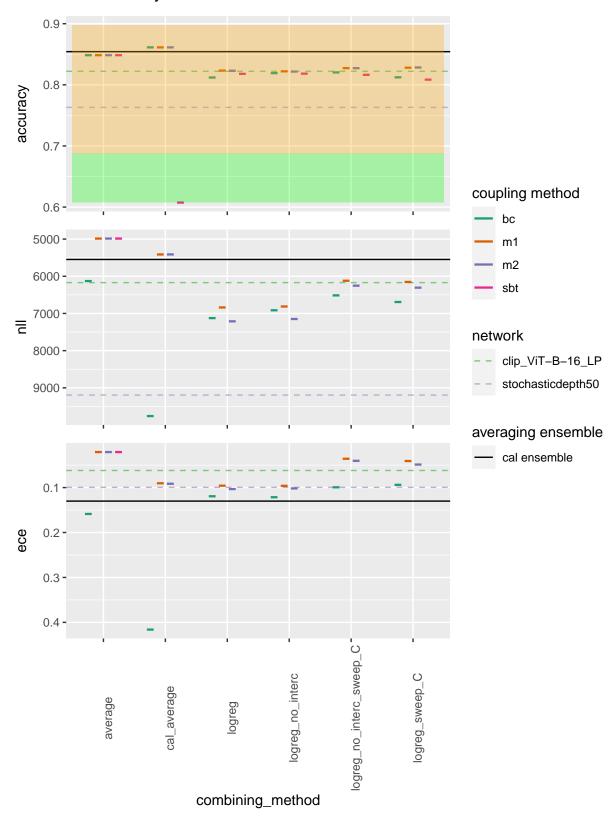


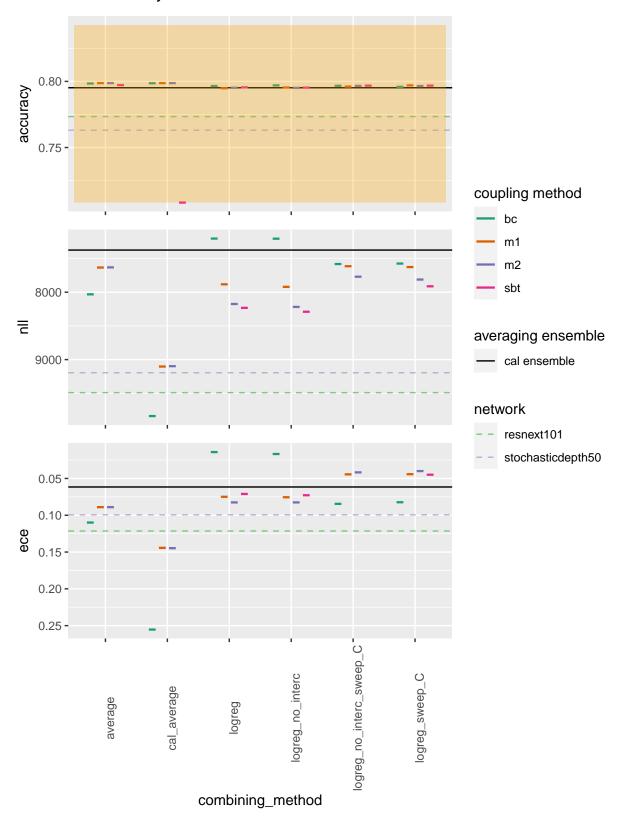


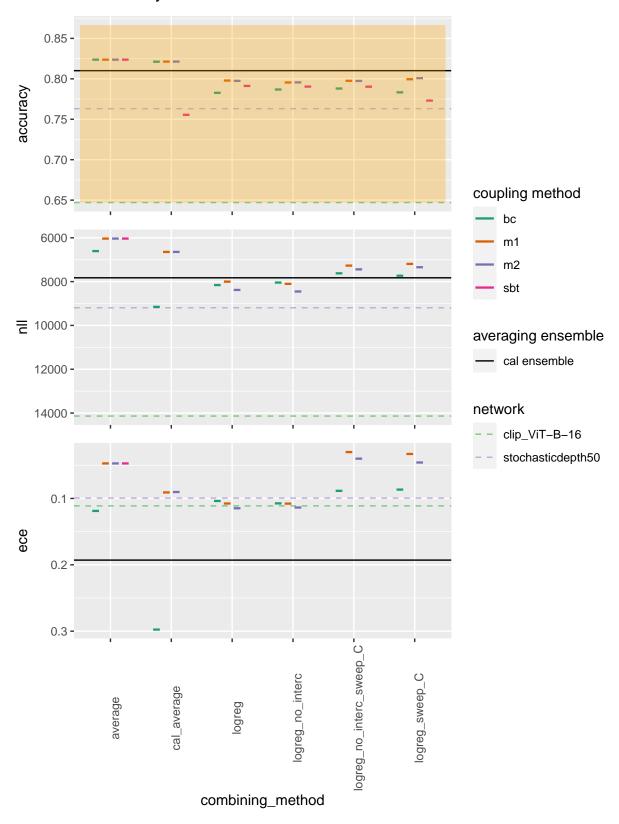


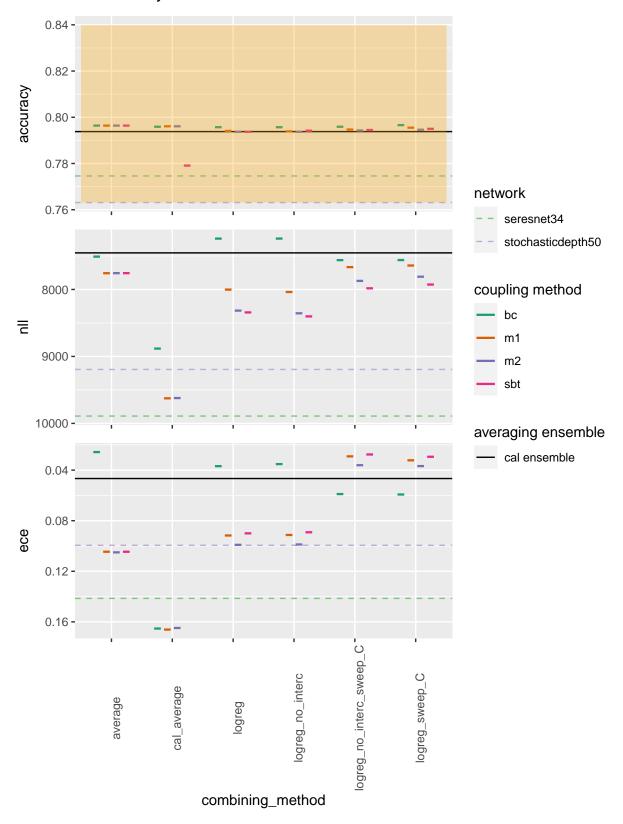


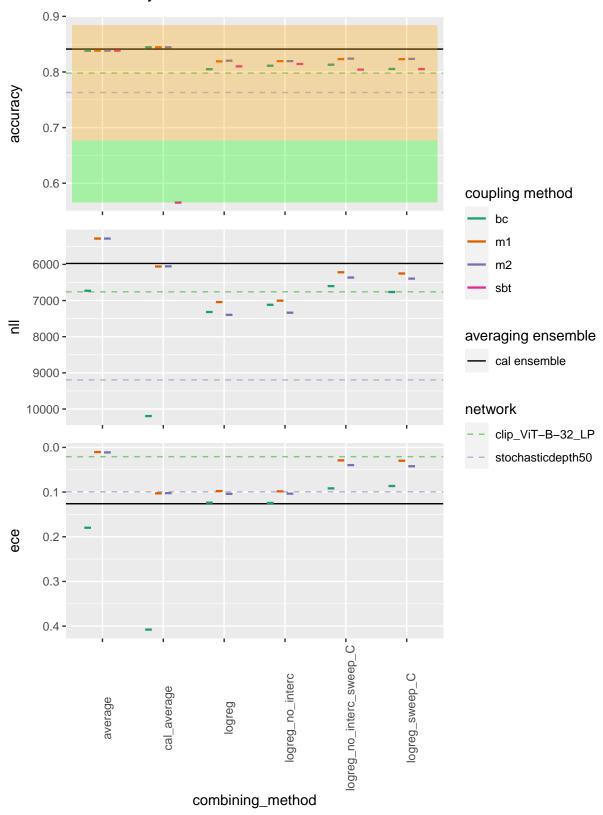


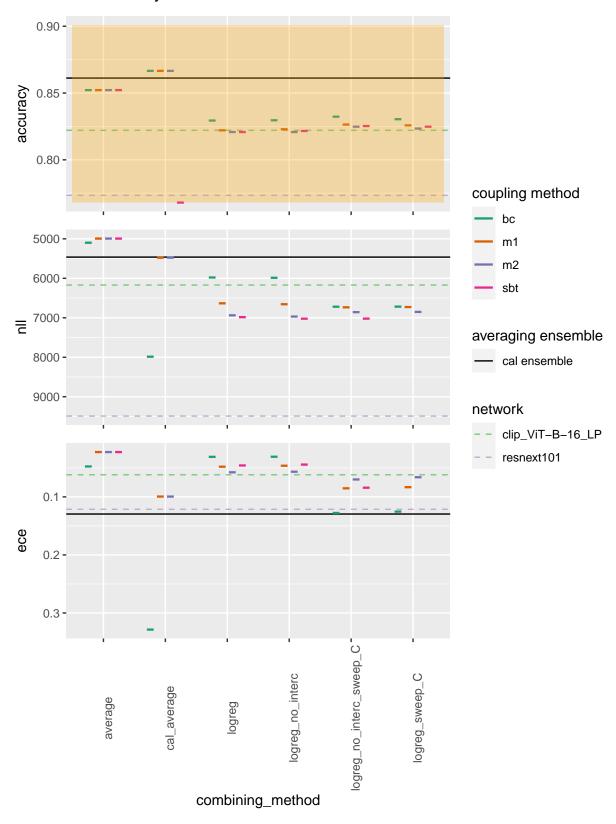


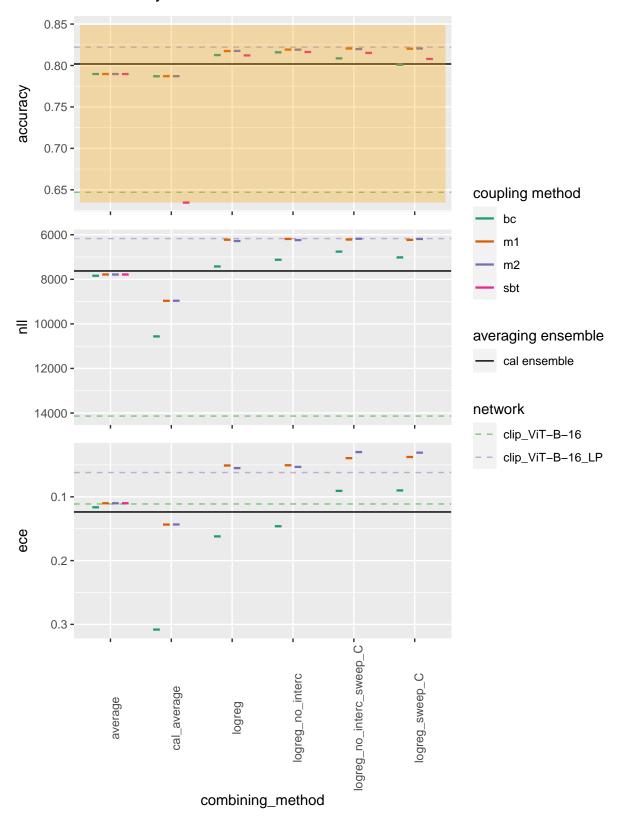


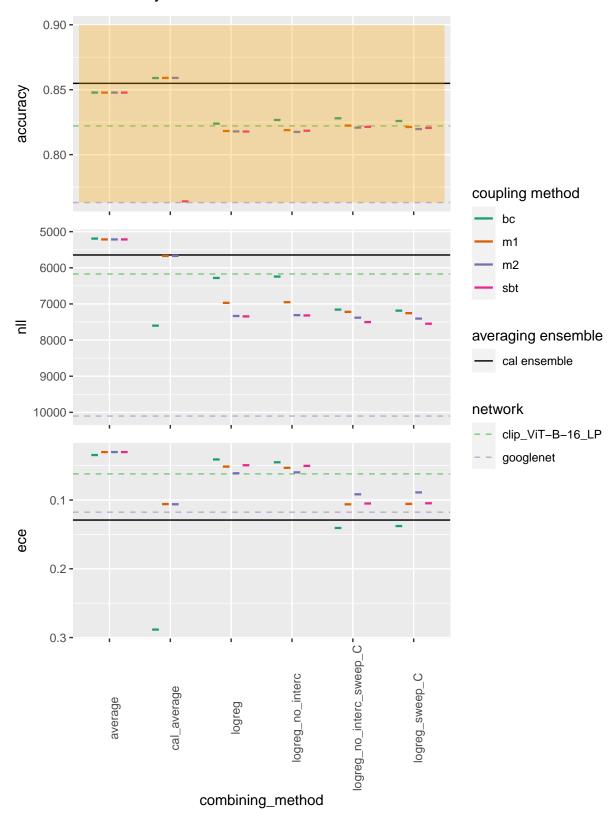


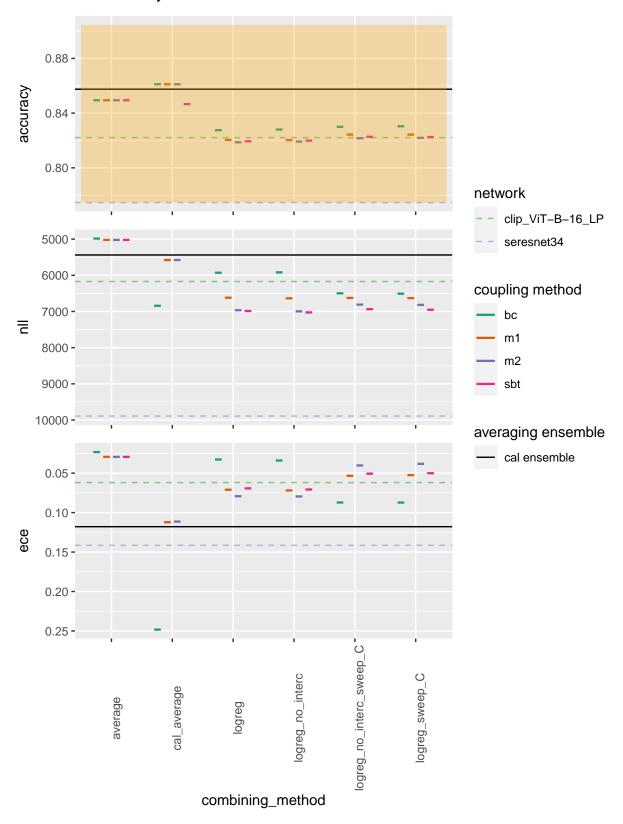


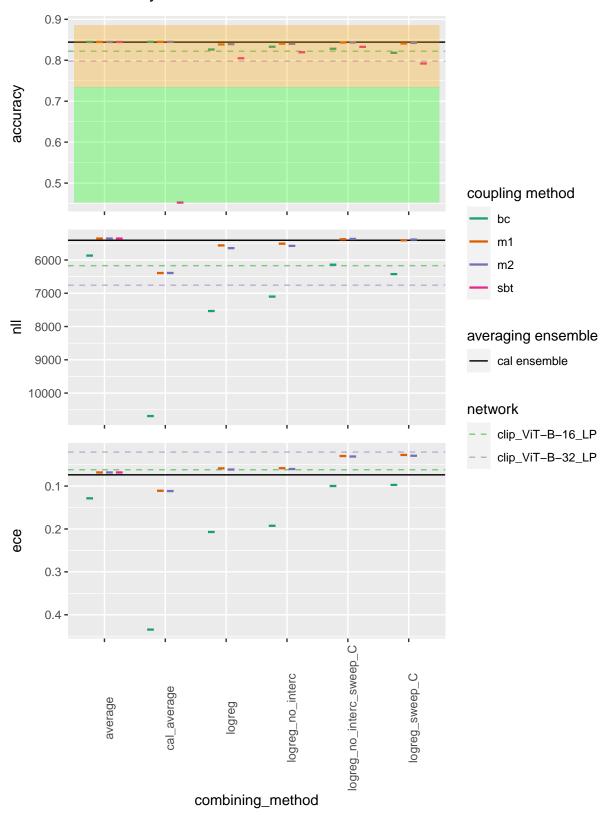


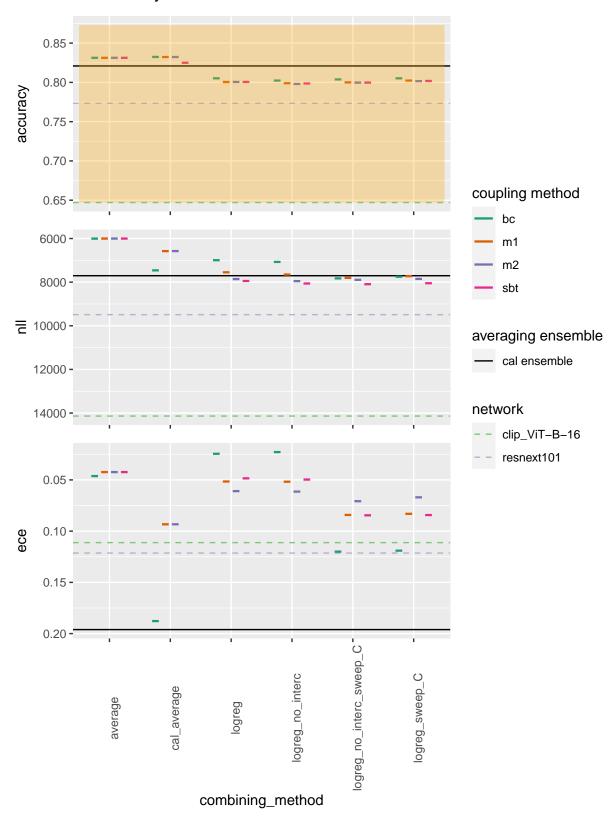


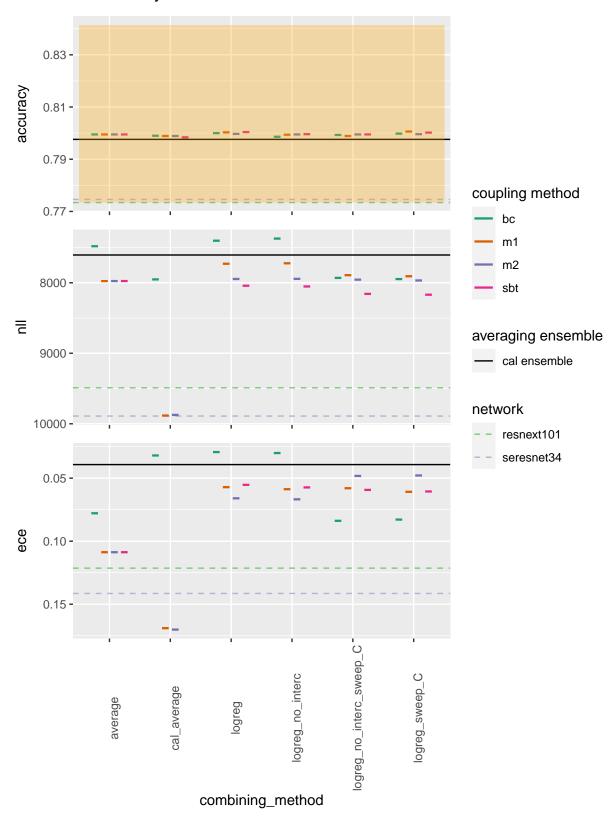


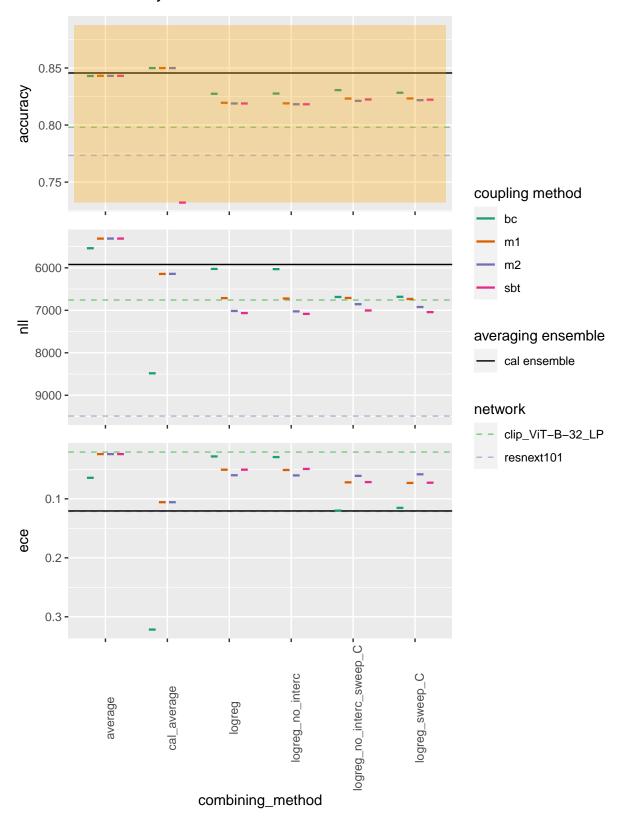


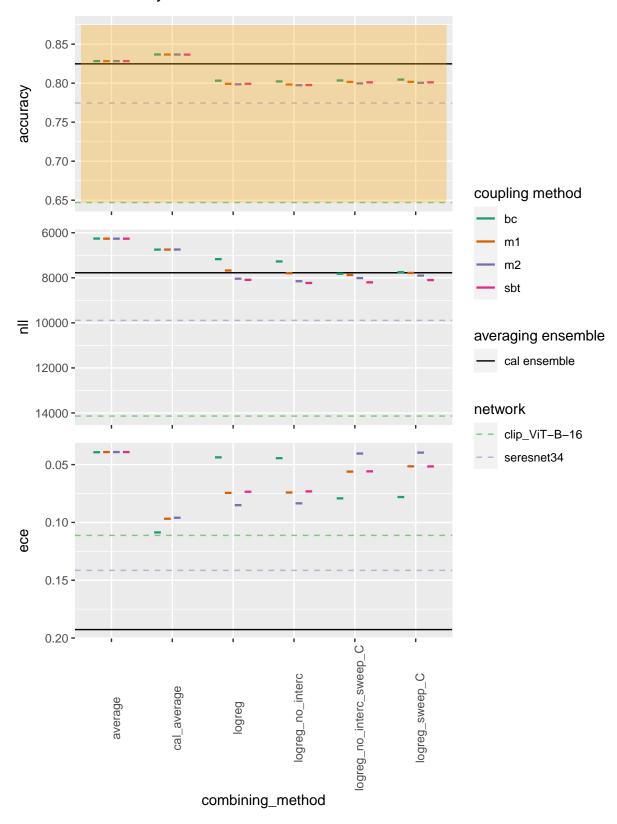


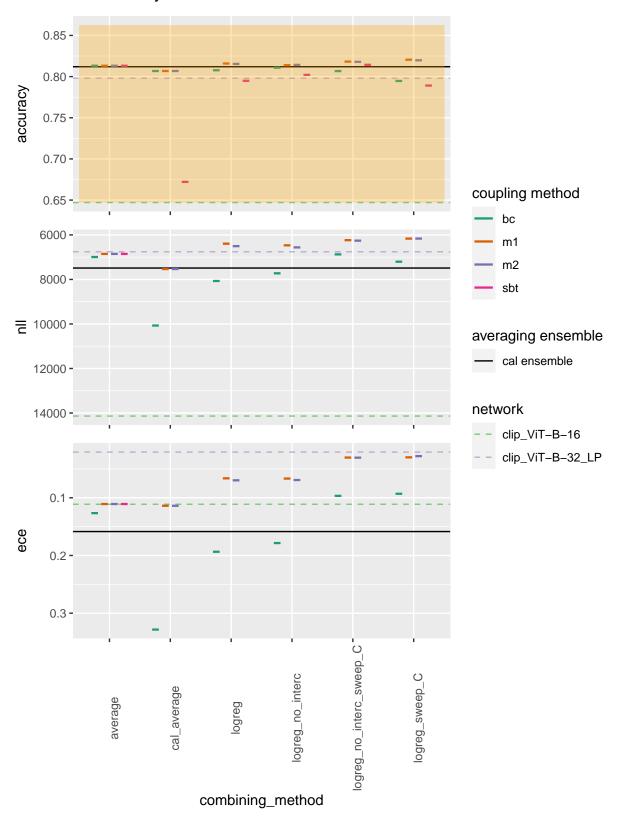


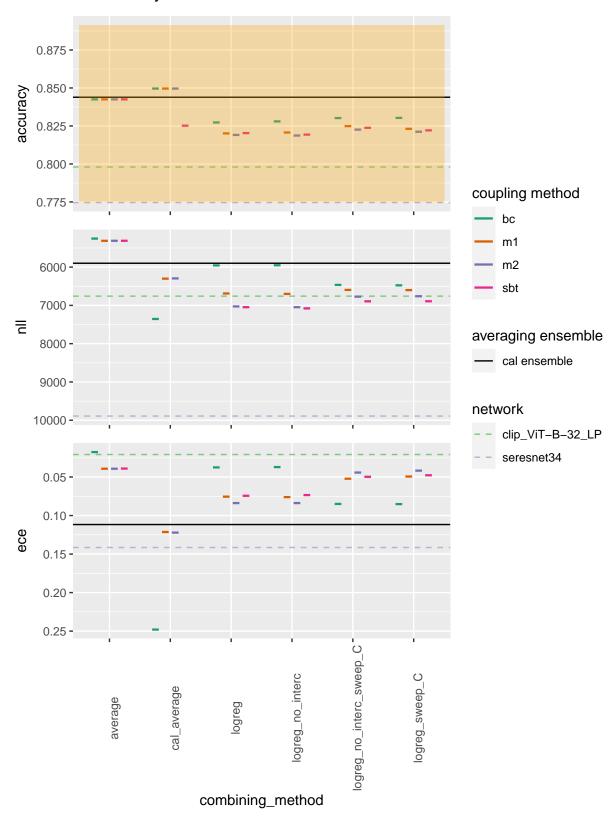


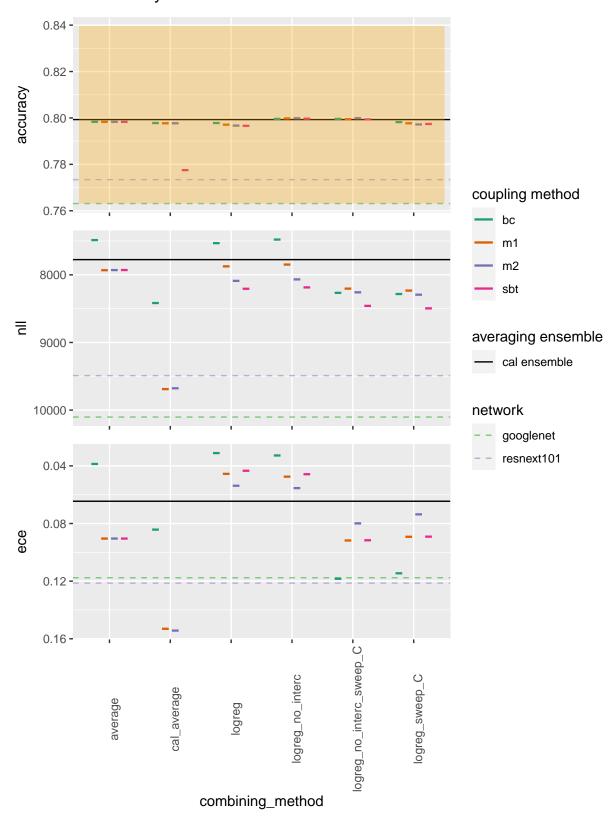


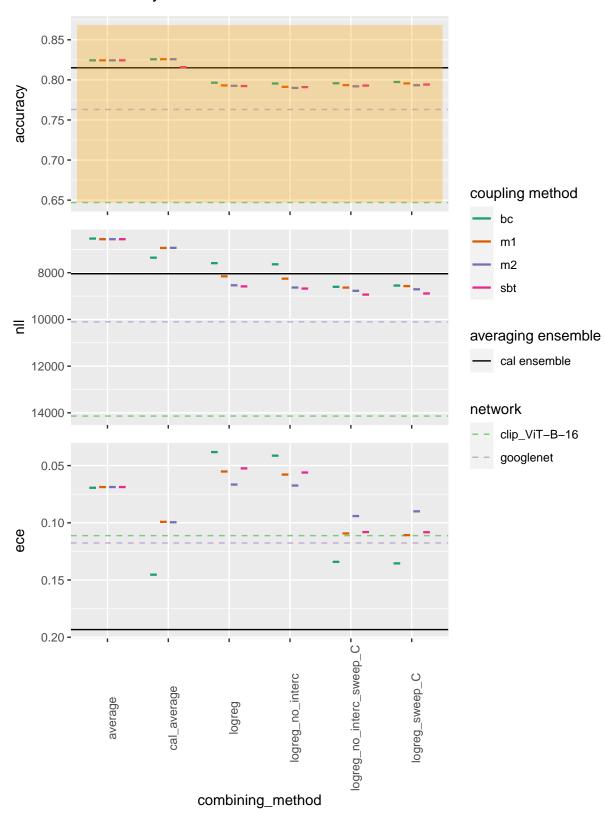


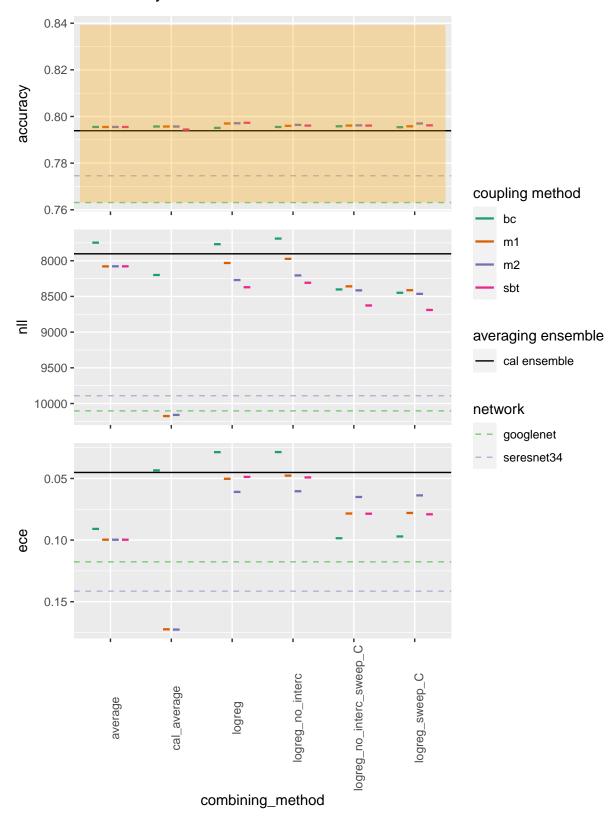


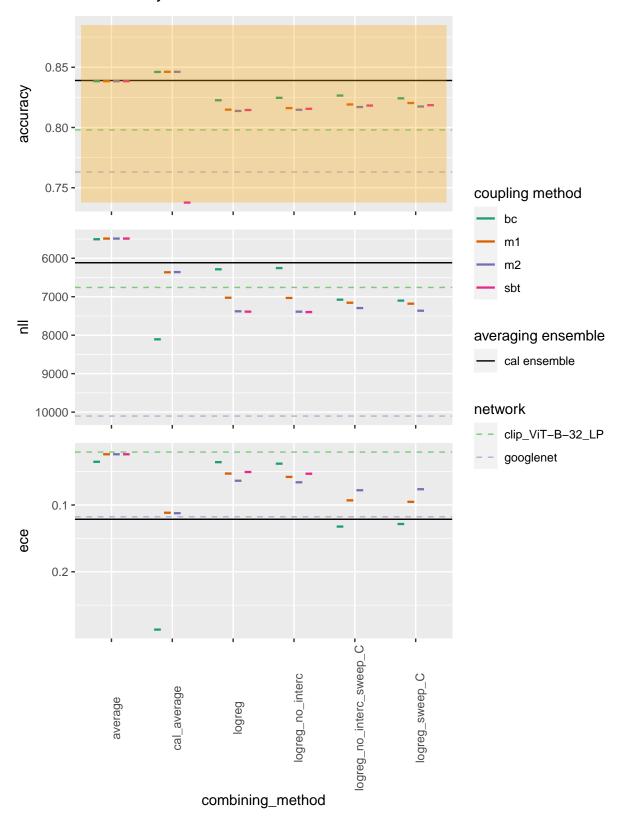


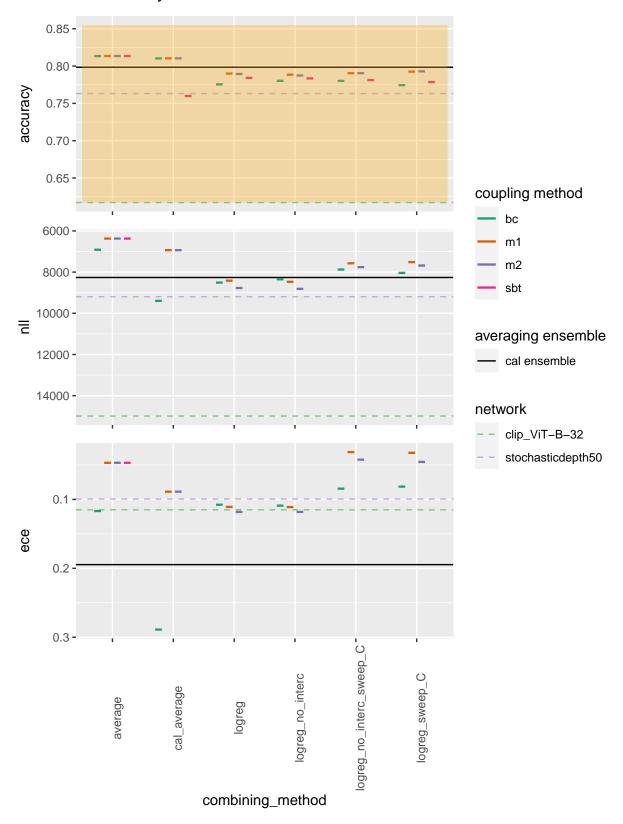


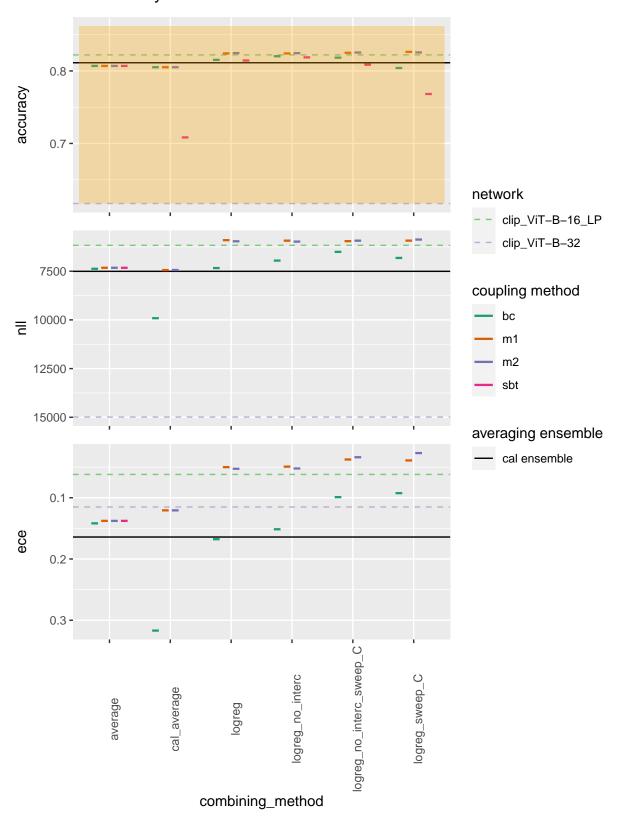


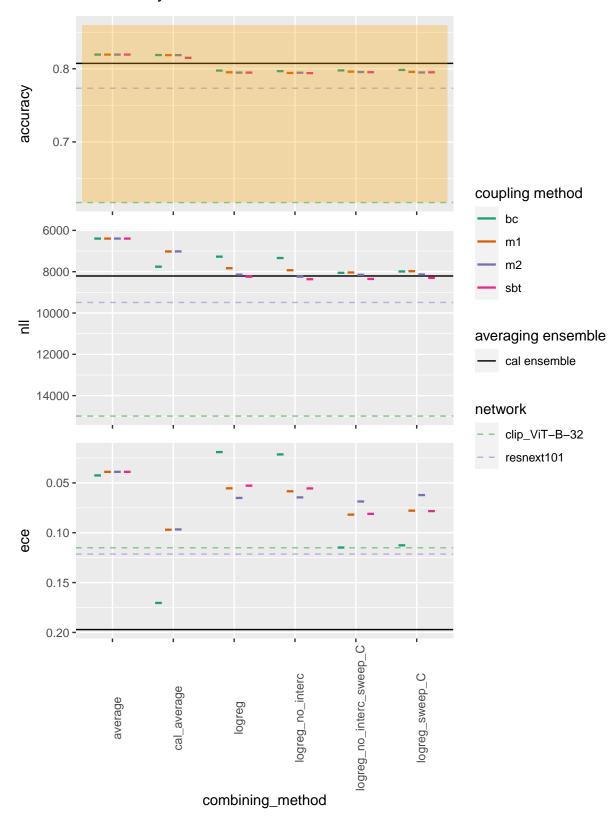


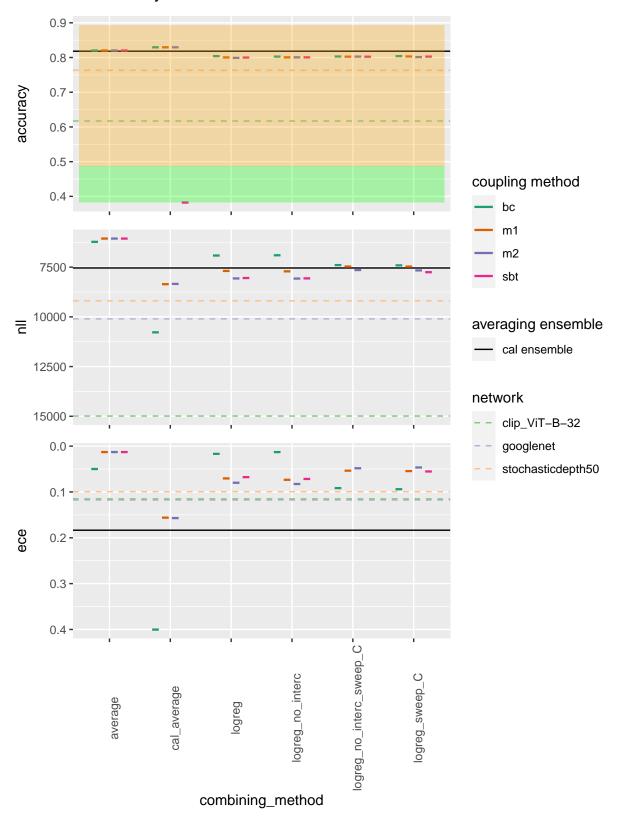


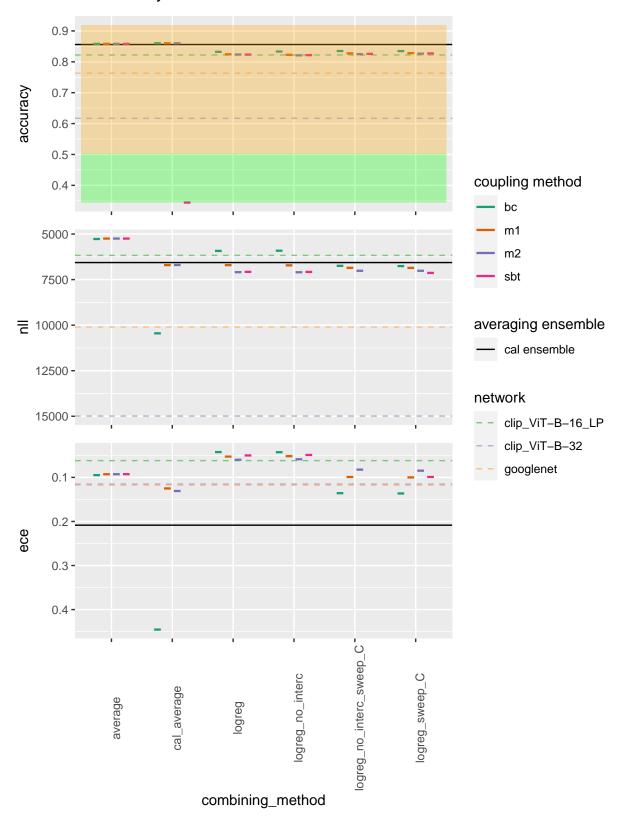


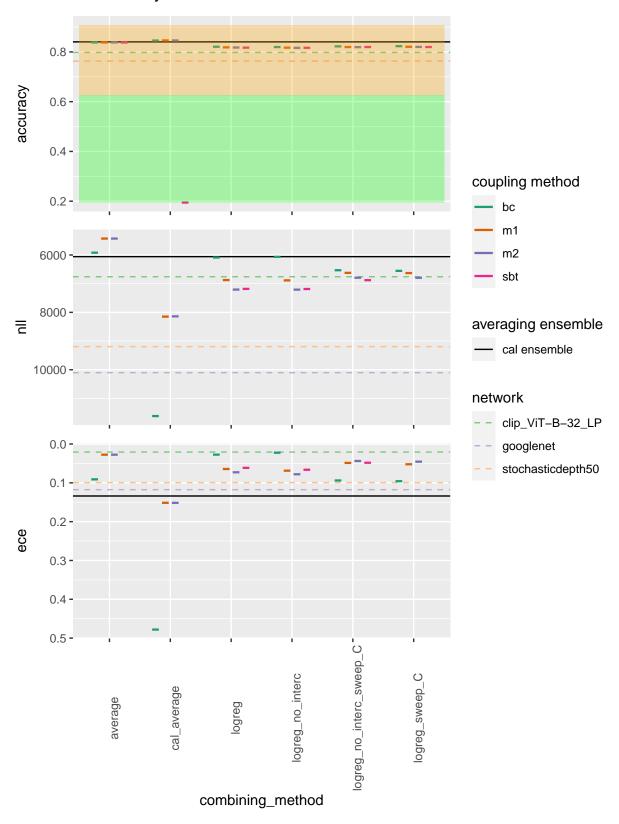


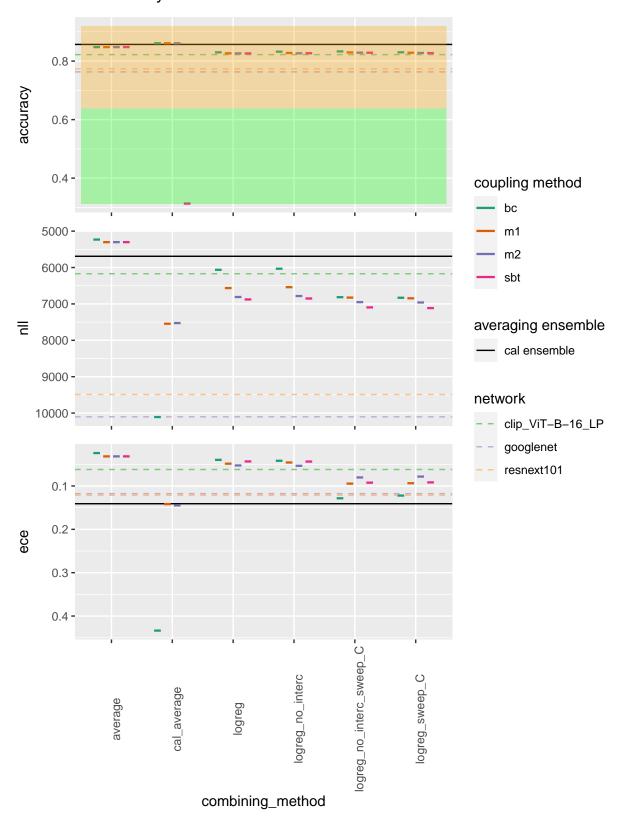


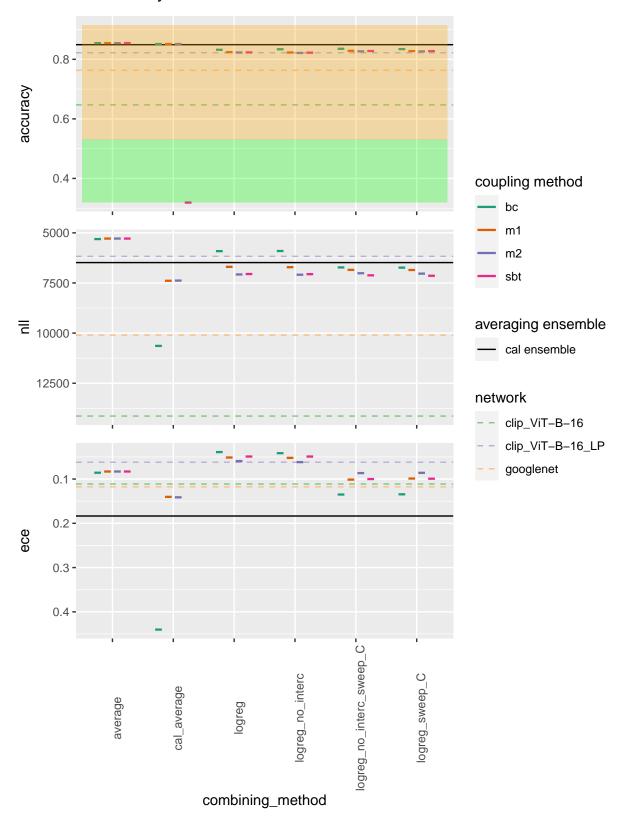


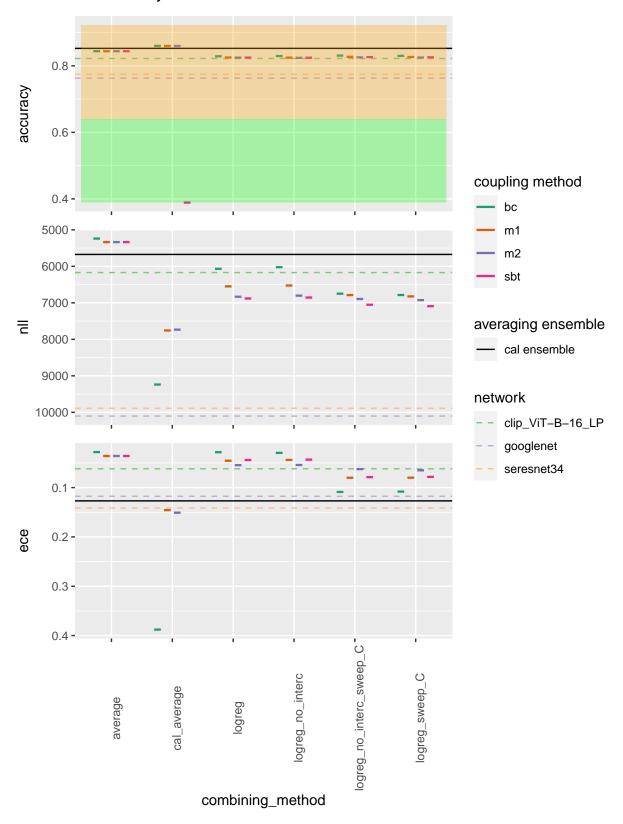


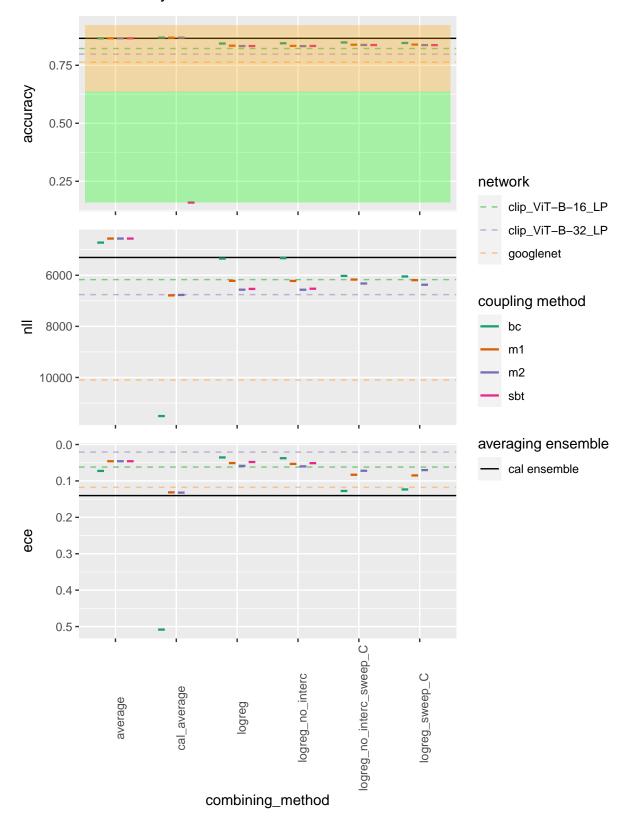


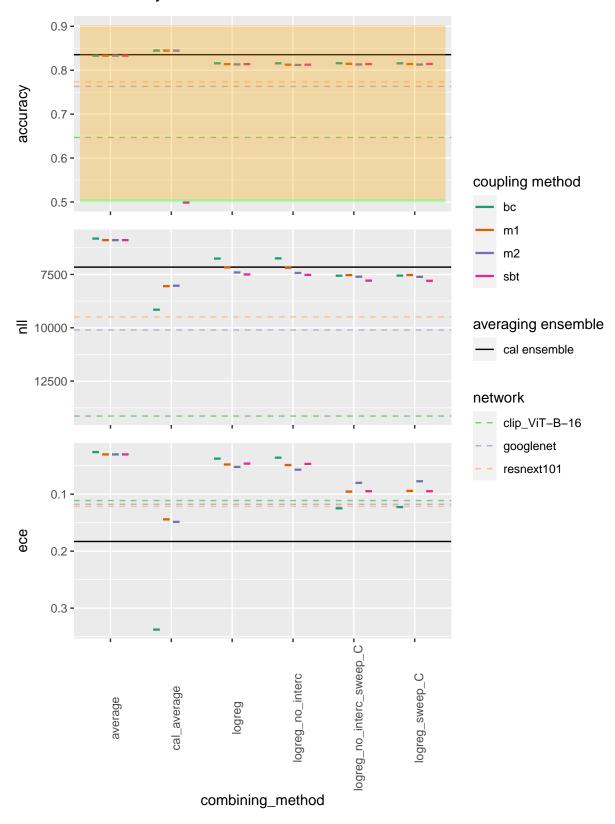


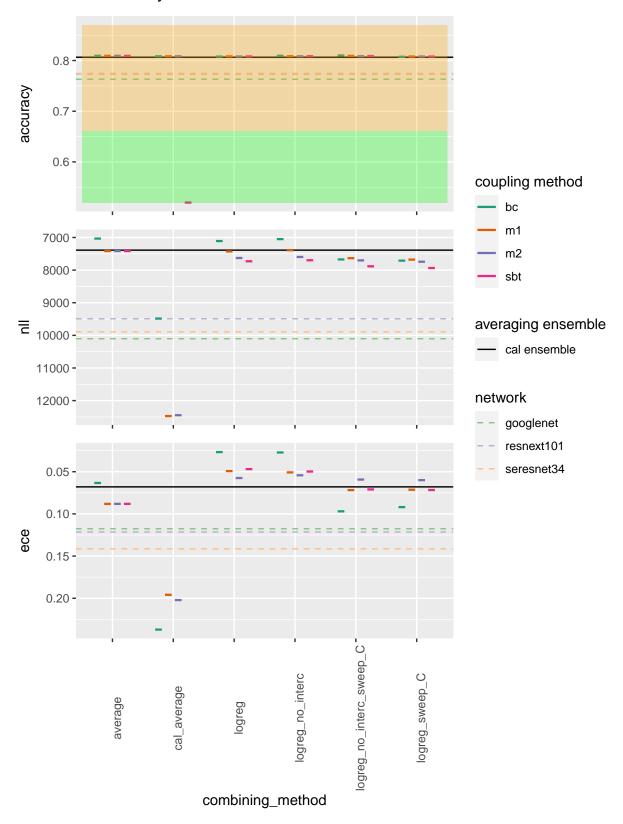


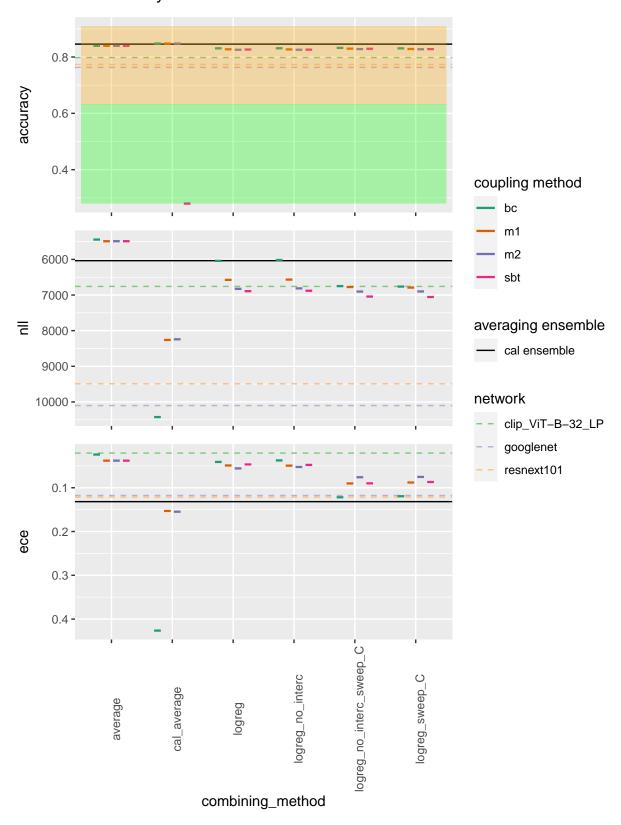


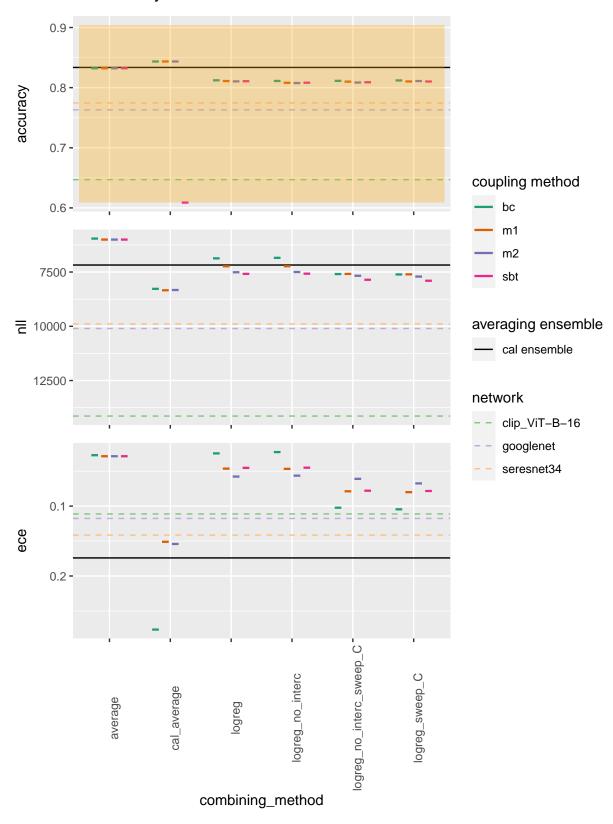


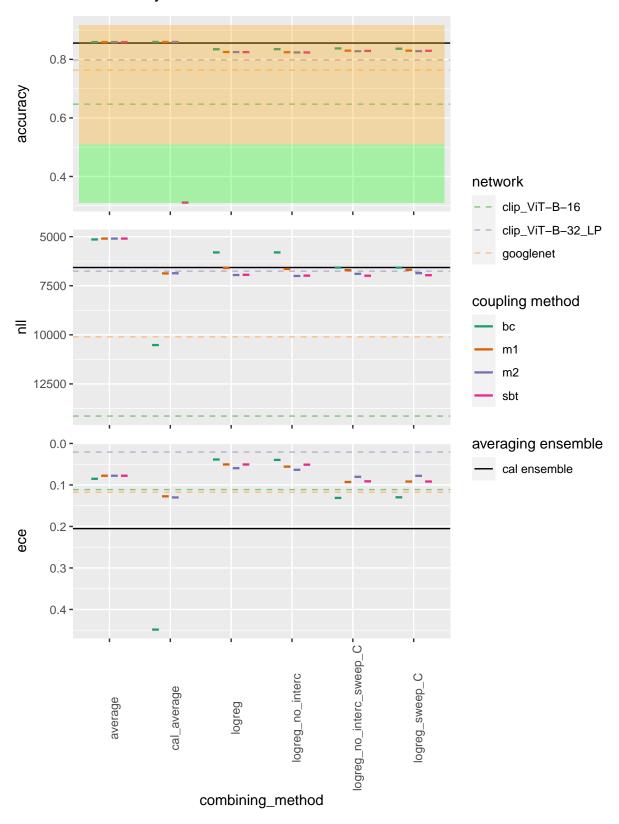


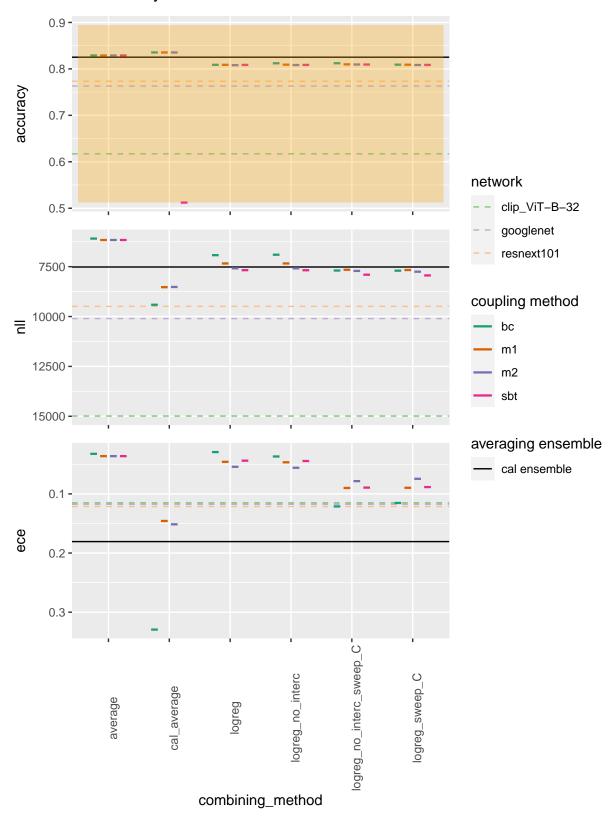


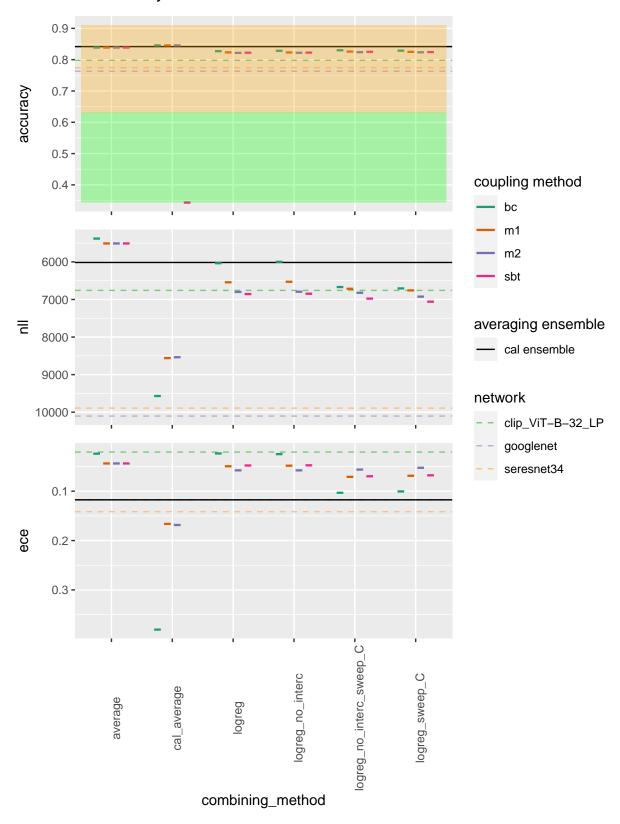


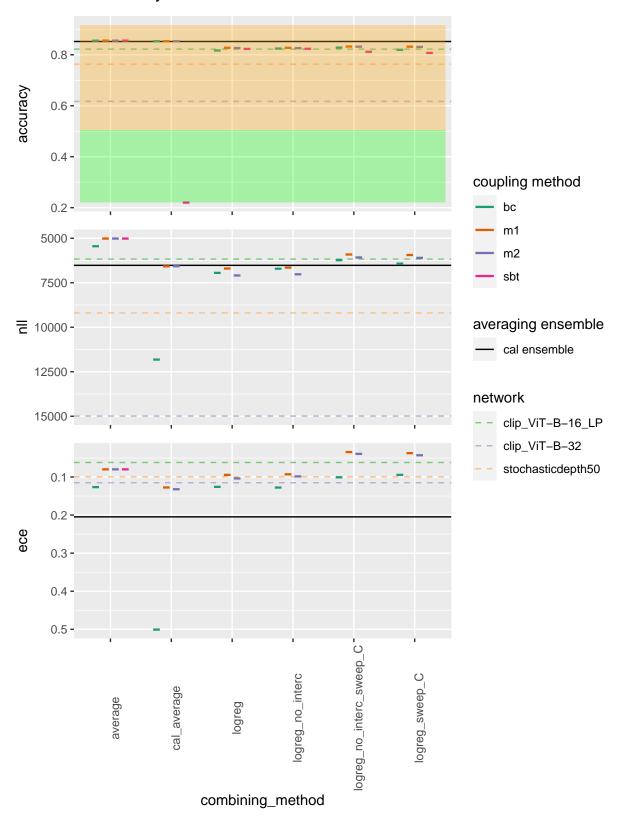


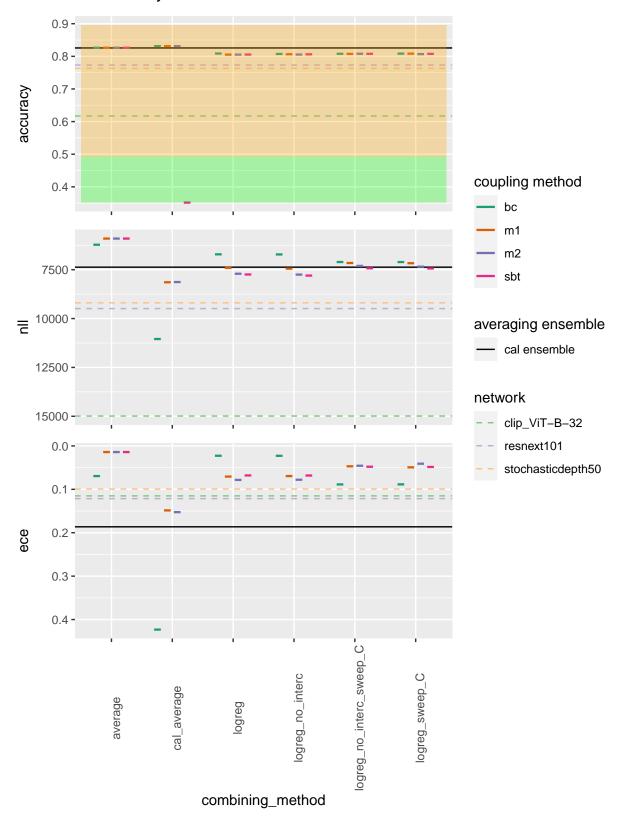


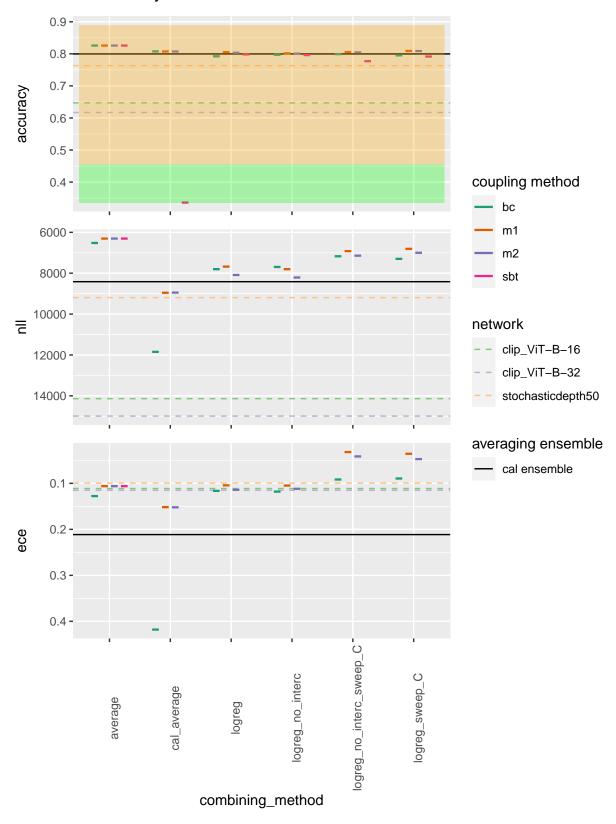


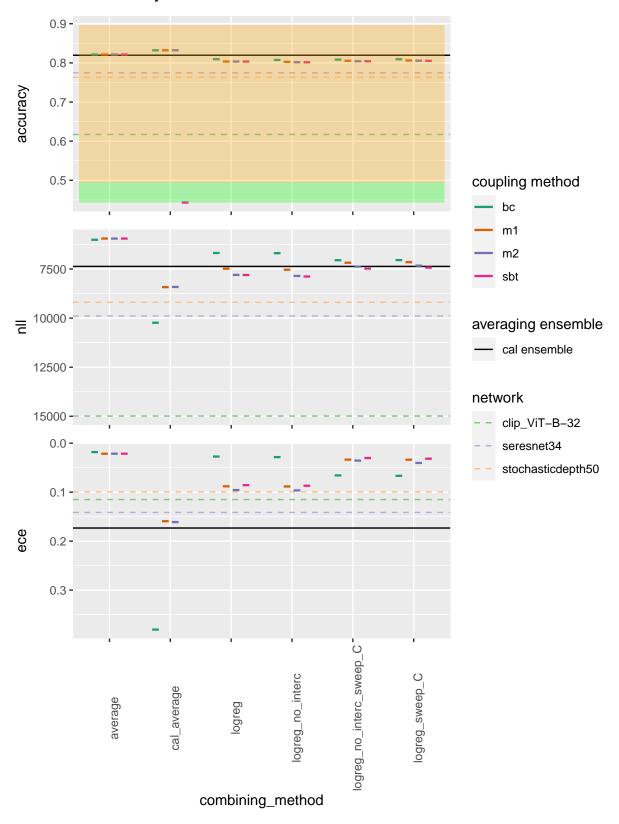


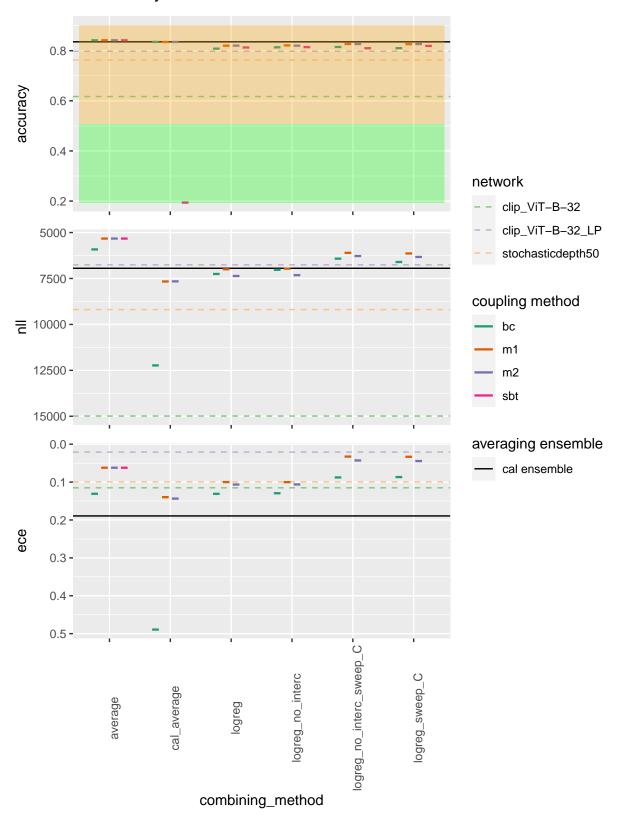


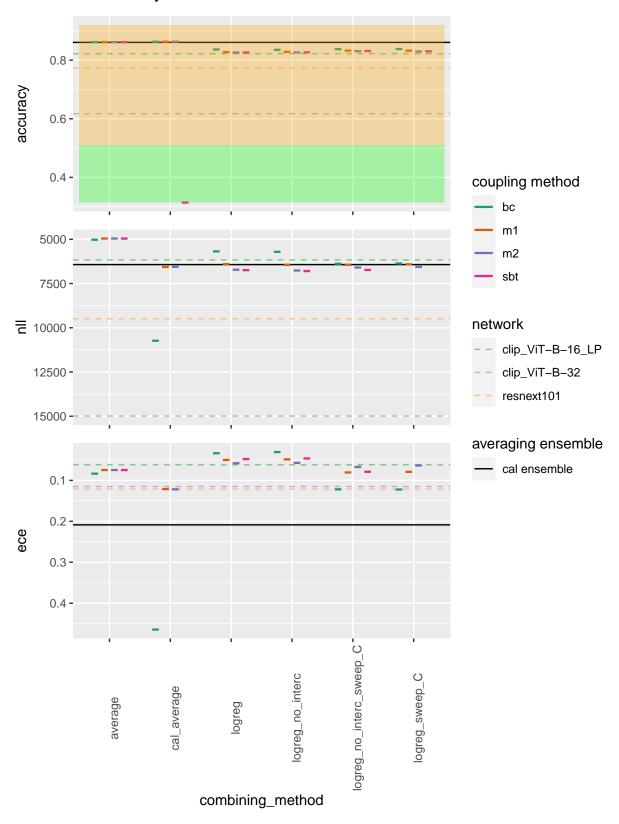


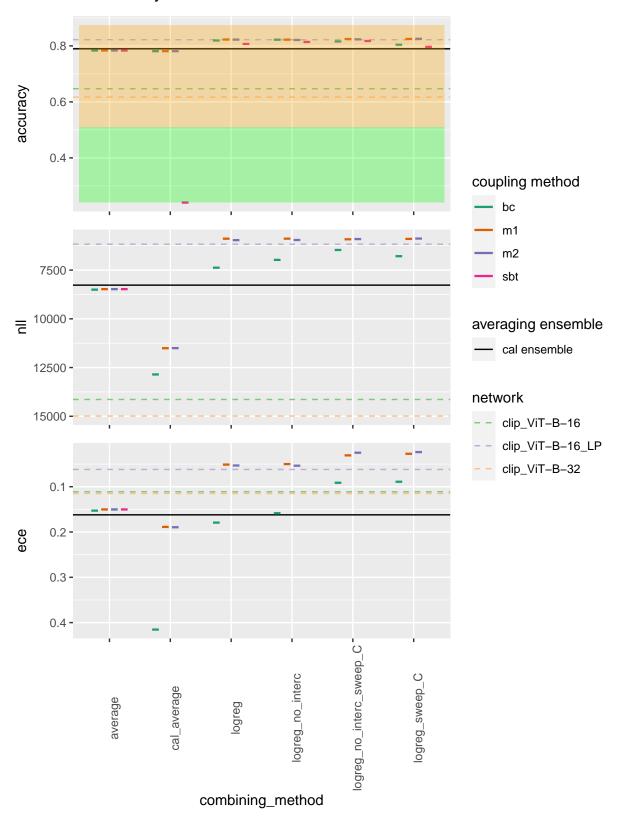


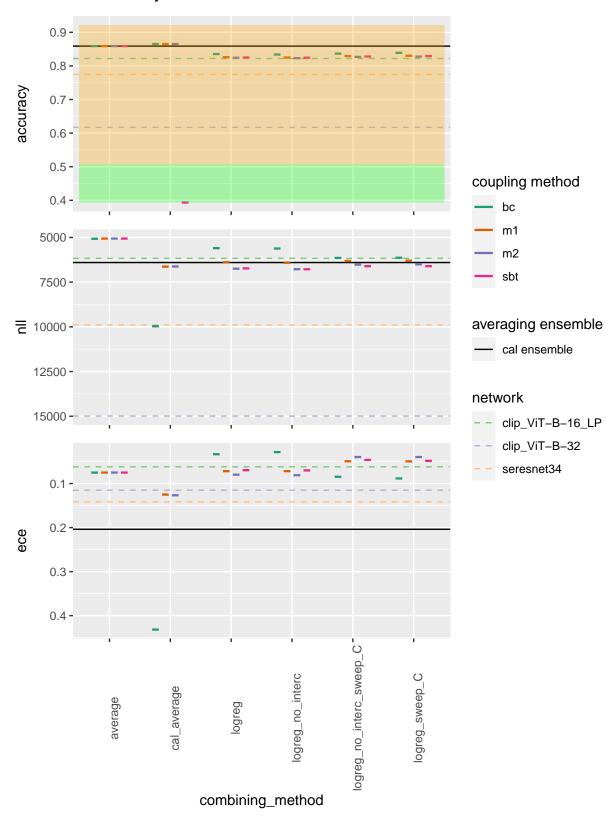


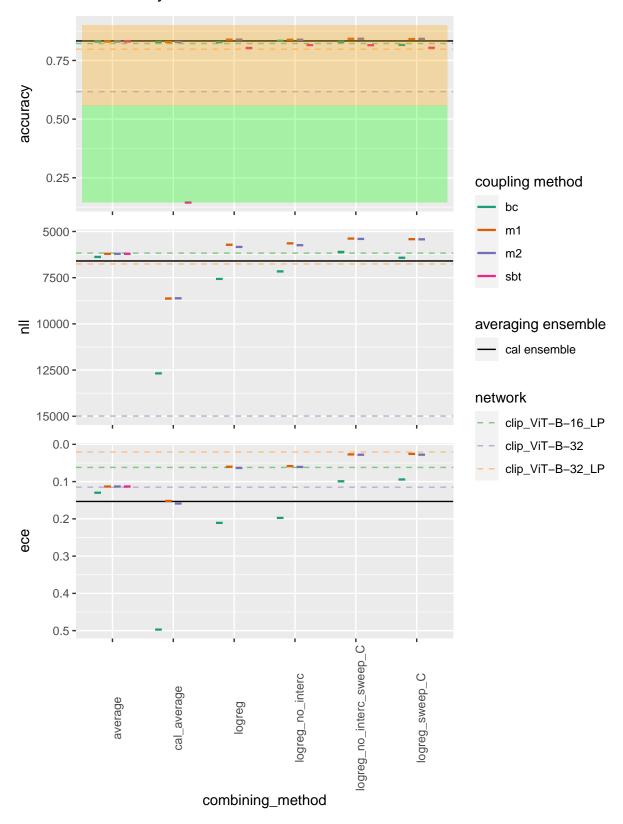


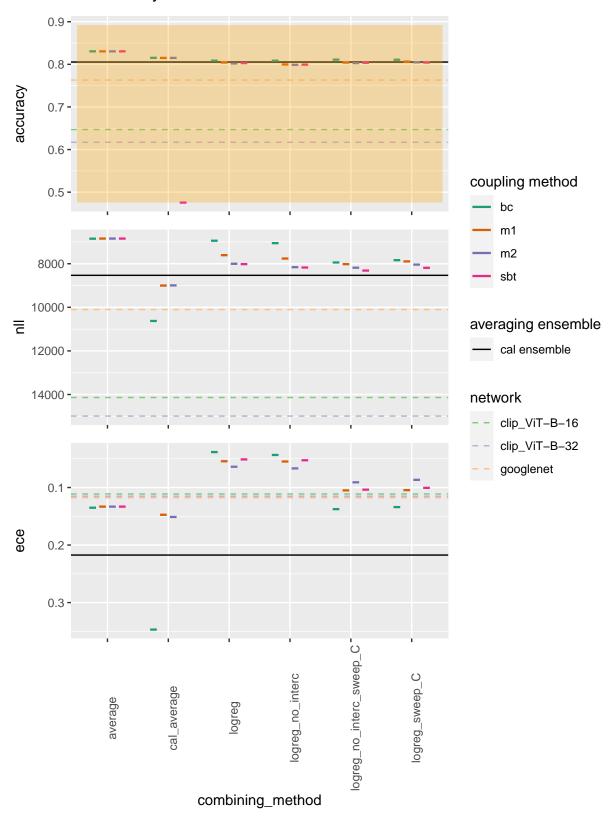


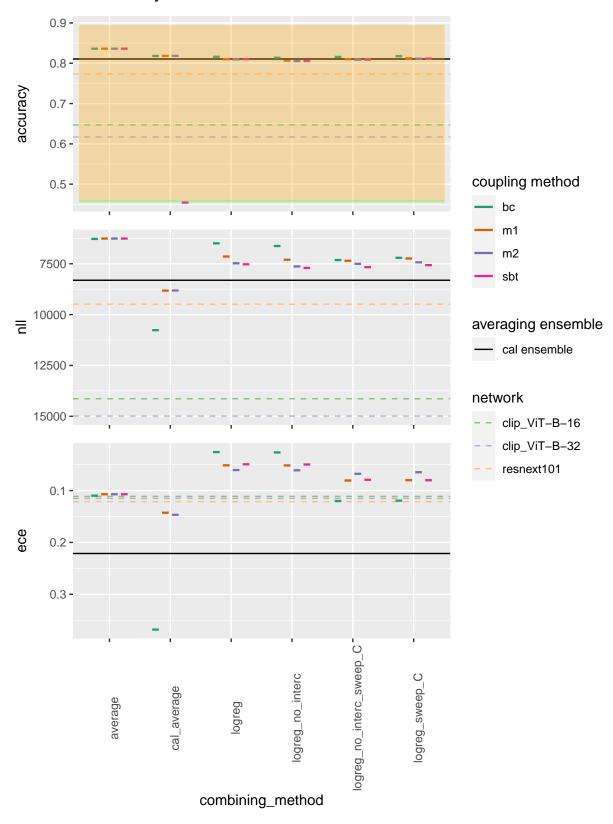


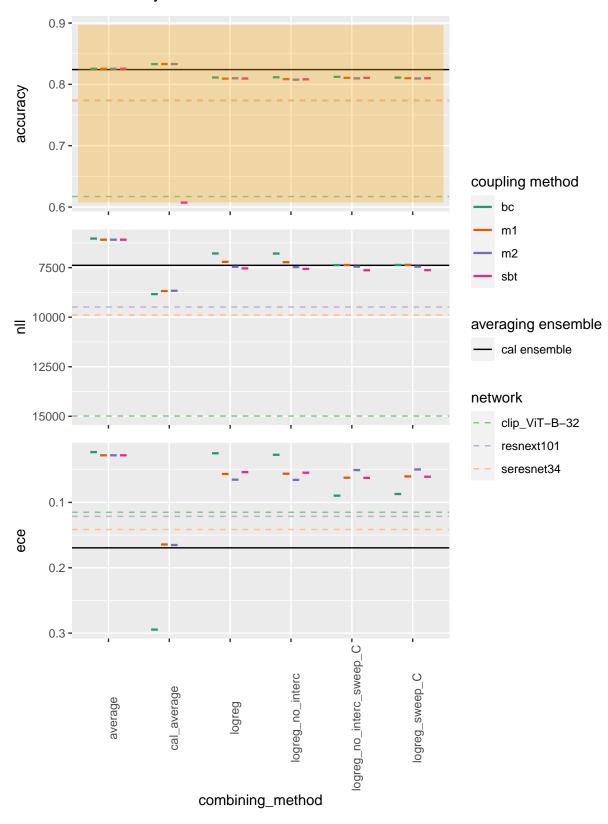


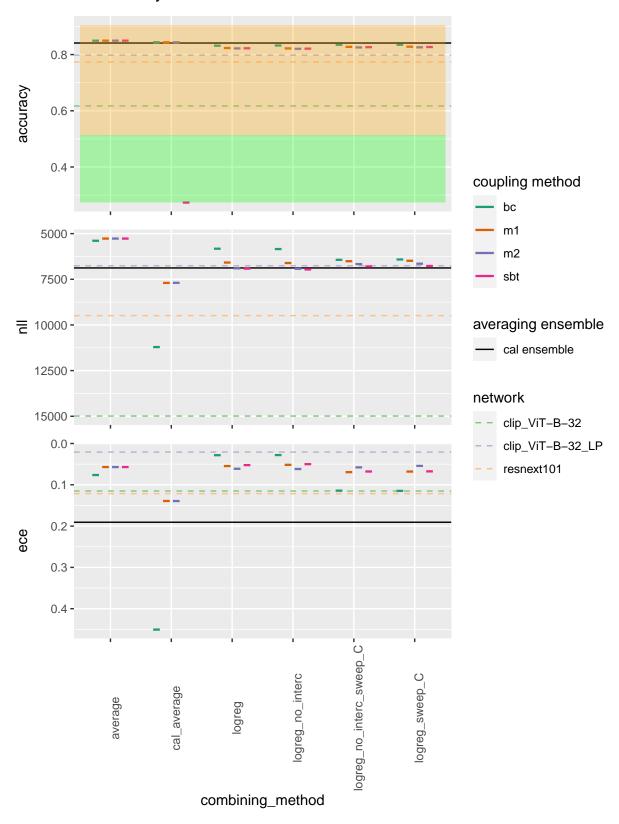


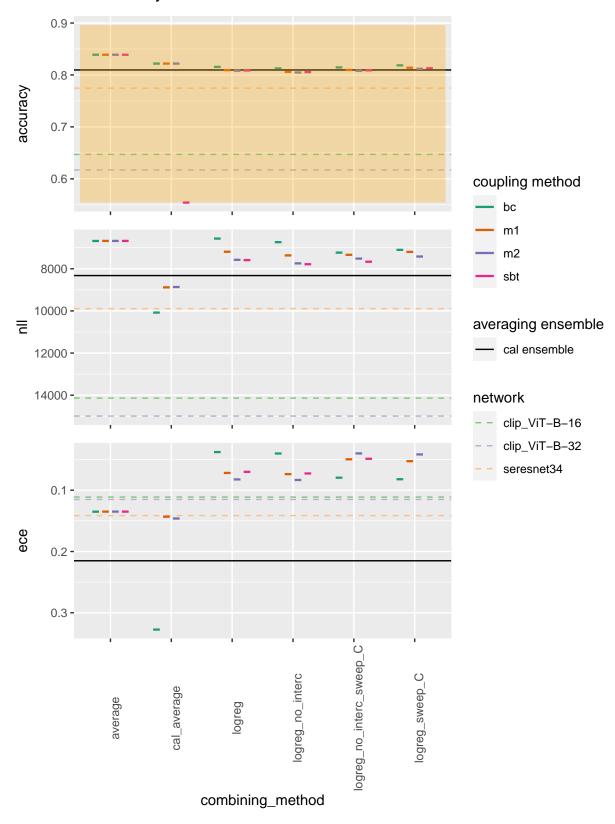


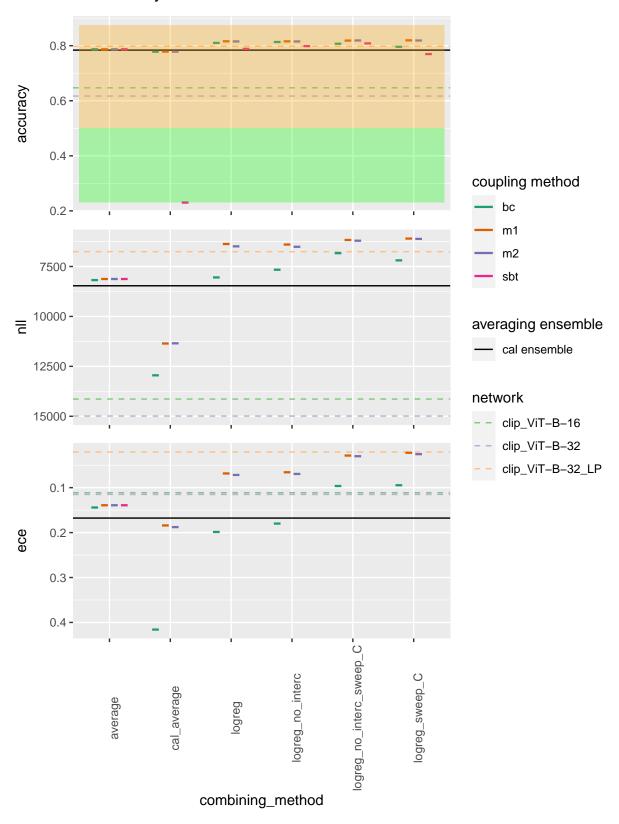


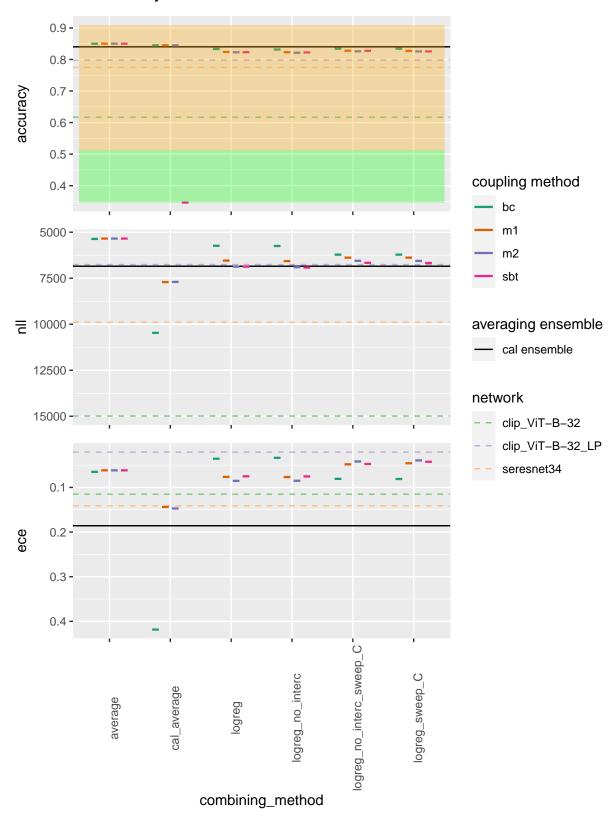


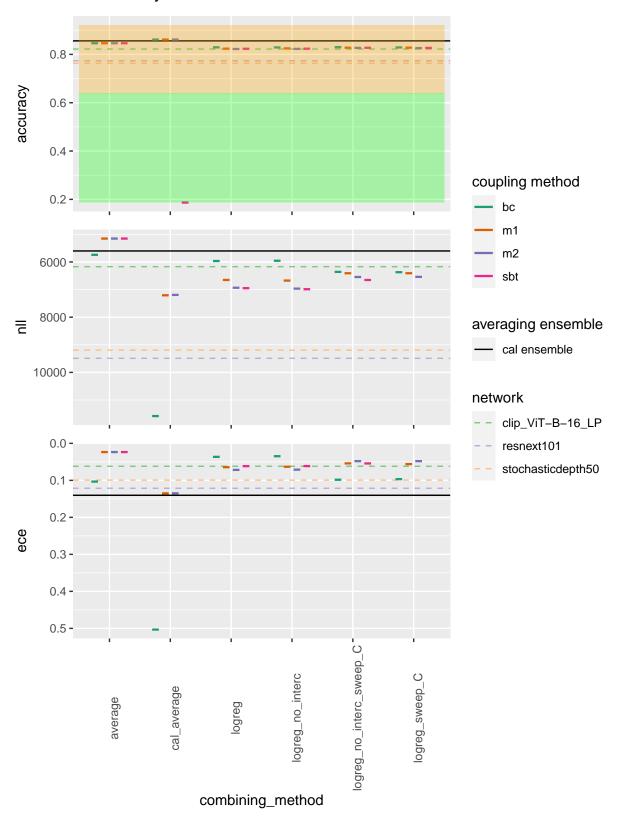


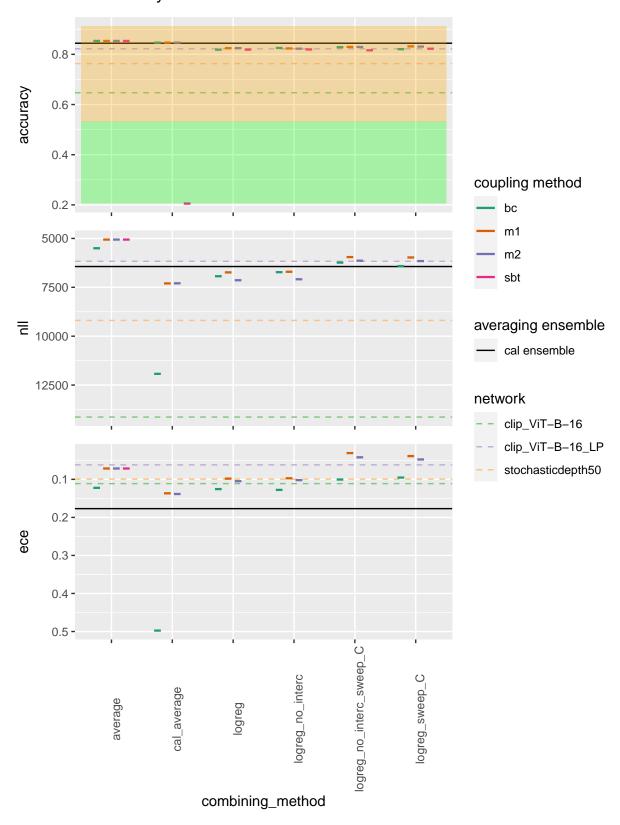


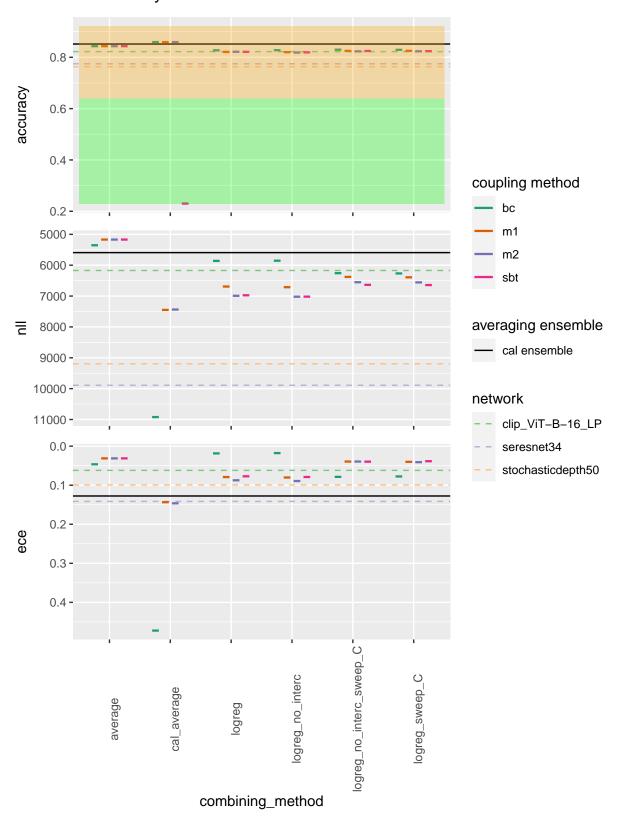


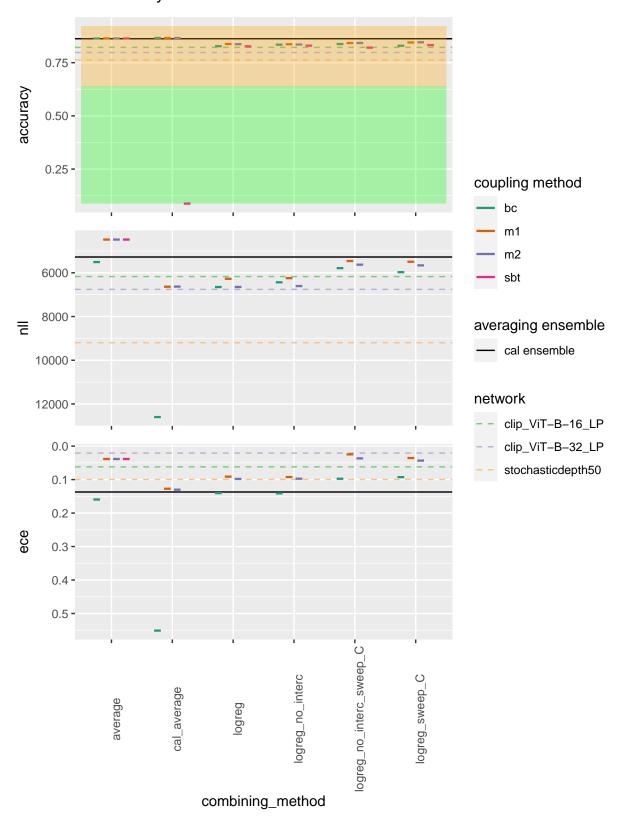


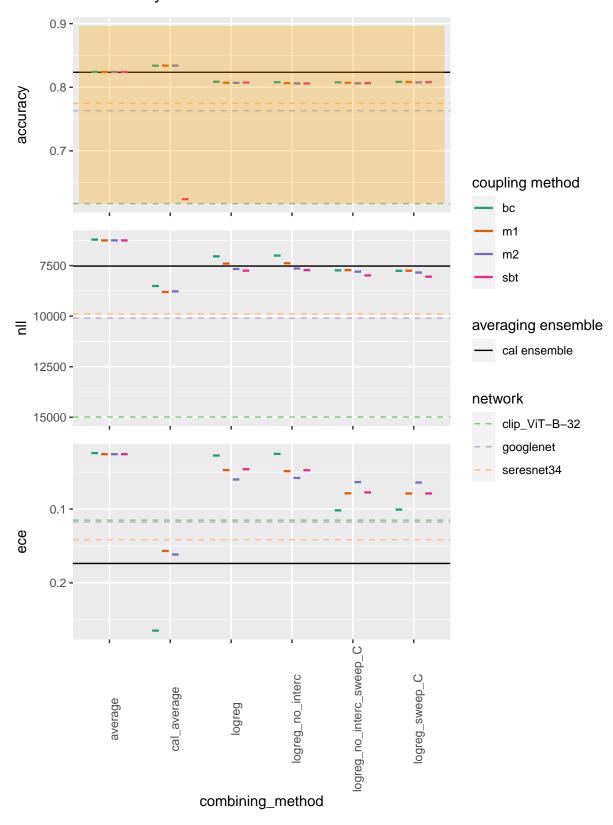


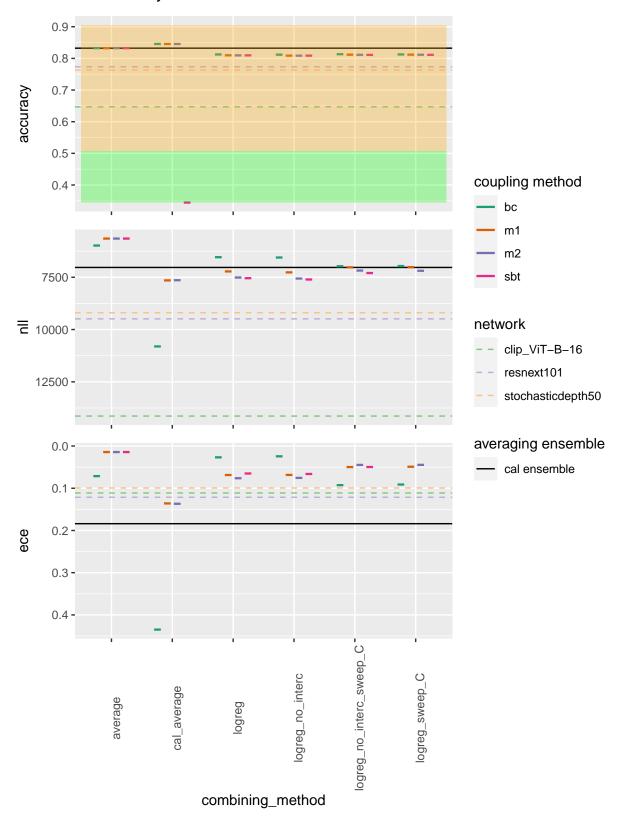


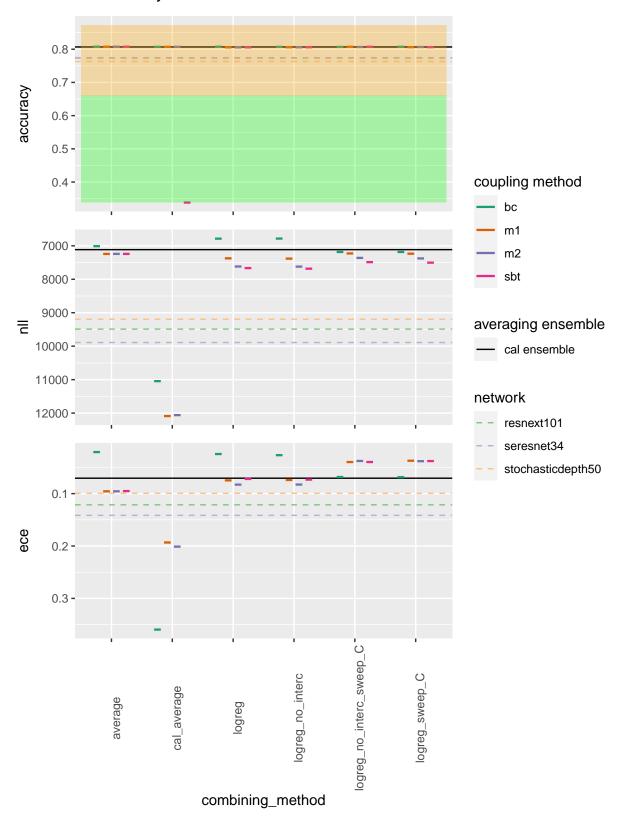


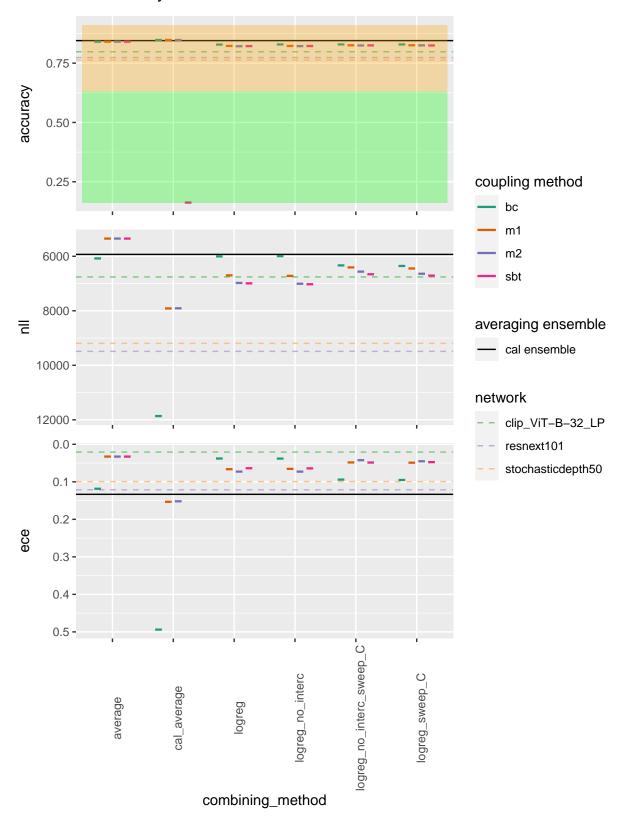


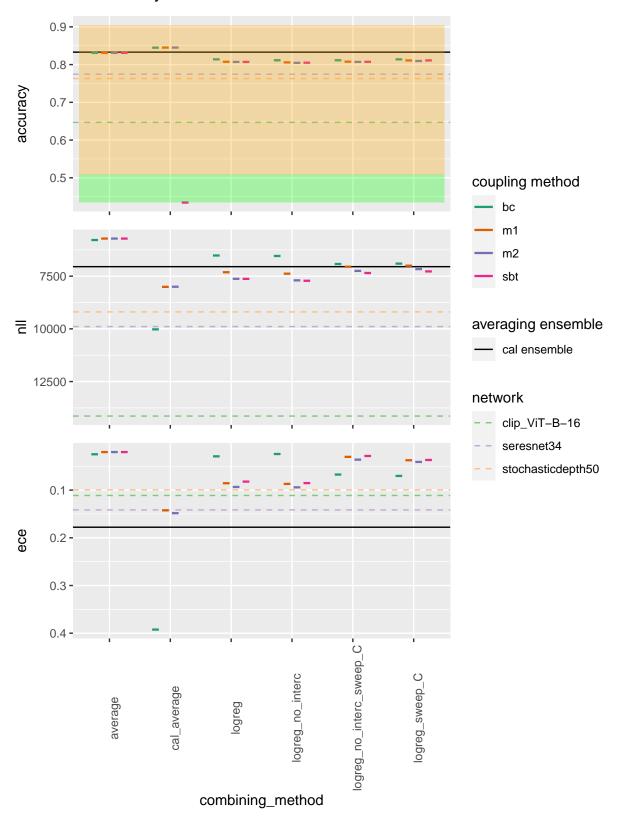


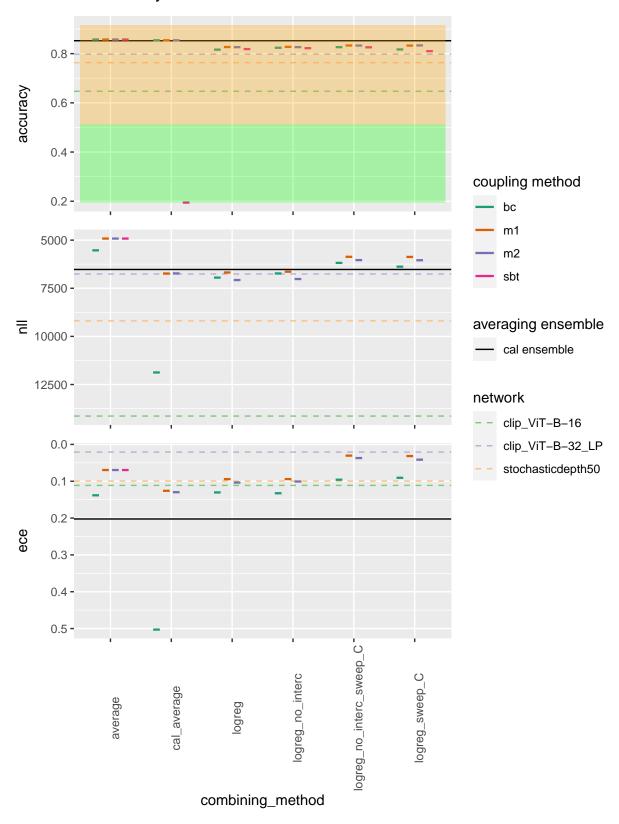


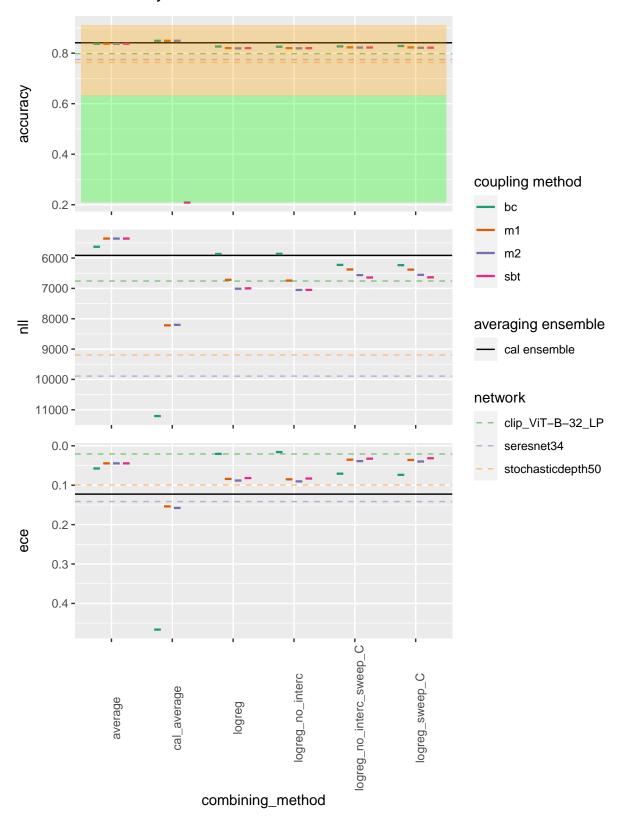


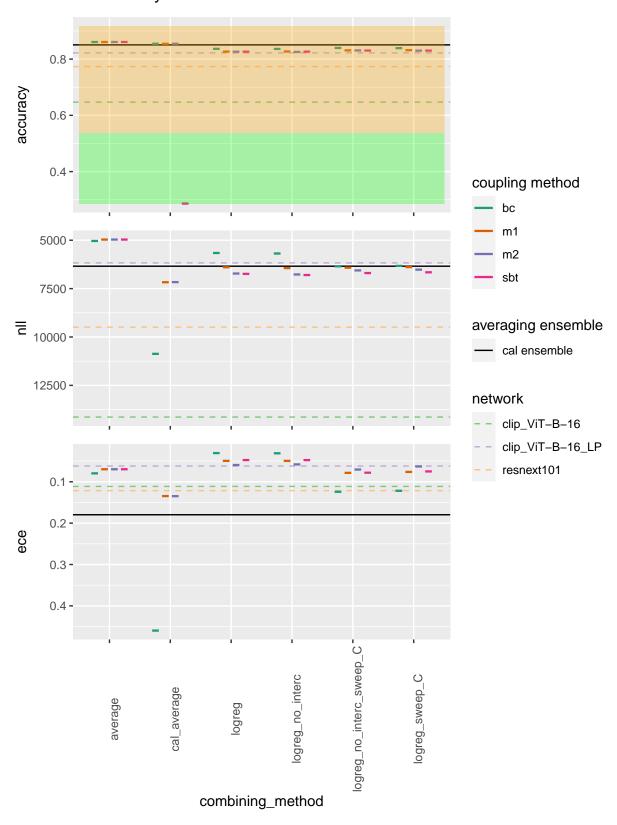


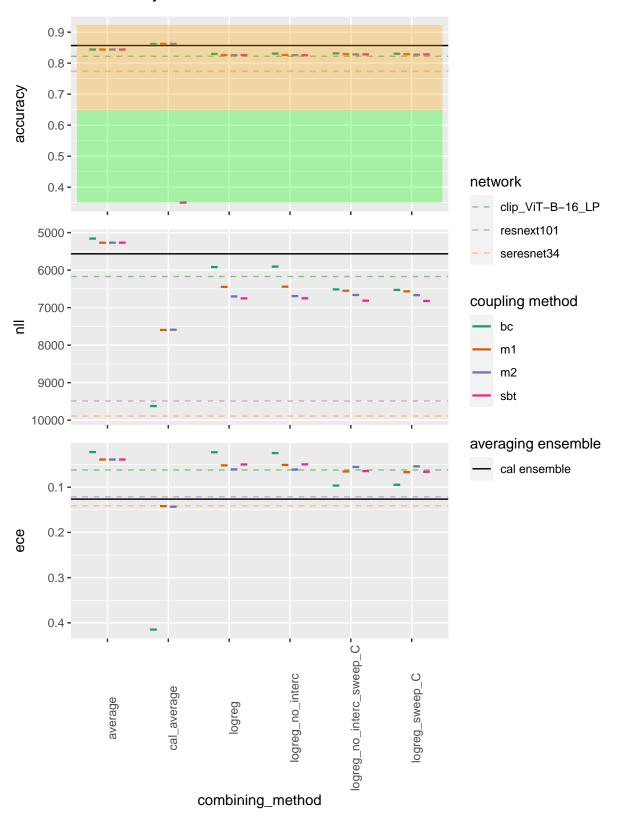


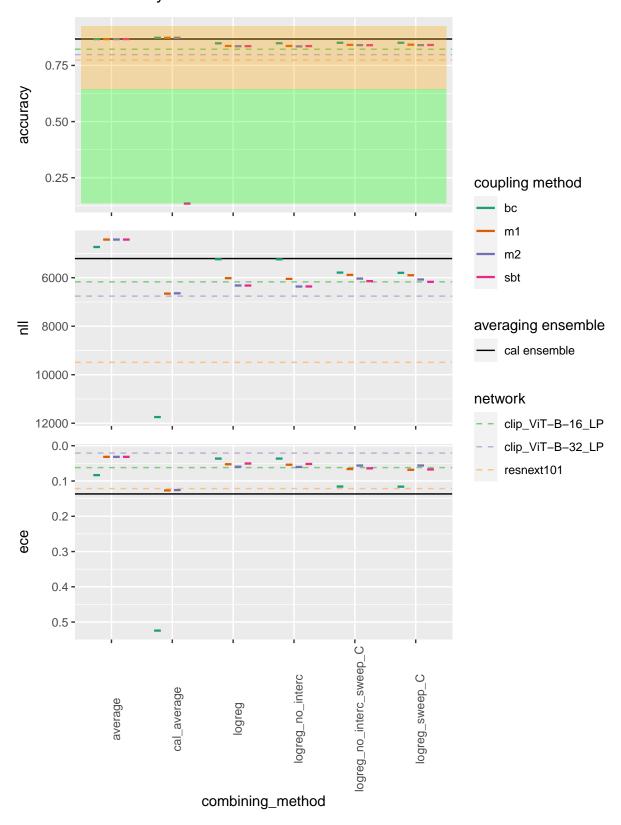


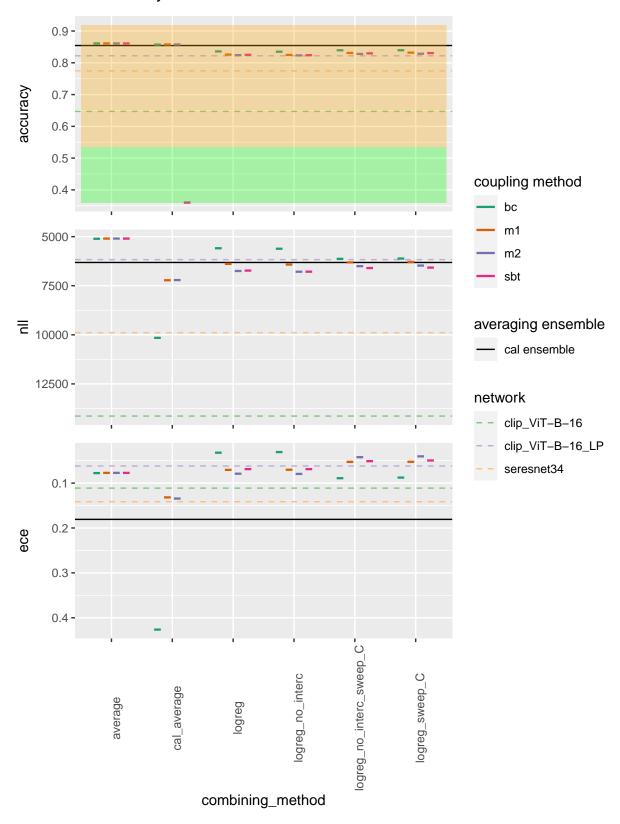


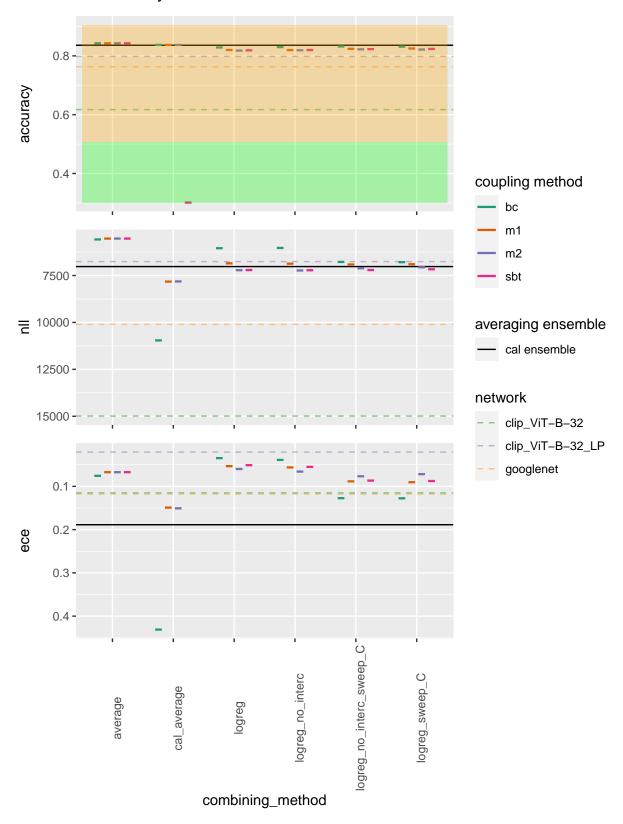


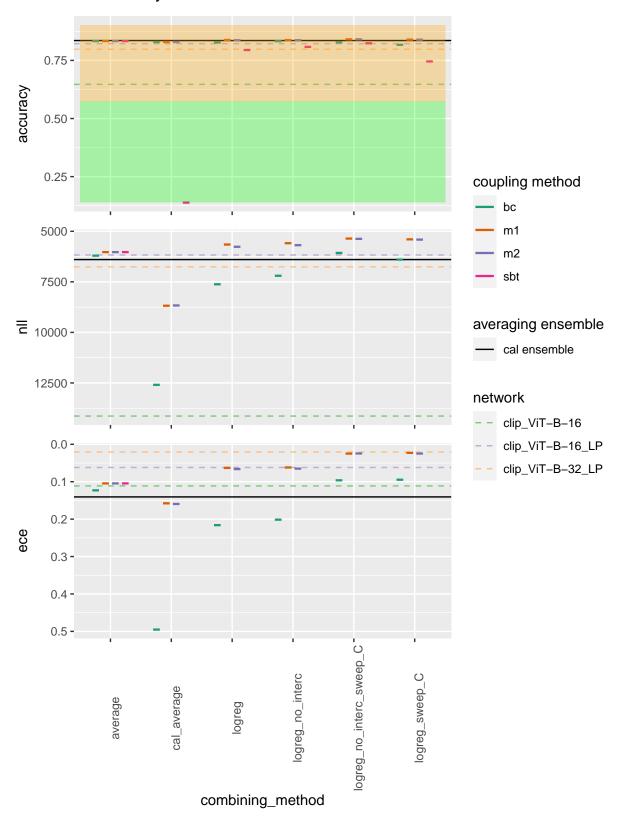


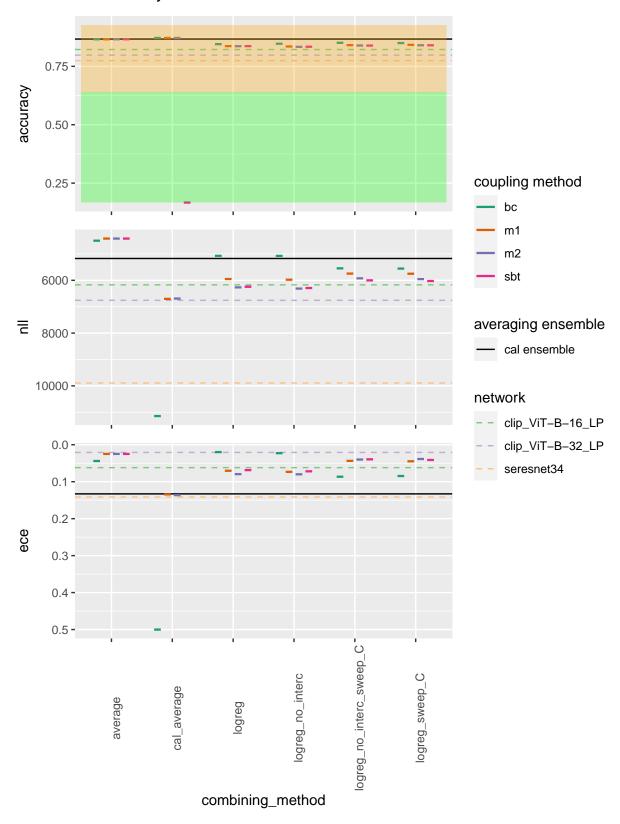


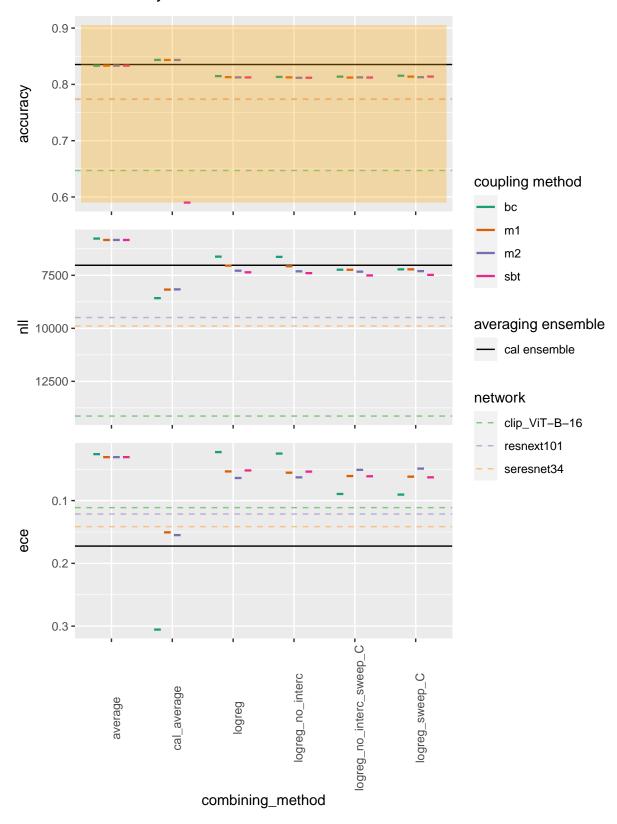


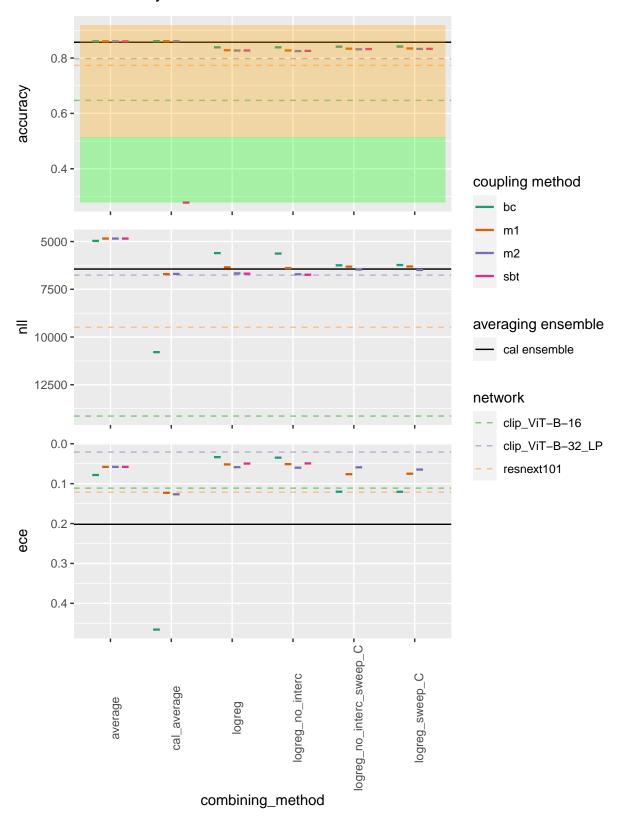


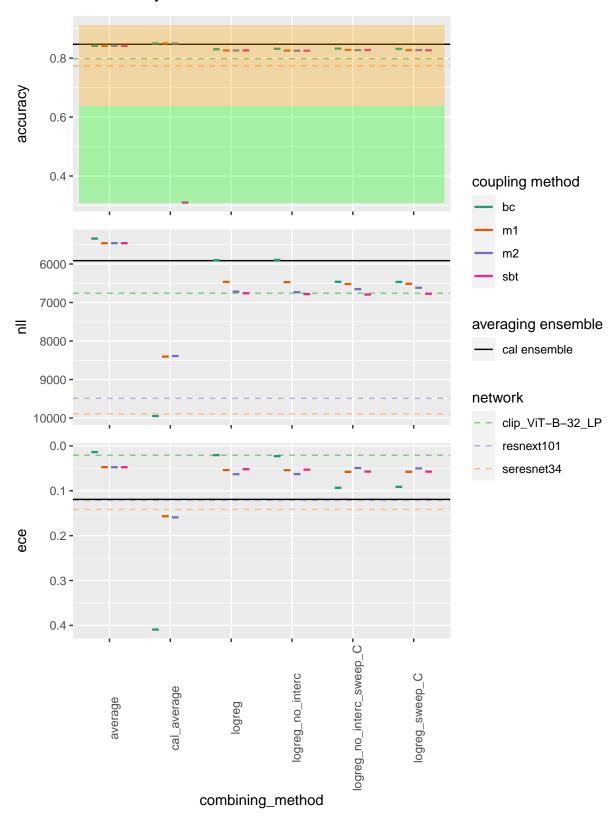


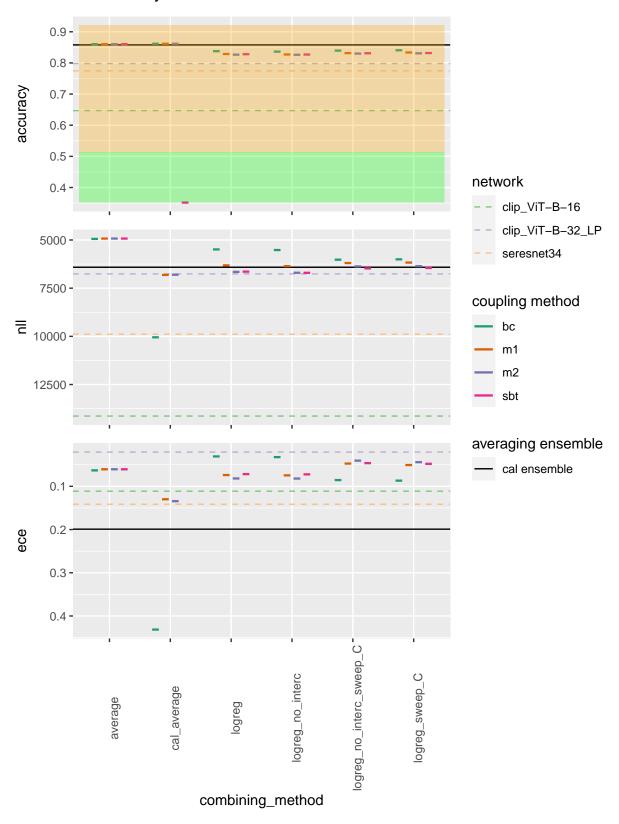


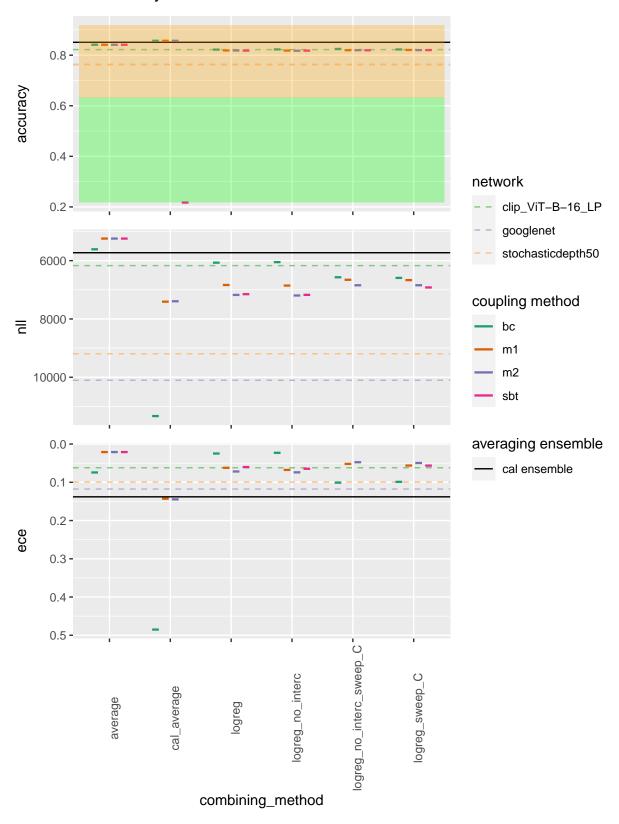


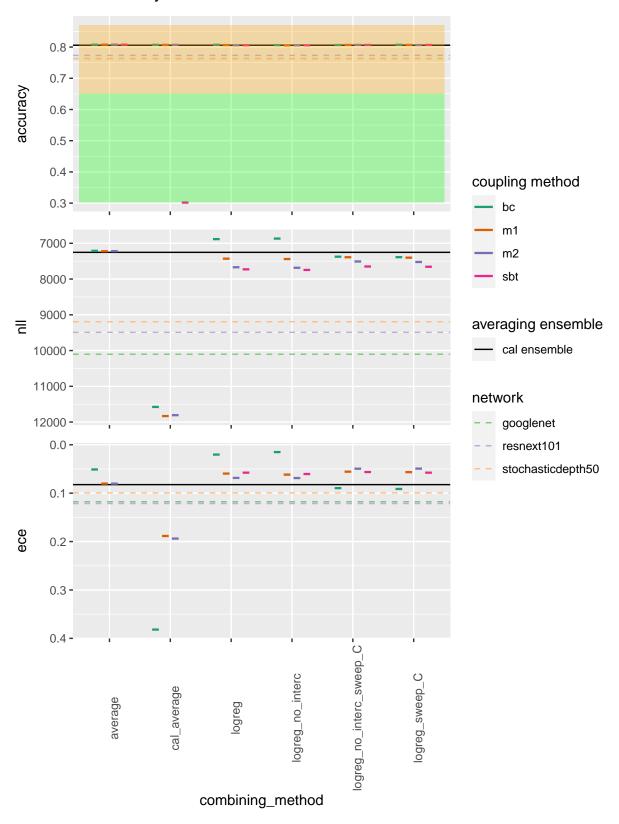


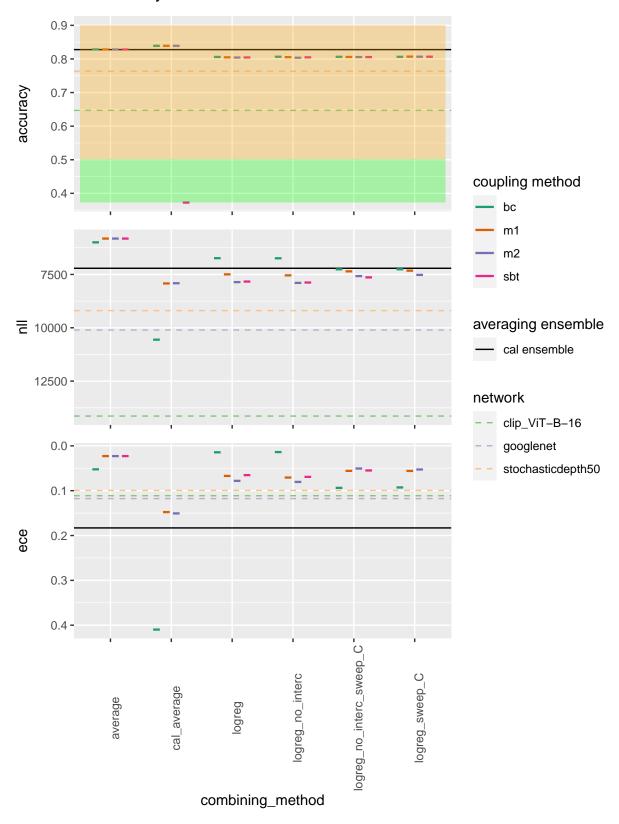


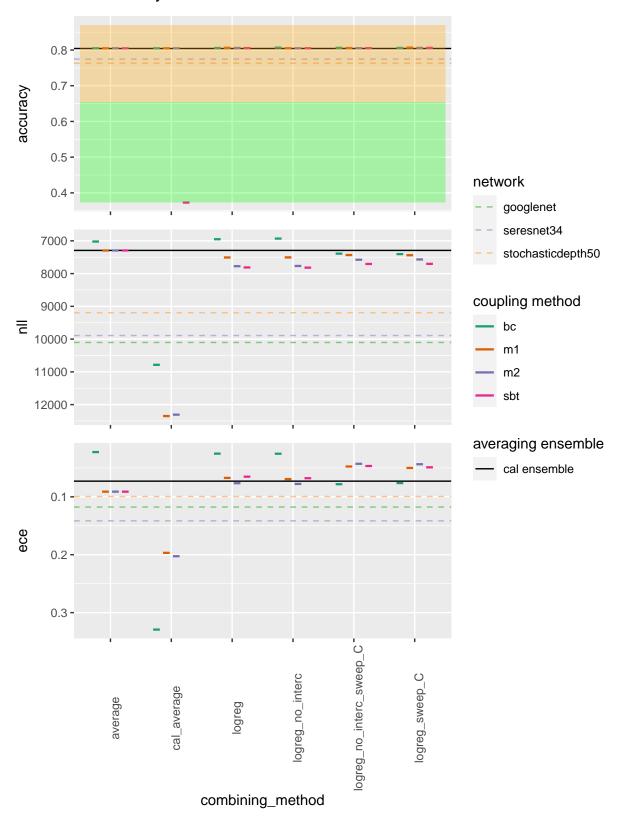






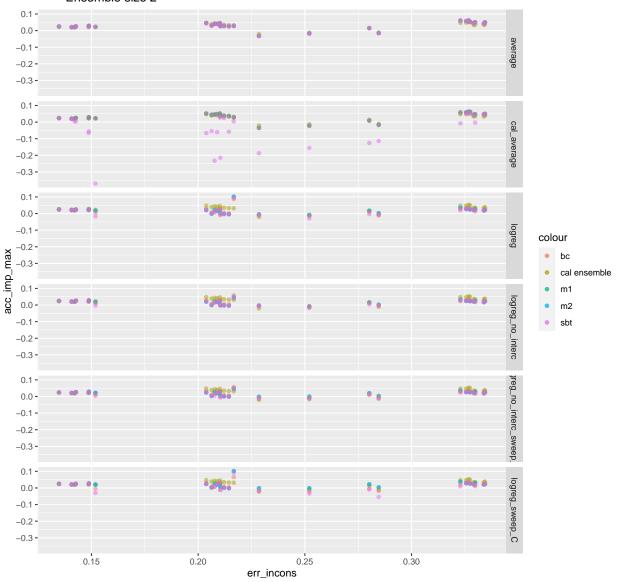




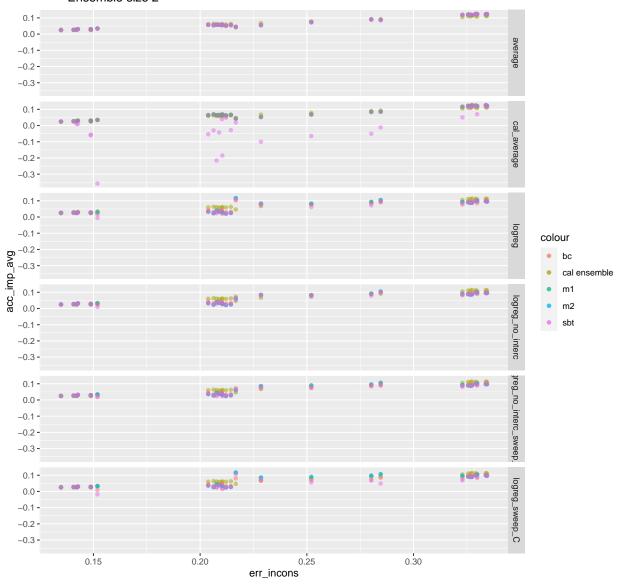


```
xax <- c("err_incons",</pre>
  "nll_var", "nll_min", "nll_max", "nll_avg",
 "acc_var", "acc_min", "acc_max", "acc_avg",
 "ece_var", "ece_min", "ece_max", "ece_avg")
yax <- c("acc_imp_max", "acc_imp_avg")</pre>
for (sss in unique(ens_cal_plt_df$combination_size))
{
  cur_ens_cal_plt_df <- ens_cal_plt_df %>% filter(combination_size == sss)
  cur_ens_pwc_plt_df <- ens_pwc_plt_df %>% filter(combination_size == sss)
  for (xa in xax)
    for (ya in yax)
      cur_plot <- ggplot() +</pre>
        geom_point(
          data=cur_ens_cal_plt_df,
          mapping=aes_string(x=xa, y=ya, color=shQuote("cal ensemble")),
          alpha=0.5) +
        geom_point(
          data=cur_ens_pwc_plt_df,
          mapping=aes_string(x=xa, y=ya, color="coupling_method"),
          alpha=0.5) +
        facet_grid(rows=vars(combining_method)) +
        ggtitle(sprintf("Accuracy improvement of ensemble over
        the %s of networks vs %s.
        Ensemble size %s",
        if (ya == "acc_imp_max") "best" else "average", xa, sss))
      print(cur_plot)
    }
  }
}
```

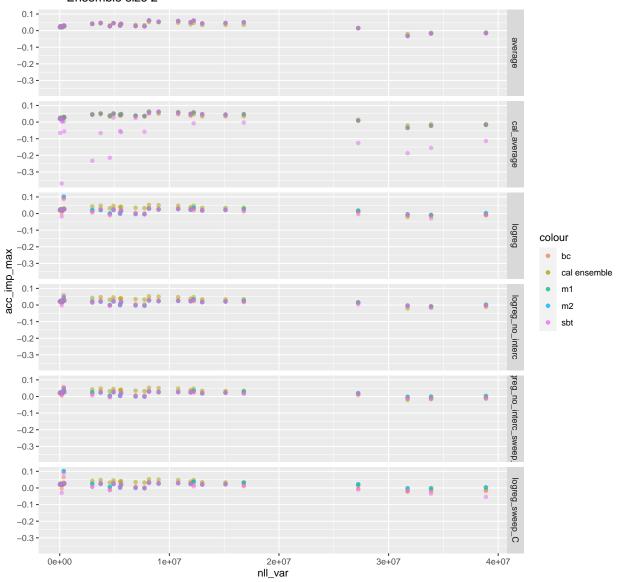
Accuracy improvement of ensemble over the best of networks vs err_incons. Ensemble size 2



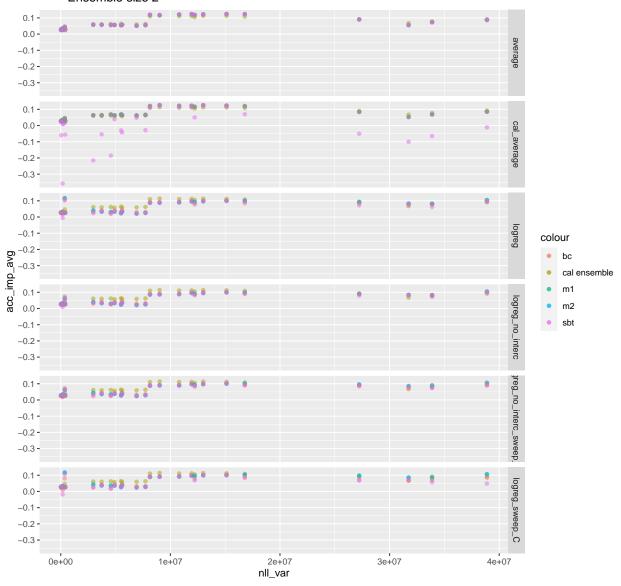
Accuracy improvement of ensemble over the average of networks vs err_incons. Ensemble size 2



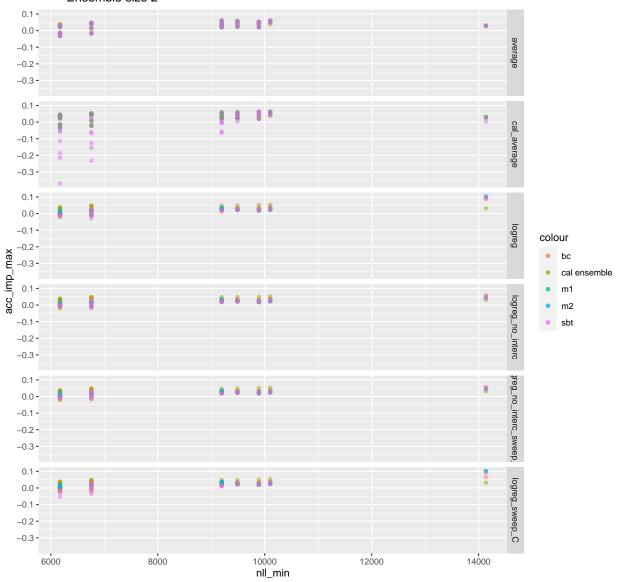
Accuracy improvement of ensemble over the best of networks vs nll_var. Ensemble size 2



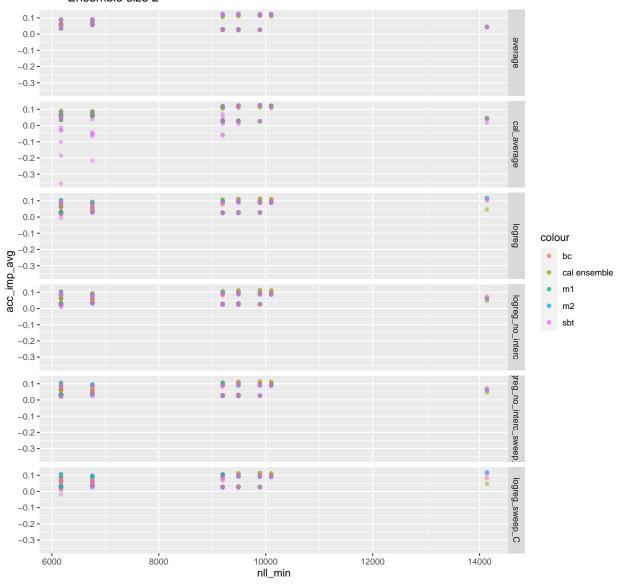
Accuracy improvement of ensemble over the average of networks vs nll_var. Ensemble size 2



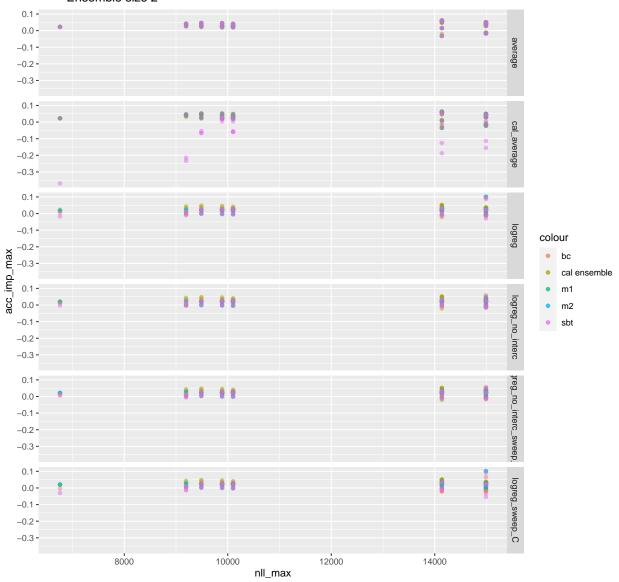
Accuracy improvement of ensemble over the best of networks vs nll_min. Ensemble size 2



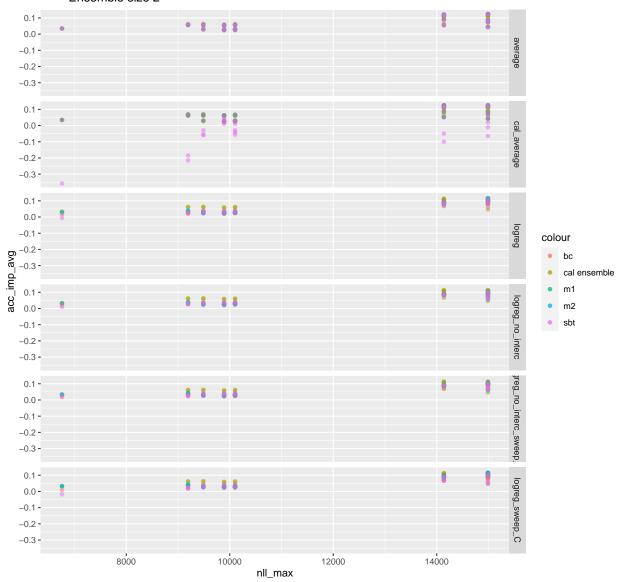
Accuracy improvement of ensemble over the average of networks vs nll_min. Ensemble size 2



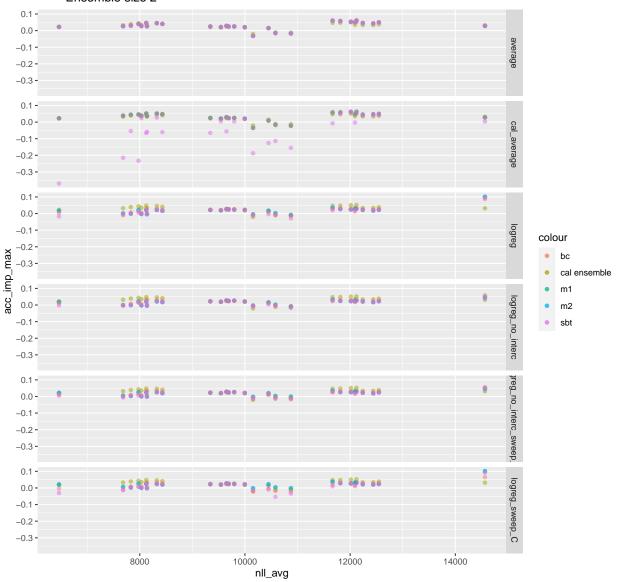
Accuracy improvement of ensemble over the best of networks vs nll_max. Ensemble size 2



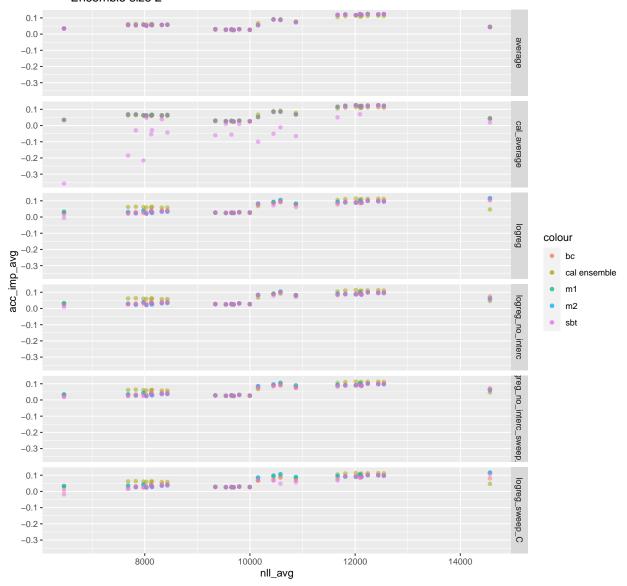
Accuracy improvement of ensemble over the average of networks vs nll_max. Ensemble size 2



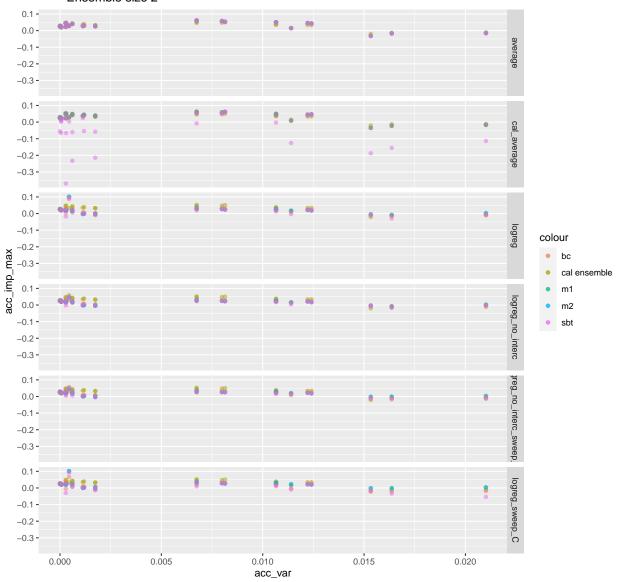
Accuracy improvement of ensemble over the best of networks vs nll_avg. Ensemble size 2



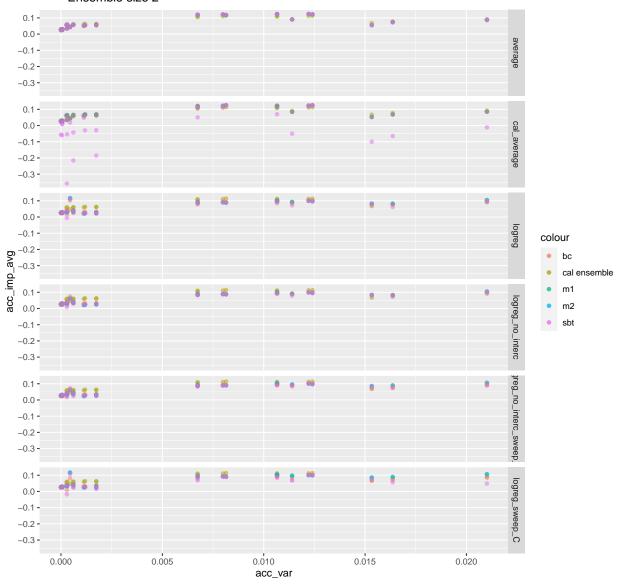
Accuracy improvement of ensemble over the average of networks vs nll_avg. Ensemble size 2



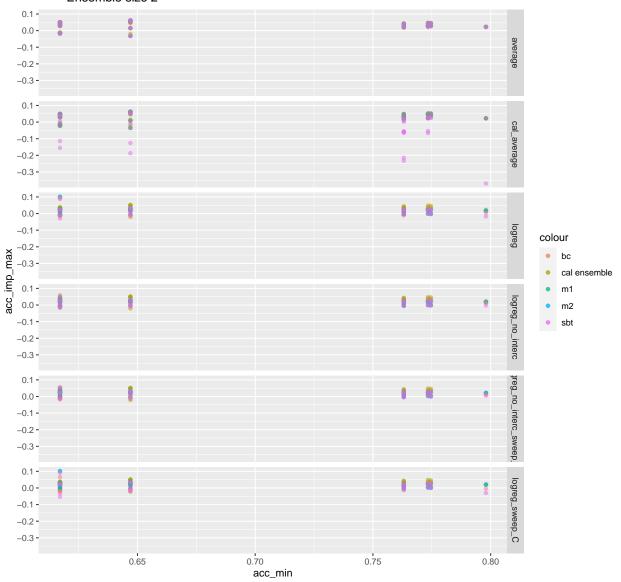
Accuracy improvement of ensemble over the best of networks vs acc_var. Ensemble size 2



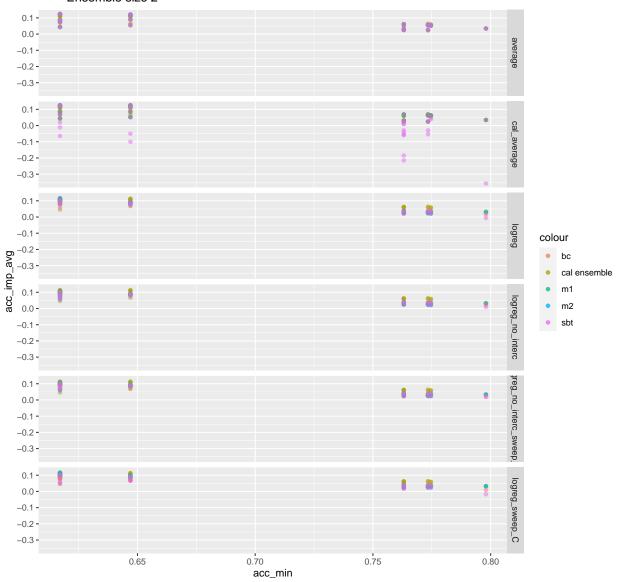
Accuracy improvement of ensemble over the average of networks vs acc_var. Ensemble size 2



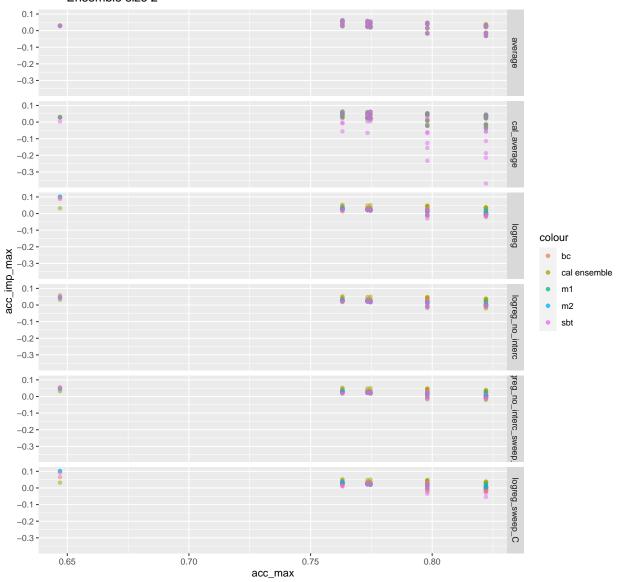
Accuracy improvement of ensemble over the best of networks vs acc_min. Ensemble size 2



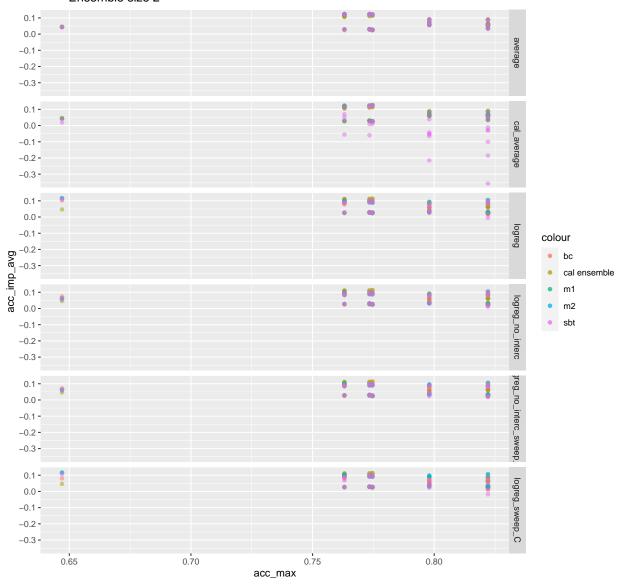
Accuracy improvement of ensemble over the average of networks vs acc_min. Ensemble size 2



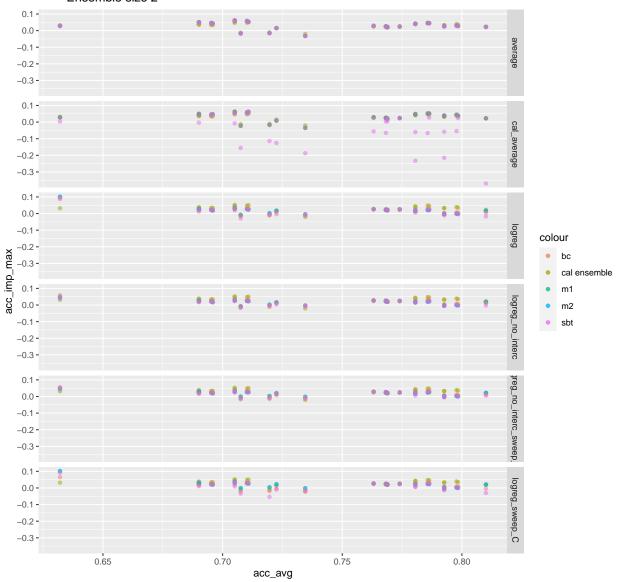
Accuracy improvement of ensemble over the best of networks vs acc_max. Ensemble size 2



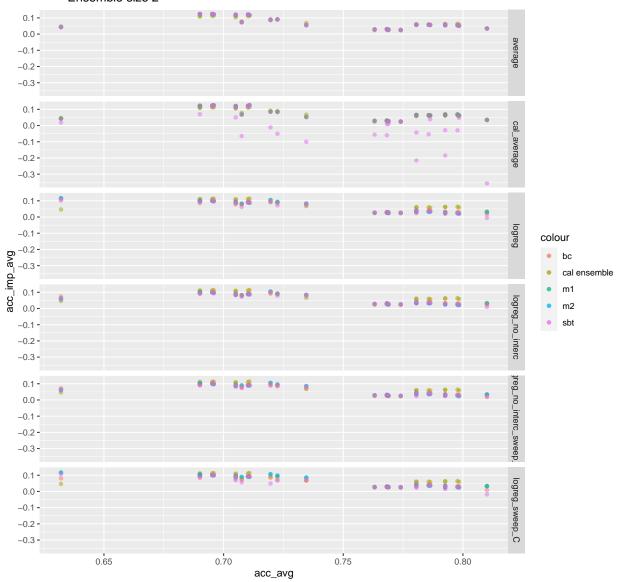
Accuracy improvement of ensemble over the average of networks vs acc_max. Ensemble size 2



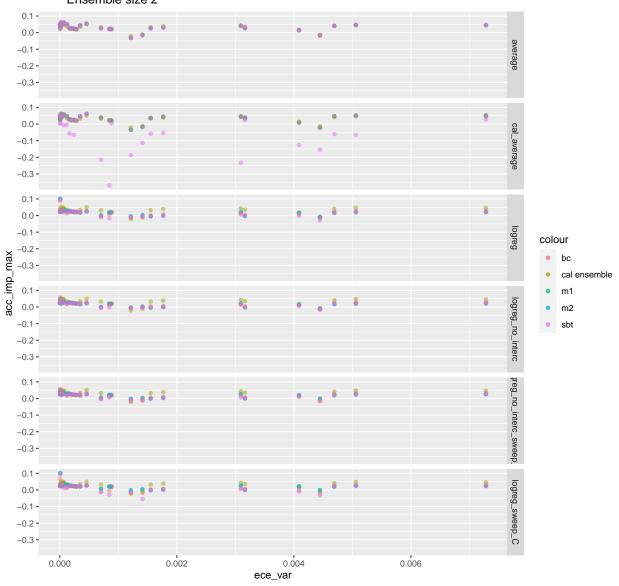
Accuracy improvement of ensemble over the best of networks vs acc_avg. Ensemble size 2



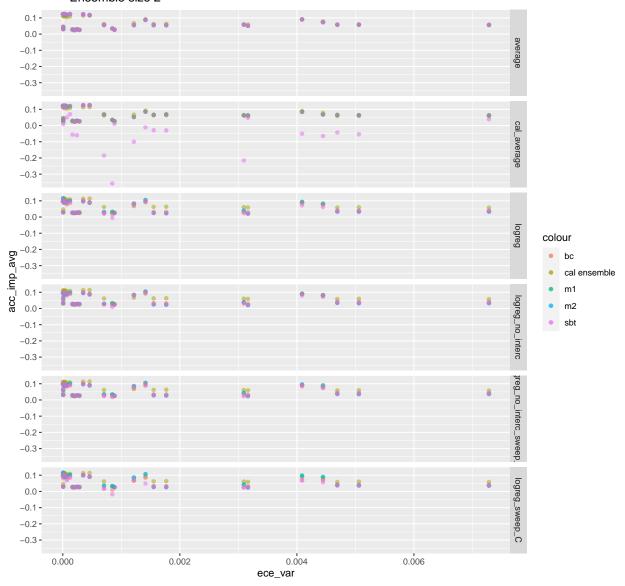
Accuracy improvement of ensemble over the average of networks vs acc_avg. Ensemble size 2



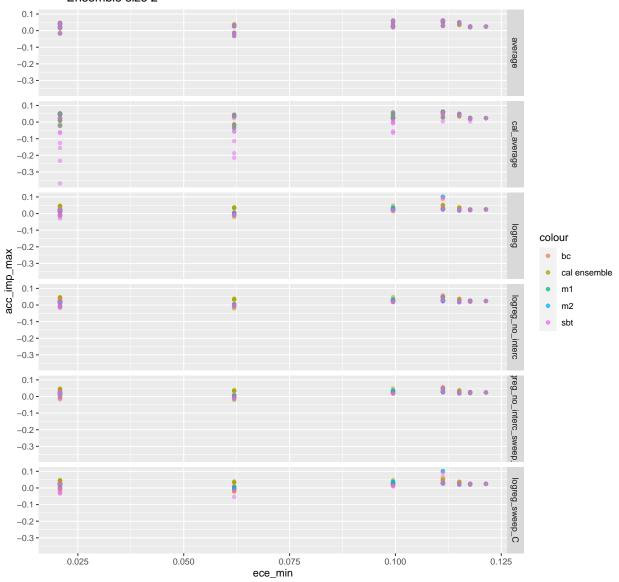
Accuracy improvement of ensemble over the best of networks vs ece_var. Ensemble size 2



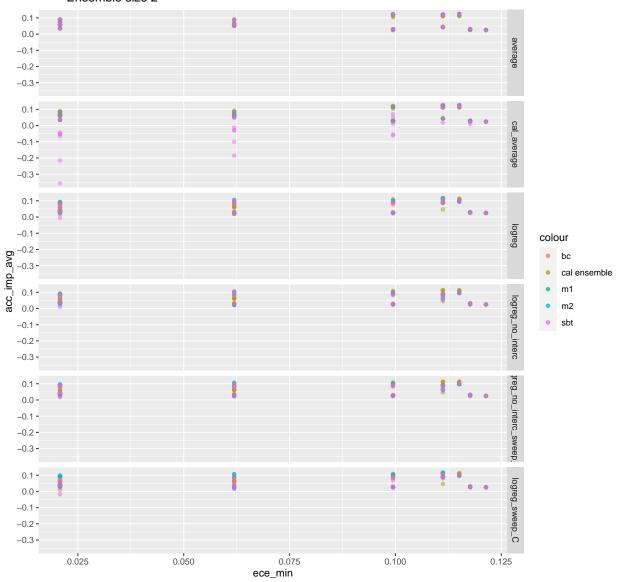
Accuracy improvement of ensemble over the average of networks vs ece_var. Ensemble size 2



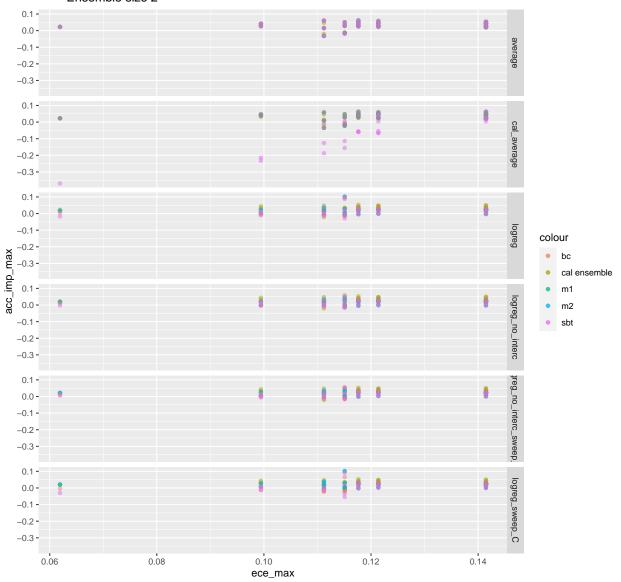
Accuracy improvement of ensemble over the best of networks vs ece_min. Ensemble size 2



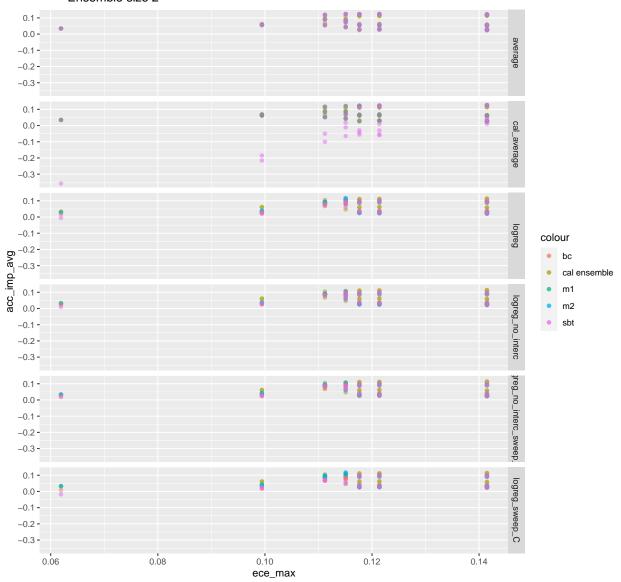
Accuracy improvement of ensemble over the average of networks vs ece_min. Ensemble size 2



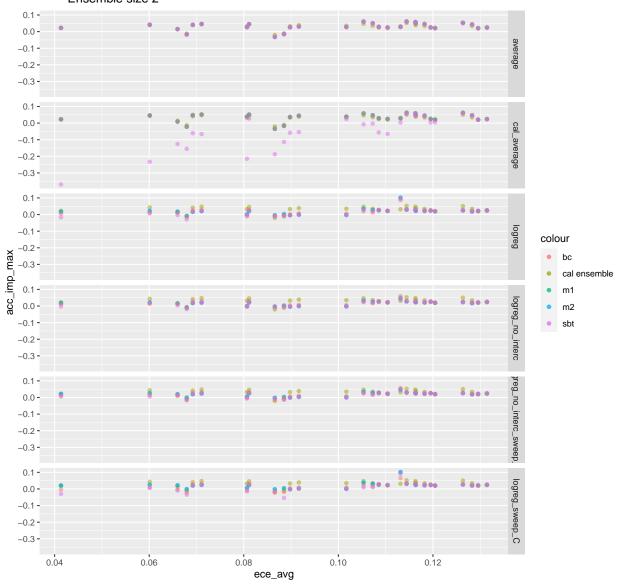
Accuracy improvement of ensemble over the best of networks vs ece_max. Ensemble size 2



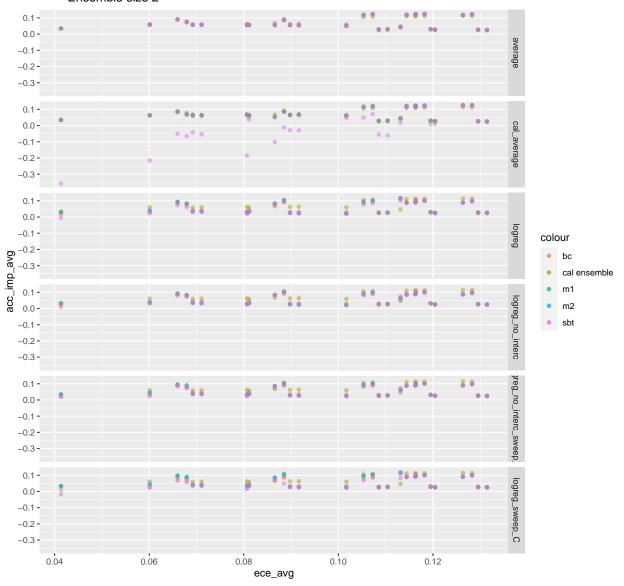
Accuracy improvement of ensemble over the average of networks vs ece_max. Ensemble size 2



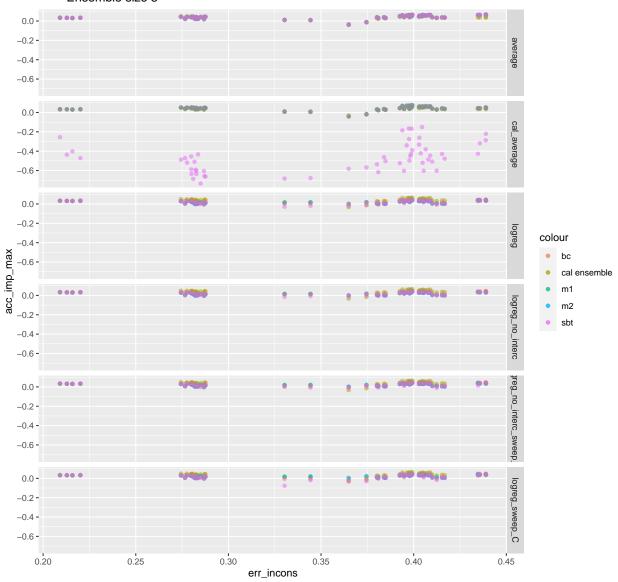
Accuracy improvement of ensemble over the best of networks vs ece_avg. Ensemble size 2



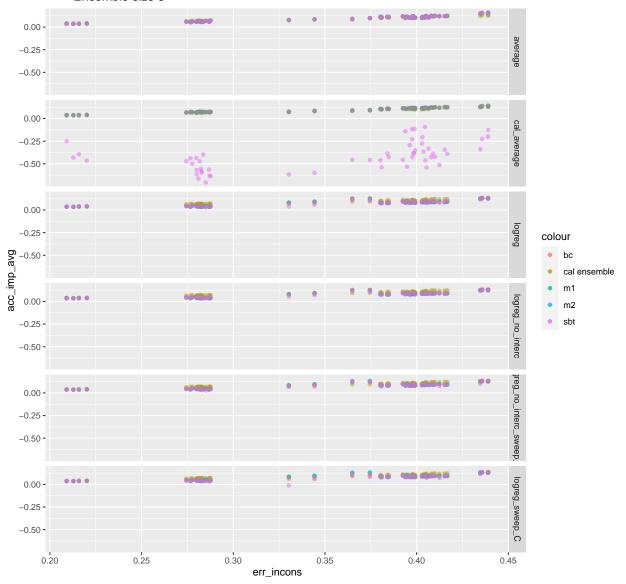
Accuracy improvement of ensemble over the average of networks vs ece_avg. Ensemble size 2



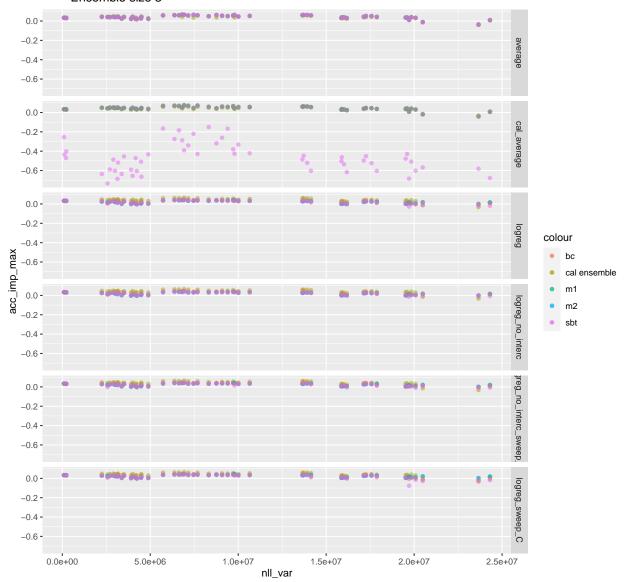
Accuracy improvement of ensemble over the best of networks vs err_incons. Ensemble size 3



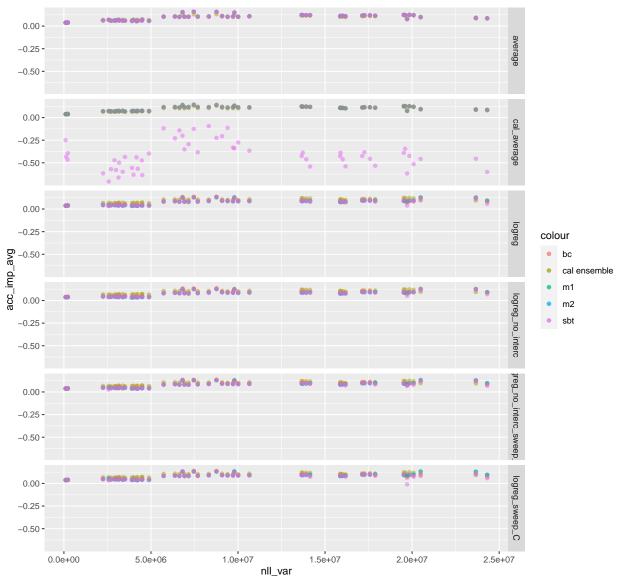
Accuracy improvement of ensemble over the average of networks vs err_incons. Ensemble size 3



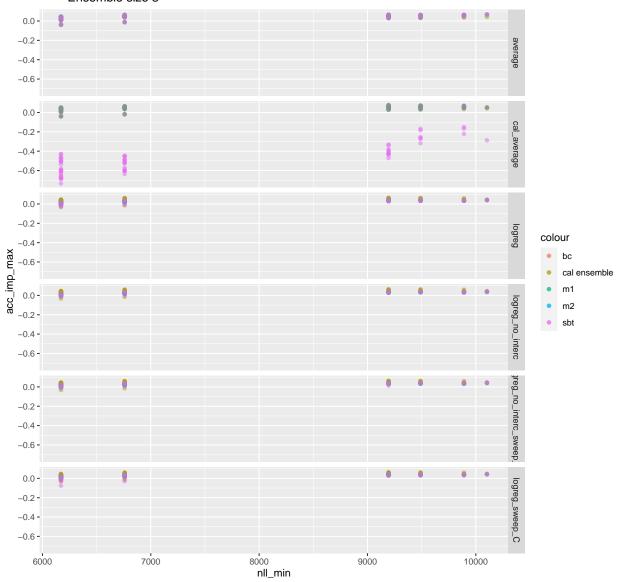
Accuracy improvement of ensemble over the best of networks vs nll_var. Ensemble size 3



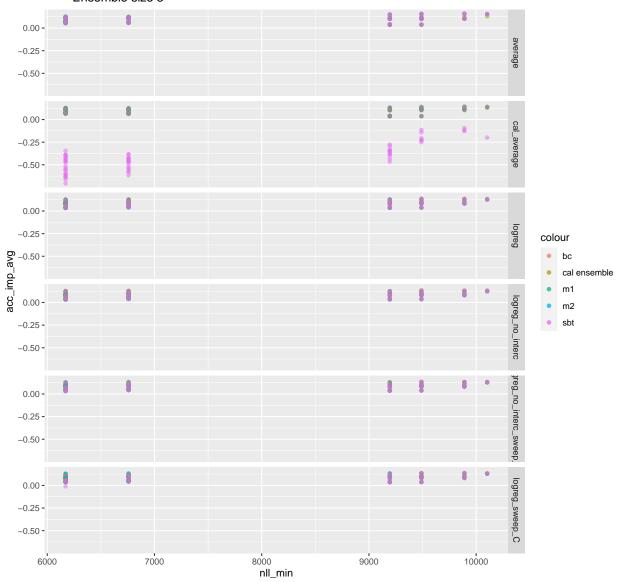
Accuracy improvement of ensemble over the average of networks vs nll_var. Ensemble size 3



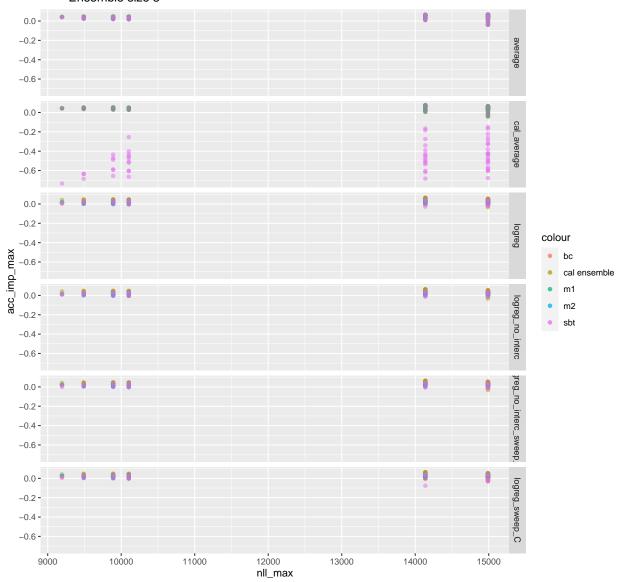
Accuracy improvement of ensemble over the best of networks vs nll_min. Ensemble size 3



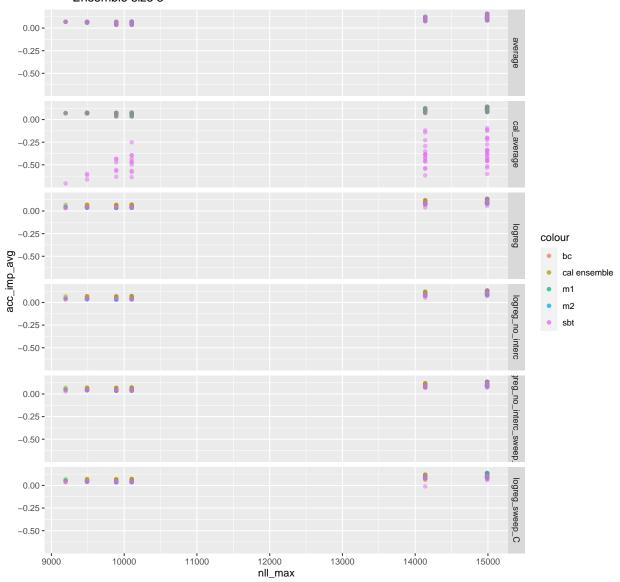
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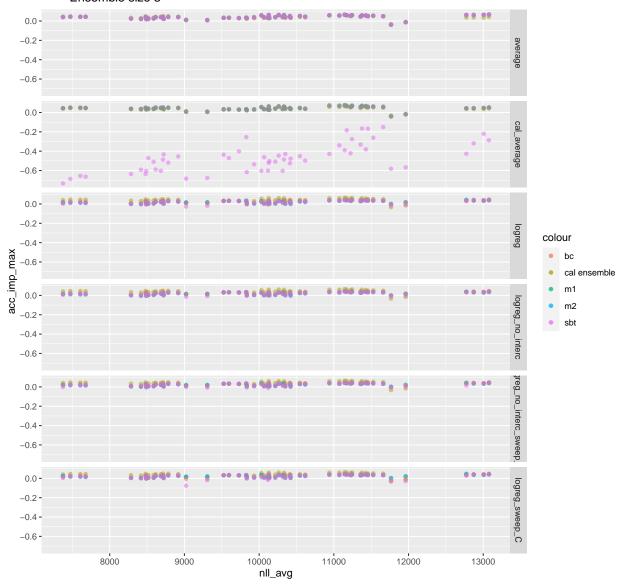
Accuracy improvement of ensemble over the best of networks vs nll_max. Ensemble size 3



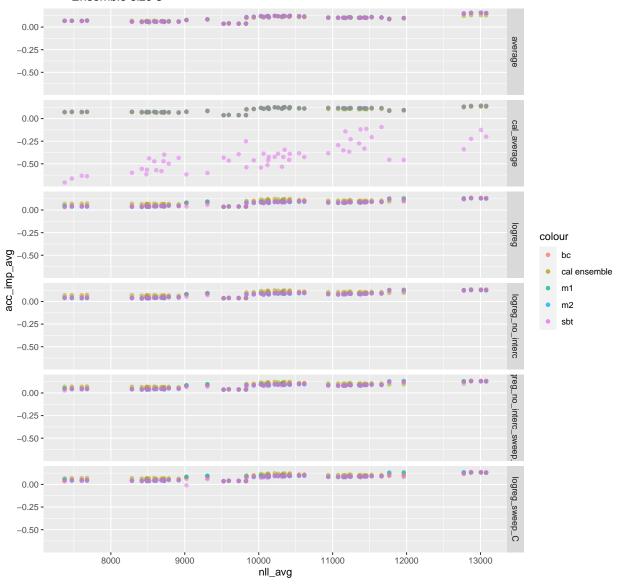
Accuracy improvement of ensemble over the average of networks vs nll_max. Ensemble size 3



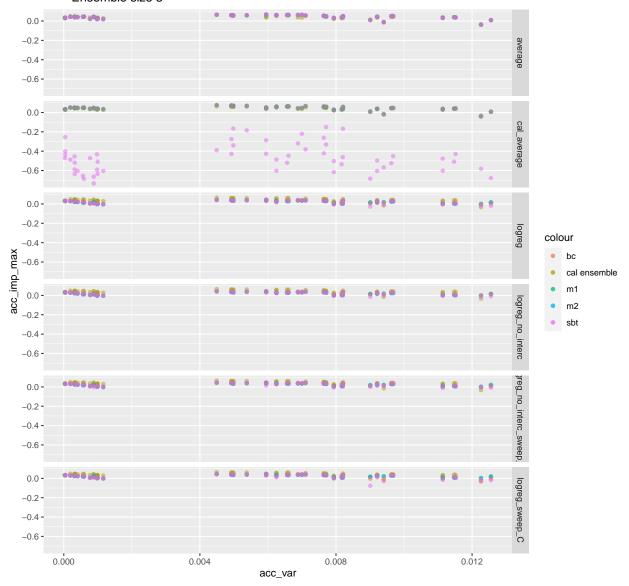
Accuracy improvement of ensemble over the best of networks vs nll_avg. Ensemble size 3



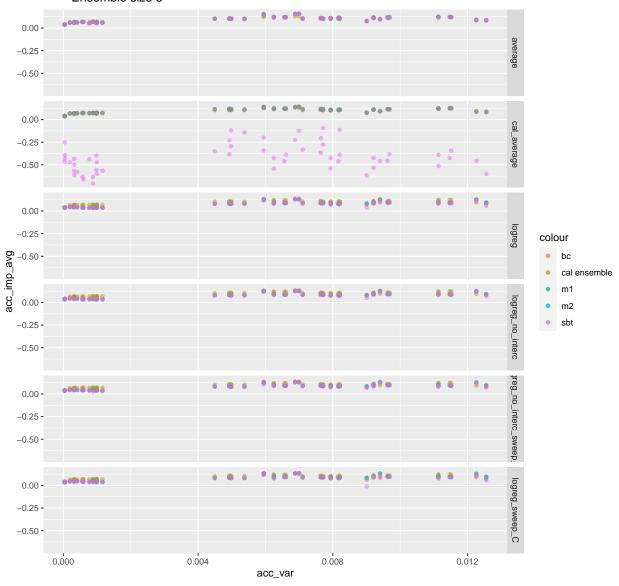
Accuracy improvement of ensemble over the average of networks vs nll_avg. Ensemble size 3



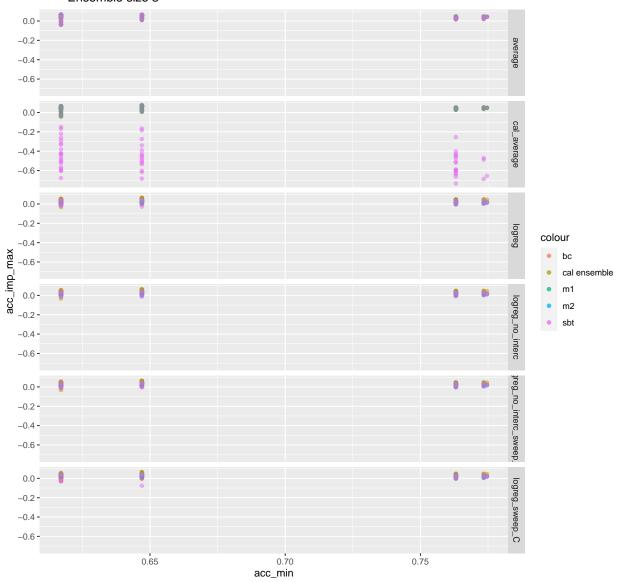
Accuracy improvement of ensemble over the best of networks vs acc_var. Ensemble size 3



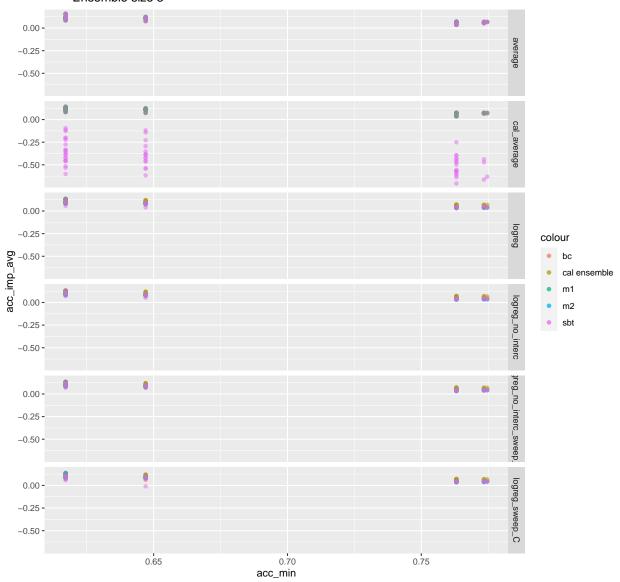
Accuracy improvement of ensemble over the average of networks vs acc_var. Ensemble size 3



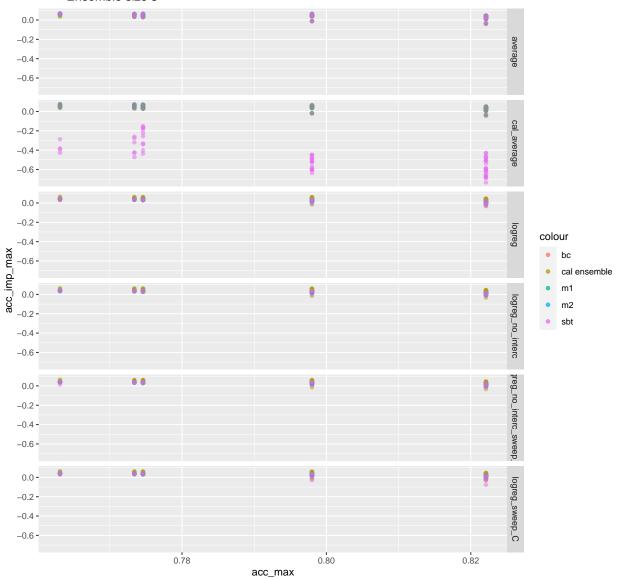
Accuracy improvement of ensemble over the best of networks vs acc_min. Ensemble size 3



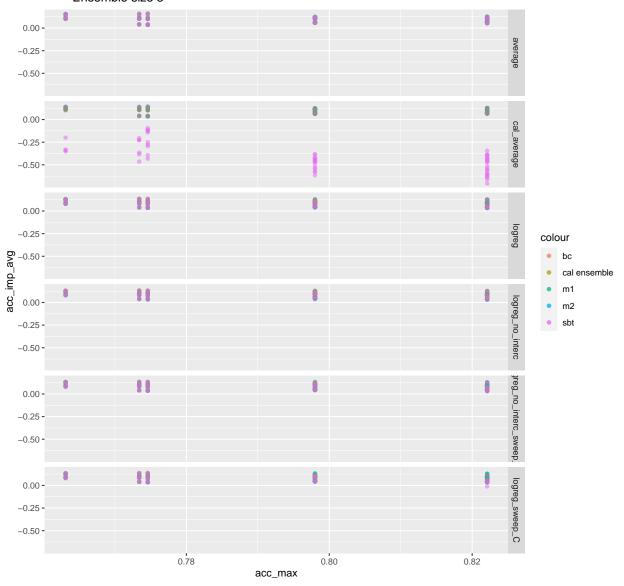
Accuracy improvement of ensemble over the average of networks vs acc_min. Ensemble size 3



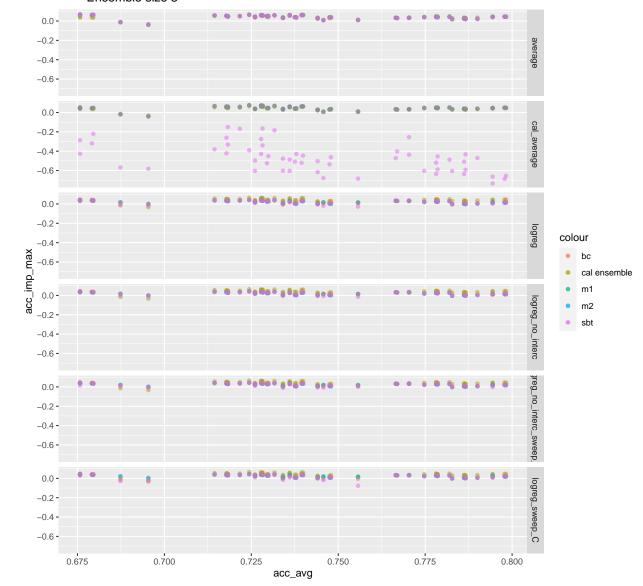
Accuracy improvement of ensemble over the best of networks vs acc_max. Ensemble size 3



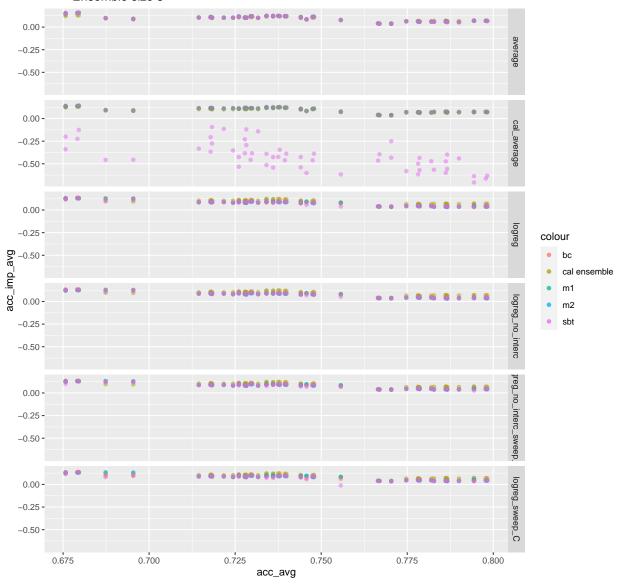
Accuracy improvement of ensemble over the average of networks vs acc_max. Ensemble size 3



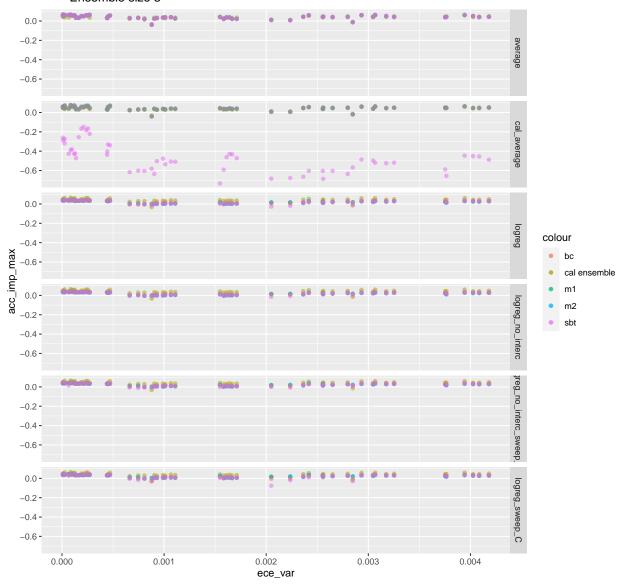
Accuracy improvement of ensemble over the best of networks vs acc_avg. Ensemble size 3



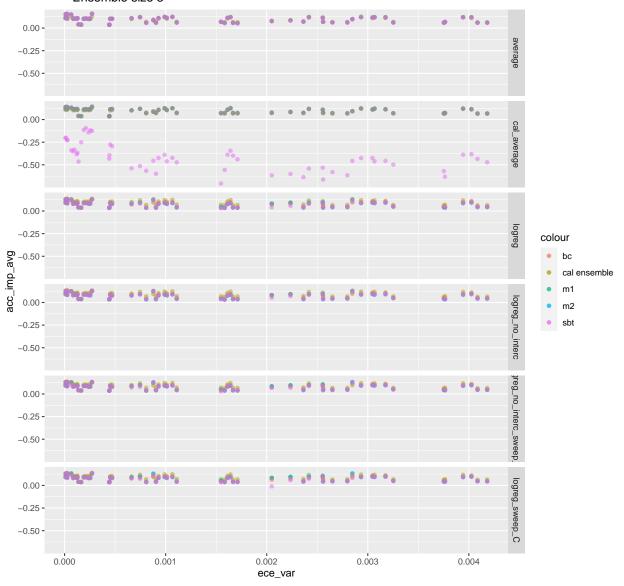
Accuracy improvement of ensemble over the average of networks vs acc_avg. Ensemble size 3



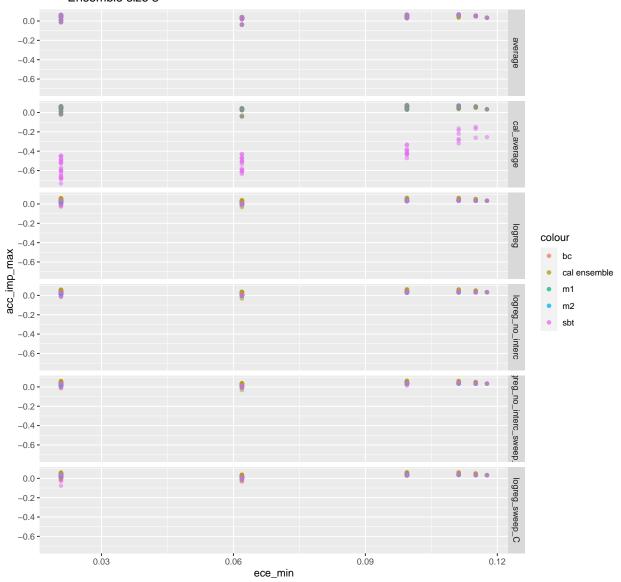
Accuracy improvement of ensemble over the best of networks vs ece_var. Ensemble size 3



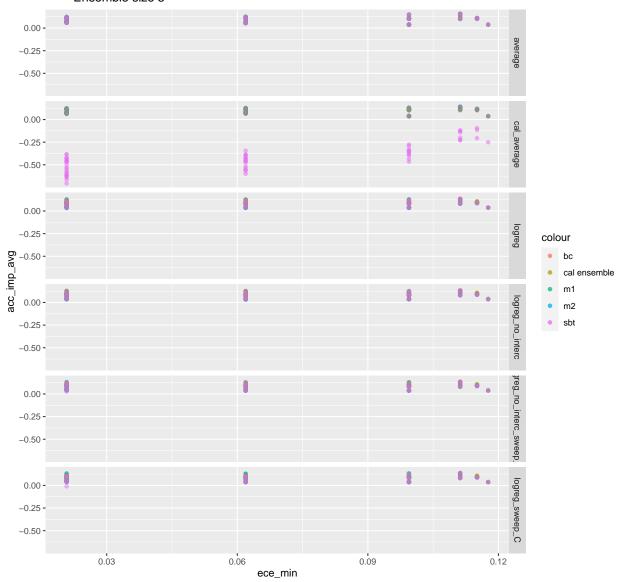
Accuracy improvement of ensemble over the average of networks vs ece_var. Ensemble size 3



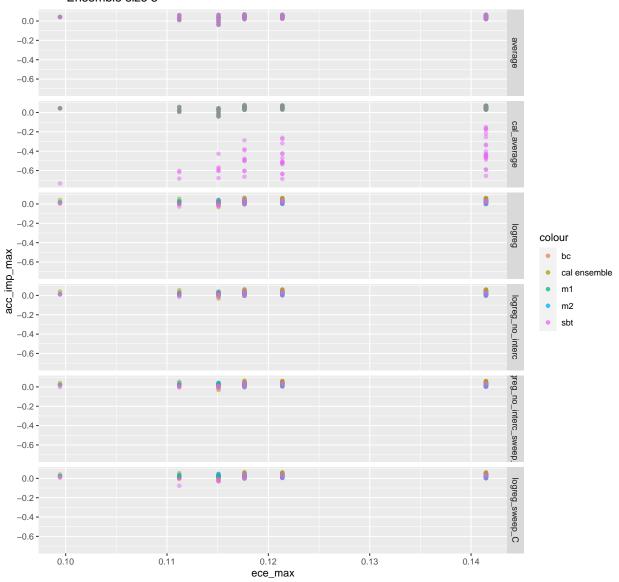
Accuracy improvement of ensemble over the best of networks vs ece_min. Ensemble size 3



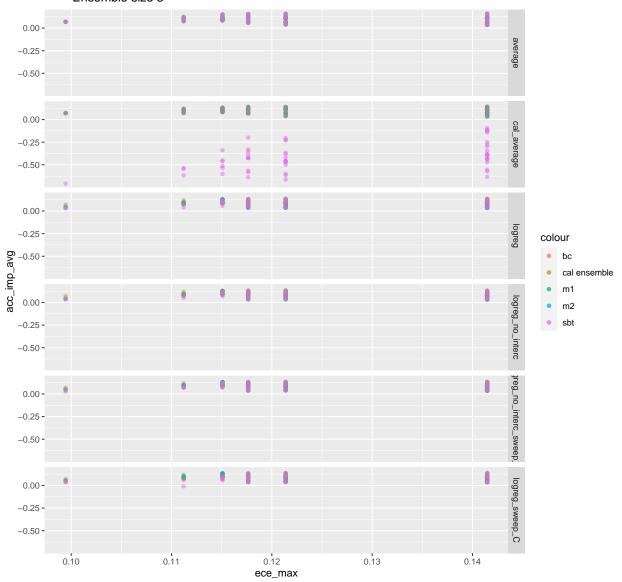
Accuracy improvement of ensemble over the average of networks vs ece_min. Ensemble size 3



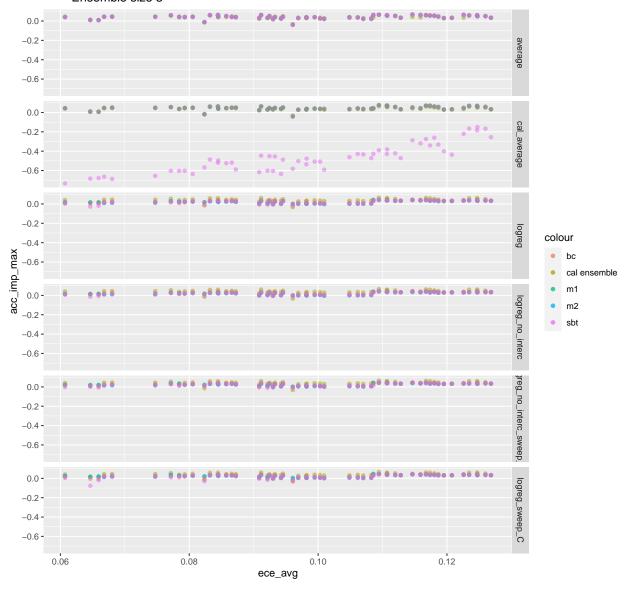
Accuracy improvement of ensemble over the best of networks vs ece_max. Ensemble size 3



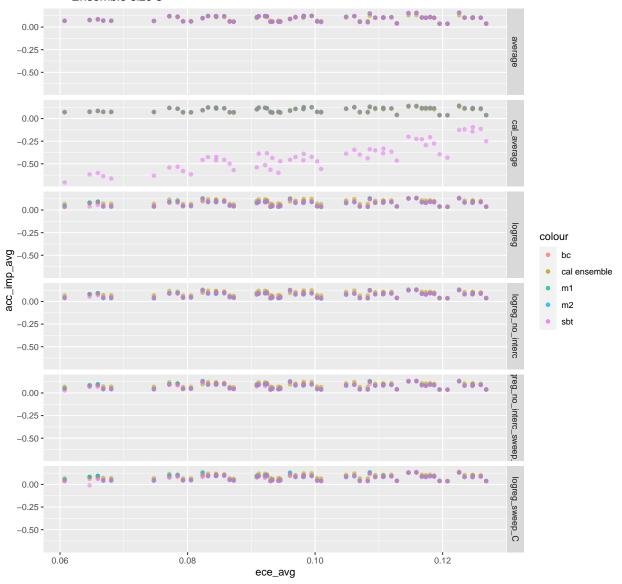
Accuracy improvement of ensemble over the average of networks vs ece_max. Ensemble size 3



Accuracy improvement of ensemble over the best of networks vs ece_avg. Ensemble size 3

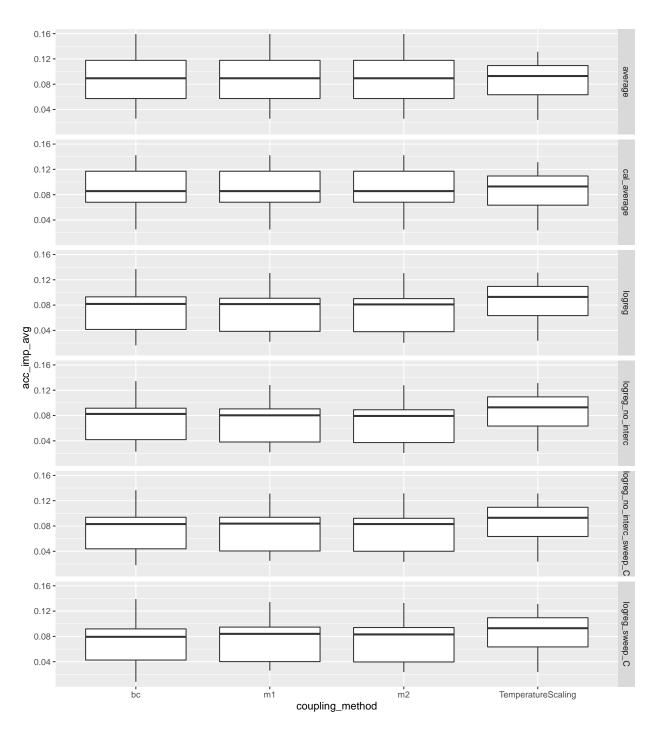


Accuracy improvement of ensemble over the average of networks vs ece_avg. Ensemble size 3



```
imp_avg_plot <- ggplot() +
  geom_boxplot(data=ens_pwc_plt_df %>% filter(coupling_method != "sbt"), mapping=aes(x=coupling_method,
  geom_boxplot(data=ens_cal_plt_df, mapping=aes(x=calibrating_method, y=acc_imp_avg)) +
  facet_grid(rows=vars(combining_method))

print(imp_avg_plot)
```



```
imp_max_plot <- ggplot() +
   geom_boxplot(data=ens_pwc_plt_df %>% filter(coupling_method != "sbt"), mapping=aes(x=coupling_method,
   geom_boxplot(data=ens_cal_plt_df, mapping=aes(x=calibrating_method, y=acc_imp_max)) +
   facet_grid(rows=vars(combining_method))

print(imp_max_plot)
```

