

cbbdata

```
# persistent log-in  
cbbdata::cbd_login()
```

API Key set!

```
library(cbbdata)  
library(tidyverse)  
library(tidymodels)  
library(caret)
```

```
duke_data <- cbd_torvik_game_factors() %>%  
  filter(team == 'Duke')
```

```
duke_unc_game <- cbd_torvik_season_prediction('Duke', 2024) %>%  
  filter(opp == 'North Carolina', game_location == 'A')  
duke_unc_game
```

| | date | team | opp | game_location | tempo | ppp | pts | win_per |
|---|------------|---------------|----------------|---------------|----------|----------|------|----------|
| 1 | 2024-02-03 | Duke | North Carolina | A | 71.05691 | 1.037392 | 73.7 | 22.89543 |
| | did_win | simulate_date | year | | | | | |
| 1 | FALSE | 2024-02-03 | 2024 | | | | | |

```
unc_duke_game <- cbd_torvik_season_prediction('North Carolina', 2024) %>%  
  filter(opp == 'Duke', game_location == 'H')  
unc_duke_game
```

```

      date      team opp game_location      tempo      ppp pts win_per
1 2024-02-03 North Carolina Duke          H 71.05691 1.152916 81.9 77.10457
  did_win simulate_date year
1    TRUE      2024-02-03 2024

```

```

#result <- rbinom(100, 1, 0.2346)
#hist(result)

```

```

home_games <- list("20150218","20160305","20170209","20180303","20190220","20200307","2021
away_games <- list("20150307","20160217","20170304","20180208","20190309","20200208","2021
home_predictions <- cbd_torvik_game_prediction('Duke','North Carolina', "20150218")
for (x in home_games){
  this_pred = cbd_torvik_game_prediction('Duke','North Carolina', x)
  home_predictions = full_join(home_predictions, this_pred)
}

```

```

Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`

```

```

away_predictions <- cbd_torvik_game_prediction('North Carolina', 'Duke', "20150307")
for (x in away_games){
  this_pred = cbd_torvik_game_prediction('North Carolina','Duke', x)
  away_predictions = full_join(away_predictions, this_pred)
}

```

```

Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`
Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`

```

```

full_predictions <- full_join(home_predictions, away_predictions)

```

```

Joining with `by` = join_by(team, date, location, tempo, ppp, pts, win_per,
did_win)`

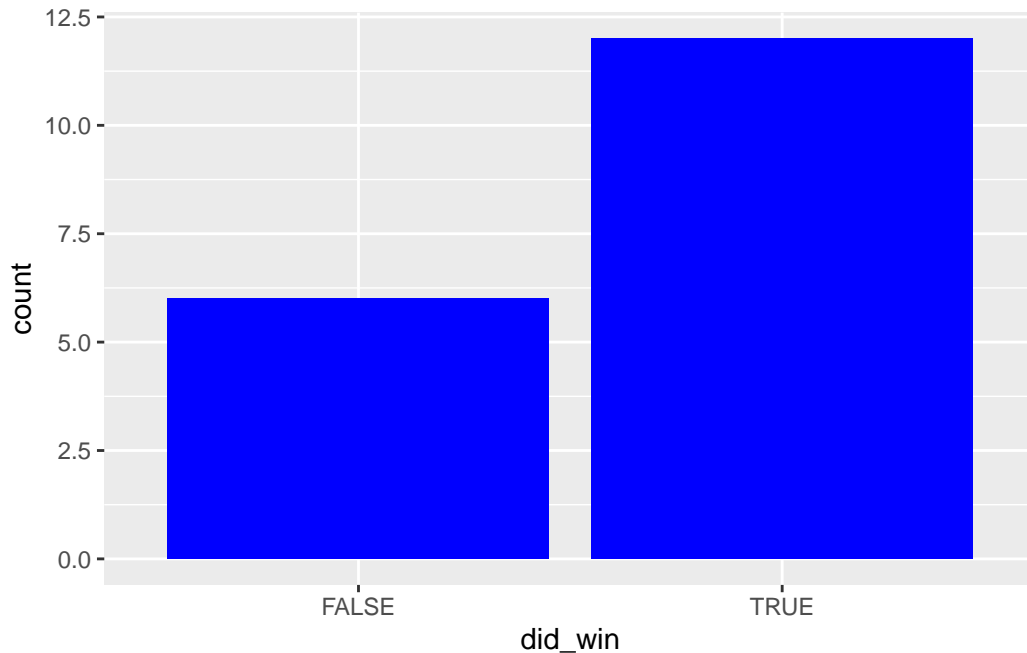
```

```

full_predictions %>%
  filter(team == 'Duke') %>%
  ggplot(aes(x = did_win)) +
  geom_histogram(stat = "count", fill = "Blue")

```

Warning in geom_histogram(stat = "count", fill = "Blue"): Ignoring unknown parameters: `binwidth`, `bins`, and `pad`



```

date <- c("02/17/2015","03/06/2015","02/16/2016","03/04/2016","02/08/2017","03/03/2017","0
date <- as.Date(date, format = "%m/%d/%Y")
winner <- c("Duke","Duke","Duke","North Carolina","Duke","North Carolina","North Carolina")
diff <- c(2,7,1,-4,8,-7,-4,10,-16,-9,2,13,-4,-18,20,-13,6,5)
duke_home <- c("Home","Away","Away","Home","Home","Away","Away","Home","Home","Away","Away")
real_results <- data.frame(date,winner,diff,duke_home)

```

```

full_predictions <- full_predictions %>%
  mutate(duke_home = case_when(team == "Duke" & location == "H" ~ "Home",
                                team == "North Carolina" & location == "A" ~ "Home",
                                TRUE ~ "Away"),
         duke_pts = if_else(team == "Duke", pts, 0),
         unc_pts = if_else(team == "North Carolina",pts,0))

```

```

full_predictions <- full_predictions %>%
  group_by(date) %>%
  mutate(diff = max(duke_pts) - max(unc_pts))

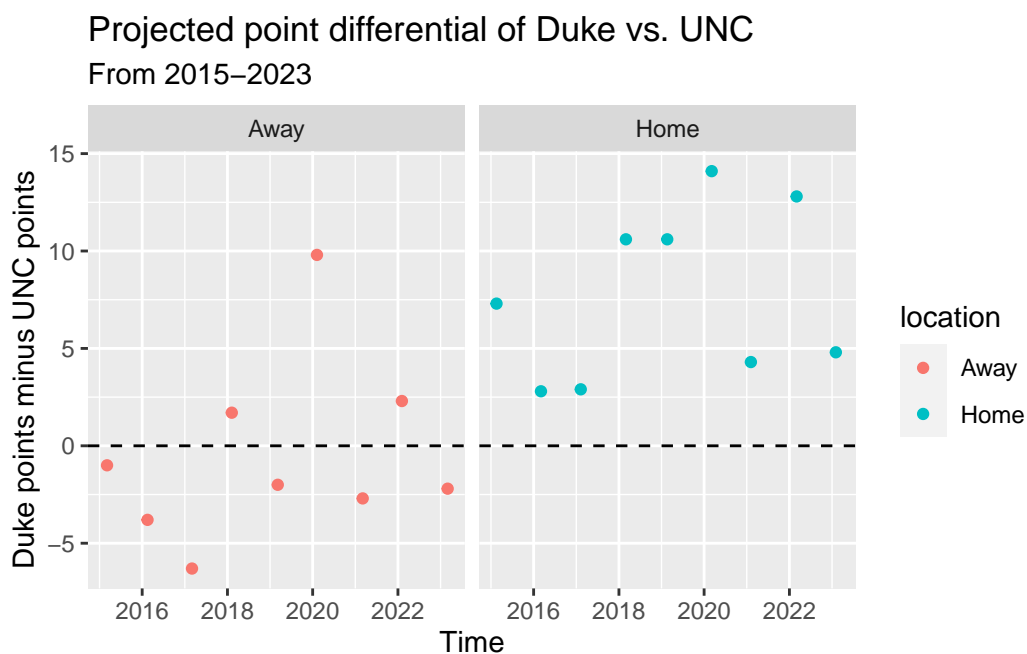
```

```

full_predictions %>%
  filter(team == "Duke") %>%

```

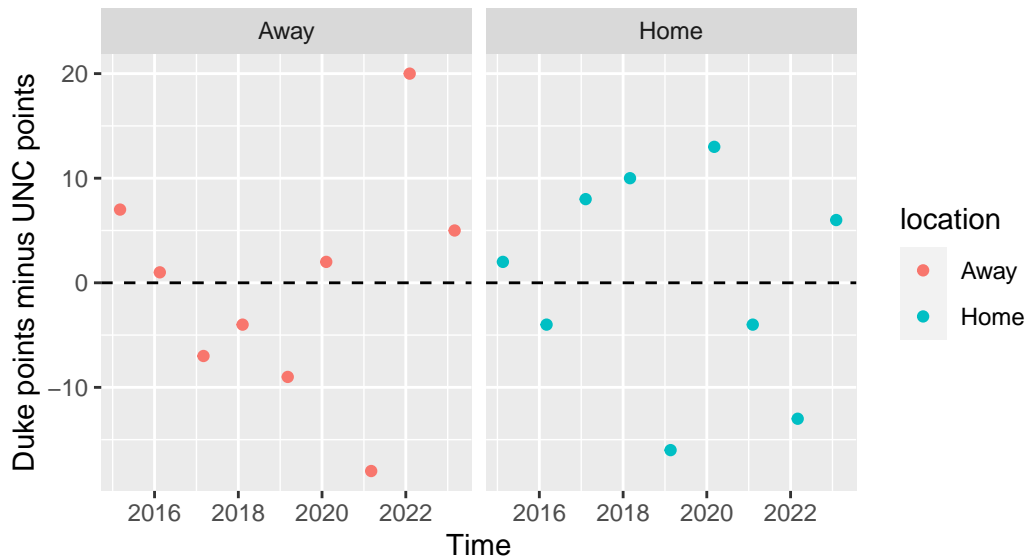
```
ggplot(aes(x = date, y = diff, color = duke_home)) +
  geom_point() +
  geom_hline(yintercept = 0, linetype = 2) +
  facet_wrap(~ duke_home) +
  labs(title = "Projected point differential of Duke vs. UNC",
        subtitle = "From 2015-2023",
        y = "Duke points minus UNC points",
        x = "Time",
        color = "location")
```



```
real_results %>%
  ggplot(aes(x = date, y = diff, color = duke_home)) +
  geom_point() +
  geom_hline(yintercept = 0, linetype = 2) +
  facet_wrap(~ duke_home) +
  labs(title = "Actual point differential of Duke vs. UNC",
        subtitle = "From 2015-2023",
        y = "Duke points minus UNC points",
        x = "Time",
        color = "location")
```

Actual point differential of Duke vs. UNC

From 2015–2023



```
acc_2023 <- full_join(cbd_torvik_season_prediction("Duke", 2023, "20230101"), duke_data, by =
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

acc_2022 <- full_join(cbd_torvik_season_prediction("Duke", 2022, "20220101"), duke_data, by =
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

test <- full_join(acc_2023, acc_2022)
```

Joining with `by = join_by(date, team.x, opp.x, game_location, tempo.x, ppp, pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y, opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg, off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score, season, tempo.y, game_id, coach, opp_coach, year.y)`

```
acc_2021 <- full_join(cbd_torvik_season_prediction("Duke", 2021, "20210101"), duke_data, by =
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

test <- full_join(test, acc_2021)
```

Joining with `by = join_by(date, team.x, opp.x, game_location, tempo.x, ppp, pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y, opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg, off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score, season, tempo.y, game_id, coach, opp_coach, year.y)`

```
acc_2020 <- full_join(cbd_torvik_season_prediction("Duke", 2020, "20200101"), duke_data, by
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

test <- full_join(test, acc_2020)
```

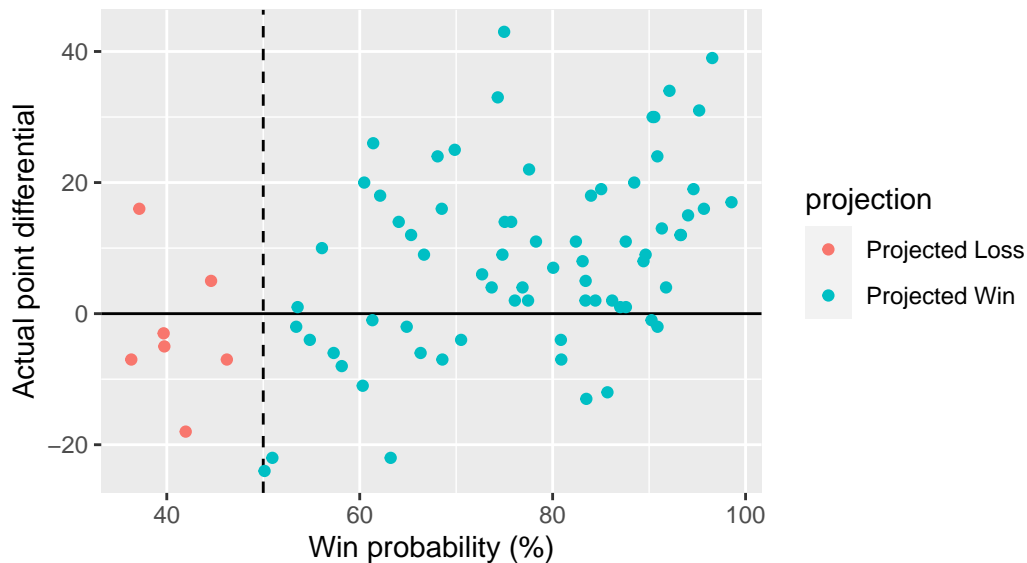
Joining with `by = join_by(date, team.x, opp.x, game_location, tempo.x, ppp, pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y, opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg, off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score, season, tempo.y, game_id, coach, opp_coach, year.y)`

```
test <- test %>%
  mutate(diff = pts_scored - pts_allowed,
    projection = case_when(win_per > 50 ~ "Projected Win",
      win_per < 50 ~ "Projected Loss",
      TRUE ~ "Too close to call")) %>%
  filter(!is.na(win_per))

test %>%
  ggplot(aes(x = win_per, y = diff, color = projection)) +
  geom_hline(yintercept = 0, linetype = 1) +
  geom_vline(xintercept = 50, linetype = 2) +
  geom_point() +
  #geom_rect(xmin = 45, xmax = 55, ymin = -1000, ymax = 1000, alpha = 0, color = "White", l
  labs(title = "Duke's ACC wins and losses in 2020-23",
    subtitle = "Comparing projected win probability to actual point difference",
    x = "Win probability (%)",
    y = "Actual point differential")
```

Duke's ACC wins and losses in 2020–23

Comparing projected win probability to actual point difference



```
unc_data <- cbd_torvik_game_factors() %>%
  filter(team == 'North Carolina')

acc_2023_unc <- full_join(cbd_torvik_season_prediction("North Carolina", 2023, date = "2023-01-01"),
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

acc_2022_unc <- full_join(cbd_torvik_season_prediction("North Carolina", 2022, "20220101"),
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

test_unc <- full_join(acc_2023_unc, acc_2022_unc)
```

Joining with `by = join_by(date, team.x, opp.x, game_location, tempo.x, ppp, pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y, opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg, off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score, season, tempo.y, game_id, coach, opp_coach, year.y)`


```
acc_2021_unc <- full_join(cbd_torvik_season_prediction("North Carolina", 2021, "20210101"))
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

test_unc <- full_join(test_unc, acc_2021_unc)
```

Joining with `by = join_by(date, team.x, opp.x, game_location, tempo.x, ppp, pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y, opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg, off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score, season, tempo.y, game_id, coach, opp_coach, year.y)`

```
acc_2020_unc <- full_join(cbd_torvik_season_prediction("North Carolina", 2020, "20200101"))
  select(-location, -avg_marg) %>%
  filter(! is.na(pts_scored), opp_conf == "ACC", !is.na(team.x))

test_unc <- full_join(test_unc, acc_2020_unc)
```

Joining with `by = join_by(date, team.x, opp.x, game_location, tempo.x, ppp, pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y, opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg, off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score, season, tempo.y, game_id, coach, opp_coach, year.y)`

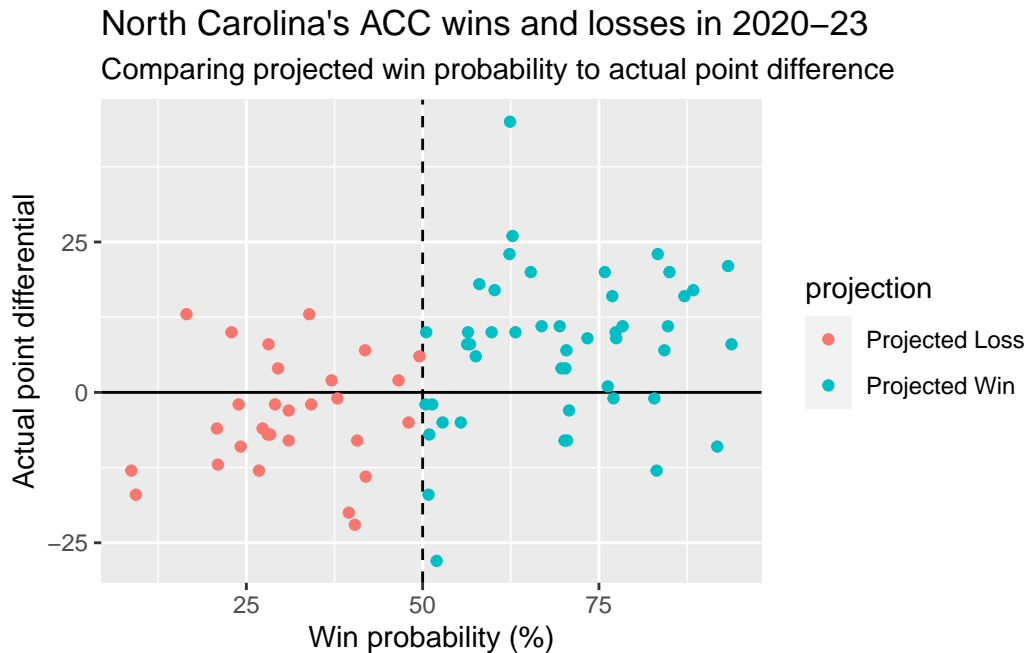
```
test_unc <- test_unc %>%
  mutate(diff = pts_scored - pts_allowed,
         projection = case_when(win_per > 50 ~ "Projected Win",
                                win_per < 50 ~ "Projected Loss",
                                TRUE ~ "Too close to call")) %>%
  filter(!is.na(win_per), team.x == "North Carolina")

test_unc %>%
  ggplot(aes(x = win_per, y = diff, color = projection)) +
  #facet_wrap(~year.y) +
  geom_hline(yintercept = 0, linetype = 1) +
  geom_vline(xintercept = 50, linetype = 2) +
  geom_point() +
  #geom_rect(xmin = 45, xmax = 55, ymin = -1000, ymax = 1000, alpha = 0, color = "White", l
  labs(title = "North Carolina's ACC wins and losses in 2020-23",
```

```

subtitle = "Comparing projected win probability to actual point difference",
x = "Win probability (%)",
y = "Actual point differential")

```



```

#library(caret)

conf_mat_data <- test %>%
  #filter(projection != "Too close to call") %>%
  mutate(projection_bin = fct_relevel(as.factor(if_else(projection == "Projected Win", 1,
    result_bin = fct_relevel(as.factor(if_else(result == "W", 1, 0))), "1")
conf_matrix <- confusionMatrix(data=conf_mat_data$projection_bin, reference = conf_mat_data$result_bin)

```

Warning in confusionMatrix.default(data = conf_mat_data\$projection_bin, :
Levels are not in the same order for reference and data. Refactoring data to match.

```
conf_matrix
```

Confusion Matrix and Statistics

| | Reference | |
|------------|-----------|----|
| Prediction | 0 | 1 |
| 0 | 5 | 2 |
| 1 | 19 | 52 |

Accuracy : 0.7308
 95% CI : (0.6184, 0.825)
 No Information Rate : 0.6923
 P-Value [Acc > NIR] : 0.2732702

Kappa : 0.2133

McNemar's Test P-Value : 0.0004803

Sensitivity : 0.9630
 Specificity : 0.2083
 Pos Pred Value : 0.7324
 Neg Pred Value : 0.7143
 Prevalence : 0.6923
 Detection Rate : 0.6667
 Detection Prevalence : 0.9103
 Balanced Accuracy : 0.5856

'Positive' Class : 1

```

conf_mat_data_unc <- test_unc %>%
  filter(projection != "Too close to call") %>%
  mutate(projection_bin = fct_relevel(as.factor(if_else(projection == "Projected Win", 1,
    result_bin = fct_relevel(as.factor(if_else(result == "W", 1, 0))), "1")
conf_matrix_unc <- confusionMatrix(data=conf_mat_data_unc$projection_bin, reference = conf
  
```

Warning in confusionMatrix.default(data = conf_mat_data_unc\$projection_bin, :
Levels are not in the same order for reference and data. Refactoring data to
match.

```
conf_matrix_unc
```

Confusion Matrix and Statistics

| | Reference | |
|------------|-----------|----|
| Prediction | 0 | 1 |
| 0 | 20 | 9 |
| 1 | 14 | 33 |

Accuracy : 0.6974
 95% CI : (0.5813, 0.7975)
 No Information Rate : 0.5526
 P-Value [Acc > NIR] : 0.007009

Kappa : 0.3793

McNemar's Test P-Value : 0.404248

Sensitivity : 0.7857
 Specificity : 0.5882
 Pos Pred Value : 0.7021
 Neg Pred Value : 0.6897
 Prevalence : 0.5526
 Detection Rate : 0.4342
 Detection Prevalence : 0.6184
 Balanced Accuracy : 0.6870

'Positive' Class : 1

```

real_results <- real_results %>%
  mutate(bin_win = as.factor(if_else(diff > 0, 1,0)))

full_predictions <- full_predictions %>%
  mutate(bin_win = as.factor(if_else(diff > 0, 1,0)))

filtered_predictions <- full_predictions %>%
  filter(team == "Duke")

confusionMatrix(data=filtered_predictions$bin_win, reference = real_results$bin_win, posit

```

Warning in confusionMatrix.default(data = filtered_predictions\$bin_win, :
Levels are not in the same order for reference and data. Refactoring data to
match.

Confusion Matrix and Statistics

Reference
Prediction 0 1
0 3 3
1 5 7

Accuracy : 0.5556
95% CI : (0.3076, 0.7847)
No Information Rate : 0.5556
P-Value [Acc > NIR] : 0.5966

Kappa : 0.0769

McNemar's Test P-Value : 0.7237

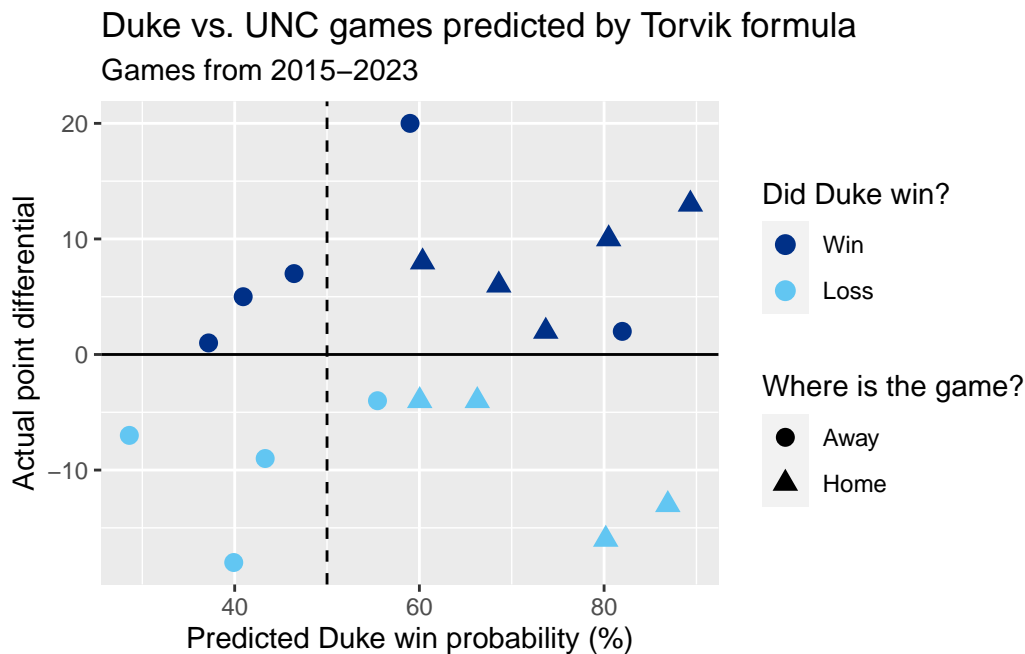
Sensitivity : 0.7000
Specificity : 0.3750
Pos Pred Value : 0.5833
Neg Pred Value : 0.5000
Prevalence : 0.5556
Detection Rate : 0.3889
Detection Prevalence : 0.6667
Balanced Accuracy : 0.5375

'Positive' Class : 1

```
joined_pred_real <- full_join(real_results,full_predictions, by = join_by(date))

joined_pred_real %>%
  mutate(win_cat = fct_relevel(if_else(bin_win.x == 1, "Win", "Loss"),"Win")) %>%
  filter(team == "Duke") %>%
  ggplot(aes(x=win_per,y=diff.x,color = win_cat, shape = duke_home.x)) +
  geom_point(size = 3) +
  scale_color_manual(values = c("#003087","#62C6F2")) +
  geom_hline(yintercept = 0, linetype = 1) +
  geom_vline(xintercept = 50, linetype = 2) +
  labs(title = "Duke vs. UNC games predicted by Torvik formula",
       subtitle = "Games from 2015-2023",
       x = "Predicted Duke win probability (%)",
       y = "Actual point differential",
```

```
color = "Did Duke win?",
shape = "Where is the game?")
```



```
both_teams <- full_join(test,test_unc)
```

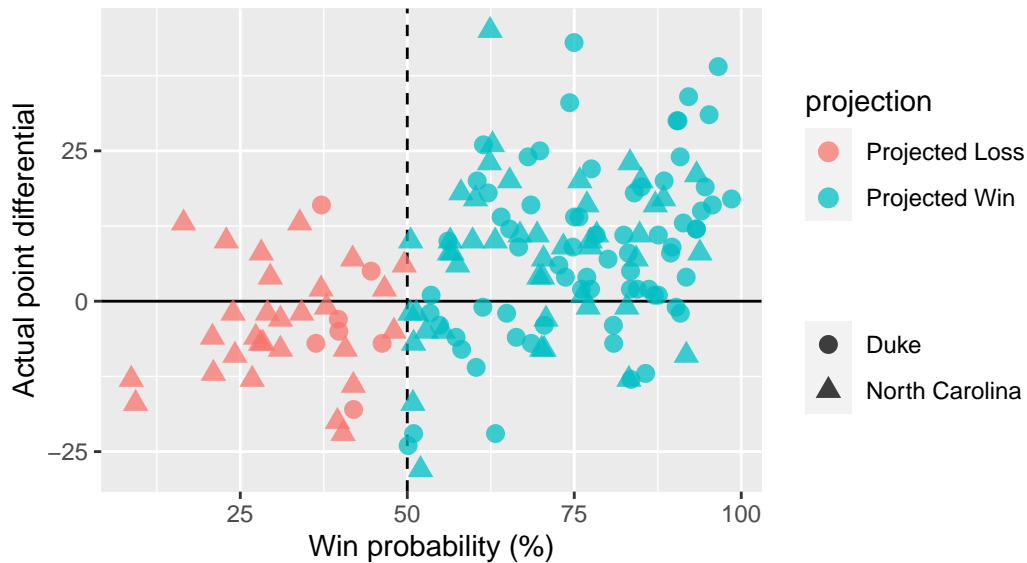
```
Joining with `by` = join_by(date, team.x, opp.x, game_location, tempo.x, ppp,
pts, win_per, did_win, simulate_date, year.x, type, team.y, conf, opp.y,
opp_conf, loc, result, pts_scored, pts_allowed, adj_o, adj_d, off_ppp, off_efg,
off_to, off_or, off_ftr, def_ppp, def_efg, def_to, def_or, def_ftr, game_score,
season, tempo.y, game_id, coach, opp_coach, year.y, diff, projection)`
```

```
both_teams %>%
  ggplot(aes(x = win_per, y = diff, color = projection, shape = team.x)) +
  geom_hline(yintercept = 0, linetype = 1) +
  geom_vline(xintercept = 50, linetype = 2) +
  geom_point(size = 3, alpha = 0.75) +
  labs(title = "Duke and UNC's ACC wins and losses from 2020–23",
       subtitle = "Comparing projected win probability to actual point difference",
       shape = "",
       x = "Win probability (%)",
```

```
y = "Actual point differential")
```

Duke and UNC's ACC wins and losses from 2020–23

Comparing projected win probability to actual point difference



```
conf_mat_data_combo <- both_teams %>%
  mutate(projection_bin = fct_relevel(as.factor(if_else(projection == "Projected Win", 1,
    result_bin = fct_relevel(as.factor(if_else(result == "W", 1, 0))), "1")
conf_matrix_combo <- confusionMatrix(data=conf_mat_data_combo$projection_bin, reference =
```

Warning in confusionMatrix.default(data = conf_mat_data_combo\$projection_bin, :
Levels are not in the same order for reference and data. Refactoring data to
match.

```
conf_matrix_combo
```

Confusion Matrix and Statistics

| | Reference | |
|------------|-----------|----|
| Prediction | 0 | 1 |
| 0 | 25 | 11 |
| 1 | 33 | 85 |

Accuracy : 0.7143
95% CI : (0.636, 0.7841)
No Information Rate : 0.6234
P-Value [Acc > NIR] : 0.011316

Kappa : 0.3421

McNemar's Test P-Value : 0.001546

Sensitivity : 0.8854
Specificity : 0.4310
Pos Pred Value : 0.7203
Neg Pred Value : 0.6944
Prevalence : 0.6234
Detection Rate : 0.5519
Detection Prevalence : 0.7662
Balanced Accuracy : 0.6582

'Positive' Class : 1