

# WBB PBP Analysis

December 21, 2022

*#points scored on a possession minus the average points per possession for each game (summed per player)  
#players with a positive number lead to high value possessions when they shoot  
#players with a negative number lead to low value possessions when they shoot*

```
pbp %>%
```

```
  group_by(date) %>%
  filter(action == "GOOD" | action == "MISS") %>%
  mutate(points_scored = ifelse(action == "GOOD" & type == "LAYUP", 2, 0),
         points_scored = ifelse(action == "GOOD" & type == "JUMPER", 2, points_scored),
         points_scored = ifelse(action == "GOOD" & type == "3PTR", 3, points_scored),
         points_scored = ifelse(action == "GOOD" & type == "LAYUP", 2, points_scored),
         points_scored = ifelse(action == "GOOD" & type == "FT", 1, points_scored),
         possession = 1,
         total_game_points = sum(points_scored),
         total_game_posSESSIONS = sum(posSESSIONS),
         exp_pos_pts = total_game_points/total_game_posSESSIONS,
         pts_over_exp = points_scored - exp_pos_pts) %>%
  ungroup() %>%
  group_by(checkname52) %>%
  summarise(total_points_added = sum(pts_over_exp),
            points_added_per = total_points_added/n()) %>%
  arrange(-points_added_per)
```

```
## # A tibble: 10 x 3
##   checkname52      total_points_added points_added_per
##   <chr>          <dbl>          <dbl>
## 1 HEGLAND,GRACE    14.1            0.205
## 2 BOTTEN,CAYDEN     3.36           0.135
## 3 KELLY,RACHEL    11.5            0.124
## 4 OLMEN,SOPHIE     4.75           0.0779
## 5 YAGODINSKI,PAIGE  4.44           0.0511
## 6 TANGEN,SARAH    -4.52          -0.146
## 7 FIX,CASSIE     -17.8          -0.259
## 8 HOWDESHELL,SARAH -3.33          -0.416
## 9 ZHEN,ZILING     -5.99          -0.544
## 10 KORMANN,SOPHIA  -6.54          -0.654
```

*#same table as above, but by quarter*

```
quarter_max <- pbp %>%
  group_by(date) %>%
  filter(action == "GOOD" | action == "MISS") %>%
  mutate(points_scored = ifelse(action == "GOOD" & type == "LAYUP", 2, 0),
         points_scored = ifelse(action == "GOOD" & type == "JUMPER", 2, points_scored),
         points_scored = ifelse(action == "GOOD" & type == "3PTR", 3, points_scored),
         points_scored = ifelse(action == "GOOD" & type == "LAYUP", 2, points_scored),
```

```

    points_scored = ifelse(action == "GOOD" & type == "FT", 1, points_scored),
    possession = 1,
    total_game_points = sum(points_scored),
    total_game_possessions = sum(possession),
    exp_pos_pts = total_game_points/total_game_possessions,
    pts_over_exp = points_scored - exp_pos_pts) %>%
ungroup() %>%
group_by(checkname52, quarter) %>%
summarise(points_added = sum(pts_over_exp)) %>%
arrange(quarter, -points_added)

```

## 'summarise()' has grouped output by 'checkname52'. You can override using the  
## '.groups' argument.

```

pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(action == "ASSIST" | action == "TURNOVER") %>%
  group_by(checkname52) %>%
  summarise(assists = sum(action == "ASSIST"),
            turnovers = sum(action == "TURNOVER"),
            `a/t` = assists/turnovers) %>%
  arrange(-`a/t`)

```

```

## # A tibble: 10 x 4
##   checkname52      assists turnovers   'a/t'
##   <chr>          <int>     <int>   <dbl>
## 1 HOWDESHELL,SARAH      4         0    Inf
## 2 FIX,CASSIE            18        18     1
## 3 YAGODINSKI,PAIGE      19        20    0.95
## 4 OLMEN,SOPHIE          11        12    0.917
## 5 KELLY,RACHEL          13        34    0.382
## 6 HEGLAND,GRACE          9        25    0.36
## 7 ZHEN,ZILING           2         8    0.25
## 8 BOTTEN,CAYDEN          1         8    0.125
## 9 TANGEN,SARAH           1         9    0.111
## 10 KORMANN,SOPHIA        0         2     0

```

```

#pbp %>%
#  filter(action == "TURNOVER" | action == "ASSIST") %>%

```

```

shooting_by_quarter <- pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(type != "FT") %>%
  group_by(checkname52, quarter) %>%
  mutate(points = ifelse(action == "GOOD" & type == "LAYUP", 2, 0),
         points = ifelse(action == "GOOD" & type == "JUMPER", 2, points),
         points = ifelse(action == "GOOD" & type == "3PTR", 3, points),
         points = ifelse(action == "GOOD" & type == "LAYUP", 2, points),
         points = ifelse(action == "GOOD" & type == "FT", 1, points)) %>%
  summarise(total_points = sum(points),
            shots = sum(action == "GOOD") + sum(action == "MISS"),
            shooting_pct = sum(action == "GOOD")/

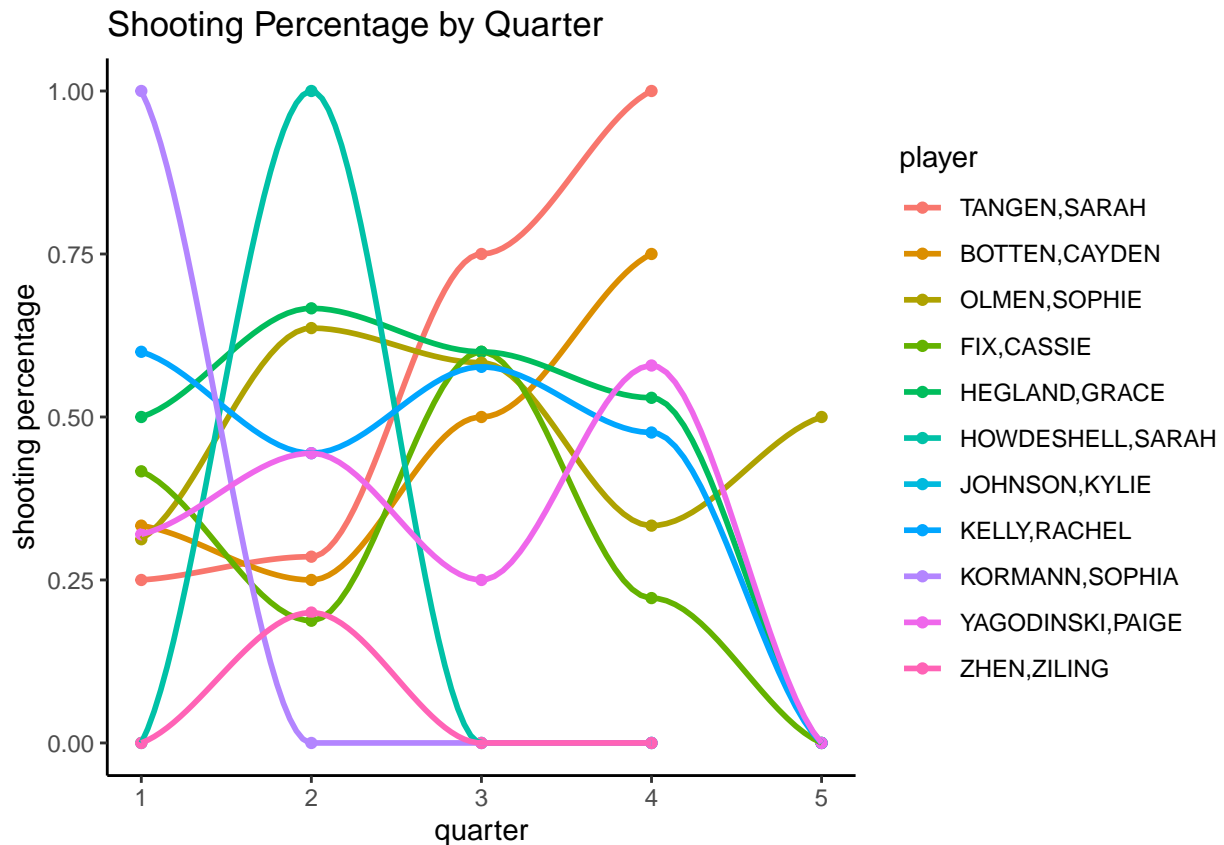
```

```
(sum(action == "GOOD") + sum(action == "MISS")),
shooting_pct = ifelse(is.na(shooting_pct), 0, shooting_pct))
```

## 'summarise()' has grouped output by 'checkname52'. You can override using the  
## '.groups' argument.

```
ggplot(data = shooting_by_quarter,
      aes(x = quarter,
          y = shooting_pct,
          color = fct_reorder2(checkname52, quarter, shooting_pct))) +
  geom_point() +
  #geom_line() +
  geom_smooth(se = FALSE) +
  labs(title = "Shooting Percentage by Quarter",
       y = "shooting percentage",
       color = "player") +
  theme_classic()
```

## 'geom\_smooth()' using method = 'loess' and formula 'y ~ x'



```
shooting_by_quarter <- shooting_by_quarter %>%
  mutate(checkname52 = tolower(checkname52))
```

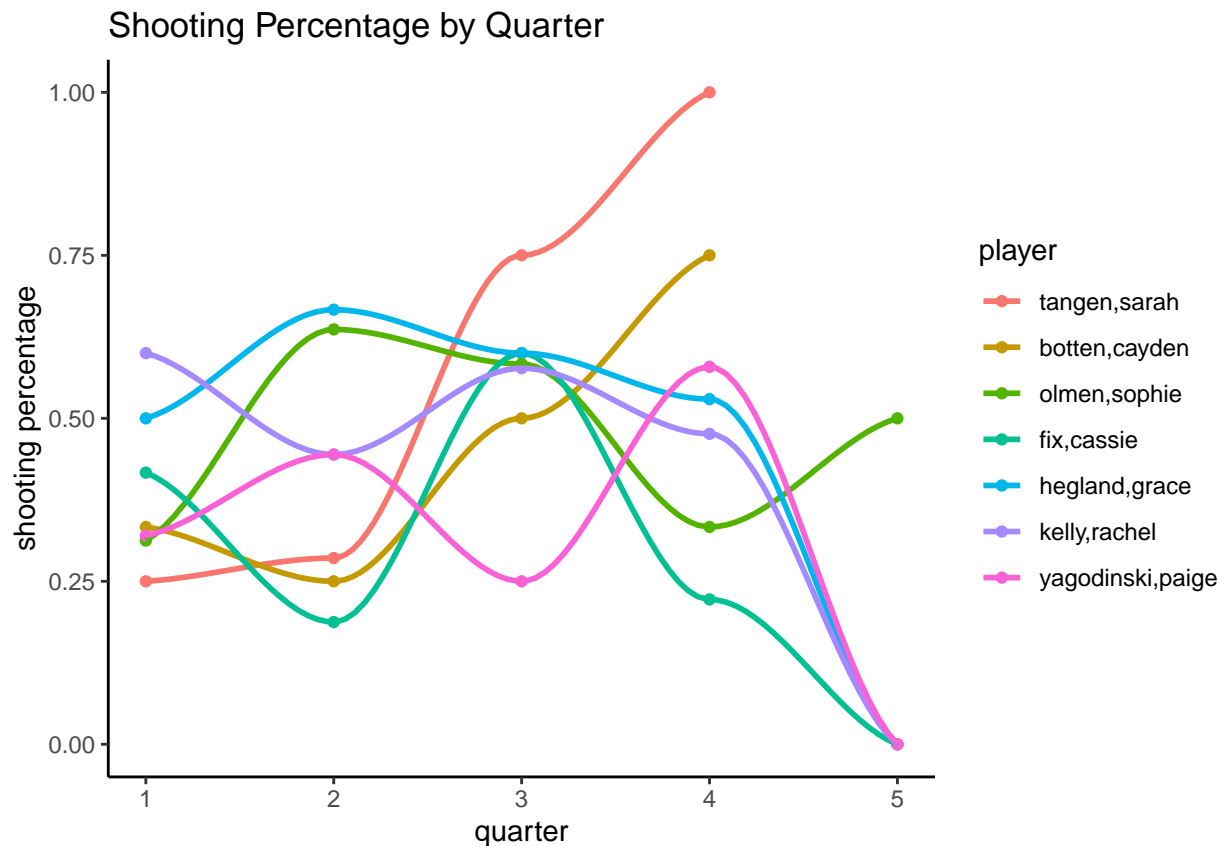
```

#filter out players with low volume to make it neater
shooting_by_quarter2 <- shooting_by_quarter %>%
  filter(checkname52 != "johnson,kylie", checkname52 != "howdeshell,sarah", checkname52 != "kormann,sophi

ggplot(data = shooting_by_quarter2,
  aes(x = quarter,
      y = shooting_pct,
      color = fct_reorder2(checkname52, quarter, shooting_pct))) +
  geom_point() +
  #geom_line() +
  geom_smooth(se = FALSE) +
  labs(title = "Shooting Percentage by Quarter",
      y = "shooting percentage",
      color = "player") +
  theme_classic()

```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



```

#just starters
shooting_by_quarter3 <- shooting_by_quarter2 %>%
  filter(checkname52 != "tangen,sarah", checkname52 != "botten,cayden")

#just starters
ggplot(data = shooting_by_quarter3,
  aes(x = quarter,

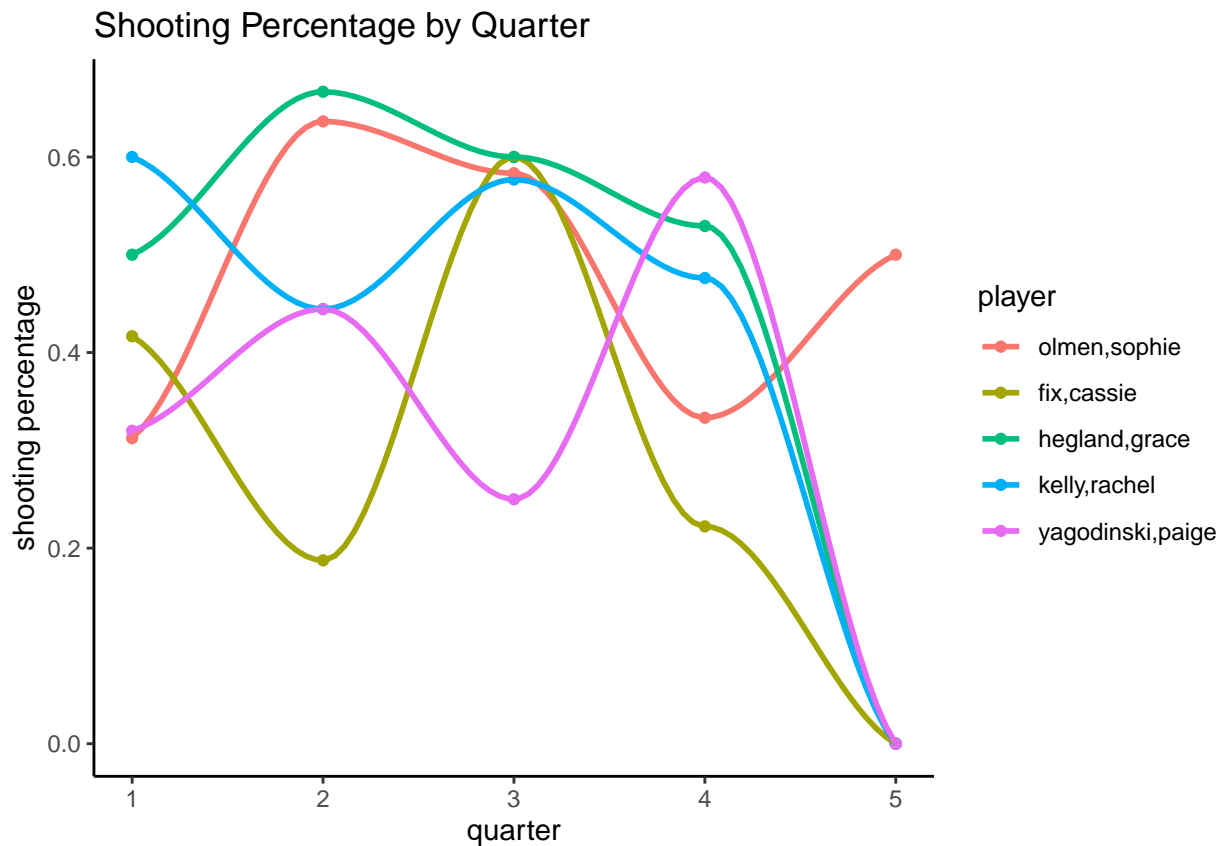
```

```

    y = shooting_pct,
    color = fct_reorder2(checkname52, quarter, shooting_pct))) +
  geom_point() +
  #geom_line() +
  geom_smooth(se = FALSE) +
  labs(title = "Shooting Percentage by Quarter",
    y = "shooting percentage",
    color = "player") +
  theme_classic()

```

## 'geom\_smooth()' using method = 'loess' and formula 'y ~ x'



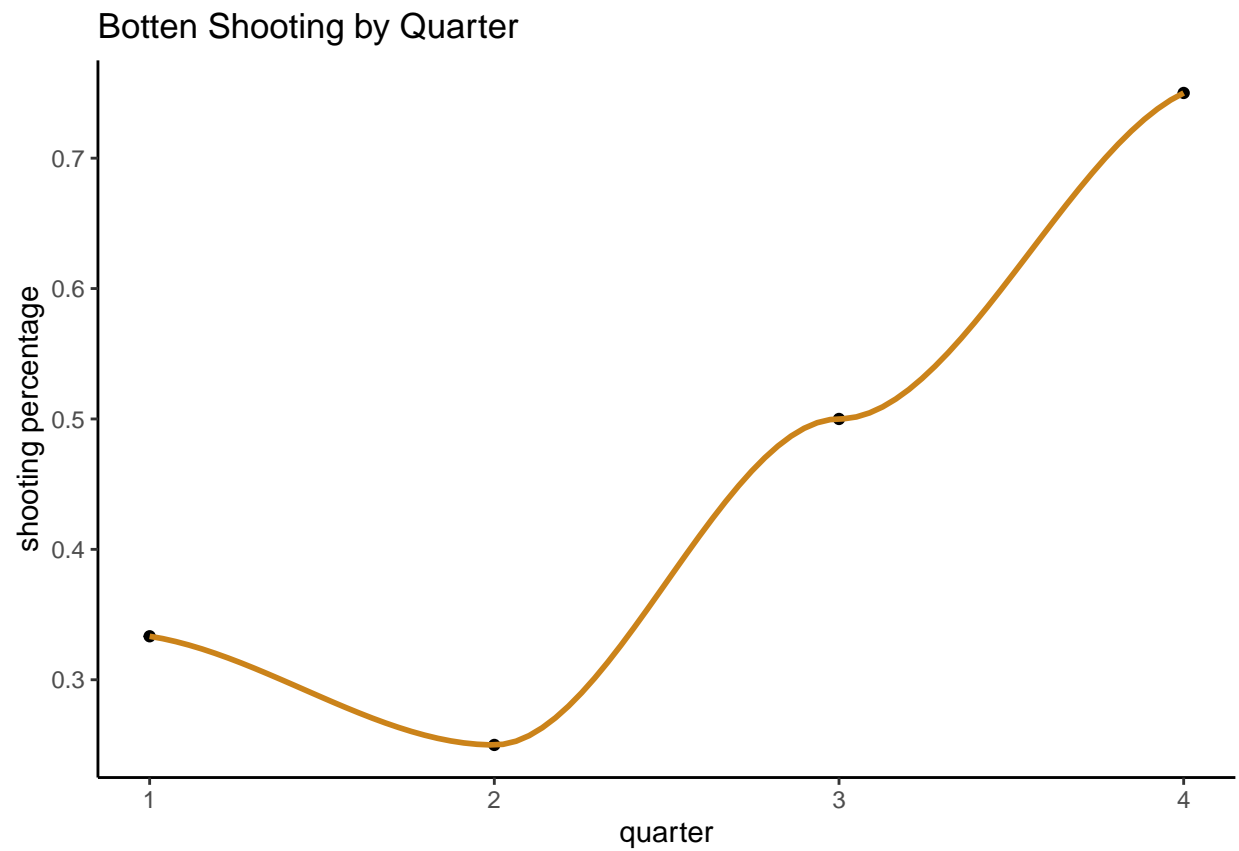
```

quarterly_shooting <- function(player){
  shooting_by_quarter %>%
    filter(str_detect(checkname52, {{player}})) %>%
    ggplot(aes(x = quarter, y = shooting_pct)) +
    geom_point() +
    geom_smooth(color = "#CB831A") +
    labs(title = str_c(str_to_title({{player}}), " Shooting by Quarter"),
      y = "shooting percentage") +
    theme_classic()
}

quarterly_shooting("botten")

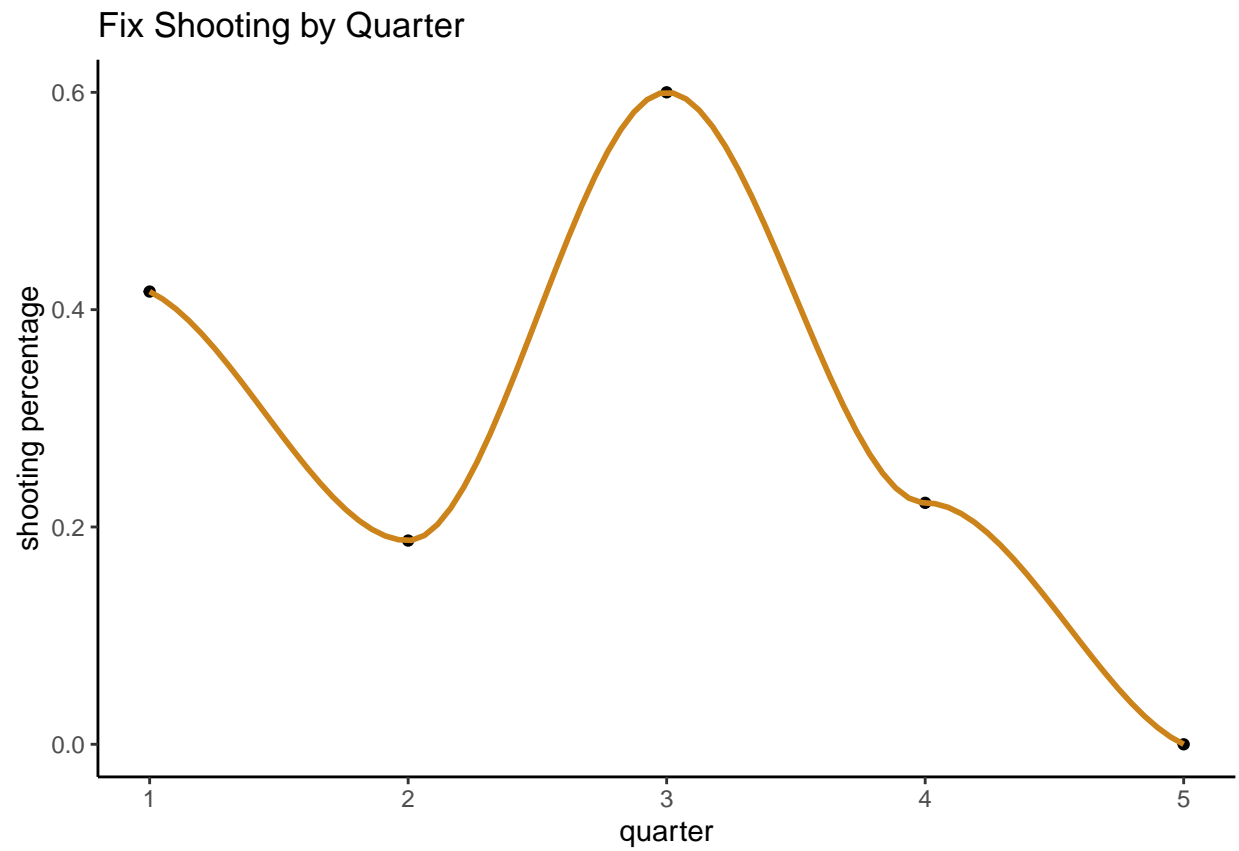
```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



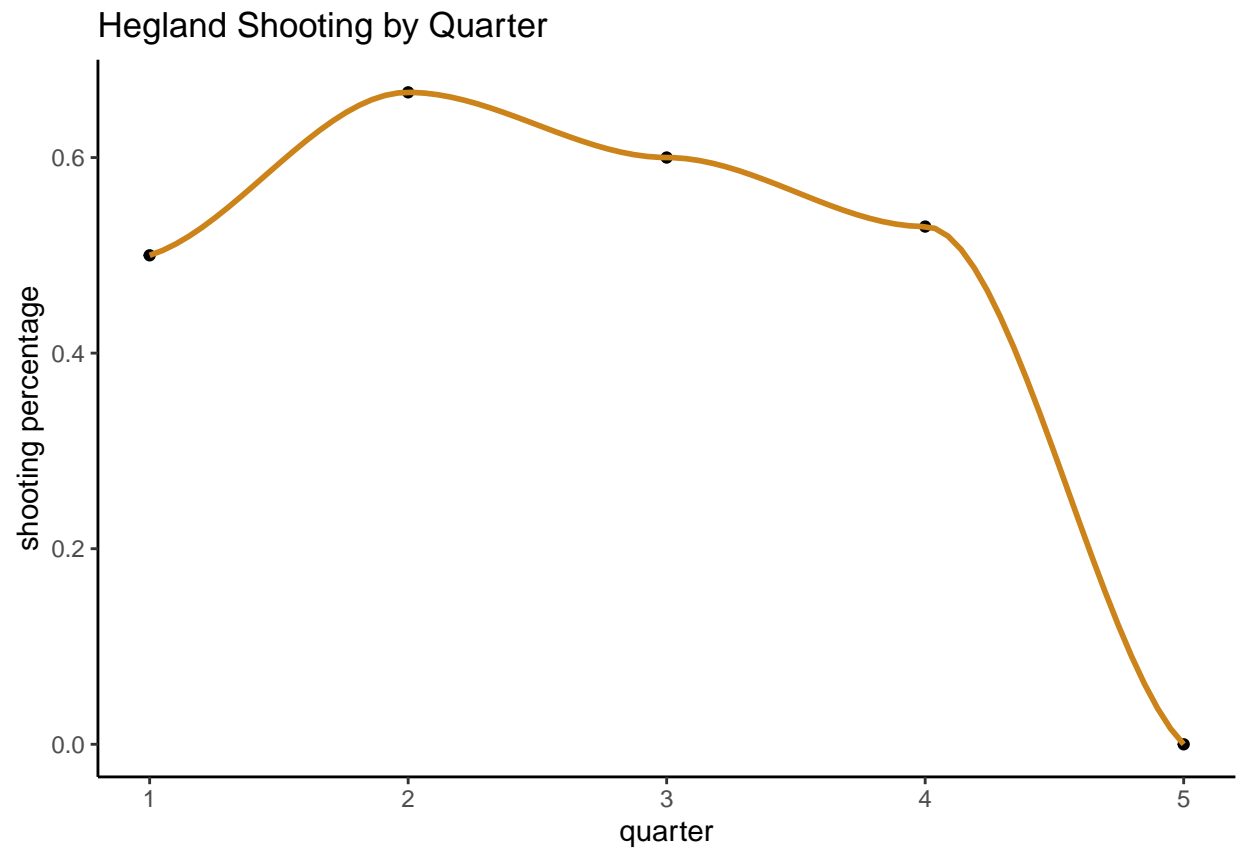
```
quarterly_shooting("fix")
```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



```
quarterly_shooting("hegland")
```

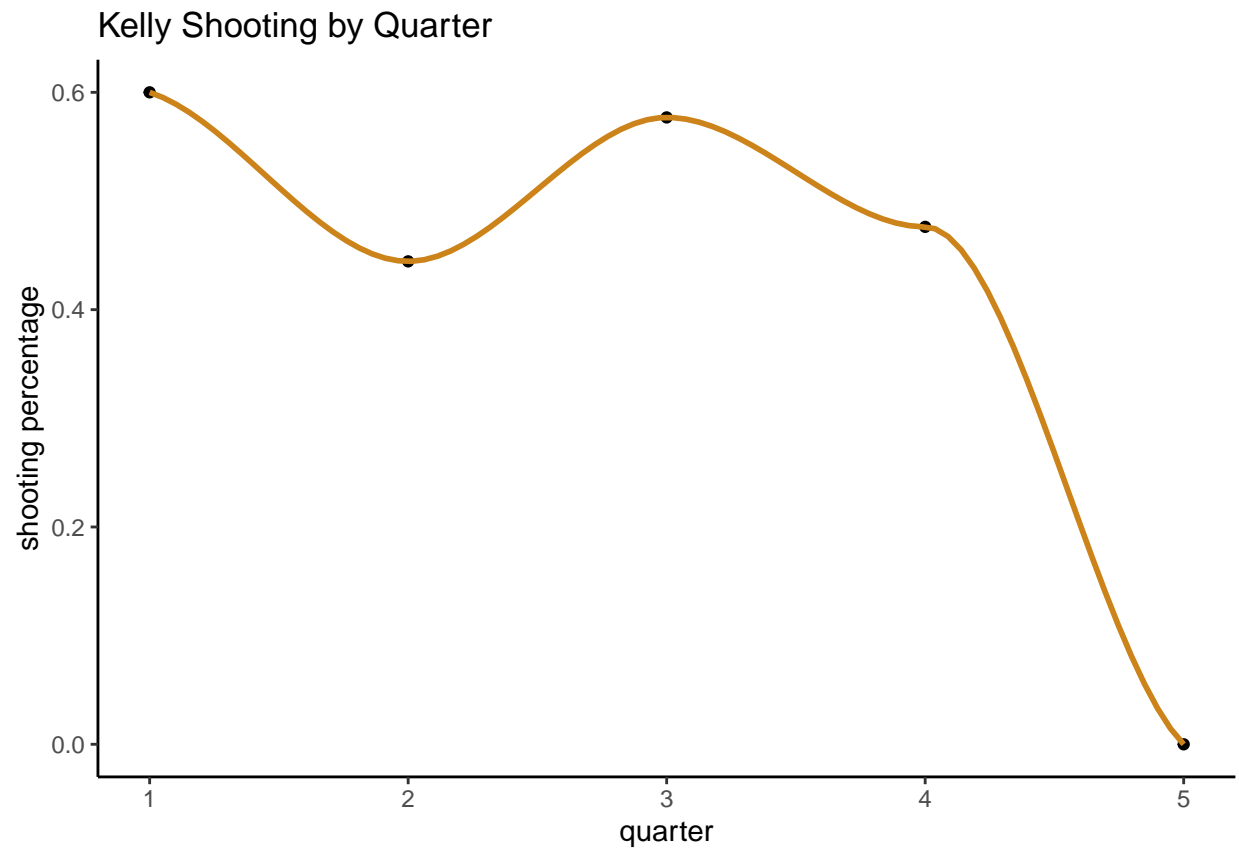
```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



```
quarterly_shooting("kelly")
```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```





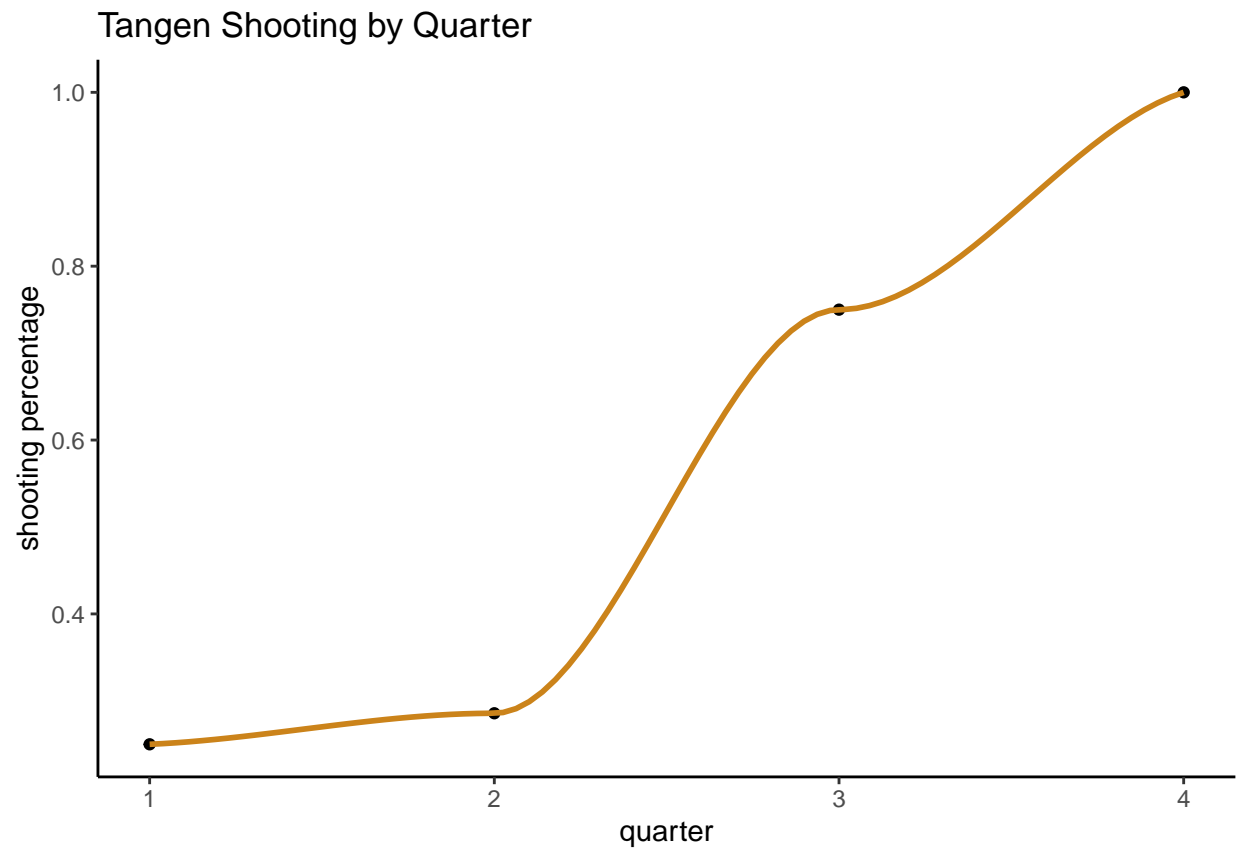
```
quarterly_shooting("olmen")
```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



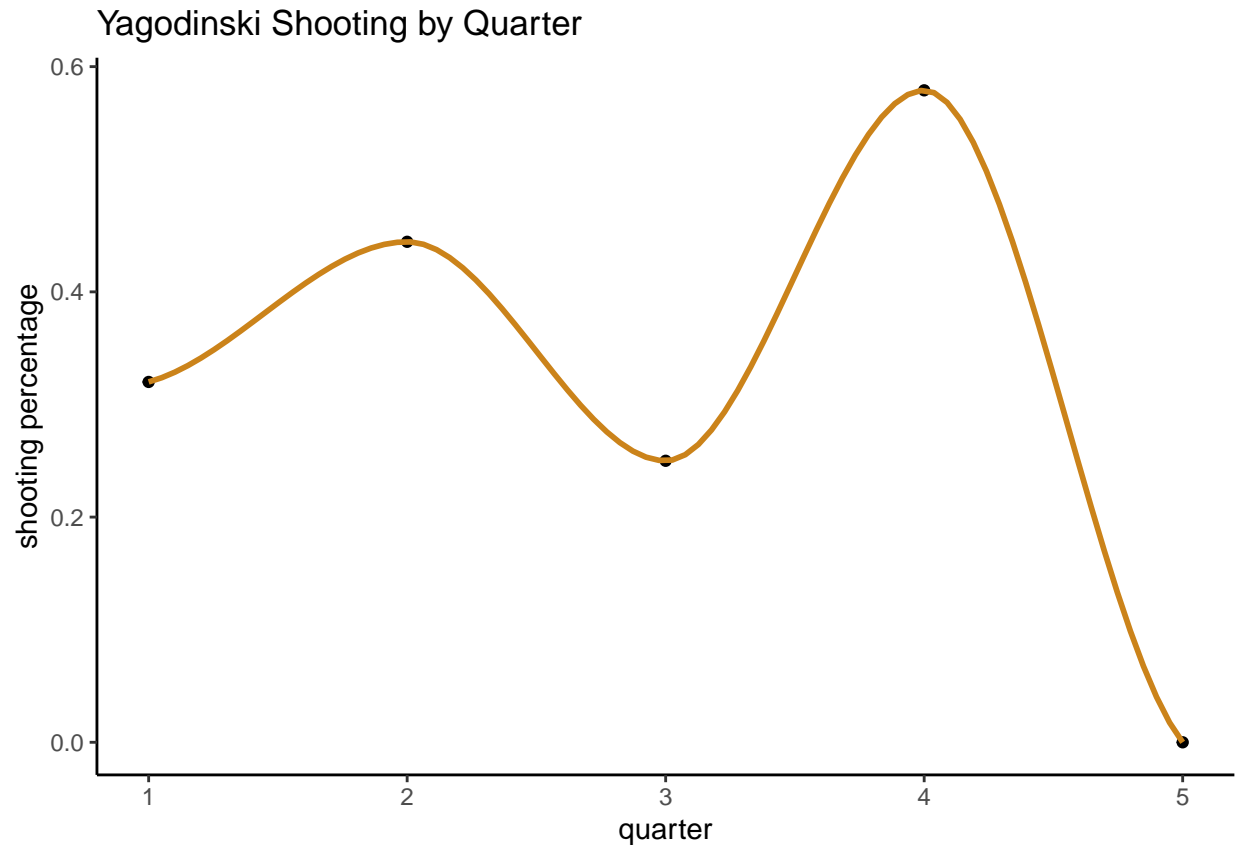
```
quarterly_shooting("tangen")
```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



```
quarterly_shooting("yagodinski")
```

```
## 'geom_smooth()' using method = 'loess' and formula 'y ~ x'
```



```
#strong first quarter shooters: hegland, kelly
#strong second quarter shooters: hegland, olmen
#strong third quarter shooters: fix, hegland, kelly, olmen, tangen
#strong fourth quarter shooters: botten, hegland, tangen, yagodinski
```

```
#points per shot (excluding free throws)
pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(type != "FT") %>%
  group_by(checkname52) %>%
  mutate(points = ifelse(action == "GOOD" & type == "LAYUP", 2, 0),
         points = ifelse(action == "GOOD" & type == "JUMPER", 2, points),
         points = ifelse(action == "GOOD" & type == "3PTR", 3, points),
         points = ifelse(action == "GOOD" & type == "LAYUP", 2, points)) %>%
  summarise(total_points = sum(points),
            shots = sum(action == "GOOD") + sum(action == "MISS"),
            pts_per_shot = total_points/shots) %>%
  arrange(-pts_per_shot)
```

```
## # A tibble: 11 x 4
##   checkname52    total_points shots pts_per_shot
##   <chr>          <dbl>   <int>    <dbl>
## 1 HEGLAND,GRACE      67     55      1.22
## 2 KELLY,RACHEL      86     77      1.12
## 3 OLMEN,SOPHIE      54     50      1.08
```

```
## 4 BOTTEN,CAYDEN      26    25      1.04
## 5 YAGODINSKI,PAIGE   76    76      1
## 6 TANGEN,SARAH       20    23      0.870
## 7 FIX,CASSIE         33    49      0.673
## 8 HOWDESHELL,SARAH   2     6      0.333
## 9 KORMANN,SOPHIA     2     9      0.222
## 10 ZHEN,ZILING       2     9      0.222
## 11 JOHNSON,KYLIE     0     0      NaN
```

*#shot distribution by player*

```
pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(action == "GOOD" | action == "MISS") %>%
  group_by(checkname52) %>%
  summarise(layups = sum(type == "LAYUP"),
            mid_range = sum(type == "JUMPER"),
            threes = sum (type == "3PTR")
  )
```

```
## # A tibble: 10 x 4
##   checkname52    layups mid_range threes
##   <chr>          <int>    <int>  <int>
## 1 BOTTEN,CAYDEN      8        7     10
## 2 FIX,CASSIE         8       31     10
## 3 HEGLAND,GRACE     35        8     12
## 4 HOWDESHELL,SARAH   2         4      0
## 5 KELLY,RACHEL      46       21     10
## 6 KORMANN,SOPHIA     8         1      0
## 7 OLMEN,SOPHIE       6       22     22
## 8 TANGEN,SARAH       6       10      7
## 9 YAGODINSKI,PAIGE   16       11     49
## 10 ZHEN,ZILING       1         7      1
```

```
pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(action == "GOOD" | action == "MISS") %>%
  group_by(checkname52) %>%
  summarise(layups = sum(type == "LAYUP"),
            layup_pct = sum(action == "GOOD" & type == "LAYUP") /
              sum(type == "LAYUP")
  ) %>%
  filter(layups > 5) %>%
  arrange(-layup_pct)
```

```
## # A tibble: 8 x 3
##   checkname52    layups layup_pct
##   <chr>          <int>    <dbl>
## 1 YAGODINSKI,PAIGE   16    0.75
## 2 OLMEN,SOPHIE       6    0.667
## 3 KELLY,RACHEL      46    0.630
## 4 FIX,CASSIE         8    0.625
## 5 HEGLAND,GRACE     35    0.6
## 6 BOTTEN,CAYDEN      8    0.5
```

```
## 7 TANGEN,SARAH      6      0.333
## 8 KORMANN,SOPHIA    8      0.125
```

```
pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(action == "GOOD" | action == "MISS") %>%
  group_by(checkname52) %>%
  summarise(mid_range = sum(type == "JUMPER"),
            mid_pct = sum(action == "GOOD" & type == "JUMPER") /
              sum(type == "JUMPER")
            ) %>%
  filter(mid_range > 5) %>%
  arrange(-mid_pct)
```

```
## # A tibble: 8 x 3
##   checkname52      mid_range mid_pct
##   <chr>          <int>   <dbl>
## 1 HEGLAND,GRACE      8   0.625
## 2 OLMEN,SOPHIE     22   0.5
## 3 TANGEN,SARAH     10   0.5
## 4 BOTTEN,CAYDEN      7  0.429
## 5 KELLY,RACHEL     21  0.381
## 6 FIX,CASSIE       31  0.323
## 7 YAGODINSKI,PAIGE  11  0.182
## 8 ZHEN,ZILING       7  0.143
```

```
pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(action == "GOOD" | action == "MISS") %>%
  group_by(checkname52) %>%
  summarise(threes = sum(type == "3PTR"),
            three_pct = sum(action == "GOOD" & type == "3PTR") /
              sum(type == "3PTR")
            ) %>%
  filter(threes > 5) %>%
  arrange(-three_pct)
```

```
## # A tibble: 7 x 3
##   checkname52      threes three_pct
##   <chr>          <int>   <dbl>
## 1 HEGLAND,GRACE     12   0.417
## 2 BOTTEN,CAYDEN     10   0.4
## 3 KELLY,RACHEL      10   0.4
## 4 OLMEN,SOPHIE     22  0.364
## 5 YAGODINSKI,PAIGE  49  0.327
## 6 TANGEN,SARAH      7  0.286
## 7 FIX,CASSIE       10   0.1
```

```
pbp %>%
  group_by(checkname52) %>%
  filter(action == "GOOD" | action == "MISS") %>%
  summarise(fts = sum(type == "FT"),
```

```

    ft_pct = sum(action == "GOOD" & type == "FT") /
      sum(type == "FT")
  ) %>%
  filter(fts > 5) %>%
  arrange(-ft_pct)

```

```

## # A tibble: 6 x 3
##   checkname52      fts ft_pct
##   <chr>          <int> <dbl>
## 1 HEGLAND,GRACE      14  0.714
## 2 OLMEN,SOPHIE       11  0.636
## 3 KELLY,RACHEL      16  0.625
## 4 FIX,CASSIE        20  0.6
## 5 YAGODINSKI,PAIGE   11  0.545
## 6 TANGEN,SARAH       8  0.5

```

```

pbp %>%
  filter(action == "GOOD" | action == "MISS") %>%
  mutate(points = ifelse(action == "GOOD" & type == "LAYUP", 2, 0),
    points = ifelse(action == "GOOD" & type == "JUMPER", 2, points),
    points = ifelse(action == "GOOD" & type == "3PTR", 3, points),
    points = ifelse(action == "GOOD" & type == "LAYUP", 2, points),
    points = ifelse(action == "GOOD" & type == "FT", 1, points)) %>%
  group_by(checkname52) %>%
  summarise(`TS%` = 100*sum(points) /
    (2*(sum(type == "LAYUP" | type == "JUMPER" | type == "3PTR") +
      0.44*sum(type == "FT"))
    )
  ) %>%
  arrange(-`TS%`)

```

```

## # A tibble: 10 x 2
##   checkname52      `TS%`
##   <chr>          <dbl>
## 1 HEGLAND,GRACE    62.9
## 2 KELLY,RACHEL     57.1
## 3 OLMEN,SOPHIE     55.6
## 4 BOTTEN,CAYDEN    52
## 5 YAGODINSKI,PAIGE 50.7
## 6 TANGEN,SARAH     45.2
## 7 FIX,CASSIE       38.9
## 8 HOWDESHELL,SARAH 29.1
## 9 ZHEN,ZILING      20.2
## 10 KORMANN,SOPHIA  10.6

```

```

usage <- function(player){
  lineups %>%
    mutate(Lineup = tolower(Lineup)) %>%
    mutate(total_mins = sum(game_time)) %>%
    filter(str_detect(Lineup, {{player}})) %>%
    full_join(pbp) %>%

```

```

mutate(checkname52 = tolower(checkname52)) %>%
summarise(usage_rate = sum(100 * (sum(action == "MISS" | action == "GOOD" & type != "FT" & str_detect(
  ) * (total_mins/5) /
  sum(game_time) * (sum(action == "MISS" | action == "GOOD" & type != "FT") + 0.44 * sum(
  )
)
)
}

usage("kelly")

```

## Error in mutate(., Lineup = tolower(Lineup)): object 'lineups' not found

```

lineups %>%
  filter(str_detect(Lineup, "Botten")) %>%
  summarise(total_mins = sum(game_time))

```

## Error in filter(., str\_detect(Lineup, "Botten")): object 'lineups' not found

```

lineups %>%
  summarise(total_mins = sum(game_time))

```

## Error in summarise(., total\_mins = sum(game\_time)): object 'lineups' not found

```

rebounding <- function(player){
  lineups %>%
    mutate(Lineup = tolower(Lineup)) %>%
    mutate(total_mins = sum(game_time)) %>%
    filter(str_detect(Lineup, {{player}})) %>%
    left_join(pbp2) %>%
    mutate(checkname52 = tolower(checkname52)) %>%
    summarise(rebound_rate = 100 * (sum(action == "REBOUND" & str_detect(checkname52, {{player}})) * (t
      ) / (sum(game_time)*sum(action == "REBOUND")))
    ) %>%
    head(1)
}

rebounding("botten")

```

## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'h'

```
rebounding("fix")
```

## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'h'

```
rebounding("hegland")
```

## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'h'



```
rebouncing("kelly")
```

```
## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'rebouncing'
```

```
rebouncing("kormann")
```

```
## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'rebouncing'
```

```
rebouncing("olmen")
```

```
## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'rebouncing'
```

```
rebouncing("yagodinski")
```

```
## Error in h(simpleError(msg, call)): error in evaluating the argument 'x' in selecting a method for function 'rebouncing'
```

```
pbp %>%
  filter(action == "STEAL" | action == "BLOCK" | action == "FOUL") %>%
  group_by(checkname52) %>%
  summarise(steals = sum(action == "STEAL"),
            blocks = sum(action == "BLOCK"),
            fouls = sum(action == "FOUL"),
            contests = n(),
            foul_rate = fouls/contests) %>%
  arrange(foul_rate)
```

```
## # A tibble: 10 x 6
##   checkname52      steals blocks fouls contests foul_rate
##   <chr>          <int>  <int> <int>    <int>    <dbl>
## 1 FIX,CASSIE         14     3    15     32     0.469
## 2 HEGLAND,GRACE       9     6    16     31     0.516
## 3 KELLY,RACHEL        6    16    25     47     0.532
## 4 BOTTEN,CAYDEN        2     1     5      8     0.625
## 5 YAGODINSKI,PAIGE     6     2    17     25     0.68
## 6 OLMEN,SOPHIE         1     2    15     18     0.833
## 7 TANGEN,SARAH         0     1     7      8     0.875
## 8 HOWDESHELL,SARAH     0     0     2      2      1
## 9 KORMANN,SOPHIA        0     0     4      4      1
## 10 ZHEN,ZILING          0     0     4      4      1
```

```
#proportions of players rebounds that are offensive rebounds
```

```
pbp %>%
  filter(action == "REBOUND") %>%
  filter(checkname52 != "TEAM") %>%
  group_by(checkname52) %>%
  summarise(offensive = sum(type == "OFF"),
            defensive = sum(type == "DEF"),
            total = n(),
            off_reb_rate = offensive/total) %>%
  arrange(-off_reb_rate)
```

```
## # A tibble: 10 x 5
##   checkname52      offensive defensive total off_reb_rate
##   <chr>          <int>      <int> <int>      <dbl>
## 1 KORMANN,SOPHIA      6         5    11      0.545
## 2 HOWDESHELL,SARAH    2         3     5      0.4
## 3 OLMEN,SOPHIE        7        12    19      0.368
## 4 KELLY,RACHEL       17        37    54      0.315
## 5 HEGLAND,GRACE       17        41    58      0.293
## 6 TANGEN,SARAH        4         10    14      0.286
## 7 BOTTEN,CAYDEN       3         11    14      0.214
## 8 YAGODINSKI,PAIGE    11        48    59      0.186
## 9 FIX,CASSIE          5         25    30      0.167
## 10 ZHEN,ZILING        0         3     3      0
```

```
pbp_full %>%
  filter(action == "REBOUND") %>%
  group_by(date) %>%
  summarise(sto_off = sum(team == "STO" & type == "OFF"),
            sto_def = sum(team == "STO" & type == "DEF"),
            opp_off = sum(team != "STO" & type == "OFF"),
            opp_def = sum(team != "STO" & type == "DEF"),
            orb_pct = sto_off/(sto_off + opp_def),
            drb_pct = sto_def/(sto_def + opp_off)) %>%
  add_column(result = c(1,1,1,0,0,0,0))
```

```
## # A tibble: 7 x 8
##   date      sto_off sto_def opp_off opp_def orb_pct drb_pct result
##   <date>    <int>  <int>  <int>  <int>  <dbl>  <dbl>  <dbl>
## 1 2022-11-11    16    32    14    25  0.390  0.696    1
## 2 2022-11-12    10    31    20    17  0.370  0.608    1
## 3 2022-11-16    23    32    10    24  0.489  0.762    1
## 4 2022-11-19    13    35    19    21  0.382  0.648    0
## 5 2022-11-30     8    26    16    23  0.258  0.619    0
## 6 2022-12-03     8    28    13    14  0.364  0.683    0
## 7 2022-12-07     3    29     5    19  0.136  0.853    0
```

*#games where rebounding is higher generally corellate strongly with wins*

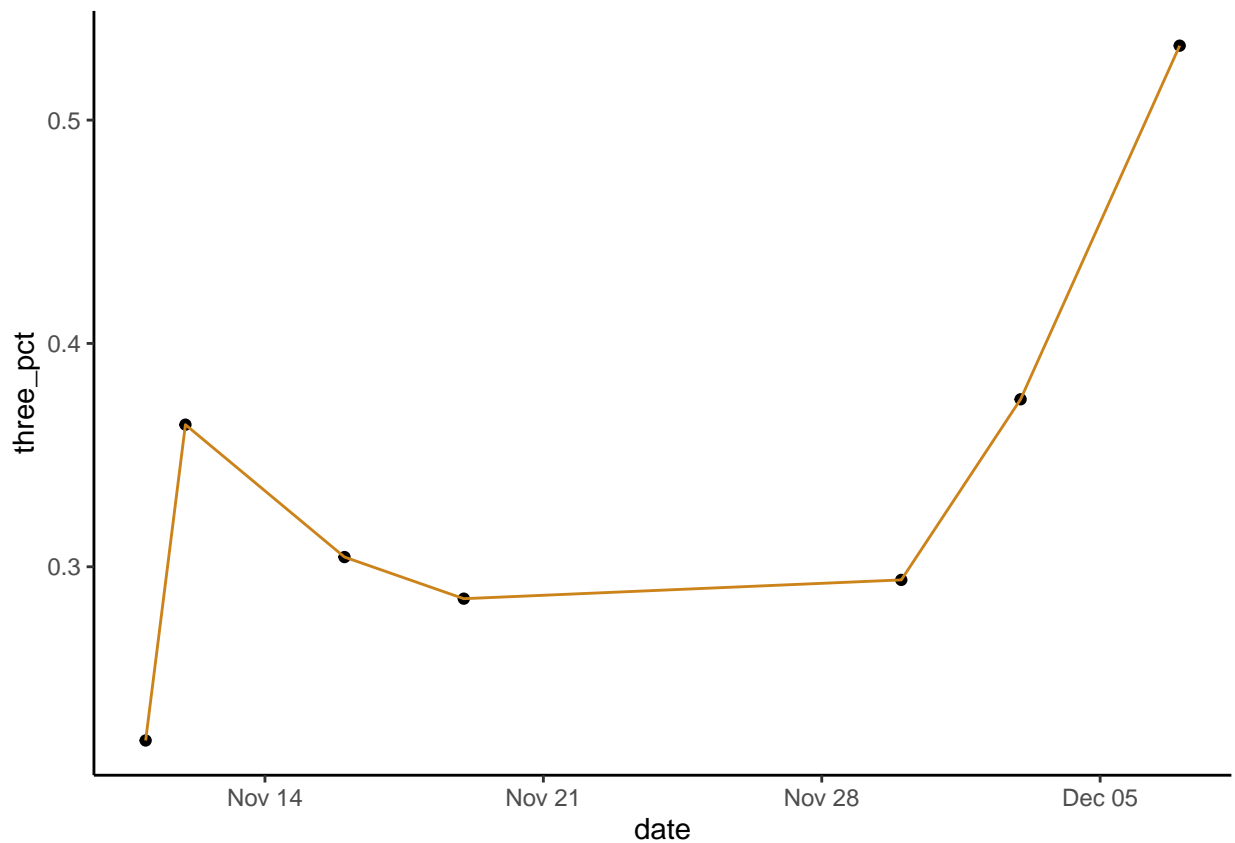
```
game_shooting <- pbp %>%
  filter(checkname52 != "TEAM") %>%
  filter(action == "GOOD" | action == "MISS") %>%
  group_by(date) %>%
  summarise(layups = sum(type == "LAYUP"),
            mid_range = sum(type == "JUMPER"),
            threes = sum (type == "3PTR"),
            layup_pct = sum(action == "GOOD" & type == "LAYUP") / layups,
            mid_pct = sum(action == "GOOD" & type == "JUMPER") / mid_range,
            three_pct = sum(action == "GOOD" & type == "3PTR") / threes
  )

game_shooting
```

```
## # A tibble: 7 x 7
```

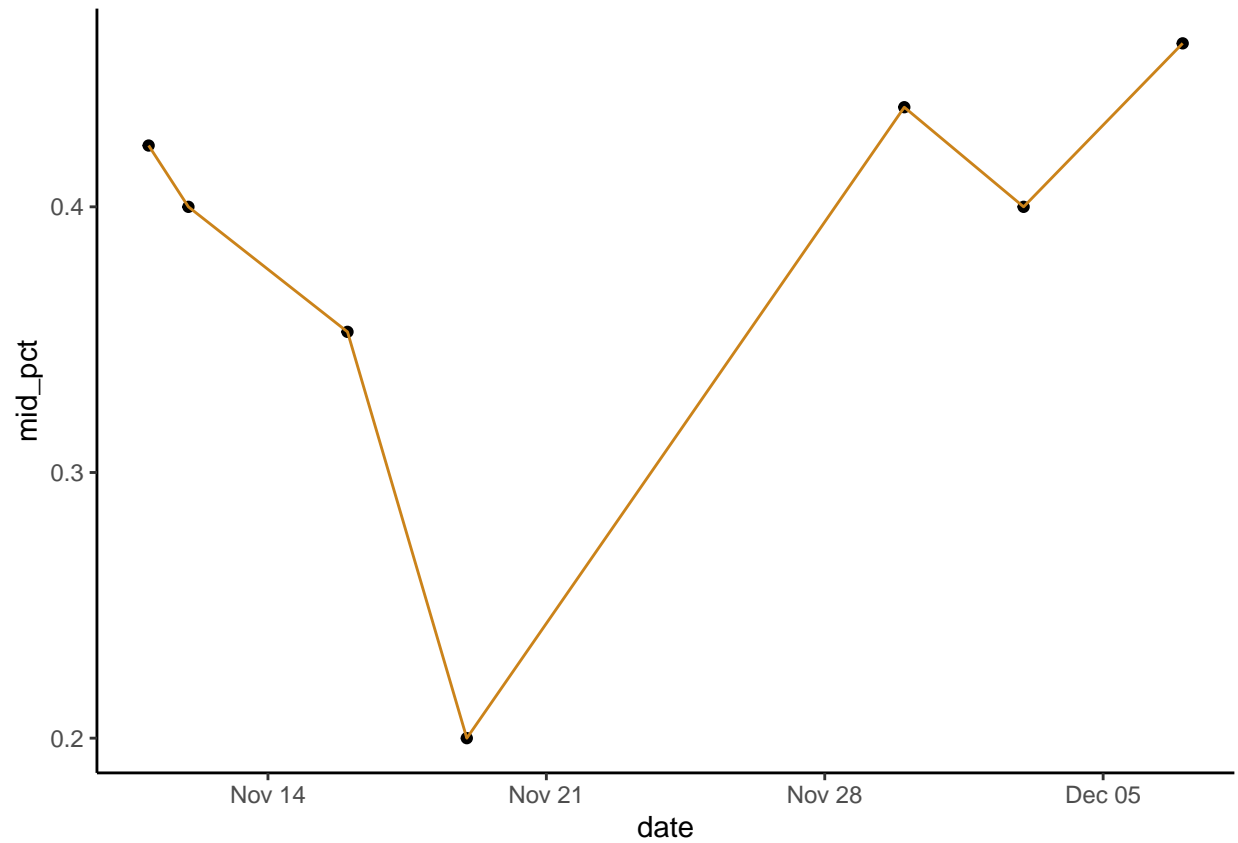
##	date	layups	mid_range	threes	layup_pct	mid_pct	three_pct
##	<date>	<int>	<int>	<int>	<dbl>	<dbl>	<dbl>
## 1	2022-11-11	22	26	18	0.682	0.423	0.222
## 2	2022-11-12	17	15	11	0.706	0.4	0.364
## 3	2022-11-16	29	17	23	0.379	0.353	0.304
## 4	2022-11-19	18	20	21	0.722	0.2	0.286
## 5	2022-11-30	22	16	17	0.591	0.438	0.294
## 6	2022-12-03	13	15	16	0.462	0.4	0.375
## 7	2022-12-07	15	13	15	0.533	0.462	0.533

```
game_shooting %>%
  ggplot(aes(x = date, y = three_pct)) +
  geom_point() +
  geom_line(color = "#CB831A") +
  theme_classic()
```



*#three pointers have recently gotten significantly better*

```
game_shooting %>%
  ggplot(aes(x = date, y = mid_pct)) +
  geom_point() +
  geom_line(color = "#CB831A") +
  theme_classic()
```



*#mid range shots have been relatively consistent outside of the 11/19 game*

```
game_shooting %>%  
  ggplot(aes(x = date, y = layup_pct)) +  
    geom_point() +  
    geom_line(color = "#CB831A") +  
    theme_classic()
```

