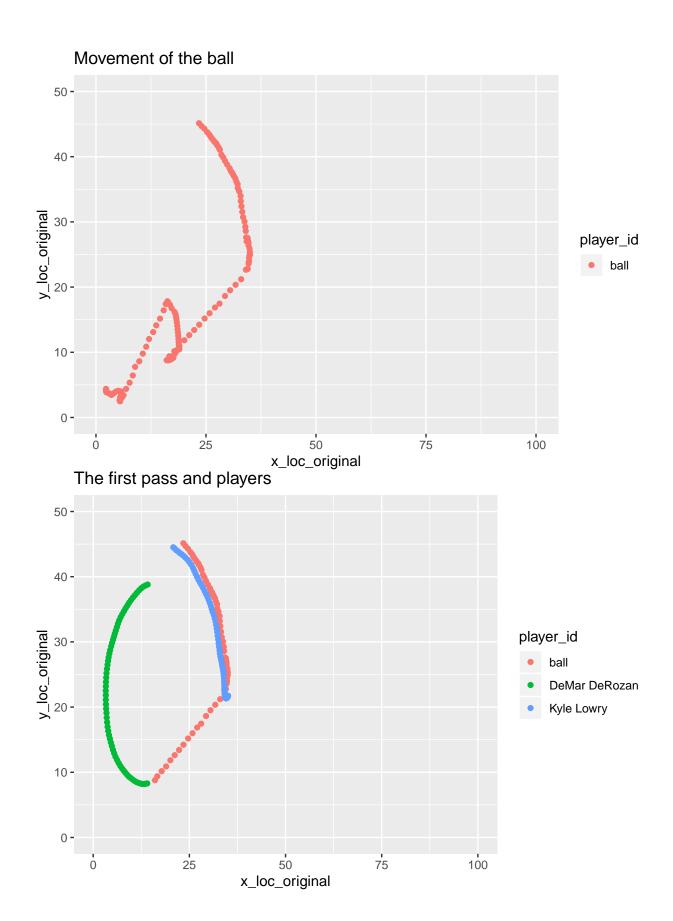
Identify long pass and 3pt shooting

Simply check the movement and event data

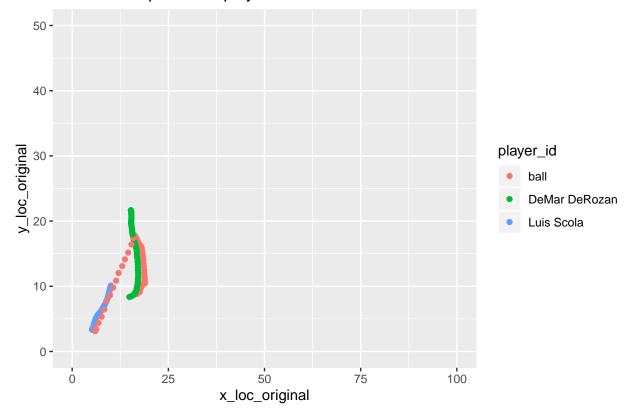
```
## # A tibble: 6 x 12
     team_id player_id x_loc y_loc radius game_clock shot_clock quarter game_id
##
       <dbl>
                 <dbl>
                        <dbl> <dbl>
                                      <dbl>
                                                 <dbl>
                                                             <dbl>
                                                                     <dbl>
                                                                              <dbl>
## 1 -1.00e0
                    -1 -201.
                              187.
                                       3.64
                                                  711.
                                                              12.0
                                                                         1 2.15e7
## 2 1.61e9
                                                                         1 2.15e7
                  2449 111.
                               143.
                                                  711.
                                                              12.0
## 3 1.61e9
                201960 115.
                                53.7
                                       0
                                                  711.
                                                              12.0
                                                                         1 2.15e7
## 4 1.61e9
                200768 -195.
                               161.
                                       0
                                                  711.
                                                              12.0
                                                                         1 2.15e7
## 5 1.61e9
                201942 -138.
                                94.2
                                       0
                                                  711.
                                                              12.0
                                                                         1 2.15e7
## 6 1.61e9
                202685 -92.1 161.
                                       0
                                                  711.
                                                              12.0
                                                                         1 2.15e7
## # ... with 3 more variables: event_id <dbl>, x_loc_original <dbl>,
      y_loc_original <dbl>
## # A tibble: 6 x 33
     GAME ID EVENTNUM EVENTMSGTYPE EVENTMSGACTIONT~ PERIOD WCTIMESTRING
##
     <chr>>
                <dbl>
                              <dbl>
                                               <dbl>
                                                     <dbl> <time>
## 1 002150~
                    0
                                 12
                                                   0
                                                           1 19:41
## 2 002150~
                    1
                                 10
                                                   0
                                                           1 19:41
## 3 002150~
                    2
                                  2
                                                 101
                                                           1 19:42
## 4 002150~
                    3
                                  4
                                                   0
                                                           1 19:42
## 5 002150~
                    4
                                                  87
                                  1
                                                           1 19:42
## 6 002150~
                    5
                                  1
                                                   48
                                                           1 19:42
     ... with 27 more variables: PCTIMESTRING <time>, HOMEDESCRIPTION <chr>,
       NEUTRALDESCRIPTION < lgl>, VISITORDESCRIPTION < chr>, SCORE < chr>,
## #
       SCOREMARGIN <chr>, PERSON1TYPE <dbl>, PLAYER1_ID <dbl>, PLAYER1_NAME <chr>,
       PLAYER1_TEAM_ID <dbl>, PLAYER1_TEAM_CITY <chr>,
       PLAYER1_TEAM_NICKNAME <chr>, PLAYER1_TEAM_ABBREVIATION <chr>,
## #
## #
       PERSON2TYPE <dbl>, PLAYER2 ID <dbl>, PLAYER2 NAME <chr>,
       PLAYER2_TEAM_ID <dbl>, PLAYER2_TEAM_CITY <chr>,
## #
       PLAYER2 TEAM NICKNAME <chr>, PLAYER2 TEAM ABBREVIATION <chr>,
## #
       PERSON3TYPE <dbl>, PLAYER3_ID <dbl>, PLAYER3_NAME <chr>,
       PLAYER3_TEAM_ID <dbl>, PLAYER3_TEAM_CITY <chr>,
## #
## #
       PLAYER3_TEAM_NICKNAME <chr>, PLAYER3_TEAM_ABBREVIATION <chr>
```

Look at Event 1 and the movement of ball

There seems to exist two pass in the ball movement. Kyle Lowry initially dribbles the ball and pass it to others



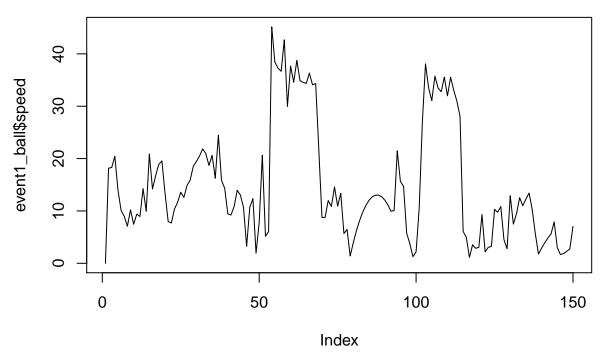
The second pass and players



Fit the passing

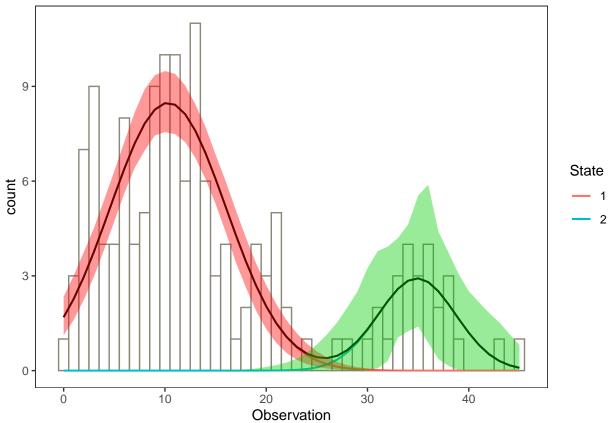
We preprocess the data (using python) and calculate the speed for each player and the ball at each timestep.

```
## # A tibble: 6 x 14
##
     index team_id player_id x_loc y_loc radius game_clock shot_clock quarter
                               <dbl> <dbl>
##
     <dbl> <chr>
                    <chr>
                                            <dbl>
                                                        <dbl>
                                                                    <dbl>
                                                                             <dbl>
## 1
         0 ball
                    ball
                               -201.
                                      187.
                                            3.64
                                                         711.
                                                                     12.0
                                                                                 1
## 2
        21 ball
                              -197.
                                      193.
                                                         711.
                    ball
                                            3
                                                                     12.0
                                                                                 1
                                                         711.
## 3
        31 ball
                              -193.
                                      199.
                                            2.25
                                                                     12.0
                    ball
                                                                                 1
        43 ball
                              -188.
                                      205.
                                            1.49
                                                         711.
## 4
                    ball
                                                                     11.9
                                                                                 1
                              -184.
## 5
        51 ball
                    ball
                                      210.
                                            0.507
                                                         711.
                                                                     11.9
                                                                                 1
## 6
        65 ball
                    ball
                              -181.
                                      212.
                                            0.956
                                                         711.
                                                                     11.9
                                                                                 1
## # ... with 5 more variables: game_id <dbl>, event_id <dbl>,
       x_loc_original <dbl>, y_loc_original <dbl>, speed <dbl>
```

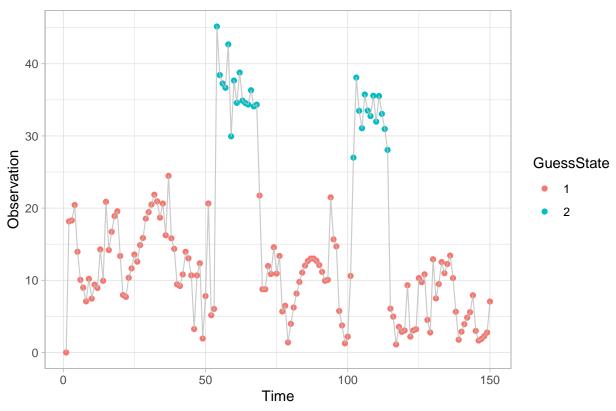


After investigating the speed data for these two potential state, we assign the initial value and starting fitting two states, a pass occurs or a pass doesn't occur.

```
# number of states, 2
m <- 2
# the mean of two state
mu \leftarrow c(9, 26)
# standard deviation of two states
sigma \leftarrow c(12, 4)
# transition probability
gamma \leftarrow matrix(c(0.99, 0.01, 0.02, 0.98), m, m, byrow = TRUE)
# Initial state probability
delta \leftarrow c(1, 0)
## $m
## [1] 2
##
## $mu
   [1] 10.30614 34.89330
##
##
## $sigma
   [1] 5.738578 3.821688
##
##
## $gamma
##
               [,1]
                           [,2]
## [1,] 0.98481175 0.01518825
## [2,] 0.07711296 0.92288704
##
## $delta
## [1] 0.8354491 0.1645509
##
## $code
## [1] 1
```







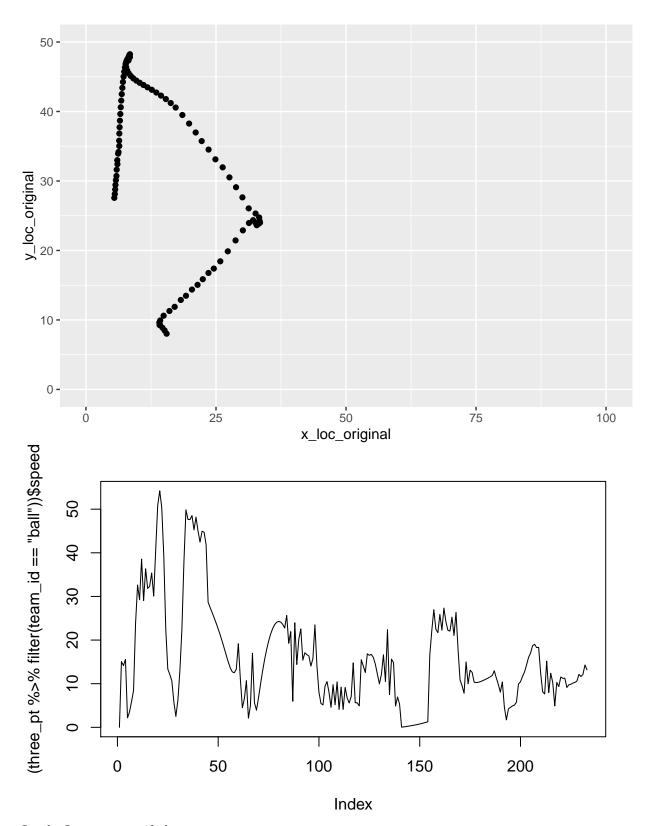
3-pt shooting

We also prepare the data for three point shooting.

```
## # A tibble: 6 x 14
##
     index team_id player_id x_loc y_loc radius game_clock shot_clock quarter
##
     <dbl> <chr>
                    <chr>
                                <dbl> <dbl>
                                              <dbl>
                                                          <dbl>
                                                                      <dbl>
                    ball
                                      108.
                                               3.15
                                                                      15.0
## 1
         0 ball
                                170.
                                                           558.
## 2
         1 TOR
                    DeMarre ~
                                164.
                                      115.
                                                           558.
                                                                      15.0
## 3
         2 TOR
                    Kyle Low~
                                -69.0 280.
                                               0
                                                           558.
                                                                      15.0
         3 TOR
                    DeMar De~
                              -237.
                                       49.2
                                                           558.
                                                                      15.0
         4 TOR
                                               0
## 5
                    Jonas Va~
                                 28.5 104.
                                                           558.
                                                                      15.0
                                                                                  1
##
         5 CHA
                    Marvin W~
                                159.
                                       43.3
                                                           558.
                                                                      15.0
                                                                                  1
     ... with 5 more variables: game_id <dbl>, event_id <dbl>,
       x_loc_original <dbl>, y_loc_original <dbl>, speed <dbl>
```

I want to fit it together with passing/dribbling, but right now I think the speed enough for long passing, but it is not enough to identify the dribble by player and shoot by player (since they are close).

I believe distance to the hoop could be another criteria for us to identify a shooting.



Lastly, I create two gif plots.