Lab 12

4/14/25

Rules

In groups of 2 to 4, mostly as assigned in class, complete the following questions.

Previous data wrangling:

```
GripStrengthMeasurements <- read excel("GripStrengthMeasurementsS25.xlsx")</pre>
GS <- GripStrengthMeasurements %>% drop_na(GripStrength) #Mostly cleans out
empty rows
GS2 <- GS %>% drop na(Arm)
GS2 <- GS2 %>% mutate(Arm = forcats::fct collapse(Arm,
                                                 Up = c("Up", "up"),
                                                 Down = c("Down", "down"),
                                                 "90" = c("90", "90 degree")),
                    SubjectID = forcats::fct_collapse(SubjectID,
                                           MDEarl = c("MDEarl", "MDEar")),
                    Arm = factor(Arm),
                    Hand = factor(Hand),
                    OrderF = factor(Order)
)
GS2 <- GS2 %>% mutate(Hand.Arm = factor(str_c(Hand, Arm)))
GS2 <- GS %>% drop_na(Arm)
GS2 <- GS2 %>% mutate(Arm = forcats::fct_collapse(Arm,
                                                 Up = c("Up", "up"),
                                                 Down = c("Down", "down"),
                                                 "90" = c("90", "90 degree")),
                    SubjectID = forcats::fct_collapse(SubjectID,
                                           MDEarl = c("MDEarl", "MDEar")),
                    Arm = factor(Arm),
                    Hand = factor(Hand),
                    OrderF = factor(Order)
```

Part II from Lab 11 with new numbers: Merging (left_join-ing) the demographics data

The following code will read in and (eventually) join the demographics data.

```
dim(GS2)
```

```
## [1] 263 6

Demographics <- read_excel("DemographicsS25.xlsx")
Demographics <- Demographics %>% dplyr::select(-c(12:13)) #Because of a
"note" left in column 13...
dim(Demographics)

## [1] 44 11
```

1) The following code highlights a potential issue with one of the subject IDs. Fix the problem in the Demographics data.frame using R code.

```
data.frame(sort(unique(GS2$SubjectID)), sort(unique(Demographics$SubjectID)))
      sort.unique.GS2.SubjectID.. sort.unique.Demographics.SubjectID..
##
## 1
                           ABH1997
                                                                   ABH1997
## 2
                         AFEDU2020
                                                                 AFEDU2020
## 3
                       AustinLions
                                                               AustinLions
## 4
                      AZBlackhawks
                                                              AZBlackhawks
## 5
                             AZRams
                                                                    AZRams
## 6
                       BelknapBull
                                                               BelknapBull
## 7
                      BostonLakers
                                                              BostonLakers
## 8
                  BostonWolverines
                                                         BostonWolverines
## 9
                    CAJustinBieber
                                                            CAJustinBieber
                CenntenialWarriors
## 10
                                                       CentennialWarriors
                   COMichealFranti
                                                          COMichealFranti
## 11
## 12
                            DCSNAP
                                                                    DCSNAP
## 13
                     DenverCovotes
                                                             DenverCovotes
## 14
                      DenverGalaxy
                                                              DenverGalaxy
## 15
                          FLTaller
                                                                  FLTaller
                            GASNAP
                                                                    GASNAP
## 16
## 17
                             HYENA
                                                                     HYENA
## 18
                     IAGarthBrooks
                                                             IAGarthBrooks
## 19
                              IDAJR
                                                                     IDAJR
## 20
                             IDPAD
                                                                     IDPAD
## 21
                           LACROIX
                                                                   LACROIX
## 22
                      LADeathGrips
                                                                   LADeath
## 23
                            MDEarl
                                                                    MDEarl
## 24
                        NDLawrence
                                                                NDLawrence
                                                             NewYorkLaeeb
## 25
                      NewYorkLaeeb
## 26
                        NMSnuggies
                                                                NMSnuggies
## 27
                               NVKP
                                                                      NVKP
## 28
                      OrlandoChamp
                                                              OrlandoChamp
## 29
                    ORMichelangelo
                                                           ORMichelangelo
## 30
                          PATaller
                                                                  PATaller
## 31
                                                            SanDiegoBobcat
                    SanDiegoBobcat
## 32
                             UTSNAP
                                                                    UTSNAP
## 33
                  VancouverMcLaren
                                                         VancouverMcLaren
                            VTPink
                                                                    VTPink
## 34
## 35
                          WATaller
                                                                  WATaller
## 36
                     WinonaBadgers
                                                             WinonaBadgers
```

```
## 37
                         WIWiggles
                                                                WIWiggles
## 38
                         WYBeavers
                                                                WYBeavers
## 39
                              WYIW
                                                                     WYIW
## 40
                         WYJourney
                                                                WYJourney
## 41
                        WYSlipKnot
                                                               WYSlipKnot
## 42
                            WYSNAP
                                                                   WYSNAP
## 43
                          WYTaller
                                                                 WYTaller
## 44
                               Z00
                                                                       Z00
which(sort(unique(GS2$SubjectID)))!= sort(unique(Demographics$SubjectID)))
## [1] 10 22
# Fix the problem in Demographics to match GS2:
Demographics <- Demographics %>% mutate(SubjectID =
                                            forcats::fct recode(SubjectID,
LADeathGrips = "LADeath"),
                                          SubjectID =
                                            forcats::fct_recode(SubjectID,
CenntenialWarriors =
"CentennialWarriors"))
#Check that problem was fixed:
data.frame(sort(unique(GS2$SubjectID)), sort(unique(Demographics$SubjectID)))
##
      sort.unique.GS2.SubjectID.. sort.unique.Demographics.SubjectID..
## 1
                           ABH1997
                                                                  ABH1997
## 2
                         AFEDU2020
                                                                AFEDU2020
## 3
                       AustinLions
                                                              AustinLions
## 4
                      AZBlackhawks
                                                             AZBlackhawks
## 5
                            AZRams
                                                                   AZRams
                       BelknapBull
                                                              BelknapBull
## 6
## 7
                      BostonLakers
                                                             BostonLakers
## 8
                  BostonWolverines
                                                         BostonWolverines
## 9
                    CAJustinBieber
                                                           CAJustinBieber
## 10
               CenntenialWarriors
                                                       CenntenialWarriors
## 11
                  COMichealFranti
                                                          COMichealFranti
## 12
                            DCSNAP
                                                                   DCSNAP
## 13
                     DenverCoyotes
                                                            DenverCoyotes
## 14
                      DenverGalaxy
                                                             DenverGalaxy
## 15
                          FLTaller
                                                                 FLTaller
## 16
                            GASNAP
                                                                   GASNAP
## 17
                             HYENA
                                                                    HYENA
                     IAGarthBrooks
                                                            IAGarthBrooks
## 18
## 19
                             IDAJR
                                                                    IDAJR
## 20
                             IDPAD
                                                                    IDPAD
## 21
                           LACROIX
                                                                  LACROIX
                      LADeathGrips
## 22
                                                             LADeathGrips
## 23
                            MDEarl
                                                                   MDEarl
## 24
                        NDLawrence
                                                               NDLawrence
```

```
## 25
                      NewYorkLaeeb
                                                            NewYorkLaeeb
## 26
                        NMSnuggies
                                                              NMSnuggies
                              NVKP
                                                                     NVKP
## 27
## 28
                      OrlandoChamp
                                                            OrlandoChamp
## 29
                   ORMichelangelo
                                                          ORMichelangelo
## 30
                          PATaller
                                                                 PATaller
## 31
                   SanDiegoBobcat
                                                          SanDiegoBobcat
## 32
                            UTSNAP
                                                                  UTSNAP
## 33
                 VancouverMcLaren
                                                        VancouverMcLaren
## 34
                            VTPink
                                                                  VTPink
                          WATaller
                                                                WATaller
## 35
## 36
                    WinonaBadgers
                                                           WinonaBadgers
## 37
                         WIWiggles
                                                               WIWiggles
                                                               WYBeavers
## 38
                         WYBeavers
## 39
                              WYIW
                                                                     WYIW
## 40
                         WYJournev
                                                               WYJourney
## 41
                        WYSlipKnot
                                                              WYSlipKnot
## 42
                            WYSNAP
                                                                  WYSNAP
                                                                WYTaller
## 43
                          WYTaller
## 44
                               Z00
                                                                     Z00
Demographics <- Demographics %>% mutate(Weights = factor(Weights),
                                         GripTesterID = factor(GripTesterID))
Demographics <- Demographics %>% mutate(Weights = fct_collapse(Weights,
no = c("no", "No"),
               yes = c("yes", "Yes")))
#Join Demographics to the GS2 repeated measures data
combined <- left join(x = GS2, y = Demographics, by = "SubjectID")
combinedR <- combined %>% drop na()
combinedR <- combinedR %>% mutate(forearm bins
                                     factor(cut_number(ForearmLength, n = 3)),
                                   epworth_bins =
                                     factor(cut_number(Epworth, n = 3)),
                                   balance bins =
                                     factor(cut_number(BalanceTime, n = 3))
                                   )
dim(combinedR)
## [1] 257
            19
dim(combined)
## [1] 263
            16
dim(GS2)
## [1] 263
```

tallv(~Sub	iectID. data	a = combinedR)		
	_			
## Subject ##	ABH1997	AFEDU2020	AustinLions	
AZBlackhaw				
##	6	6	6	
6 ##	AZRams	BelknapBull	BostonLakers	
## BostonWolv		реткнарвитт	DOS COILLAKEI'S	
##	6	6	6	
6				
	ustinBieber	CenntenialWarriors	COMichealFranti	
DCSNAP	6	6	-	
## 6	6	6	5	
	nverCoyotes	DenverGalaxy	FLTaller	
GASNAP	-	•		
##	6	6	6	
6 ##	HYENA	IAGarthBrooks	IDAJR	
## IDPAD	ПІСІЛА	TAGGLCHDLOOKS	IDAJK	
##	6	6	6	
6				
##	LACROIX	LADeathGrips	MDEarl	
NDLawrence	6	6	0	
6	В	D	0	
	lewYorkLaeeb	NMSnuggies	NVKP	
OrlandoCha	•			
##	6	6	6	
6 ## ORM	ichelangelo	PATaller	SanDiegoBobcat	
UTSNAP	ircherange10	PATALLEL	SampleRoponcar	
##	6	6	6	
6				
	uverMcLaren	VTPink	WATaller	
WinonaBadg ##	ers 6	6	6	
6	б	0	0	
##	WIWiggles	WYBeavers	WYIW	
WYJourney				
##	6	6	6	
6 ##	WClinkno+	WYSNAP	WYTaller	
## Z00	WYSlipKnot	WYSNAP	wylalier	
##	6	6	6	
6				

2) What is the sample size before and after the left_join? How many subjects are in the data set as analyzed in combinedR?

Sample size was 263 before left_join and 263 after. The combinedR group had the NAs removed after join which lowered the sample size to 257. There are 44 unique subjects in the dataset in CombinedR.

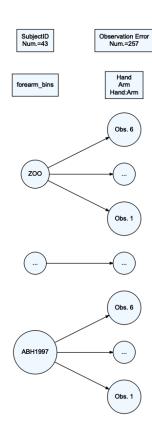
```
unique(combinedR$SubjectID)
                           WYSNAP
                                              UTSNAP
                                                                  DCSNAP
## [1] GASNAP
## [5] COMichealFranti
                           LADeathGrips
                                              NMSnuggies
CAJustinBieber
## [9] ORMichelangelo
                           VTPink
                                              WYSlipKnot
IAGarthBrooks
## [13] WYJourney
                           WIWiggles
                                              NDLawrence
                                                                  WATaller
## [17] FLTaller
                           PATaller
                                              WYTaller
                                                                  NVKP
## [21] IDAJR
                           WYIW
                                              IDPAD
                                                                  LACROIX
## [25] VancouverMcLaren
                           Z00
                                              HYENA
                                                                  AFEDU2020
## [29] ABH1997
                           BelknapBull
                                              DenverGalaxy
CenntenialWarriors
## [33] OrlandoChamp
                           AustinLions
                                              BostonWolverines
WinonaBadgers
                           DenverCoyotes
## [37] NewYorkLaeeb
                                              SanDiegoBobcat
                                                                  AZRams
## [41] BostonLakers
                           AZBlackhawks
                                              WYBeavers
## 44 Levels: ABH1997 AFEDU2020 AustinLions AZBlackhawks AZRams ... ZOO
dim(combinedR)
## [1] 257 19
dim(combined)
## [1] 263 16
dim(GS2)
## [1] 263
```

3) Now we can incorporate forearm binned variables into the model using the forearm_bins, which we will treat as a fixed effect. Make a model_diagram from the provided model (I like to add the option of heightVal = 800) and explain/discuss the location of the fixed effects in it.

Hand, Arm, and Hand: Arm are located at the top of the right column of the model diagram. This is because these are indicated at the observation level, not the subject level. The 6 observations per individual are a combination of hand and arm. The forearm bins are located in the left column as they are splitting the individuals into groups based on their forearm size, as a proxy for height. These groups were then split down into the 6 hand and arm observations per individual.

```
high = "(11,13.1]")
)
lmer2 <- lmer(GripStrength ~ Hand*Arm + forearm_bins + (1|SubjectID), data =
combinedR)

model_diagram(lmer2, heightVal = 800)</pre>
```



4) The following provides the theoretical and estimated fixed effect part of the model, except does not add the subscripts for the fixed effects or define the distributions of the random effects (see all locations with ?). Add the definition of the random effects and subscripts in the appropriate places based on the previous model diagram.

```
lmer2 %>% tbl_regression(intercept = T)
```

Characteristic	Beta	95% CI ¹	p-value	
(Intercept)	47	38, 56	<0.001	
Hand				
D	_	_		
ND	-3.7	-5.9, -1.6	<0.001	
Arm				
90	_	_		
Down	0.25	-1.9, 2.4	0.8	
Up	2.0	-0.14, 4.2	0.067	
forearm_bins				
low		_		
medium	12	-1.7, 25	0.085	
high	35	21, 48	<0.001	
Hand * Arm				
ND * Down	1.4	-1.7, 4.4	0.4	
ND * Up	1.5	-1.6, 4.5	0.3	

¹CI = Confidence Interval

- Theoretical model: $GripStrength_{ij} = \mu_{ij} + Subject_i + \epsilon_{ij}$
 - o where $Subject_i \sim N(0, \sigma_{subject}^2)$ and $\epsilon_{ij} \sim N(0, \sigma_{\epsilon}^2)$ and i = 1, ..., I subjects and $j = 1, ..., n_i$ for the j^{th} observation on the i^{th} subject.
- Estimated model for μ_{ij} :
 - $\circ \quad \text{Result: } \hat{\mu}_{ij} = 47 3.7 I_{Hand=ND,ij} + 0.25 I_{Arm=Down,ij} + 2.0 I_{Arm=Up,ij} + \\ 12 I_{forearmbins=medium,i} + 35 I_{forearm_bins=high,i} + 1.4 I_{Hand=ND,ij} I_{Arm=Down,ij} + \\ 1.5 I_{Hand=ND,ij} I_{Arm=Up,ij}$

Part 2 (all new questions): Summarizing/exploring mixed models

In mixed models, the random effect variances create some extra opportunities and challenges when trying to summarize the model. The following models will also incorporate the GripTesterID so we can control for differences in the different machines used.

First, the random effects can be used to calculate the intra-class correlation (ICC) as discussed on page 16 of the Mixed Models Part A notes.

5) For the model 1mer3 below, report the estimated subject variance and estimated residual variance.

```
lmer3 <- lmer(GripStrength ~ Hand*Arm + forearm_bins + GripTesterID +
(1|SubjectID), data = combinedR)
summary(lmer3)</pre>
```

```
## Linear mixed model fit by REML. t-tests use Satterthwaite's method [
## lmerModLmerTest]
## Formula: GripStrength ~ Hand * Arm + forearm_bins + GripTesterID + (1 |
       SubjectID)
##
##
      Data: combinedR
##
## REML criterion at convergence: 1681.5
## Scaled residuals:
##
        Min
                       Median
                  10
                                    3Q
                                            Max
## -2.76250 -0.56395
                      0.04184 0.55084
                                        2.99852
##
## Random effects:
## Groups
                          Variance Std.Dev.
              Name
##
    SubjectID (Intercept) 258.08
                                   16.065
                           25.53
                                    5.052
## Number of obs: 257, groups: SubjectID, 43
##
## Fixed effects:
##
                      Estimate Std. Error
                                                 df t value Pr(>|t|)
                       49.7050
                                                      7.547 5.49e-09
## (Intercept)
                                   6.5861
                                           36.8617
## HandND
                       -3.7474
                                   1.0974 209.0198
                                                     -3.415 0.000766
## ArmDown
                        0.2535
                                   1.0896 209.0036
                                                      0.233 0.816271
## ArmUp
                        2.0070
                                   1.0896 209.0036
                                                      1.842 0.066908
## forearm binsmedium 14.9673
                                   6.1736
                                           36.0023
                                                      2.424 0.020481
## forearm binshigh
                       35.8431
                                   6.2432
                                           36.0007
                                                      5.741 1.54e-06
## GripTesterIDD2
                                   8.4488
                                           36.0137
                                                    -2.409 0.021229
                      -20.3543
                                                      0.367 0.715588
## GripTesterIDD3
                        2.8831
                                   7.8507
                                           36.0172
                        3.4540
                                   8.4488
## GripTesterIDD4
                                           36.0137
                                                      0.409 0.685095
## GripTesterIDD5
                      -10.6640
                                   8.7142 36.0103
                                                    -1.224 0.228996
## HandND:ArmDown
                        1.3893
                                   1.5464 209.0118
                                                      0.898 0.370014
## HandND:ArmUp
                        1.4870
                                   1.5464 209.0118
                                                      0.962 0.337389
##
## Correlation of Fixed Effects:
               (Intr) HandND ArmDwn ArmUp frrm_bnsm frrm_bnsh GTIDD2 GTIDD3
##
## HandND
               -0.080
## ArmDown
               -0.083
                       0.496
## ArmUp
               -0.083
                       0.496 0.500
## frrm bnsmdm -0.332 -0.001 0.000
                                     0.000
## frrm_bnshgh -0.262 -0.001 0.000
                                     0.000
                                            0.471
## GrpTstrIDD2 -0.631 -0.002 0.000
                                     0.000 -0.102
                                                      -0.110
## GrpTstrIDD3 -0.699 -0.002
                              0.000
                                     0.000 -0.009
                                                      -0.174
                                                                 0.580
## GrpTstrIDD4 -0.631 -0.002
                              0.000
                                     0.000 -0.102
                                                      -0.110
                                                                 0.541
                                                                       0.580
                                                      -0.238
## GrpTstrIDD5 -0.559 -0.002 0.000
                                                                 0.543
                                                                        0.578
                                     0.000 -0.230
## HndND:ArmDw
               0.057 -0.710 -0.705 -0.352
                                                       0.001
                                                                 0.001
                                            0.001
                                                                        0.001
                                            0.001
## HndND:ArmUp
               0.057 -0.710 -0.352 -0.705
                                                       0.001
                                                                 0.001
                                                                        0.001
##
               GTIDD4 GTIDD5 HND:AD
## HandND
## ArmDown
## ArmUp
```

```
## frrm_bnsmdm
## frrm_bnshgh
## GrpTstrIDD2
## GrpTstrIDD3
## GrpTstrIDD4
## GrpTstrIDD5 0.543
## HndND:ArmDw 0.001 0.001
## HndND:ArmUp 0.001 0.001 0.504
```

- $\hat{\sigma}_{subject}^2 = 258.08$
- $\hat{\sigma}_{\epsilon}^2 = 25.53$
- 6) Use the two variances to calculate the estimated ICC. Show your work.
 - Estimated ICC = 258.08 / (258.08 + 25.53) = 0.91

7) Interpret the ICC result in a sentence as you would in a report and then write a sentence to discuss what this suggests about repeated measures on grip strength (something about what the ICC suggests).

Once we account for grip tester, arm position, hand dominance, and forearm length, the estimated correlation of the two grip strength measurements is 0.91. This indicates high correlation between two observations once we account for systematic changes across subjects.

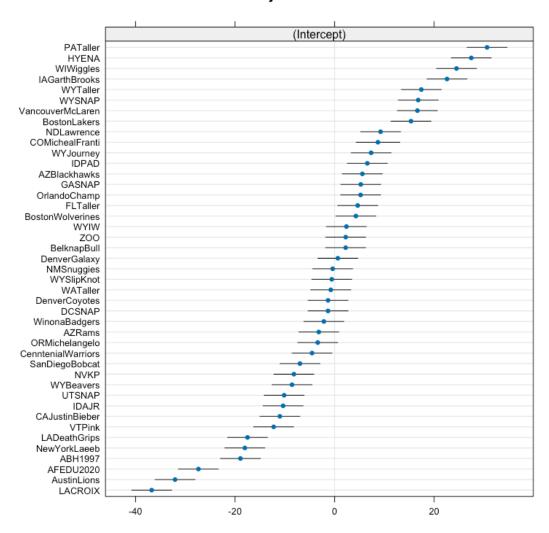
8) We can also explore the estimates for each subject on the random subject effect. These are not to be used to do inferences for differences, but we can qualitatively explore the variability. You can print out the subject random effect estimates using ranef(modelname) or you can plot the results with estimates of the uncertainty using dotplot(ranef(modelname, postVar = T)) or you can make a QQ-plot to use for assessing normality of a single random effect using the provided code. Fix the title on the QQ-plot, then find a subject of interest to you in the caterpillar plot, note their ID, and discuss their random effect estimate relative to other subjects.

LACROIX's grip strength is roughly 35 pounds lower than average from the other subjects. Their respective grip strength is roughly 5 pounds lower than the next subject, AustinLion's, strength measurement.

```
ranef(lmer3)
## $SubjectID
##
                       (Intercept)
## ABH1997
                      -18.9222476
## AFEDU2020
                      -27.3589088
## AustinLions
                      -32.0617553
## AZBlackhawks
                        5.5772627
## AZRams
                       -3.1790597
## BelknapBull
                        2.2202531
```

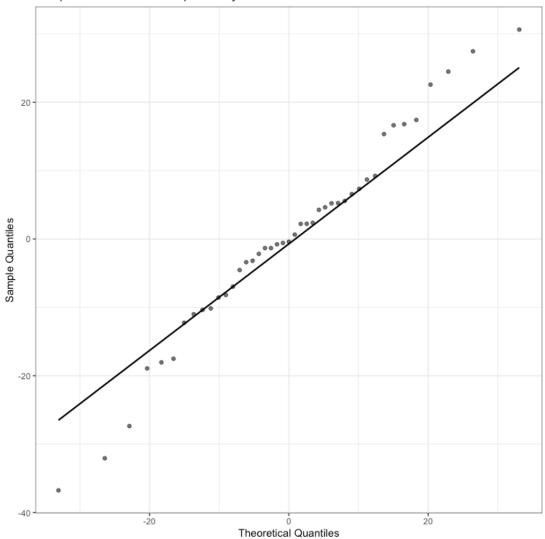
```
## BostonLakers
                       15.3495004
## BostonWolverines
                        4.2726050
## CAJustinBieber
                      -10.9992280
## CenntenialWarriors -4.5357118
## COMichealFranti
                        8.7024014
## DCSNAP
                        -1.3220229
## DenverCoyotes
                       -1.3213632
## DenverGalaxy
                        0.6550206
## FLTaller
                        4.6429109
## GASNAP
                        5.2603926
## HYENA
                       27.4618081
## IAGarthBrooks
                       22.5844403
## IDAJR
                      -10.3482257
## IDPAD
                        6.5734899
## LACROIX
                      -36.7553106
## LADeathGrips
                      -17.5020184
## NDLawrence
                        9.2377935
## NewYorkLaeeb
                      -18.0361838
## NMSnuggies
                       -0.3916764
## NVKP
                       -8.1839046
## OrlandoChamp
                        5.2235946
## ORMichelangelo
                       -3.3913114
## PATaller
                       30.6379712
## SanDiegoBobcat
                       -6.9617152
## UTSNAP
                       -10.1432711
## VancouverMcLaren
                       16.6408623
## VTPink
                      -12.2453523
## WATaller
                       -0.7685516
## WinonaBadgers
                       -2.1622432
## WIWiggles
                       24.4953455
## WYBeavers
                       -8.5564100
## WYIW
                        2.3760186
## WYJourney
                        7.3447403
## WYSlipKnot
                       -0.5711354
## WYSNAP
                       16.8034385
## WYTaller
                       17.4224954
## Z00
                        2.2352620
##
## with conditional variances for "SubjectID"
library(lattice)
dotplot(ranef(lmer3, postVar = T))
## $SubjectID
```

SubjectID



```
as.data.frame(ranef(lmer3)) %>% ggplot(aes(sample = condval)) +
    stat_qq_point(alpha = 0.6) +
    stat_qq_line() + theme(aspect.ratio = 1) +
    labs(x = "Theoretical Quantiles",
        y = "Sample Quantiles",
        title = "QQ-plot of random intercept of subject") +
    coord_fixed()
```

QQ-plot of random intercept of subject



9) Calculate and write two sentences to report the two R-squared results for 1mer3. Be specific about the contents of the model in reporting the results.

The fixed effects of forearm length, hand, arm, and grip tester explain 50.7% of the variation in the grip strengths. The fixed effects with the random effect of subject together explain 95.57% of the variation in grip strength.

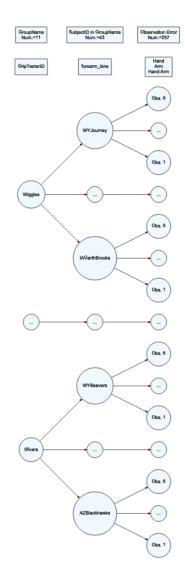
```
library(MuMIn)
r.squaredGLMM(lmer3)

## R2m R2c
## [1,] 0.5078611 0.9557038
```

Part 3: Three-level model

10) The previous model failed to account for groups and that you were nested into groups for taking measurements that might also be systematically different on grip strength. Modify lmer3 to fit a new model account for group and then make a new model_diagram and generate an Anova set of F-tests for the model. No discussion.

```
lmer4 <- lmer(GripStrength ~ Hand*Arm + forearm_bins + GripTesterID +</pre>
(1 GroupName/SubjectID), data = combinedR)
Anova(lmer4, test.statistic = "F")
## Analysis of Deviance Table (Type II Wald F tests with Kenward-Roger df)
## Response: GripStrength
##
                      F Df Df.res
                                      Pr(>F)
               19.5002 1 209.006 1.613e-05
## Hand
                6.5154 2 209.006 0.0017994
## Arm
## forearm_bins 10.1805 2 33.920 0.0003443
## GripTesterID 1.3293 4
                             5.739 0.3625960
## Hand:Arm
                0.5782 2 209.006 0.5618222
model diagram(lmer4, heightVal = 800)
```



11) Discuss how the denominator DF from the F-tests loosely/qualitatively relate to the model_diagram results for the Grip Tester, forearm, and Hand fixed effects. Report how many unique values were present at each level (provided in the model diagram) and the denominator DF in the discussion. Note that this is not about a formula but about relative size and number of unique observations at each level.

The model diagram shows 11 groups, 43 subjects, and 257 observations. The denominator DF generally make sense because the griptester DF is 5.739, forearm_bins is 33.920, and hand, arm, hand:arm all have denominator DF of 209.006. These relative sizes line up with the unique values in our model diagram for the levels where these groups were applied.

12) Generate an caterpillar plot from your new model. Find your group or a group of interest to you. Discuss the relative location of that group and, if you know something

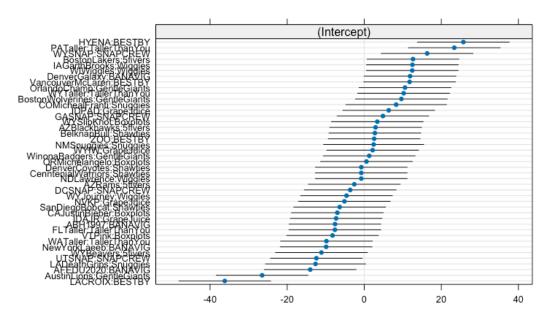
about the group, discuss whether this result is something you expected given how we formed the groups based on height of the students.

At the group level, the TallerThanYou group had relatively higher estimated mean grip strength than the rest of the groups, and the average. This makes sense as these individuals were the tallest in their class last semester, and included PATaller who had the highest grip strength of all.

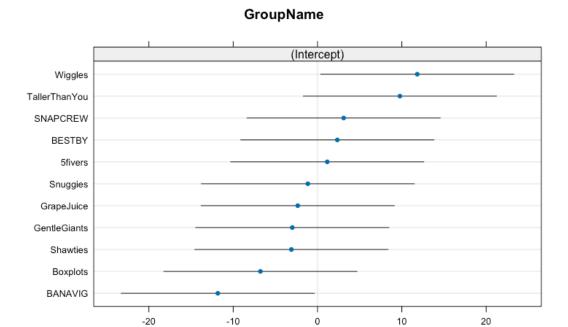
```
ranef(lmer4)
## $`SubjectID:GroupName`
##
                                  (Intercept)
## ABH1997:BANAVIG
                                   -7.5761812
## AFEDU2020:BANAVIG
                                  -14.0182654
## AustinLions:GentleGiants
                                  -26.4846160
## AZBlackhawks:5fivers
                                    2.9398201
## AZRams:5fivers
                                   -2.5804367
## BelknapBull:Shawties
                                    2.7620350
## BostonLakers:5fivers
                                   12.6558283
## BostonWolverines:GentleGiants
                                    9.6406761
## CAJustinBieber:Boxplots
                                   -6.9782713
## CenntenialWarriors:Shawties
                                   -0.7693745
## COMichealFranti:Snuggies
                                    8.2861776
## DCSNAP:SNAPCREW
                                   -3.6384098
## DenverCovotes:Shawties
                                   -0.7592028
## DenverGalaxy:BANAVIG
                                   11.8884391
## FLTaller:TallerThanYou
                                   -7.6098964
## GASNAP:SNAPCREW
                                    4.8521628
## HYENA:BESTBY
                                   25.7167890
## IAGarthBrooks:Wiggles
                                   12.5002301
## IDAJR:GrapeJuice
                                   -7.2854334
## IDPAD:GrapeJuice
                                    6.3532329
## LACROIX:BESTBY
                                  -36.1847913
## LADeathGrips:Snuggies
                                  -12.6273592
## NDLawrence:Wiggles
                                   -0.7696199
## NewYorkLaeeb:BANAVIG
                                   -9.8808974
## NMSnuggies:Snuggies
                                    2.4384973
## NVKP:GrapeJuice
                                   -5.1335659
## OrlandoChamp:GentleGiants
                                   10.5861936
## ORMichelangelo:Boxplots
                                    0.5858693
## PATaller:TallerThanYou
                                   23.3673020
## SanDiegoBobcat:Shawties
                                   -6.3671002
## UTSNAP:SNAPCREW
                                  -12.4089004
## VancouverMcLaren:BESTBY
                                   11.7724255
## VTPink:Boxplots
                                   -8.2172253
## WATaller:TallerThanYou
                                   -9.8045397
## WinonaBadgers:GentleGiants
                                    1.2968216
## WIWiggles:Wiggles
                                   12.4541075
## WYBeavers:5fivers
                                  -11.1125272
## WYIW:GrapeJuice
                                    2.1799140
```

```
## WYJourney:Wiggles
                                   -4.5978128
## WYSlipKnot:Boxplots
                                    3.3898180
## WYSNAP:SNAPCREW
                                   16.3287899
## WYTaller:TallerThanYou
                                   10.2278681
## ZOO:BESTBY
                                    2.5814291
##
## $GroupName
##
                 (Intercept)
## 5fivers
                    1.148931
## BANAVIG
                  -11.827506
## BESTBY
                    2.346463
## Boxplots
                   -6.775055
## GentleGiants
                   -2.995643
## GrapeJuice
                   -2.346463
## Shawties
                   -3.099938
## SNAPCREW
                   3.099938
## Snuggies
                   -1.148931
## TallerThanYou
                    9.770698
## Wiggles
                   11.827506
##
## with conditional variances for "SubjectID:GroupName" "GroupName"
dotplot(ranef(lmer4, postVar = T))
## $`SubjectID:GroupName`
```

SubjectID:GroupName



```
##
## $GroupName
```



13) Note any additional resources used to complete this lab or NONE.

NONE