Carryover_CornResults

Kolby Grint

3/4/2021

Analysis Procedure

Prior to analysis I took the approach of plotting the response variables with box-plots to visualize treatment differences with soil management between locations. The intention of this was to visualize the differences between locations as well determine if I feel comfortable pooling things within a location (not testing for a site-year or year effect). This has been the desired direction to simplify results for publication. When I didn't feel the data allowed for this I tested for differences between site-years in a condensed model. This approach is up for more discussion, as it eliminates the potential to view anomalies in the data which might be insightful and scientifically interesting. We are assuming editors won't like complex findings.

I would also like to point out that for every linear-mixed-effects model I am testing to see that the model meets the visual assumptions for normal distribution of residual and evenly distributed variance. I will demonstrate for the first model, and only include it in the output for future analyses when it is suspected that transformations need to be made.

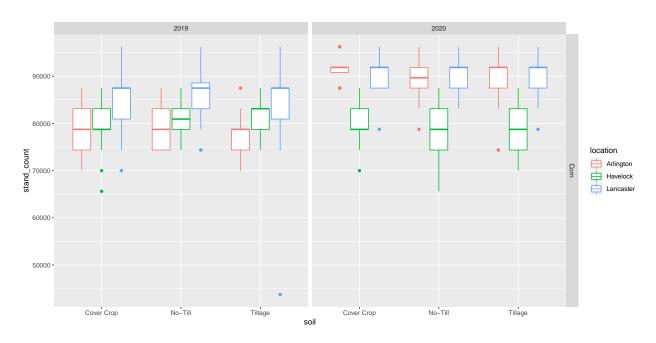
More analyses were made than are going to be included in this pdf. I chose not to include them all so as to condense the output to the approach and considerations that I think are most valuable for the publication.

Removing the Arlington 2020 Site-year

After some consideration and evaluating some analyses we decided to remove the Arlington 2020 site-year for corn from all analyses. There was an establishment issue with this site-year (Kolby used the wrong map to lay out herbicide treatments) and a suspected fertility misapplication that reduced yield for part of the trial.

Early Season Stand Counts

```
Corn1 %>%
  ggplot(aes(x = soil, y = stand_count, color = location)) +
  geom_boxplot() +
  facet_grid(crop ~ year)
```



```
Corn1 %>%
  ggplot(aes(x = herb, y = stand_count, color = location)) +
  geom_boxplot() +
  facet_grid(soil ~ year)
```

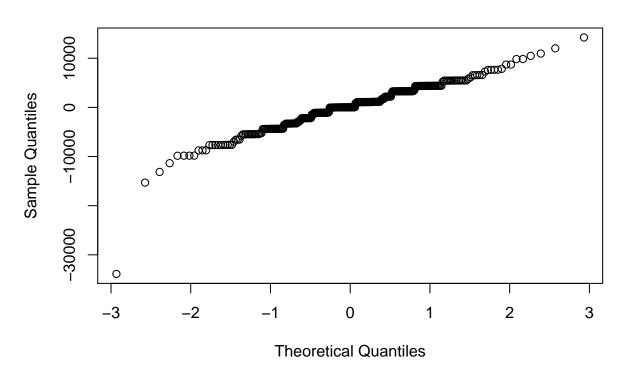


Based on these visual representations it doesn't appear to me that there are really any consistent patterns as a function of soil management, herbicide treatment, location, or year. There does appear to be differences in location across seasons. Therefore, I think it is best if we test for site-year differences as a fixed effect in models for our initial approach and separate means by site-year where appropriate.

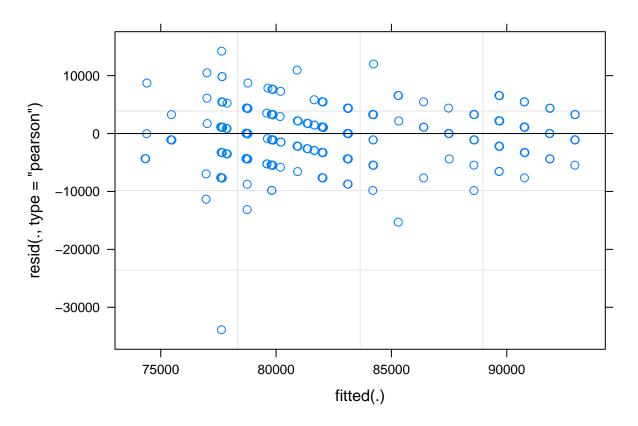
Condensed Stand Count Model

```
cn_stand= lmer(stand_count ~ site_crop_yr*soil*herb + (1|site_crop_yr:rep), data= Corn1)
qqnorm(resid(cn_stand))
```

Normal Q-Q Plot



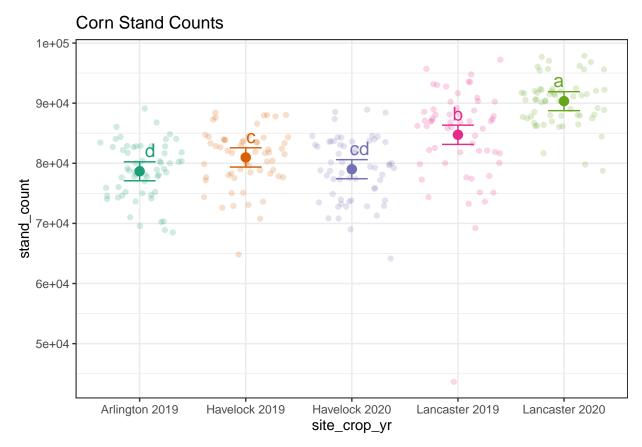
plot(cn_stand)



```
#assumptions met satisfactorily
anova(cn_stand)
```

```
## Type III Analysis of Variance Table with Satterthwaite's method
##
                              Sum Sq
                                        Mean Sq NumDF
                                                         DenDF F value
                                                                          Pr(>F)
                          5594185266 1398546317
## site_crop_yr
                                                     4 14.697 43.6977 5.387e-08
## soil
                             6890561
                                         3445280
                                                     2 207.310 0.1076
                                                                           0.8980
## herb
                           105594808
                                        26398702
                                                     4 207.608
                                                                0.8248
                                                                           0.5107
## site_crop_yr:soil
                           135486393
                                        16935799
                                                     8 207.305
                                                                0.5292
                                                                           0.8338
## site_crop_yr:herb
                           189233105
                                        11827069
                                                    16 207.589
                                                                0.3695
                                                                           0.9878
## soil:herb
                           165394906
                                                     8 210.005
                                                                0.6460
                                        20674363
                                                                           0.7384
                           836955171
                                        26154849
                                                    32 209.491
                                                                0.8172
                                                                           0.7471
## site_crop_yr:soil:herb
##
## site_crop_yr
## soil
## herb
## site_crop_yr:soil
## site_crop_yr:herb
## soil:herb
## site_crop_yr:soil:herb
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

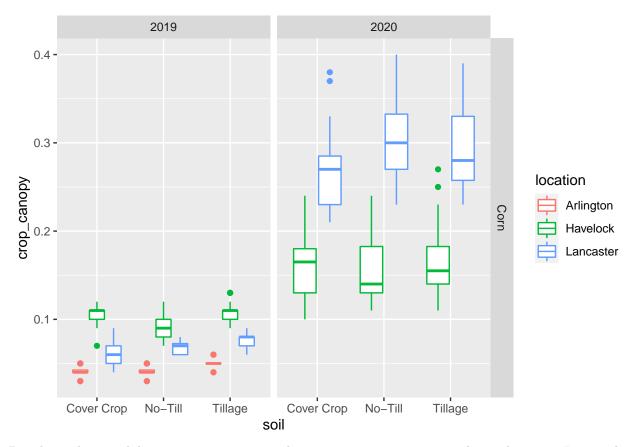
Herbicide carryover and soil management had no effect on early season stand counts in corn.



Wisconsin Stand counts should be closer to 80,000 and Havelock should be closer to 79,000

Corn Canopy

```
Corn1 %>%
  ggplot(aes(x = soil, y = crop_canopy, color = location)) +
  geom_boxplot() +
  facet_grid(crop ~ year)
```



Based on the variability in canopy coverage between cropping seasons within a location, I created a condensed model, similar to the stand count model, with site-year as a fixed effect.

I also decided to perform the analysis using a separate model for each site-year. The first model and figures resulting from this analysis will also be displayed.

Condensed analysis

```
cn_canopy = glmmTMB(crop_canopy~ soil*herb*site_crop_yr + (1|rep:site_crop_yr), data= Corn1, beta_famil
#no assumptions to meet.
Anova(cn_canopy)
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: crop_canopy
##
                              Chisq Df Pr(>Chisq)
## soil
                             17.1467
                                        0.0001891 ***
                                        0.0205277 *
## herb
                             11.6068
                                     4
## site_crop_yr
                          1502.0143
                                         < 2.2e-16 ***
## soil:herb
                                        0.5887809
                             6.5237
                                     8
## soil:site_crop_yr
                            29.6688
                                     8
                                        0.0002418 ***
## herb:site_crop_yr
                            19.5036 16
                                        0.2434150
## soil:herb:site_crop_yr
                            24.0172 32
                                        0.8437917
```

```
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
#all 3 main fixed effects significant and the soil:site-year interaction
```

Separated analysis for each site-year

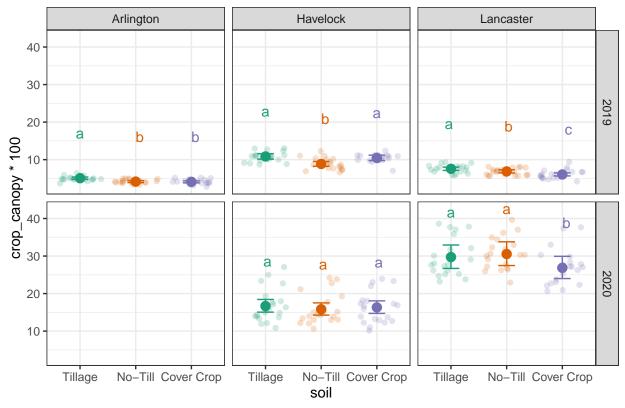
Just showing the first one and then hiding later ones.

```
#begining of analysis with new model for each site-year
arl19_corn_can = glmmTMB(crop_canopy~ soil*herb + (1|rep:site_crop_yr), data= (filter(Corn1, site_crop_
Anova(arl19_corn_can)
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: crop_canopy
##
              Chisq Df Pr(>Chisq)
## soil
            42.0083 2 7.551e-10 ***
## herb
            1.7739 4
                           0.7773
## soil:herb 6.0650 8
                           0.6399
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
#Soil was significant
```

Comparison of canopy coverage analysis approaches

Separated

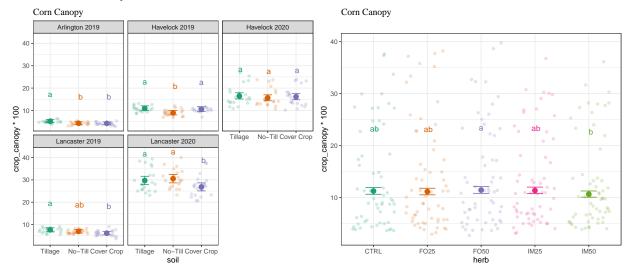
Corn Canopy



Condensed

Corn Canopy Coverage

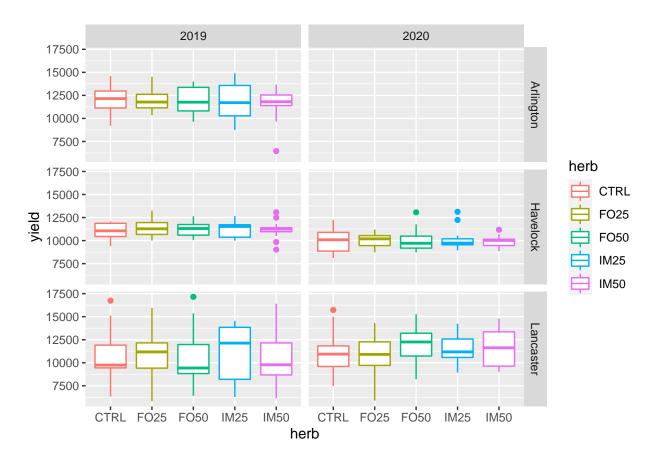
Condensed Analysis



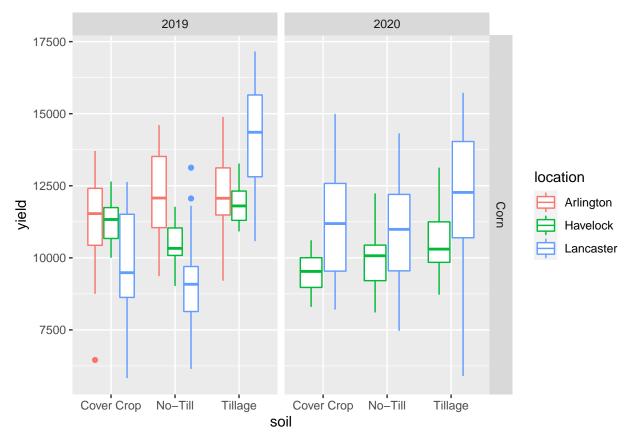
There were slight differences in the Lancaster 2019 site-year results between analysis approaches. The separated approach didn't show that herbicide treatment had a significant effect on canopy coverage but in the composite approach there was reduced coverage for the imazethapyr half-rate treatment, although not significantly different from the control treatment. I prefer the results from the composite approach, similar to my selection in soybean.

Corn Yield

```
Corn1 %>%
  ggplot(aes(x = herb, y = yield, color = herb)) +
  geom_boxplot() +
  facet_grid(location ~ year)
```



```
Corn1 %%
ggplot(aes(x = soil, y = yield, color = location)) +
geom_boxplot() +
facet_grid(crop ~ year)
```



Doesn't appear as if herbicides are likely having any effect on corn yield. It does appear that there are similar trends and yield within a location across years. I will proceed with performing a separate analysis for each location.

Arlington 2019 Analysis

Only going to show the first model. Repeated for each location.

```
arlcn_yield1= lmer(yield~ soil*herb + (1|rep:site_crop_yr), data= (filter(Corn1, site_crop_yr == "Arlin
qqnorm(resid(arlcn_yield1))
plot(arlcn_yield1)
#assumptions look good
anova(arlcn_yield1)
## Type III Analysis of Variance Table with Satterthwaite's method
##
               Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
             12799443 6399722
                                          3.5104 0.03893 *
## soil
                                       42
## herb
              2171602 542900
                                       42
                                           0.2978 0.87774
## soil:herb 10675314 1334414
                                       42 0.7320 0.66269
```

Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1

```
#soil managment fixed effect significant
```

Lancaster Analysis

anova(lancn yield)

```
## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
## soil 222731977 111365989 2 96.199 23.3189 5.531e-09 ***
## herb 3513660 878415 4 96.230 0.1839 0.9462
## soil:herb 22283004 2785375 8 96.271 0.5832 0.7895
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

#Soil management fixed effect significant

Havelock Analysis

anova(havcn_yield)

```
## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)

## soil 21547459 10773729 2 97.033 12.7752 1.188e-05 ***

## herb 884330 221082 4 97.065 0.2622 0.9016

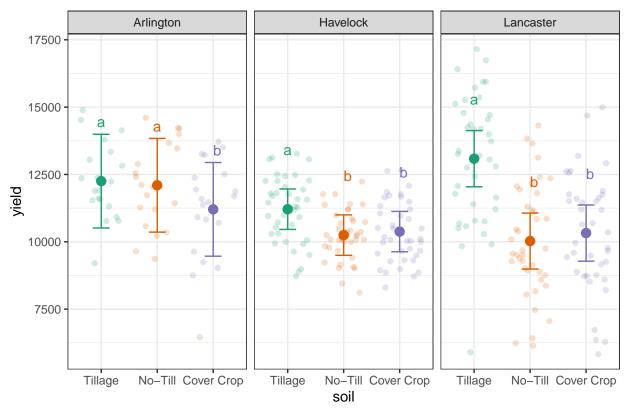
## soil:herb 1679206 209901 8 97.404 0.2489 0.9800

## ---

## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#soil management significant

Corn Yield



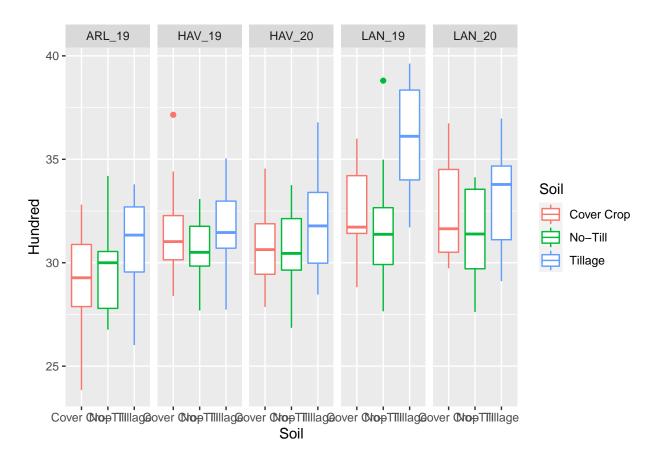
No impact on crop yield from herbicides. All three location had reduced yield for the CC treatment. Havelock and Lancaster showed reduced yield for the no-till treatment as well.

Now to see if the yield components explain more.

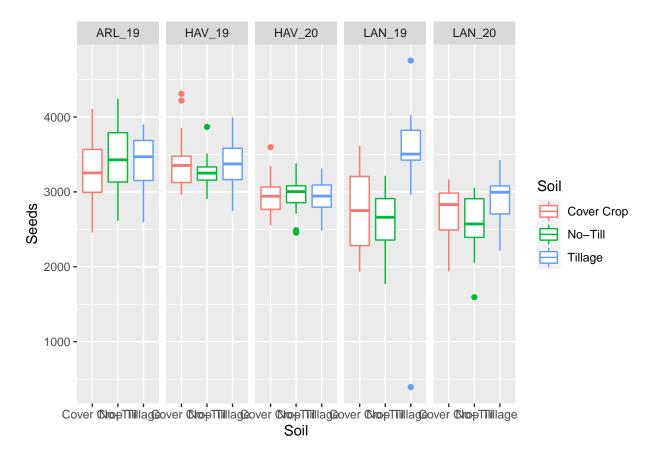
Corn Yield Components

```
#CornComp %>%
  #ggplot(aes(x = Soil, y = Total, color = Soil)) +
  #geom_boxplot() +
  #facet_grid(~ Site_Yr)

#Plot of seed density
CornComp %>%
  ggplot(aes(x = Soil, y = Hundred, color = Soil)) +
  geom_boxplot() +
  facet_grid(~ Site_Yr)
```



```
#Plot of seed counts
CornComp %>%
    ggplot(aes(x = Soil, y = Seeds, color = Soil)) +
    geom_boxplot() +
    facet_grid(~ Site_Yr)
```



Based on these figures I think it would be appropriate to conduct analyses for each location separately similar to how yield was done.

All yield component Figures will be included at the end of this section.

Corn Seed Density

Arlington

Herb

Only chose to show the first model

2.254 0.5635

```
arl_CNHun= lmer(Hundred~ Soil*Herb + (1|Rep) , data= (filter(CornComp, Location == "Arlington" )))
qqnorm(resid(arl_CNHun))

#Assumptions met
anova(arl_CNHun)

## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
## Soil 31.525 15.7626 2 40.075 3.9809 0.02649 *
```

4 40.087 0.1423 0.96535

```
## Soil:Herb 28.057 3.5071 8 40.099 0.8857 0.53695
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1

#Soil Significant
```

Lancaster

```
## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
## Soil 202.001 101.001 2 97.070 17.9829 2.272e-07 ***
## Herb 7.163 1.791 4 97.070 0.3188 0.8648
## Soil:Herb 20.186 2.523 8 97.068 0.4493 0.8883
```

```
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

Havelock

#Soil significant

```
anova(hav CNHun)
```

```
## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)
## Soil 26.356 13.1780 2 105 3.6167 0.03027 *
## Herb 25.971 6.4928 4 105 1.7820 0.13795
## Soil:Herb 43.752 5.4690 8 105 1.5009 0.16565
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

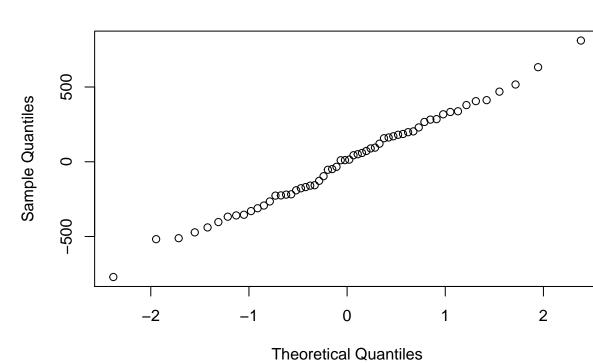
#Soil significant

Corn Seed Count

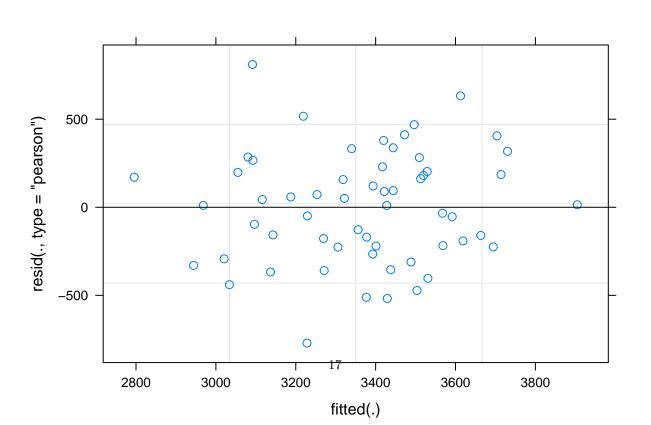
Analysis by Location

Arlington

Normal Q-Q Plot



Showing first model only



Type III Analysis of Variance Table with Satterthwaite's method ## Sum Sq Mean Sq NumDF DenDF F value Pr(>F) ## Soil 159990 79995 2 40.071 0.5652 0.5727 ## Herb 129497 32374 4 40.082 0.2287 0.9207 ## Soil:Herb 852129 106516 8 40.092 0.7526 0.6454

#Nothing Significant

Lancaster

```
anova(lan_Seeds)
```

```
## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)

## Soil 7863046 3931523 2 97.145 14.3403 3.491e-06 ***

## Herb 325624 81406 4 97.144 0.2969 0.8793

## Soil:Herb 994778 124347 8 97.140 0.4536 0.8855

## ---

## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#Soil significant

Havelock

```
anova(hav_Seeds)
```

```
## Type III Analysis of Variance Table with Satterthwaite's method
## Sum Sq Mean Sq NumDF DenDF F value Pr(>F)

## Soil 100933 50467 2 98.005 0.6196 0.5403

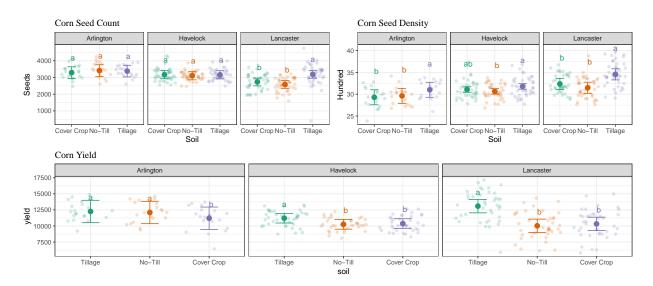
## Herb 137558 34390 4 98.034 0.4222 0.7923

## Soil:Herb 252556 31569 8 98.360 0.3876 0.9249
```

#Nothing significant

Corn Yield Components to Yield comparison

Corn Yield Components - Yield



Arlington

When final grain yield was lowest for the cover crop soil management treatment, there was reduced seed density (also reduced density for the no-till treatment).

Havelock

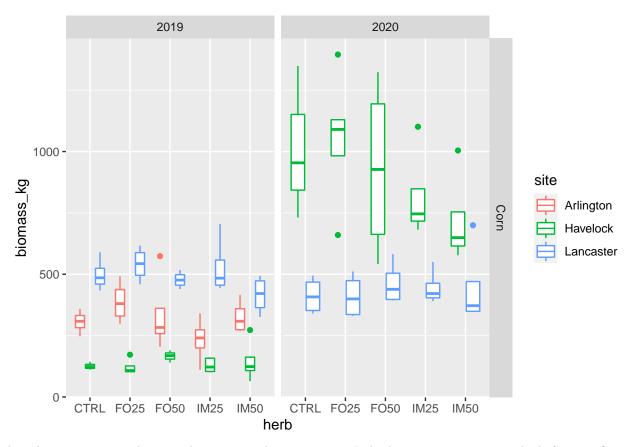
For the reduced final grain yield for the no-till and cover crop treatments, there was significantly lower seed density for the no-till treatment and (not significantly reduced) mean grain density for the cover crop treatment

Lancaster

For the reduced final grain yield for the no-till and cover crop treatments, there was significantly lower seed density for the no-till and cover crop treatments as well as significantly lower seed counts.

Cover Crop Biomass analysis

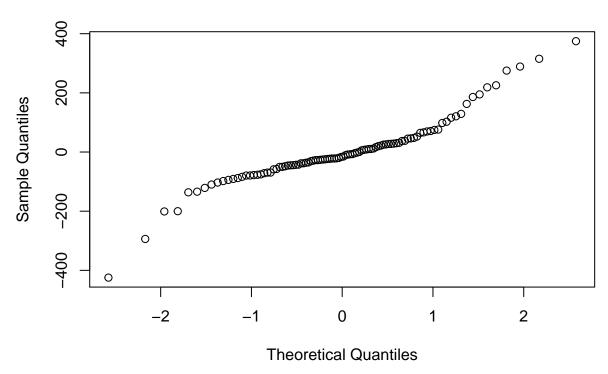
```
CornCC %>%
  ggplot(aes(x = herb, y = biomass_kg, color = site)) +
  geom_boxplot() +
  facet_grid(crop ~ year)
```



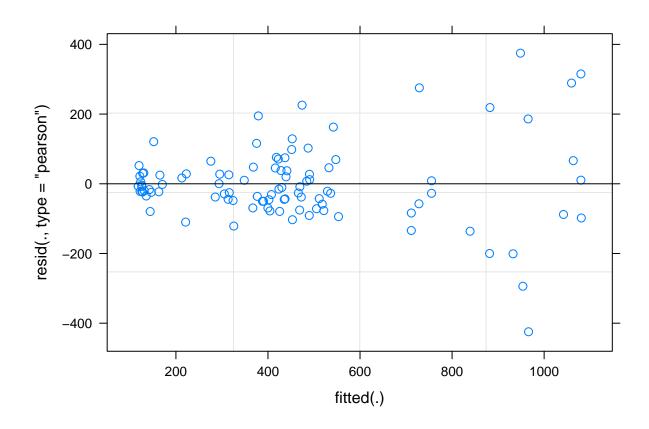
based on separations between locations and across years, I think it is appropriate to look for significant differences between site-years and separate means accordingly in CC biomass models.

```
cn_cc_bio= lmer(biomass_kg~ site_crop_yr * herb + (1|site_crop_yr:rep), data=CornCC)
qqnorm(resid(cn_cc_bio))
```





plot(cn_cc_bio)

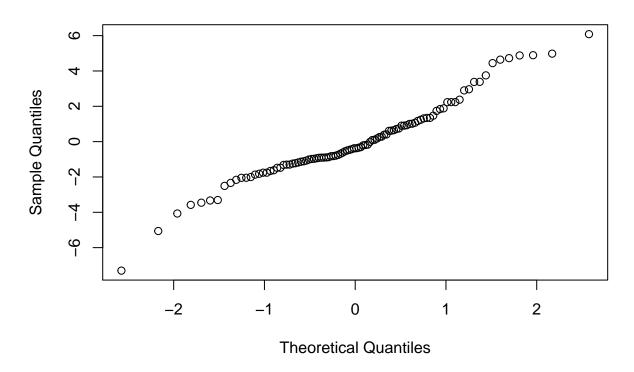


```
#Assumption for equal variance not met

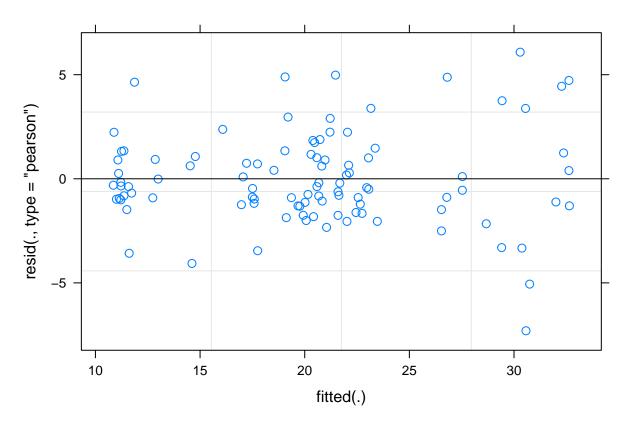
#Proceeded with a square-root transformation
cn_cc_bio1= lmer(sqrt(biomass_kg)~ site_crop_yr * herb + (1|site_crop_yr:rep), data=CornCC)

qqnorm(resid(cn_cc_bio1))
```

Normal Q-Q Plot



plot(cn_cc_bio1)

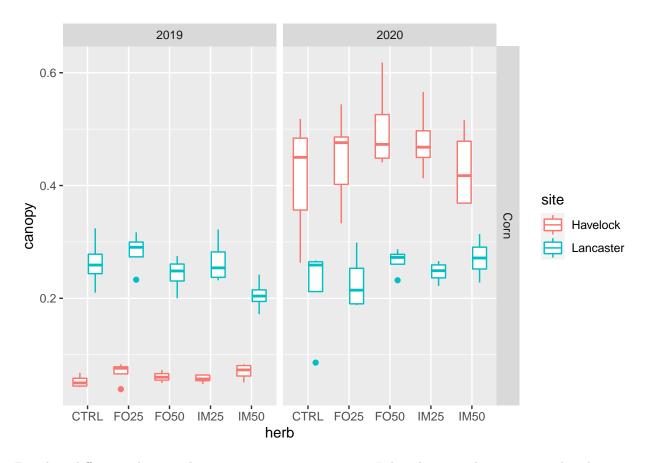


```
#assumptions improved. Use this one!
anova(cn_cc_bio1)
## Type III Analysis of Variance Table with Satterthwaite's method
                     Sum Sq Mean Sq NumDF DenDF F value
                    2155.06 538.77
                                        4 13.964 75.2804 2.725e-09 ***
## site_crop_yr
## herb
                      42.79
                              10.70
                                        4 60.805
                                                 1.4949
                                                            0.2149
                     123.04
                               7.69
                                       16 60.528
                                                 1.0745
                                                            0.3982
## site_crop_yr:herb
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
#Site-year significant
```

There is no evidence that herbicide treatment influenced cover crop biomass.

Cover Crop Canopy

```
CornCC1 %>%
  ggplot(aes(x = herb, y = canopy, color = site)) +
  geom_boxplot() +
  facet_grid(crop ~ year)
```



Based on differences between location across growing seasons I thought it was best to proceed with testing site-year as a fixed effect.

```
cn_cc_can= glmmTMB(canopy~ site_crop_yr*herb + (1|site_crop_yr:rep), data=CornCC1, beta_family(link="log")
Anova(cn_cc_can)
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: canopy
                        Chisq Df Pr(>Chisq)
##
## site_crop_yr
                     612.4325
                               3
                                      <2e-16 ***
                       6.4557
                               4
                                      0.1676
## herb
## site_crop_yr:herb 15.1064 12
                                      0.2357
                     '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
#Site-year significant
```

There is no evidence that herbicide treatment influenced cover crop biomass.