

Analysis_First_Chapter2

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23/5/2022

1. Uploading Libraries

```
library(tidyr)
library(tidyverse)
library(ggplot2)
library(survival)
library(survminer)
library(ranger)
library(ggplot2)
library(ggpubr)
library(ggsci)
library(readxl)
library(showtext)
library(lubridate)
setwd("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter")
# setwd("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter")
data_analysis <-
  read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\data_analysis_cens.xlsx",
             col_types = c("numeric", "date", "numeric", "date",
                           "numeric", "numeric", "numeric", "numeric"))

# #pathsFede
# setwd("/home/fbartu/Research/Laura_Blanco/Chapter-Survival/PrimerCap/")
# data_analysis <-
#   read_excel("data_analysis_cens.xlsx",
#             col_types = c("numeric", "date", "numeric", "date",
#                           "numeric", "numeric", "numeric", "numeric"))

#Now, data of weather (RH and Temperature) in both locations in the field (HOBO's data)
# jardin_clima <-
#   read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\Jardin_clima_total.xlsx",
#             col_types = c("date", "numeric", "numeric"))
#
# palafolls_clima <-
#   read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\Palafolls_clima_total.xlsx",
#             col_types = c("date", "numeric", "numeric"))

jardin_clima <-
  read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\Jardin_clima_total.xlsx",
            col_types = c("date", "numeric", "numeric"))
```

```

palafolls_clima <-
  read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\Palafolls_clima_total.xlsx")

#URBAN DATAFRAME OF WEATHER
temperaturemeanpal<- palafolls_clima%>%
  #v#calculating means of temperature and rh per day (HOBO makes 3 measures per day)
  group_by(DATE)%>%
  summarise(meantemperature=mean(TEMPERATURE),meanrh = mean(RH) )

temperatureminpal<- palafolls_clima%>%
  #v#calculating mins of temperature and rh per day (HOBO makes 3 measures per day)
  group_by(DATE)%>%
  summarise(mintemperature=min(TEMPERATURE),minrh = min(RH) )

temperaturemaxpal<- palafolls_clima%>%
  #v#calculating max of temperature and rh per day (HOBO makes 3 measures per day)
  group_by(DATE)%>%
  summarise(maxtemperature=max(TEMPERATURE),maxrh = max(RH) )
palafolls_clima<- merge(temperaturemaxpal, temperaturemeanpal, by = "DATE")
palafolls_clima_total<- merge(palafolls_clima, temperatureminpal, by = "DATE")
remove(palafolls_clima)
remove(temperaturemaxpal)
remove(temperatureminpal)
remove(temperaturemeanpal)

#SEMI-URBAN DATAFRAME OF WEATHER
temperaturemeanjar<- jardin_clima%>% #calculating means of temperature and rh per day
  group_by(DATE)%>%
  summarise(meantemperature=mean(TEMPERATURE),meanrh = mean(RH))

temperatureminjar<- jardin_clima%>% #calculating min of temperature and rh per day
  group_by(DATE)%>%
  summarise(mintemperature=min(TEMPERATURE),minrh = min(RH))

temperaturemaxjar<- jardin_clima%>% #calculating max of temperature and rh per day
  group_by(DATE)%>%
  summarise(maxtemperature=max(TEMPERATURE),maxrh = max(RH))
jardin_clima<- merge(temperaturemaxjar, temperaturemeanjar, by = "DATE")
jardin_clima_total<- merge(jardin_clima, temperatureminjar, by = "DATE")
remove(jardin_clima)
remove(temperaturemaxjar)
remove(temperaturemeanjar)
remove(temperatureminjar)

jardin_clima_total$location <- "1"
#creating new columns according to the locations
jardin_clima_total$location<- as.numeric(jardin_clima_total$location)
palafolls_clima_total$location<- "2"
palafolls_clima_total$location<- as.numeric(palafolls_clima_total$location)
#renaming column DATE to match with start_date column from our data_analysis dataframe
jardin_clima_total <- jardin_clima_total %>%
  rename(start_date = DATE)

```

```

palafolls_clima_total <- palafolls_clima_total %>%
  rename(start_date = DATE)

datos_semi <- inner_join(data_analysis, jardin_clima_total,
                           by = c("start_date", "location"), all= TRUE)
#Combining temperature of each location with the data
datos_urban <- inner_join(data_analysis, palafolls_clima_total,
                           by = c("start_date", "location"), all= TRUE)
datos_lab<- subset(data_analysis, location=="3")
datos_lab$meantemperature <- NA
datos_lab$meanrh <- NA
datos_lab$mintemperature <- NA
datos_lab$minrh <- NA
datos_lab$maxtemperature <- NA
datos_lab$maxrh <- NA
datos_field_lab <- rbind(datos_semi, datos_urban, datos_lab)
#merging all to have a dataframe completed (data survival + weather)
datos_field<- rbind(datos_semi, datos_urban)
clima_field <- rbind(jardin_clima_total, palafolls_clima_total)

```

2. Creating weather variables and duplicating rows per mosquito

```

df <- read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\datos_field.xlsx",
                 col_types = c("numeric",
                               "date", "date", "numeric", "numeric",
                               "numeric", "numeric", "numeric", "numeric",
                               "numeric", "numeric", "numeric", "numeric"))
clima <- read_excel("C:\\\\Users\\\\lblan\\\\OneDrive\\\\Escritorio\\\\CEAB\\\\2022\\\\First_chapter\\\\clima_field.xlsx",
                     col_types = c("date",
                                   "numeric", "numeric", "numeric", "numeric",
                                   "numeric", "numeric", "numeric"))
#pathsFEDE
# setwd("/home/fbartu/Research/Laura_Blanco/Chapter-Survival/PrimerCap/")
# df <- read_excel("datos_field.xlsx",
#                     col_types = c("numeric",
#                                   "date", "date", "numeric", "numeric",
#                                   "numeric", "numeric", "numeric", "numeric",
#                                   "numeric", "numeric", "numeric", "numeric"))
# clima <- read_excel("clima_field.xlsx",
#                     col_types = c("date",
#                                   "numeric", "numeric", "numeric", "numeric",
#                                   "numeric", "numeric", "numeric"))
new_df <- df[0, ]
# this also works, maintaining object structure (data.frame) and column names
id <- seq_len(nrow(df)) # since there are duplicated ID, we iterate by row
df$start_date <- as.Date(df$start_date, format = '%Y-%m-%d')

```

```

df$start_date <- as.Date(df$start_date, format = '%Y-%m-%d')
clima$start_date <- as.character(as.Date(clima$start_date, format = '%Y-%m-%d'))

new_df <- do.call('rbind', lapply(seq_len(nrow(df)), function(id){
  tmp <- do.call('rbind', replicate(df$total_lived[id],
    df[id, ], simplify = FALSE))
  tmp$start_date <- format(seq(tmp$start_date[1], by = 'day',
    length.out = nrow(tmp)), '%Y-%m-%d')
  tmp
}))

vars <- c('maxtemperature', 'meantemperature',
  'mintemperature', 'maxrh', 'minrh', 'meanrh')
for(d in unique(clima$start_date)){
  new_df[new_df$start_date == d & new_df$location == 1, vars] <-
    clima[clima$start_date == d & clima$location == 1, vars]
  new_df[new_df$start_date == d & new_df$location == 2, vars] <-
    clima[clima$start_date == d & clima$location == 2, vars]
}

```

Adding photoperiod

```

#we add photoperiod
library(meteor)
photoperiod <- photoperiod(152:337, 41.6833)
photoperiod <- as.data.frame(photoperiod)
values = seq(from = as.Date("2021-06-01"), to = as.Date("2021-12-03"),
  by = 'day')
photoperiod$dates <- values
photoperiod$dates <- as.character(as.Date(photoperiod$dates,
  format = '%Y-%m-%d'))

new_df$start_date <- as.character(as.Date(new_df$start_date,
  format = '%Y-%m-%d'))

str(photoperiod)

## 'data.frame': 186 obs. of 2 variables:
## $ photoperiod: num 15 15 15 15 15.1 ...
## $ dates      : chr "2021-06-01" "2021-06-02" "2021-06-03" "2021-06-04" ...

new_df[, 'photoperiod'] <- 0 # new column called photoperiod
vars2 <- c('photoperiod')
for(d in unique(photoperiod$dates)){
  new_df[new_df$start_date == d, vars2] <-
    photoperiod[photoperiod$dates == d, vars2]
}

new_df$`hl/bg` <- factor(new_df$`hl/bg`,
```

```

            levels = c("1", "2"),
            labels = c("HB", "BG"))
new_df$location <- factor(new_df$location,
                           levels = c("1", "2"),
                           labels = c("Peri_Urban", "Urban"))

```

Other weather parameters: GDD and MWI

Growing degree days

```

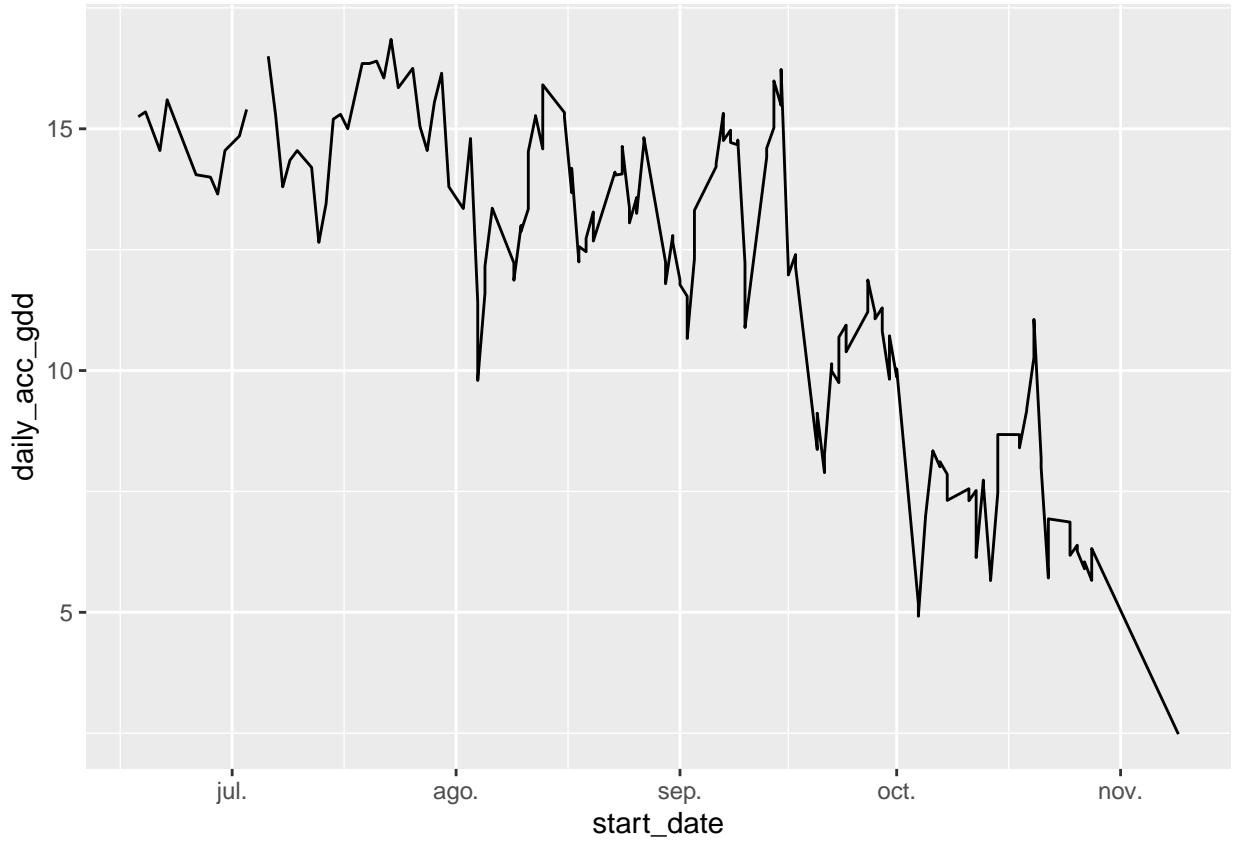
#library(scales) not needed because there are other packages we use that import this package
library(pollen)
new_df_gdd <- new_df %>%
  mutate(gdd = gdd(tmax = maxtemperature, tmin = mintemperature, tbase = 10,
                   tbase_max = 30)) %>%
  mutate(daily_acc_gdd = c(NA, diff(gdd)))

ddfield <- datos_field %>%
  mutate(gdd = gdd(tmax = maxtemperature, tmin = mintemperature, tbase = 10,
                   tbase_max = 30)) %>%
  mutate(daily_acc_gdd = c(NA, diff(gdd)))

ddfield <- ddfield %>%
  rename(method = 'hl/bg')

gdd <- ggplot(aes(x = start_date, y= daily_acc_gdd), data = ddfield) + geom_line()
gdd

```



MWImean

```

# michaelakis mwi
# mwi = function(Hum, Temp) {
#   FH = case_when(Hum < 40~0, Hum >95~0, (Hum >=40 & Hum <= 95)~
#                 ((Hum/55)-(40/55)) )
#   FT = case_when(Temp<=15~0, Temp>30~0, (Temp>15 & Temp <=20)~
#                  (.2*Temp)-3, (Temp>20 & Temp<=25)~1, (Temp>25 & Temp <= 30)~
#                  (-.2*6)+6)
#   return(FH*FT)
# }

#new mwi
mwi = function(Hum, Temp) {
  FH = case_when(Hum < 34~0, (Hum >=34 & Hum <= 100)~
                 ((Hum/66)-(34/66)) )
  FT = case_when(Temp<10~0, Temp>35~0, (Temp>=10 & Temp <=20)~
                 (.1*Temp)-1, (Temp>20 & Temp<=25)~1, (Temp>25 & Temp <= 35)~
                 (-.1*Temp)+3.5)
  return(FH*FT)
}

##MEAN MWI
new_df_gdd= new_df_gdd %>% mutate(

```

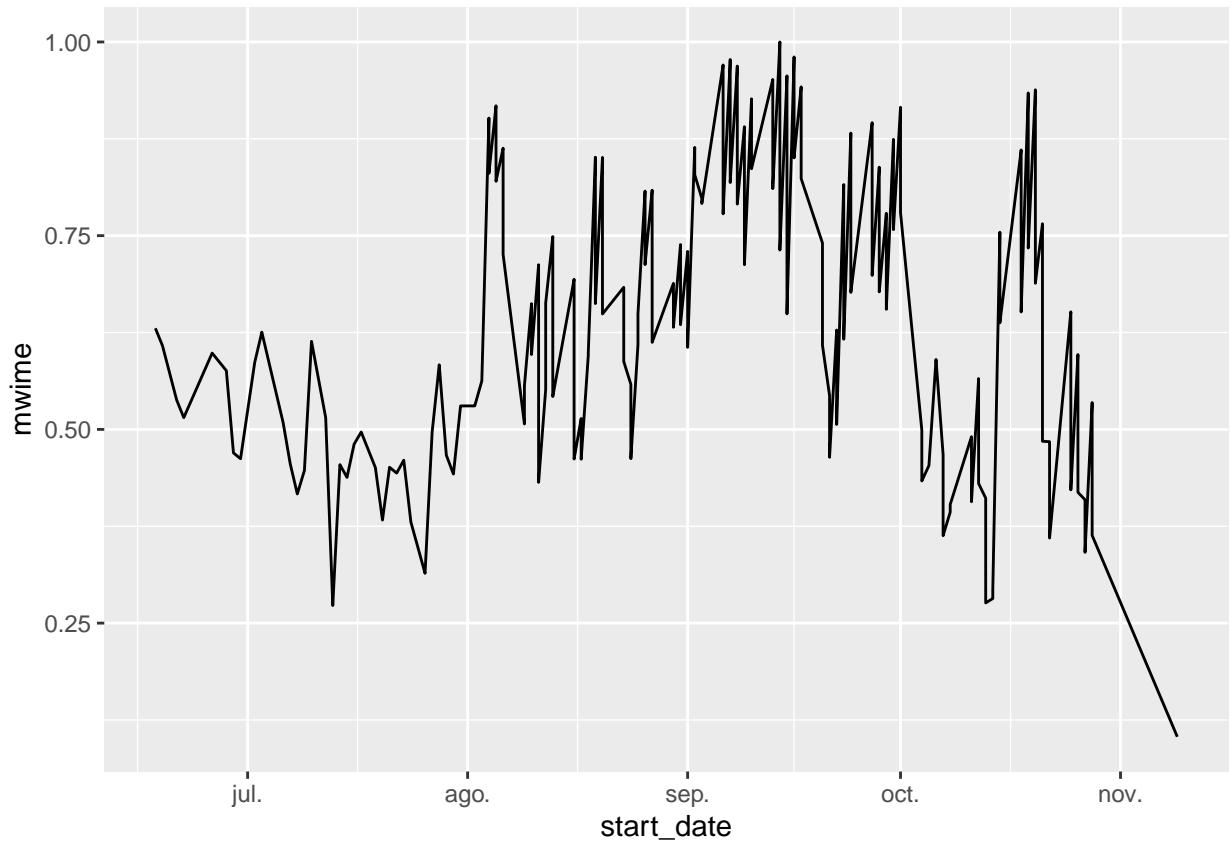
```

FHme = case_when(meanrh < 34~0, (meanrh >=34 & meanrh <= 100)~
  ((meanrh/66)-(34/66)) ),
FTme = case_when(meantemperature<10~0, meantemperature>35~0, (meantemperature>=10 & meantemperature <=
mwime = FHme*FTme

ddfield= ddfield %>% mutate(
  FHme = case_when(meanrh < 34~0, (meanrh >=34 & meanrh <= 100)~
    ((meanrh/66)-(34/66)) ),
  FTme = case_when(meantemperature<10~0, meantemperature>35~0, (meantemperature>=10 & meantemperature <=
  mwime = FHme*FTme)

mwiplot <-ggplot(aes(x =start_date, y= mwime), data = ddfield) + geom_line()
mwiplot

```



```

##MIN MWI
new_df_gdd= new_df_gdd %>% mutate(
  FHmin = case_when(minrh < 34~0, (minrh >=34 & minrh <= 100)~
    ((minrh/66)-(34/66)) ),
  FTmin = case_when(mintemperature<10~0, mintemperature>35~0, (mintemperature>=10 & mintemperature <=
  mwimin = FHmin*FTmin)

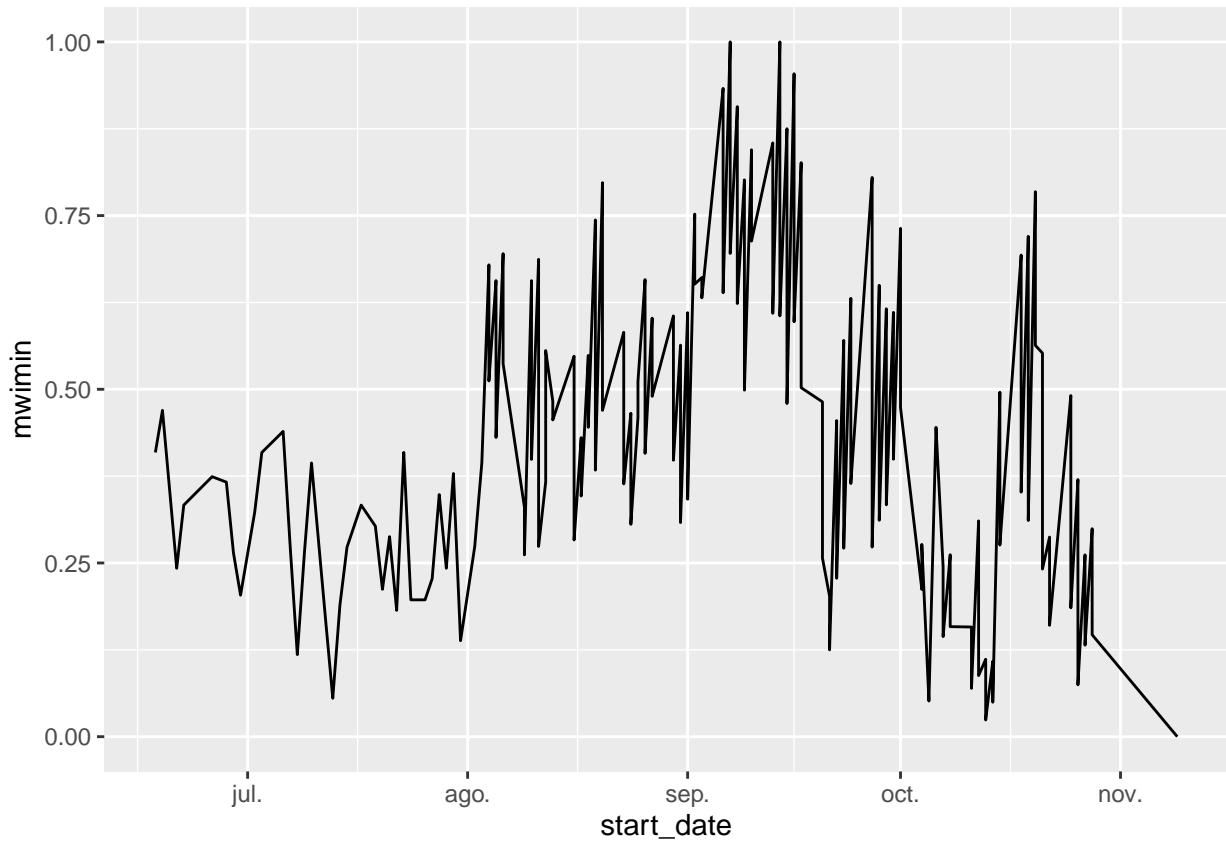
ddfield= ddfield %>% mutate(
  FHmin = case_when(minrh < 34~0, (minrh >=34 & minrh <= 100)~
    ((minrh/66)-(34/66)) ),
  FTmin = case_when(mintemperature<10~0, mintemperature>35~0, (mintemperature>=10 & mintemperature <=

```

```

mwimin = FHmin*FTmin)
mwiminplot <-ggplot(aes(x =start_date, y= mwimin), data = ddfield) + geom_line()
mwiminplot

```

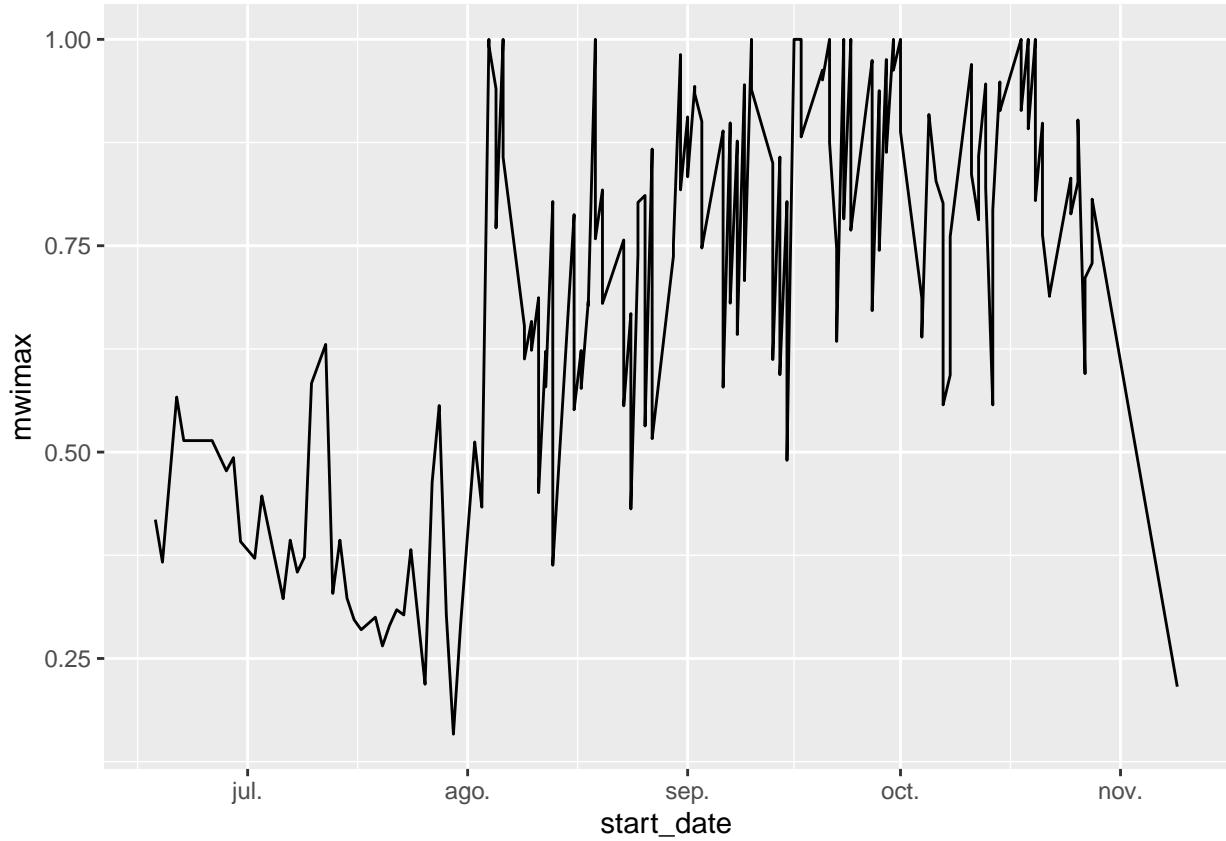


```

##MAX MWI
new_df_gdd= new_df_gdd %>% mutate(
  FHmax = case_when(maxrh < 34~0, (maxrh >=34 & maxrh <= 100)~
                     ((maxrh/66)-(34/66)) ),
  FTmax = case_when(maxtemperature<10~0, maxtemperature>35~0, (maxtemperature>=10 & maxtemperature <=20),
  mwimax = FHmax*FTmax)

ddfield= ddfield %>% mutate(
  FHmax = case_when(maxrh < 34~0, (maxrh >=34 & maxrh <= 100)~
                     ((maxrh/66)-(34/66)) ),
  FTmax = case_when(maxtemperature<10~0, maxtemperature>35~0, (maxtemperature>=10 & maxtemperature <=20),
  mwimax = FHmax*FTmax)
mwimaxplot <-ggplot(aes(x =start_date, y= mwimax), data = ddfield) + geom_line()
mwimaxplot

```



3.Cox-Regression models

1. No random effects
2. Random effects; level 1 (method) + level 2 (location);
 - Separated: $(1|\text{method}) + (1|\text{location})$
 - Together: $(1|\text{location}/\text{method})$, to check the effect of the method of capture within location

Temperature

Models with minimum temperatures

```

new_df_gdd <- new_df_gdd %>%
  rename(method = 'hl/bg')
#writexl::write_xlsx(new_df_gdd, "C:\\Users\\lbian\\OneDrive\\Escritorio\\CEAB\\2022\\First_chapter\\da
library(coxme)

# No random effect
cox_mint<- coxph(Surv(total_lived, censored) ~ mintemperature, data= new_df_gdd)
summary(cox_mint)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mintemperature,
##        data = new_df_gdd)
##
##      n= 15155, number of events= 14542
##
##              coef exp(coef) se(coef)     z Pr(>|z|)
## mintemperature 0.030025  1.030481 0.002078 14.45   <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## mintemperature     1.03      0.9704    1.026     1.035
##
## Concordance= 0.538  (se = 0.003 )
## Likelihood ratio test= 214.8 on 1 df,  p=<2e-16
## Wald test           = 208.7 on 1 df,  p=<2e-16
## Score (logrank) test = 209 on 1 df,  p=<2e-16

```

```
cox.zph(cox_mint)
```

```

##                  chisq df      p
## minttemperature 9.63  1 0.0019
## GLOBAL          9.63  1 0.0019

```

```

#Random effect - separated
coxme_mint_s<- coxme(Surv(total_lived, censored) ~ mintemperature +
                         (1|location) + (1|method), data= new_df_gdd)
summary(coxme_mint_s)

```

```

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 7 31
##                 NULL Integrated      Fitted
## Log-likelihood -125304.4 -125046.8 -125040.8
##
##                 Chisq   df   p     AIC     BIC
## Integrated loglik 515.23 3.00 0 509.23 486.47
## Penalized loglik 527.19 2.98 0 521.22 498.58
##
## Model: Surv(total_lived, censored) ~ mintemperature + (1 | location) + (1 | method)
## Fixed coefficients
##              coef exp(coef) se(coef)     z p
## minttemperature 0.02387999  1.024167 0.00217684 10.97 0
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.11984332 0.01436242
## method   Intercept 0.19470477 0.03790995

```

```

exp(confint(coxme_mint_s))

##                2.5 %    97.5 %
## minttemperature 1.019807 1.028546

#Random effect - together
coxme_mint_t<- coxme(Surv(total_lived, censored) ~ mintemperature +
                      (1|location/method), data= new_df_gdd)
exp(confint(coxme_mint_t))

##                2.5 %    97.5 %
## minttemperature 1.019723 1.028469

summary(coxme_mint_t)

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14542, 15155
##   Iterations= 16 67
##                  NULL Integrated     Fitted
## Log-likelihood -125304.4 -125047.3 -125038.9
##
##                  Chisq   df p     AIC     BIC
## Integrated loglik 514.21 3.00 0 508.21 485.46
## Penalized loglik 531.13 3.97 0 523.19 493.09
##
## Model: Surv(total_lived, censored) ~ mintemperature + (1 | location/method)
## Fixed coefficients
##                  coef exp(coef)    se(coef)      z p
## minttemperature 0.02380119 1.024087 0.002178638 10.92 0
##
## Random effects
##   Group           Variable     Std Dev     Variance
##   location/method (Intercept) 0.1849459790 0.0342050152
##   location         (Intercept) 0.0198709809 0.0003948559

```

Models with mean temperatures

```

# No random effect
cox_meant<- coxph(Surv(total_lived, censored) ~ meantemperature,
                     data= new_df_gdd)

summary(cox_meant)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ meantemperature,
##       data = new_df_gdd)
##
## n= 15155, number of events= 14542

```

```

##                                     coef exp(coef)   se(coef)      z Pr(>|z|)
## meantemperature 0.035534  1.036173 0.002192 16.21    <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##                                     exp(coef) exp(-coef) lower .95 upper .95
## meantemperature     1.036      0.9651     1.032     1.041
##
## Concordance= 0.547  (se = 0.003 )
## Likelihood ratio test= 271.4  on 1 df,  p=<2e-16
## Wald test            = 262.8  on 1 df,  p=<2e-16
## Score (logrank) test = 263.4  on 1 df,  p=<2e-16

#Random effect - separated
coxme_meant_s<- coxme(Surv(total_lived, censored) ~ meantemperature +
                         (1|location) + (1|method), data= new_df_gdd)
summary(coxme_meant_s)

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14542, 15155
##   Iterations= 18 75
##           NULL Integrated Fitted
## Log-likelihood -125304.4 -125004.6 -124998.5
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 599.73 3.00 0 593.73 570.98
## Penalized loglik 611.91 2.99 0 605.94 583.28
##
## Model: Surv(total_lived, censored) ~ meantemperature + (1 | location) + (1 | method)
## Fixed coefficients
##                                     coef exp(coef)   se(coef)      z p
## meantemperature 0.03151728  1.032019 0.002218942 14.2 0
##
## Random effects
##   Group   Variable Std Dev Variance
##   location Intercept 0.13288329 0.01765797
##   method   Intercept 0.19425609 0.03773543

exp(confint(coxme_meant_s))

##               2.5 % 97.5 %
## meantemperature 1.027541 1.036517

#Random effect - together
coxme_meant_t<- coxme(Surv(total_lived, censored) ~ meantemperature +
                         (1|location/method), data= new_df_gdd)
exp(confint(coxme_meant_t))

##               2.5 % 97.5 %
## meantemperature 1.027488 1.036472

```

```

summary(coxme_meant_t)

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14542, 15155
## Iterations= 17 71
##             NULL Integrated     Fitted
## Log-likelihood -125304.4 -125005.1 -124996.6
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 598.65 3.00 0 592.65 569.89
## Penalized loglik 615.73 3.97 0 607.79 577.67
##
## Model: Surv(total_lived, censored) ~ meantemperature + (1 | location/method)
## Fixed coefficients
##           coef exp(coef) se(coef)     z p
## meantemperature 0.0314699 1.03197 0.00222067 14.17 0
##
## Random effects
## Group           Variable     Std Dev     Variance
## location/method (Intercept) 0.1898531057 0.0360442017
## location       (Intercept) 0.0199107424 0.0003964377

```

Models with maximum temperatures

```

# No random effect
cox_maxt<- coxph(Surv(total_lived, censored) ~ maxtemperature,
                     data= new_df_gdd)

summary(cox_maxt)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ maxtemperature,
##        data = new_df_gdd)
##
## n= 15155, number of events= 14542
##
##           coef exp(coef) se(coef)     z Pr(>|z|)
## maxtemperature 0.033117 1.033672 0.002136 15.5 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##           exp(coef) exp(-coef) lower .95 upper .95
## maxtemperature     1.034      0.9674     1.029      1.038
##
## Concordance= 0.541  (se = 0.003 )
## Likelihood ratio test= 245.8 on 1 df,  p=<2e-16
## Wald test          = 240.3 on 1 df,  p=<2e-16
## Score (logrank) test = 240.6 on 1 df,  p=<2e-16

```

```

#Random effect - separated
coxme_maxt_s<- coxme(Surv(total_lived, censored) ~ maxtemperature +
  (1|location) + (1|method), data= new_df_gdd)
summary(coxme_maxt_s)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 7 31
##           NULL Integrated Fitted
## Log-likelihood -125304.4 -124979.1 -124972.8
##
##          Chisq df p   AIC   BIC
## Integrated loglik 650.65 3.00 0 644.65 621.89
## Penalized loglik 663.31 2.99 0 657.33 634.64
##
## Model: Surv(total_lived, censored) ~ maxtemperature + (1 | location) + (1 | method)
## Fixed coefficients
##            coef exp(coef)    se(coef)      z p
## maxtemperature 0.0340556 1.034642 0.002145233 15.88 0
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.1729280 0.0299041
## method   Intercept 0.1950528 0.0380456

exp(confint(coxme_maxt_s))

##           2.5 % 97.5 %
## maxtemperature 1.030301 1.039002

#Random effect - together
coxme_maxt_t<- coxme(Surv(total_lived, censored) ~ maxtemperature +
  (1|location/method), data= new_df_gdd)

summary(coxme_maxt_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 8 35
##           NULL Integrated Fitted
## Log-likelihood -125304.4 -124979.8 -124971
##
##          Chisq df p   AIC   BIC
## Integrated loglik 649.24 3.00 0 643.24 620.48
## Penalized loglik 666.81 3.97 0 658.86 628.71
##
## Model: Surv(total_lived, censored) ~ maxtemperature + (1 | location/method)
## Fixed coefficients
##            coef exp(coef)    se(coef)      z p
## maxtemperature 0.03400195 1.034587 0.002146769 15.84 0

```

```

## Random effects
## Group           Variable     Std Dev     Variance
## location/method (Intercept) 0.2057477731 0.0423321461
## location       (Intercept) 0.0200121633 0.0004004867

exp(confint(coxme_maxt_t))

##          2.5 %   97.5 %
## maxtemperature 1.030243 1.038949

```

MWI (Mosquito Weather Index)

```

# No random effect
cox_mwimin<- coxph(Surv(total_lived, censored) ~ mwimin,
                      data= new_df_gdd)

summary(cox_mwimin)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mwimin, data = new_df_gdd)
##
##    n= 15155, number of events= 14542
##
##          coef exp(coef) se(coef)      z Pr(>|z|)
## mwimin 0.15475  1.16737  0.03196 4.843 1.28e-06 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## mwimin     1.167      0.8566     1.096     1.243
##
## Concordance= 0.508  (se = 0.003 )
## Likelihood ratio test= 23.39  on 1 df,  p=1e-06
## Wald test            = 23.45  on 1 df,  p=1e-06
## Score (logrank) test = 23.46  on 1 df,  p=1e-06

#Random effect - separated
coxme_mwimin_s<- coxme(Surv(total_lived, censored) ~ mwimin +
                           (1|location) + (1|method), data= new_df_gdd)
summary(coxme_mwimin_s)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 7 31
##             NULL Integrated     Fitted
## Log-likelihood -125304.4  -125107.1 -125100.8
##
##          Chisq    df p     AIC     BIC

```

```

## Integrated loglik 394.58 3.00 0 388.58 365.83
## Penalized loglik 407.28 2.99 0 401.30 378.62
##
## Model: Surv(total_lived, censored) ~ mwimin + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)   se(coef)      z      p
## mwimin -0.04933129 0.9518657 0.03561648 -1.39 0.17
##
## Random effects
##  Group      Variable Std Dev Variance
##  location Intercept 0.17513375 0.03067183
##  method    Intercept 0.19618926 0.03849022

exp(confint(coxme_mwimin_s))

##          2.5 % 97.5 %
## mwimin 0.887685 1.020687

#Random effect - together
coxme_mwimin_t<- coxme(Surv(total_lived, censored) ~ mwimin +
                         (1|location/method), data= new_df_gdd)
exp(confint(coxme_mwimin_t))

##          2.5 % 97.5 %
## mwimin 0.8856942 1.018462

summary(coxme_mwimin_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 8 35
##             NULL Integrated Fitted
## Log-likelihood -125304.4 -125107.1 -125098.3
##
##          Chisq df p     AIC     BIC
## Integrated loglik 394.61 3.00 0 388.61 365.85
## Penalized loglik 412.23 3.97 0 404.29 374.14
##
## Model: Surv(total_lived, censored) ~ mwimin + (1 | location/method)
## Fixed coefficients
##           coef exp(coef)   se(coef)      z      p
## mwimin -0.0515448 0.9497611 0.03563267 -1.45 0.15
##
## Random effects
##  Group      Variable Std Dev Variance
##  location/method (Intercept) 0.2075090473 0.0430600047
##  location       (Intercept) 0.0200091744 0.0004003671

```

MWIMEAN

```

#no random effect
cox_mwimean<- coxph(Surv(total_lived, censored) ~ mwime,
                        data= new_df_gdd)

summary(cox_mwimean)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mwime, data = new_df_gdd)
##
##    n= 15155, number of events= 14542
##
##          coef exp(coef) se(coef)      z Pr(>|z|)
## mwime 0.10816   1.11422  0.03601 3.004  0.00267 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## mwime     1.114      0.8975    1.038     1.196
##
## Concordance= 0.497  (se = 0.003 )
## Likelihood ratio test= 9.07  on 1 df,  p=0.003
## Wald test            = 9.02  on 1 df,  p=0.003
## Score (logrank) test = 9.02  on 1 df,  p=0.003

# Random effect separated
coxme_mwimean_s<- coxme(Surv(total_lived, censored) ~ mwime +
                           (1|location) + (1|method), data= new_df_gdd)
exp(confint(coxme_mwimean_s))

##           2.5 %   97.5 %
## mwime 0.8843852 1.024973

summary(coxme_mwimean_s)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 7 31
##           NULL Integrated Fitted
## Log-likelihood -125304.4 -125107.3 -125100.9
##
##           Chisq   df p    AIC    BIC
## Integrated loglik 394.36 3.00 0 388.36 365.61
## Penalized loglik 407.02 2.99 0 401.04 378.37
##
## Model: Surv(total_lived, censored) ~ mwime + (1 | location) + (1 | method)
## Fixed coefficients
##          coef exp(coef) se(coef)      z      p
## mwime -0.04909832 0.9520875 0.03763551 -1.3 0.19
##
## Random effects
```

```

## Group      Variable   Std Dev   Variance
## location Intercept 0.17211501 0.02962358
## method    Intercept 0.19607171 0.03844412

coxme_mwimean_t<- coxme(Surv(total_lived, censored) ~ mwime +
                           (1|location/method), data= new_df_gdd)
exp(confint(coxme_mwimean_t))

##           2.5 %   97.5 %
## mwime 0.8802006 1.020401

summary(coxme_mwimean_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14542, 15155
## Iterations= 8 35
##             NULL Integrated     Fitted
## Log-likelihood -125304.4  -125107.2 -125098.4
##
##             Chisq   df p     AIC     BIC
## Integrated loglik 394.54 3.00 0 388.54 365.78
## Penalized loglik 412.12 3.97 0 404.17 374.03
##
## Model: Surv(total_lived, censored) ~ mwime + (1 | location/method)
## Fixed coefficients
##             coef exp(coef) se(coef)     z     p
## mwime -0.05370504 0.9477116 0.037705 -1.42 0.15
##
## Random effects
## Group      Variable   Std Dev   Variance
## location/method (Intercept) 0.2059771551 0.0424265884
## location       (Intercept) 0.0200031667 0.0004001267

```

MWIMAX

```

#no random effect
cox_mwimax<- coxph(Surv(total_lived, censored) ~ mwimax,
                      data= new_df_gdd)

summary(cox_mwimax)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mwimax, data = new_df_gdd)
##
## n= 15155, number of events= 14542
##
##             coef exp(coef) se(coef)     z Pr(>|z|)
## mwimax -0.36363   0.69515  0.03967 -9.167  <2e-16 ***
## ---

```

```

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## mwimax     0.6951      1.439     0.6432     0.7514
##
## Concordance= 0.52  (se = 0.003 )
## Likelihood ratio test= 82.37  on 1 df,  p=<2e-16
## Wald test             = 84.03  on 1 df,  p=<2e-16
## Score (logrank) test = 84.11  on 1 df,  p=<2e-16

# Random effect separated
coxme_mwimax_s<- coxme(Surv(total_lived, censored) ~ mwimax +
                           (1|location) + (1|method), data= new_df_gdd)
exp(confint(coxme_mwimax_s))

##           2.5 %    97.5 %
## mwimax 0.5626578 0.6583775

summary(coxme_mwimax_s)

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14542, 15155
##   Iterations= 8 35
##           NULL Integrated Fitted
## Log-likelihood -125304.4 -125033.7 -125027.3
##
##           Chisq df p    AIC    BIC
## Integrated loglik 541.39 3.00 0 535.39 512.64
## Penalized loglik 554.35 2.99 0 548.37 525.68
##
## Model: Surv(total_lived, censored) ~ mwimax + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef) se(coef)    z p
## mwimax -0.4965303 0.6086388 0.04007903 -12.39 0
##
## Random effects
##   Group   Variable Std Dev Variance
##   location Intercept 0.20212058 0.04085273
##   method   Intercept 0.19075845 0.03638879

coxme_mwimax_t<- coxme(Surv(total_lived, censored) ~ mwimax +
                           (1|location/method), data= new_df_gdd)
exp(confint(coxme_mwimax_t))

##           2.5 %    97.5 %
## mwimax 0.557105 0.6522028

summary(coxme_mwimax_t)

## Cox mixed-effects model fit by maximum likelihood

```

```

##   Data: new_df_gdd
##   events, n = 14542, 15155
## Iterations= 8 35
##          NULL Integrated      Fitted
## Log-likelihood -125304.4  -125031.4 -125022.4
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 546.14 3.00 0 540.14 517.39
## Penalized loglik 564.09 3.98 0 556.14 525.97
##
## Model: Surv(total_lived, censored) ~ mwimax + (1 | location/method)
## Fixed coefficients
##          coef exp(coef) se(coef)     z p
## mwimax -0.5062006 0.6027814 0.04020526 -12.59 0
##
## Random effects
## Group           Variable   Std Dev   Variance
## location/method (Intercept) 0.2189776149 0.0479511958
## location       (Intercept) 0.0200557823 0.0004022344

```

GDD (Growing Degree Days)

```

# No random effect
cox_gdd<- coxph(Surv(total_lived, censored) ~ daily_acc_gdd,
                   data= new_df_gdd)

summary(cox_gdd)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ daily_acc_gdd,
##        data = new_df_gdd)
##
##    n= 15154, number of events= 14541
##    (1 observation deleted due to missingness)
##
##          coef exp(coef) se(coef)     z Pr(>|z|)
## daily_acc_gdd 0.035024  1.035645 0.002301 15.22  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## daily_acc_gdd     1.036      0.9656     1.031      1.04
##
## Concordance= 0.544  (se = 0.003 )
## Likelihood ratio test= 238 on 1 df,  p=<2e-16
## Wald test          = 231.7 on 1 df,  p=<2e-16
## Score (logrank) test = 232.3 on 1 df,  p=<2e-16

```

```

#Random effect - separated
coxme_gdd_s<- coxme(Surv(total_lived, censored) ~ daily_acc_gdd +
                      (1|location) + (1|method), data= new_df_gdd)
exp(confint(coxme_gdd_s))

```

```

##          2.5 %   97.5 %
## daily_acc_gdd 1.027066 1.036461

summary(coxme_gdd_s)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154 (1 observation deleted due to missingness)
## Iterations= 7 31
##           NULL Integrated     Fitted
## Log-likelihood -125294.8    -125006 -124999.8
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 577.75 3.00 0 571.75 548.99
## Penalized loglik 590.01 2.99 0 584.04 561.38
##
## Model: Surv(total_lived, censored) ~ daily_acc_gdd + (1 | location) + (1 | method)
## Fixed coefficients
##          coef exp(coef)   se(coef)     z p
## daily_acc_gdd 0.03125914 1.031753 0.002322962 13.46 0
##
## Random effects
## Group      Variable Std Dev Variance
## location Intercept 0.13839373 0.01915282
## method    Intercept 0.19408685 0.03766971

#Random effect - together
coxme_gdd_t<- coxme(Surv(total_lived, censored) ~ daily_acc_gdd +
                      (1|location/method), data= new_df_gdd)

exp(confint(coxme_gdd_t))

##          2.5 %   97.5 %
## daily_acc_gdd 1.027004 1.036406

summary(coxme_gdd_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154 (1 observation deleted due to missingness)
## Iterations= 16 67
##           NULL Integrated     Fitted
## Log-likelihood -125294.8    -125006.5 -124997.9
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 576.65 3.00 0 570.65 547.90
## Penalized loglik 593.81 3.97 0 585.87 555.75
##
## Model: Surv(total_lived, censored) ~ daily_acc_gdd + (1 | location/method)
## Fixed coefficients
##          coef exp(coef)   se(coef)     z p
## daily_acc_gdd 0.03120251 1.031694 0.00232466 13.42 0

```

```

##  

## Random effects  

## Group           Variable     Std Dev      Variance  

## location/method (Intercept) 0.1922513923 0.0369605978  

## location       (Intercept) 0.0199271829 0.0003970926

```

Checking all temperatures together

```

# No random effect
cox_temps<- coxph(Surv(total_lived, censored) ~ mintemperature + meantemperature
                     + maxtemperature + mwime + mwimin+ mwimax + daily_acc_gdd,
                     data= new_df_gdd)

summary(cox_temps)

```

```

## Call:  

## coxph(formula = Surv(total_lived, censored) ~ mintemperature +  

##        meantemperature + maxtemperature + mwime + mwimin + mwimax +  

##        daily_acc_gdd, data = new_df_gdd)  

##  

## n= 15154, number of events= 14541  

## (1 observation deleted due to missingness)  

##  

##              coef exp(coef) se(coef)      z Pr(>|z|)  

## mintemperature  0.03678   1.03747  0.02064  1.782  0.0748 .  

## meantemperature 0.20250   1.22446  0.02501  8.096 5.68e-16 ***  

## maxtemperature  0.04067   1.04150  0.02217  1.834  0.0666 .  

## mwime          -0.77211   0.46204  0.17510 -4.409 1.04e-05 ***  

## mwimin          0.33957   1.40434  0.12762  2.661  0.0078 **  

## mwimax          -0.12434   0.88308  0.08663 -1.435  0.1512  

## daily_acc_gdd   -0.24159   0.78538  0.03422 -7.059 1.67e-12 ***  

## ---  

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

##              exp(coef) exp(-coef) lower .95 upper .95  

## mintemperature    1.0375    0.9639    0.9963    1.0803  

## meantemperature   1.2245    0.8167    1.1659    1.2860  

## maxtemperature    1.0415    0.9602    0.9972    1.0878  

## mwime            0.4620    2.1643    0.3278    0.6512  

## mwimin            1.4043    0.7121    1.0936    1.8035  

## mwimax            0.8831    1.1324    0.7452    1.0465  

## daily_acc_gdd     0.7854    1.2733    0.7344    0.8399  

##  

## Concordance= 0.551  (se = 0.003 )  

## Likelihood ratio test= 500.8  on 7 df,  p=<2e-16  

## Wald test          = 517.6  on 7 df,  p=<2e-16  

## Score (logrank) test = 514.7  on 7 df,  p=<2e-16

```

```

#Random effect - separated
coxme_temps_s<- coxme(Surv(total_lived, censored) ~ mintemperature + meantemperature
                         + maxtemperature + mwime + mwimin + mwimax + daily_acc_gdd +

```

```

(1|location) + (1|method), data= new_df_gdd)
summary(coxme_temps_s)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154 (1 observation deleted due to missingness)
## Iterations= 8 43
##             NULL Integrated      Fitted
## Log-likelihood -125294.8   -124853.2 -124846.7
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 883.27 9.00 0 865.27 797.01
## Penalized loglik 896.29 8.99 0 878.31 810.13
##
## Model: Surv(total_lived, censored) ~ mintemperature + meantemperature +      maxtemperature + mwime
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## mintemperature  0.02308186 1.0233503 0.02005981  1.15 2.5e-01
## meantemperature 0.11835726 1.1256462 0.02590830  4.57 4.9e-06
## maxtemperature  0.06081066 1.0626977 0.02160386  2.81 4.9e-03
## mwime          -0.32164753 0.7249537 0.17652421 -1.82 6.8e-02
## mwimin         -0.07078805 0.9316593 0.12961233 -0.55 5.8e-01
## mwimax          -0.25097048 0.7780453 0.08687792 -2.89 3.9e-03
## daily_acc_gdd -0.16516778 0.8477515 0.03299941 -5.01 5.6e-07
##
## Random effects
## Group      Variable Std Dev Variance
## location Intercept 0.21056245 0.04433654
## method     Intercept 0.18892487 0.03569261

#Random effect - together
coxme_temps_t<- coxme(Surv(total_lived, censored) ~ mintemperature +
                         meantemperature
                         + maxtemperature + mwime + mwimin + mwimax + daily_acc_gdd +
                         (1|location/method), data= new_df_gdd)

summary(coxme_temps_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154 (1 observation deleted due to missingness)
## Iterations= 7 38
##             NULL Integrated      Fitted
## Log-likelihood -125294.8   -124852.1 -124843.1
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 885.45 9.00 0 867.45 799.18
## Penalized loglik 903.49 9.97 0 883.54 807.89
##
## Model: Surv(total_lived, censored) ~ mintemperature + meantemperature +      maxtemperature + mwime
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p

```

```

## mintemperature 0.02145837 1.0216903 0.02007082 1.07 2.9e-01
## meantemperature 0.12124789 1.1289047 0.02592254 4.68 2.9e-06
## maxtemperature 0.05862912 1.0603819 0.02162114 2.71 6.7e-03
## mwime -0.32864539 0.7198983 0.17653750 -1.86 6.3e-02
## mwimin -0.06530512 0.9367816 0.12960672 -0.50 6.1e-01
## mwimax -0.25669403 0.7736049 0.08693334 -2.95 3.1e-03
## daily_acc_gdd -0.16428380 0.8485012 0.03300654 -4.98 6.4e-07
##
## Random effects
## Group Variable Std Dev Variance
## location/method (Intercept) 0.2222171639 0.0493804679
## location (Intercept) 0.0200836385 0.0004033525

```

Checking collinearity in the 3 cases

```

library(rms)
#No random effects
rms::vif(cox_temps)

## mintemperature meantemperature maxtemperature mwime mwimin
## 99.953295 138.406415 117.589049 22.074879 15.154853
## mwimax daily_acc_gdd
## 4.668785 235.088052

#daily_acc_gdd has a lot of collinearity so we should remove it and do it again
cox_temps2 <- coxph(Surv(total_lived, censored) ~ mintemperature + meantemperature
+ maxtemperature + mwimin + mwime + mwimax,
data= new_df_gdd)

summary(cox_temps2)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mintemperature +
##     meantemperature + maxtemperature + mwimin + mwime + mwimax,
##     data = new_df_gdd)
##
## n= 15155, number of events= 14542
##
##          coef exp(coef)  se(coef)      z Pr(>|z|)
## mintemperature -0.071338  0.931147 0.013372 -5.335 9.56e-08 ***
## meantemperature  0.207875  1.231059 0.024876  8.356 < 2e-16 ***
## maxtemperature -0.087801  0.915943 0.012961 -6.774 1.25e-11 ***
## mwimin         -0.006616  0.993405 0.117417 -0.056  0.9551
## mwime          -0.428464  0.651509 0.167806 -2.553  0.0107 *
## mwimax         -0.192705  0.824726 0.086207 -2.235  0.0254 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## mintemperature    0.9311     1.0739    0.9071    0.9559
## meantemperature   1.2311     0.8123    1.1725    1.2926

```

```

## maxtemperature      0.9159      1.0918      0.8930      0.9395
## mwimin            0.9934      1.0066      0.7892      1.2505
## mwime              0.6515      1.5349      0.4689      0.9052
## mwimax            0.8247      1.2125      0.6965      0.9765
##
## Concordance= 0.549  (se = 0.003 )
## Likelihood ratio test= 449.1  on 6 df,   p=<2e-16
## Wald test          = 461.1  on 6 df,   p=<2e-16
## Score (logrank) test = 464.1  on 6 df,   p=<2e-16

rms::vif(cox_temps2)

##  mintemperature  meantemperature  maxtemperature      mwimin      mwime
##        43.345265     138.825322     39.865540     12.780076    20.557889
##      mwimax
##        4.560266

#mean temperature is the next variable with higher VIF, we remove it and repeat
cox_temps3 <- coxph(Surv(total_lived, censored) ~ mintemperature
                     + maxtemperature + mwimin + mwime + mwimax,
                     data= new_df_gdd)
summary(cox_temps3)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mintemperature +
##        maxtemperature + mwimin + mwime + mwimax, data = new_df_gdd)
##
## n= 15155, number of events= 14542
##
##             coef exp(coef)  se(coef)      z Pr(>|z|)
## mintemperature  0.031479  1.031980  0.005356  5.878 4.16e-09 ***
## maxtemperature  0.011943  1.012014  0.005055  2.362  0.0182 *
## mwimin         -0.068694  0.933612  0.117439 -0.585  0.5586
## mwime          -0.134181  0.874432  0.164467 -0.816  0.4146
## mwimax         -0.341856  0.710451  0.084608 -4.040 5.33e-05 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##             exp(coef) exp(-coef) lower .95 upper .95
## mintemperature    1.0320     0.9690    1.0212    1.0429
## maxtemperature    1.0120     0.9881    1.0020    1.0221
## mwimin           0.9336     1.0711    0.7417    1.1753
## mwime            0.8744     1.1436    0.6335    1.2070
## mwimax           0.7105     1.4076    0.6019    0.8386
##
## Concordance= 0.543  (se = 0.003 )
## Likelihood ratio test= 379.3  on 5 df,   p=<2e-16
## Wald test          = 391.4  on 5 df,   p=<2e-16
## Score (logrank) test = 393.7  on 5 df,   p=<2e-16

#mean MWI high VIF
cox_temps4 <- coxph(Surv(total_lived, censored) ~ mintemperature

```

```

+ maxtemperature + mwimin + mwimax,
data= new_df_gdd)
summary(cox_temps4)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mintemperature +
##        maxtemperature + mwimin + mwimax, data = new_df_gdd)
##
##   n= 15155, number of events= 14542
##
##              coef exp(coef)    se(coef)      z Pr(>|z|)
## mintemperature  0.032606  1.033143  0.005185  6.289 3.20e-10 ***
## maxtemperature  0.009268  1.009311  0.003847  2.410  0.0160 *
## mwimin         -0.149294  0.861316  0.063680 -2.344  0.0191 *
## mwimax         -0.397136  0.672242  0.050623 -7.845 4.33e-15 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##              exp(coef) exp(-coef) lower .95 upper .95
## mintemperature   1.0331      0.9679    1.0227    1.0437
## maxtemperature   1.0093      0.9908    1.0017    1.0169
## mwimin          0.8613      1.1610    0.7603    0.9758
## mwimax          0.6722      1.4876    0.6087    0.7424
##
## Concordance= 0.544  (se = 0.003 )
## Likelihood ratio test= 378.6  on 4 df,   p=<2e-16
## Wald test        = 390.2  on 4 df,   p=<2e-16
## Score (logrank) test = 392.4  on 4 df,   p=<2e-16

```

```
rms::vif(cox_temps4)
```

```

## mintemperature maxtemperature           mwimin           mwimax
##       6.472754      3.504940      3.747708      1.573929

```

```

#mintemperature with high VIF
cox_temps5 <- coxph(Surv(total_lived, censored) ~ maxtemperature + mwimin + mwimax,
                      data= new_df_gdd)
summary(cox_temps5)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ maxtemperature +
##        mwimin + mwimax, data = new_df_gdd)
##
##   n= 15155, number of events= 14542
##
##              coef exp(coef)    se(coef)      z Pr(>|z|)
## maxtemperature  0.027922  1.028315  0.002437 11.457 < 2e-16 ***
## mwimin          0.134724  1.144221  0.044796  3.008  0.00263 **
## mwimax         -0.459515  0.631590  0.049353 -9.311 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## 
```

```

##          exp(coef) exp(-coef) lower .95 upper .95
## maxtemperature   1.0283     0.9725    1.0234    1.0332
## mwimin         1.1442     0.8740    1.0480    1.2492
## mwimax         0.6316     1.5833    0.5734    0.6957
##
## Concordance= 0.539  (se = 0.003 )
## Likelihood ratio test= 339.1  on 3 df,  p=<2e-16
## Wald test          = 351.2  on 3 df,  p=<2e-16
## Score (logrank) test = 352.9  on 3 df,  p=<2e-16

stats::step(cox_temps5)

## Start:  AIC=250275.8
## Surv(total_lived, censored) ~ maxtemperature + mwimin + mwimax
##
##          Df      AIC
## <none>       250276
## - mwimin     1 250283
## - mwimax     1 250359
## - maxtemperature 1 250408

## Call:
## coxph(formula = Surv(total_lived, censored) ~ maxtemperature +
##        mwimin + mwimax, data = new_df_gdd)
##
##          coef  exp(coef)  se(coef)      z      p
## maxtemperature 0.027922  1.028315  0.002437 11.457 < 2e-16
## mwimin         0.134724  1.144221  0.044796  3.008 0.00263
## mwimax        -0.459515  0.631590  0.049353 -9.311 < 2e-16
##
## Likelihood ratio test=339.1  on 3 df, p=< 2.2e-16
## n= 15155, number of events= 14542

#trying with GDD and removing maxtemperature
cox_temps6 <- coxph(Surv(total_lived, censored) ~ mwimin + daily_acc_gdd + mwimax,
                      data= new_df_gdd)
summary(cox_temps6)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ mwimin + daily_acc_gdd +
##        mwimax, data = new_df_gdd)
##
## n= 15154, number of events= 14541
## (1 observation deleted due to missingness)
##
##          coef  exp(coef)  se(coef)      z Pr(>|z|)
## mwimin      -0.034439  0.966147  0.053175 -0.648   0.517
## daily_acc_gdd  0.037517  1.038230  0.003136 11.963 <2e-16 ***
## mwimax      -0.412523  0.661978  0.050688 -8.138   4e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##

```

```

##          exp(coef) exp(-coef) lower .95 upper .95
## mwimin      0.9661     1.0350    0.8705    1.0723
## daily_acc_gdd 1.0382     0.9632    1.0319    1.0446
## mwimax      0.6620     1.5106    0.5994    0.7311
##
## Concordance= 0.541  (se = 0.003 )
## Likelihood ratio test= 351  on 3 df,  p=<2e-16
## Wald test           = 361.5  on 3 df,  p=<2e-16
## Score (logrank) test = 363.5  on 3 df,  p=<2e-16

rms::vif(cox_temps6)

##      mwimin daily_acc_gdd      mwimax
## 2.636329     1.985769     1.581871

new_df_gdd <- new_df_gdd[-1,]
stats::step(cox_temps6)

## Start: AIC=250244.7
## Surv(total_lived, censored) ~ mwimin + daily_acc_gdd + mwimax
##
##          Df   AIC
## - mwimin     1 250243
## <none>        250245
## - mwimax     1 250308
## - daily_acc_gdd 1 250389
##
## Step: AIC=250243.1
## Surv(total_lived, censored) ~ daily_acc_gdd + mwimax
##
##          Df   AIC
## <none>        250243
## - mwimax     1 250354
## - daily_acc_gdd 1 250509

## Call:
## coxph(formula = Surv(total_lived, censored) ~ daily_acc_gdd +
##        mwimax, data = new_df_gdd)
##
##          coef exp(coef)  se(coef)      z      p
## daily_acc_gdd  0.036089  1.036748  0.002227 16.21 <2e-16
## mwimax       -0.432405  0.648947  0.040322 -10.72 <2e-16
##
## Likelihood ratio test=350.5  on 2 df, p=< 2.2e-16
## n= 15154, number of events= 14541

#Random effects - Separated
rms::vif(coxme_temps_s)

```

```

## mintemperature meantemperature maxtemperature      mwime      mwimin
##      86.61080     146.14270     113.05445      20.72447     12.94793
## mwimax daily_acc_gdd
##      4.61171     215.08693

```

```

#daily_acc_gdd has a lot of collinearity so we should remove it and do it again
coxme_temps_s2<- coxme(Surv(total_lived, censored) ~ mintemperature + meantemperature
+ maxtemperature + mwimin + mwime + mwimax +
(1|location) + (1|method), data= new_df_gdd)

summary(coxme_temps_s2)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##           NULL Integrated      Fitted
## Log-likelihood -125294.8 -124866.1 -124859.5
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 857.50 8.00 0 841.50 780.82
## Penalized loglik 870.63 7.99 0 854.65 794.05
##
## Model: Surv(total_lived, censored) ~ mintemperature + meantemperature + maxtemperature + mwimin
## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## mintemperature -0.04927604 0.9519183 0.01362037 -3.62 3.0e-04
## meantemperature 0.11700963 1.1241303 0.02582958  4.53 5.9e-06
## maxtemperature -0.02340612 0.9768657 0.01377409 -1.70 8.9e-02
## mwimin        -0.33732817 0.7136746 0.11798888 -2.86 4.3e-03
## mwime         -0.05070172 0.9505622 0.16781807 -0.30 7.6e-01
## mwimax        -0.31306687 0.7312010 0.08609279 -3.64 2.8e-04
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.22210080 0.04932876
## method   Intercept 0.18930856 0.03583773

rms::vif(coxme_temps_s2)

##   mintemperature meantemperature maxtemperature      mwimin      mwime
##       40.852298      146.646438      45.701970      10.693778     18.906159
##      mwimax
##       4.471114

#mean temperature is the next variable with higher VIF, we remove it and repeat
coxme_temps_s3<- coxme(Surv(total_lived, censored) ~ mintemperature
+ maxtemperature + mwimin + mwime + mwimax +
(1|location) + (1|method), data= new_df_gdd)
summary(coxme_temps_s3)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##           NULL Integrated      Fitted
## Log-likelihood -125294.8 -124876.3 -124869.7

```

```

##
##          Chisq   df p    AIC    BIC
## Integrated loglik 837.00 0 823.0 769.91
## Penalized loglik 850.28 6.99 0 836.3 783.27
##
## Model: Surv(total_lived, censored) ~ mintemperature + maxtemperature + mwimin + mwime + mwimax
## Fixed coefficients
##          coef exp(coef)    se(coef)      z      p
## mintemperature 0.007288342 1.0073150 0.005490153 1.33 1.8e-01
## maxtemperature 0.034430514 1.0350301 0.005180823 6.65 3.0e-11
## mwimin        -0.395617327 0.6732643 0.117345494 -3.37 7.5e-04
## mwime         0.122556571 1.1303831 0.163405134 0.75 4.5e-01
## mwimax        -0.399306075 0.6707854 0.083998559 -4.75 2.0e-06
##
## Random effects
## Group     Variable Std Dev Variance
## location Intercept 0.23862719 0.05694293
## method    Intercept 0.18922033 0.03580433

rms::vif(coxme_temps_s3)

## mintemperature maxtemperature      mwimin      mwime      mwimax
##       6.639131       6.460671      10.563422      17.934636      4.265675

#mean MWI is the next variable with higher VIF, we remove it and repeat
coxme_temps_s4<- coxme(Surv(total_lived, censored) ~ mintemperature
+ maxtemperature + mwimin + mwimax +
(1|location) + (1|method), data= new_df_gdd)
summary(coxme_temps_s4)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##          NULL Integrated Fitted
## Log-likelihood -125294.8 -124876.6 -124870
##
##          Chisq   df p    AIC    BIC
## Integrated loglik 836.44 6.00 0 824.44 778.93
## Penalized loglik 849.71 5.99 0 837.73 792.28
##
## Model: Surv(total_lived, censored) ~ mintemperature + maxtemperature + mwimin + mwimax + (1 | 
```

```

rms::vif(coxme_temps_s4)

## mintemperature maxtemperature      mwimin      mwimax
##       6.297828      4.136924      3.074118      1.528740

#mintemperature is the next variable with higher VIF, we remove it and repeat
coxme_temps_s5<- coxme(Surv(total_lived, censored) ~maxtemperature + mwimin +
                         mwimax + (1|location) + (1|method), data= new_df_gdd)
summary(coxme_temps_s5)

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 8 35
##           NULL Integrated     Fitted
## Log-likelihood -125294.8 -124877.3 -124870.7
##
##           Chisq    df p     AIC     BIC
## Integrated loglik 835.02 5.00 0 825.02 787.09
## Penalized loglik 848.33 4.99 0 838.35 800.49
##
## Model: Surv(total_lived, censored) ~ maxtemperature + mwimin + mwimax + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## maxtemperature 0.04068165 1.0415205 0.002520624 16.14 0.0e+00
## mwimin        -0.27580067 0.7589642 0.050248787 -5.49 4.0e-08
## mwimax        -0.35869712 0.6985859 0.049559571 -7.24 4.6e-13
##
## Random effects
##   Group   Variable Std Dev Variance
##   location Intercept 0.24319638 0.05914448
##   method   Intercept 0.18881115 0.03564965

exp(confint(coxme_temps_s5))

##           2.5 % 97.5 %
## maxtemperature 1.0363877 1.046679
## mwimin        0.6877798 0.837516
## mwimax        0.6339203 0.769848

rms::vif(coxme_temps_s5)

## maxtemperature      mwimin      mwimax
##       1.530780      1.943009      1.487704

#trying with gdd and not maxt
coxme_temps_s6<- coxme(Surv(total_lived, censored) ~daily_acc_gdd + mwimin +
                         mwimax + (1|location) + (1|method), data= new_df_gdd)
exp(confint(coxme_temps_s6))

```

```

##          2.5 %    97.5 %
## daily_acc_gdd 1.0430100 1.0559852
## mwimin        0.5879308 0.7365124
## mwimax        0.6481467 0.7903932

rms::vif(coxme_temps_s6)

## daily_acc_gdd      mwimin      mwimax
##      1.984031     2.536794     1.535565

summary(coxme_temps_s6)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##           NULL Integrated   Fitted
## Log-likelihood -125294.8 -124891.2 -124884.6
##
##           Chisq   df p     AIC     BIC
## Integrated loglik 807.37 5.00 0 797.37 759.44
## Penalized loglik 820.50 4.99 0 810.52 772.66
##
## Model: Surv(total_lived, censored) ~ daily_acc_gdd + mwimin + mwimax + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## daily_acc_gdd  0.04829244 1.0494775 0.003153989 15.31 0.0e+00
## mwimin        -0.41848758 0.6580413 0.057479825 -7.28 3.3e-13
## mwimax        -0.33443147 0.7157449 0.050616632 -6.61 3.9e-11
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.22128829 0.04896851
## method   Intercept 0.18992575 0.03607179

#Random effects - Together
rms::vif(coxme_temps_t)

## mintemperature meantemperature maxtemperature      mwime      mwimin
##      86.681772     146.227470     113.180039     20.686813     12.951252
## mwimax daily_acc_gdd
##      4.598918     215.073532

#daily_acc_gdd has a lot of collinearity so we should remove it and do it again
coxme_temps_t2<- coxme(Surv(total_lived, censored) ~ mintemperature +
                           meantemperature +
                           maxtemperature + mwimin + mwime + mwimax +
                           (1|location/method), data= new_df_gdd)

summary(coxme_temps_t2)

```

```

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 7 31
##           NULL Integrated      Fitted
## Log-likelihood -125294.8 -124864.9 -124855.7
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 859.96 8.00 0 843.96 783.28
## Penalized loglik 878.19 8.98 0 860.24 792.15
##
## Model: Surv(total_lived, censored) ~ mintemperature + meantemperature + maxtemperature + mwimin + mwime + mwimax
## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## mintemperature -0.05055743 0.9506993 0.01362566 -3.71 2.1e-04
## meantemperature 0.12001923 1.1275185 0.02584503  4.64 3.4e-06
## maxtemperature -0.02520013 0.9751147 0.01378104 -1.83 6.7e-02
## mwimin         -0.33010791 0.7188462 0.11800591 -2.80 5.2e-03
## mwime          -0.05970247 0.9420448 0.16786487 -0.36 7.2e-01
## mwimax         -0.31839139 0.7273181 0.08614815 -3.70 2.2e-04
##
## Random effects
## Group            Variable   Std Dev     Variance
## location/method (Intercept) 0.2292645199 0.0525622201
## location         (Intercept) 0.0200985197 0.0004039505

rms::vif(coxme_temps_t2)

## mintemperature meantemperature maxtemperature      mwimin      mwime
##        40.865861       146.731152       45.724345       10.700338      18.876248
##      mwimax
##        4.458792

#mean temperature is the next variable with higher VIF, we remove it and repeat
coxme_temps_t3<- coxme(Surv(total_lived, censored) ~ mintemperature
                         + maxtemperature + mwimin + mwime + mwimax +
                         (1|location/method), data= new_df_gdd)

summary(coxme_temps_t3)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 14 59
##           NULL Integrated      Fitted
## Log-likelihood -125294.8 -124875.6 -124866.4
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 838.42 7.00 0 824.42 771.33
## Penalized loglik 856.92 7.98 0 840.97 780.45
##
## Model: Surv(total_lived, censored) ~ mintemperature + maxtemperature + mwimin + mwime + mwimax

```

```

## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## mintemperature 0.007456241 1.0074841 0.005490367 1.36 1.7e-01
## maxtemperature 0.034125568 1.0347145 0.005180349 6.59 4.5e-11
## mwimin        -0.390175776 0.6769379 0.117357954 -3.32 8.9e-04
## mwime         0.118473997 1.1257776 0.163425098  0.72 4.7e-01
## mwimax        -0.406483325 0.6659882 0.084071915 -4.83 1.3e-06
##
## Random effects
##   Group       Variable     Std Dev     Variance
## location/method (Intercept) 0.2401840683 0.0576883867
## location       (Intercept) 0.0200645333 0.0004025855

```

```
rms::vif(coxme_temps_t3)
```

```

## mintemperature maxtemperature          mwimin          mwime          mwimax
##       6.636699       6.455825      10.568025      17.900261      4.256049

```

#mean MWI is the next variable with higher VIF, we remove it and repeat

```

coxme_temps_t4<- coxme(Surv(total_lived, censored) ~ mintemperature
+ maxtemperature + mwimin + mwimax +
(1|location/method), data= new_df_gdd)

```

```
summary(coxme_temps_t4)
```

```

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 16 67
##                   NULL Integrated      Fitted
## Log-likelihood -125294.8  -124875.9 -124866.6
##
##           Chisq   df p     AIC     BIC
## Integrated loglik 837.89 6.00 0 825.89 780.39
## Penalized loglik 856.38 6.98 0 842.42 789.49
##
## Model: Surv(total_lived, censored) ~ mintemperature + maxtemperature + mwimin + mwimax + (1 | ...
## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## mintemperature 0.00656430 1.0065859 0.005342324 1.23 2.2e-01
## maxtemperature 0.03637548 1.0370452 0.004148063 8.77 0.0e+00
## mwimin        -0.31858732 0.7271756 0.063277810 -5.03 4.8e-07
## mwimax        -0.35769813 0.6992841 0.050428015 -7.09 1.3e-12
##
## Random effects
##   Group       Variable     Std Dev     Variance
## location/method (Intercept) 0.2396019293 0.0574090845
## location       (Intercept) 0.0200640099 0.0004025645

```

```
rms::vif(coxme_temps_t4)
```

```

## mintemperature maxtemperature      mwimin      mwimax
##       6.296414     4.134695     3.075789     1.530447

#min temperature is the next variable with higher VIF, we remove it and repeat
coxme_temps_t5<- coxme(Surv(total_lived, censored) ~ maxtemperature + mwimin +
                         mwimax + (1|location/method), data= new_df_gdd)

summary(coxme_temps_t5)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 18 75
##           NULL Integrated   Fitted
## Log-likelihood -125294.8 -124876.6 -124867.4
##
##          Chisq   df p    AIC    BIC
## Integrated loglik 836.38 5.00 0 826.38 788.46
## Penalized loglik 854.96 5.98 0 843.00 797.64
##
## Model: Surv(total_lived, censored) ~ maxtemperature + mwimin + mwimax + (1 | location/method)
## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## maxtemperature 0.04041705 1.0412449 0.002521624 16.03 0.0e+00
## mwimin        -0.27126834 0.7624119 0.050232743 -5.40 6.7e-08
## mwimax        -0.36788418 0.6921973 0.049688980 -7.40 1.3e-13
##
## Random effects
## Group            Variable   Std Dev   Variance
## location/method (Intercept) 0.238723722 0.056989015
## location         (Intercept) 0.020035020 0.000401402

exp(confint(coxme_temps_t5))

##                2.5 %    97.5 %
## maxtemperature 1.0361115 1.0464038
## mwimin        0.6909259 0.8412941
## mwimax        0.6279638 0.7630013

rms::vif(coxme_temps_t5)

## maxtemperature      mwimin      mwimax
##       1.531273     1.942337     1.489669

#put gdd and change by maxt
coxme_temps_t6<- coxme(Surv(total_lived, censored) ~ daily_acc_gdd + mwimin +
                         mwimax + (1|location/method), data= new_df_gdd)

summary(coxme_temps_t6)

## Cox mixed-effects model fit by maximum likelihood

```

```

##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 7 31
##           NULL Integrated Fitted
## Log-likelihood -125294.8 -124890.1 -124881
##
##          Chisq df p    AIC    BIC
## Integrated loglik 809.46 5.00 0 799.46 761.54
## Penalized loglik 827.70 5.98 0 815.75 770.40
##
## Model: Surv(total_lived, censored) ~ daily_acc_gdd + mwimin + mwimax + (1 | location/method)
## Fixed coefficients
##          coef exp(coef)    se(coef)      z      p
## daily_acc_gdd 0.04802371 1.0491955 0.003155711 15.22 0.0e+00
## mwimin       -0.41375812 0.6611609 0.057473511 -7.20 6.1e-13
## mwimax       -0.34386472 0.7090248 0.050747789 -6.78 1.2e-11
##
## Random effects
##   Group      Variable     Std Dev     Variance
## location/method (Intercept) 0.2297209153 0.0527716989
## location      (Intercept) 0.0200983622 0.0004039442

exp(confint(coxme_temps_t6))

##          2.5 %    97.5 %
## daily_acc_gdd 1.0427262 1.0557050
## mwimin        0.5907253 0.7399948
## mwimax        0.6418963 0.7831736

```

Relative Humidity

Minimum relative humidity

```

# No random effect
cox_minrh<- coxph(Surv(total_lived, censored) ~ minrh,
                     data= new_df_gdd)

summary(cox_minrh)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ minrh, data = new_df_gdd)
##
##   n= 15154, number of events= 14541
##
##          coef  exp(coef)    se(coef)      z Pr(>|z|)
## minrh -0.0020949  0.9979073  0.0005979 -3.504 0.000459 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## minrh    0.9979      1.002    0.9967    0.9991

```

```

##  

## Concordance= 0.516  (se = 0.003 )  

## Likelihood ratio test= 12.28  on 1 df,  p=5e-04  

## Wald test             = 12.28  on 1 df,  p=5e-04  

## Score (logrank) test = 12.28  on 1 df,  p=5e-04

#Random effect - separated  

coxme_minrh_s<- coxme(Surv(total_lived, censored) ~ minrh +  

                         (1|location) + (1|method), data= new_df_gdd)  

exp(confint(coxme_minrh_s))

##           2.5 %    97.5 %  

## minrh 0.9924069 0.9948981

summary(coxme_minrh_s)

## Cox mixed-effects model fit by maximum likelihood  

##   Data: new_df_gdd  

##   events, n = 14541, 15154  

## Iterations= 8 35  

##                 NULL Integrated     Fitted  

## Log-likelihood -125294.8 -125049.5 -125042.9  

##  

##                 Chisq   df  p      AIC      BIC  

## Integrated loglik 490.70 3.00 0 484.70 461.94  

## Penalized loglik 503.86 2.99 0 497.87 475.18  

##  

## Model: Surv(total_lived, censored) ~ minrh + (1 | location) + (1 | method)  

## Fixed coefficients  

##            coef exp(coef)    se(coef)      z p  

## minrh -0.006368525 0.9936517 0.0006395817 -9.96 0  

##  

## Random effects  

##   Group      Variable Std Dev Variance  

##   location Intercept 0.21759027 0.04734553  

##   method    Intercept 0.19529367 0.03813962

#Random effect - together  

coxme_minrh_t<- coxme(Surv(total_lived, censored) ~ minrh +  

                         (1|location/method), data= new_df_gdd)  

exp(confint(coxme_minrh_t))

##           2.5 %    97.5 %  

## minrh 0.9923985 0.9948896

summary(coxme_minrh_t)

## Cox mixed-effects model fit by maximum likelihood  

##   Data: new_df_gdd  

##   events, n = 14541, 15154  

## Iterations= 7 31

```

```

##                               NULL Integrated      Fitted
## Log-likelihood -125294.8   -125049.4 -125040.3
##
##                               Chisq    df p     AIC     BIC
## Integrated loglik 490.86 3.00 0 484.86 462.11
## Penalized loglik 509.14 3.98 0 501.19 471.00
##
## Model: Surv(total_lived, censored) ~ minrh + (1 | location/method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z p
## minrh -0.006377049 0.9936432 0.0006395605 -9.97 0
##
## Random effects
##   Group          Variable    Std Dev     Variance
##   location/method (Intercept) 0.2312599116 0.0534811467
##   location        (Intercept) 0.0200883709 0.0004035426

```

Mean relative humidity

```

# No random effect
cox_meanrh<- coxph(Surv(total_lived, censored) ~ meanrh,
                      data= new_df_gdd)

summary(cox_meanrh)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ meanrh, data = new_df_gdd)
##
## n= 15154, number of events= 14541
##
##           coef  exp(coef)    se(coef)      z Pr(>|z|)
## meanrh -0.0034409  0.9965650  0.0007815 -4.403 1.07e-05 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##           exp(coef) exp(-coef) lower .95 upper .95
## meanrh    0.9966      1.003     0.995     0.9981
##
## Concordance= 0.516  (se = 0.003 )
## Likelihood ratio test= 19.31  on 1 df,  p=1e-05
## Wald test            = 19.38  on 1 df,  p=1e-05
## Score (logrank) test = 19.39  on 1 df,  p=1e-05

#Random effect - separated
coxme_meanrh_s<- coxme(Surv(total_lived, censored) ~ meanrh +
                           (1|location) + (1|method), data= new_df_gdd)

exp(confint(coxme_meanrh_s))

##             2.5 %    97.5 %
## meanrh 0.9905181 0.9936692

```

```

summary(coxme_meanrh_s)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##             NULL Integrated   Fitted
## Log-likelihood -125294.8 -125051.4 -125044.9
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 486.87 3.00 0 480.87 458.12
## Penalized loglik 499.94 2.99 0 493.95 471.26
##
## Model: Surv(total_lived, censored) ~ meanrh + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)    se(coef)    z p
## meanrh -0.007939023 0.9920924 0.0008102597 -9.8 0
##
## Random effects
## Group      Variable Std Dev Variance
## location Intercept 0.20797347 0.04325297
## method     Intercept 0.19544520 0.03819883

#Random effect - together
coxme_meanrh_t<- coxme(Surv(total_lived, censored) ~ meanrh +
                           (1|location/method), data= new_df_gdd)
exp(confint(coxme_meanrh_t))

##           2.5 %   97.5 %
## meanrh 0.990481 0.993633

summary(coxme_meanrh_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 7 31
##             NULL Integrated   Fitted
## Log-likelihood -125294.8 -125051.1 -125042
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 487.57 3.00 0 481.57 458.82
## Penalized loglik 505.71 3.98 0 497.75 467.57
##
## Model: Surv(total_lived, censored) ~ meanrh + (1 | location/method)
## Fixed coefficients
##           coef exp(coef)    se(coef)    z p
## meanrh -0.007975982 0.9920557 0.000810538 -9.84 0
##
## Random effects
## Group      Variable Std Dev Variance
## location/method (Intercept) 0.2255811609 0.0508868602
## location       (Intercept) 0.0200723157 0.0004028979

```

Maximum relative humidity

```
# No random effect
cox_maxrh<- coxph(Surv(total_lived, censored) ~ maxrh,
                      data= new_df_gdd)

summary(cox_maxrh)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ maxrh, data = new_df_gdd)
##
##    n= 15154, number of events= 14541
##
##              coef  exp(coef)   se(coef)      z Pr(>|z|)
## maxrh -0.0030313  0.9969733  0.0009514 -3.186  0.00144 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## maxrh     0.997     1.003    0.9951    0.9988
##
## Concordance= 0.508  (se = 0.003 )
## Likelihood ratio test= 10.05  on 1 df,  p=0.002
## Wald test           = 10.15  on 1 df,  p=0.001
## Score (logrank) test = 10.15  on 1 df,  p=0.001

#Random effect - separated
coxme_maxrh_s<- coxme(Surv(total_lived, censored) ~ maxrh +
                           (1|location) + (1|method), data= new_df_gdd)
exp(confint(coxme_maxrh_s))

##             2.5 %    97.5 %
## maxrh 0.9911302 0.9948644

summary(coxme_maxrh_s)

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 8 35
##                 NULL Integrated Fitted
## Log-likelihood -125294.8 -125072.4 -125066
##
##                 Chisq   df p   AIC     BIC
## Integrated loglik 444.80 3.00 0 438.8 416.05
## Penalized loglik 457.69 2.99 0 451.7 429.02
##
## Model: Surv(total_lived, censored) ~ maxrh + (1 | location) + (1 | method)
## Fixed coefficients
##              coef  exp(coef)   se(coef)      z      p
## maxrh -0.00702911 0.9929955 0.0009593553 -7.33 2.4e-13
```

```

##  

## Random effects  

##   Group      Variable   Std Dev   Variance  

##   location Intercept  0.18997490 0.03609046  

##   method    Intercept  0.19610649 0.03845775  

#Random effect - together  

coxme_maxrh_t<- coxme(Surv(total_lived, censored) ~ maxrh +  

                         (1|location/method), data= new_df_gdd)  

exp(confint(coxme_maxrh_t))  

##           2.5 %    97.5 %  

## maxrh 0.9910726 0.9948087  

summary(coxme_maxrh_t)  

## Cox mixed-effects model fit by maximum likelihood  

##   Data: new_df_gdd  

##   events, n = 14541, 15154  

##   Iterations= 8 35  

##                   NULL Integrated     Fitted  

## Log-likelihood -125294.8 -125072.1 -125063.2  

##  

##             Chisq   df p     AIC     BIC  

## Integrated loglik 445.45 3.00 0 439.45 416.70  

## Penalized loglik 463.33 3.98 0 455.37 425.21  

##  

## Model: Surv(total_lived, censored) ~ maxrh + (1 | location/method)  

## Fixed coefficients  

##             coef exp(coef)     se(coef)      z      p  

## maxrh -0.007086124 0.9929389 0.0009598838 -7.38 1.6e-13  

##  

## Random effects  

##   Group      Variable   Std Dev   Variance  

##   location/method (Intercept) 0.2160588437 0.0466814239  

##   location       (Intercept) 0.0200360615 0.0004014438

```

All RH together + Check collinearity

```

#No random effects  

cox_rhs <- coxph(Surv(total_lived, censored) ~ minrh + meanrh  

                  + maxrh + mwimin + mwime + mwimax,  

                  data= new_df_gdd)  

rms::vif(cox_rhs)  

##      minrh      meanrh      maxrh      mwimin      mwime      mwimax  

## 32.692372 55.656483  9.823637 14.229008 15.999182  2.872901

```

```

#meanrh has a lot of collinearity so we should remove it and do it again
cox_rhs2 <- coxph(Surv(total_lived, censored) ~ minrh + maxrh
+ mwimin + mwime + mwimax,
data= new_df_gdd)

summary(cox_rhs2)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ minrh + maxrh +
##        mwimin + mwime + mwimax, data = new_df_gdd)
##
##    n= 15154, number of events= 14541
##
##              coef exp(coef)   se(coef)      z Pr(>|z|)
## minrh   -0.008570  0.991467  0.001199  -7.150 8.69e-13 ***
## maxrh    0.006242  1.006262  0.001567   3.983 6.80e-05 ***
## mwimin   0.398871  1.490142  0.107864   3.698 0.000217 ***
## mwime    0.386027  1.471124  0.121291   3.183 0.001459 **
## mwimax  -0.779796  0.458500  0.063939 -12.196 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## minrh     0.9915     1.0086    0.9891     0.9938
## maxrh     1.0063     0.9938    1.0032     1.0094
## mwimin    1.4901     0.6711    1.2062     1.8409
## mwime     1.4711     0.6798    1.1599     1.8659
## mwimax    0.4585     2.1810    0.4045     0.5197
##
## Concordance= 0.539  (se = 0.003 )
## Likelihood ratio test= 299.6 on 5 df,  p=<2e-16
## Wald test            = 304.8 on 5 df,  p=<2e-16
## Score (logrank) test = 305.6 on 5 df,  p=<2e-16

rms::vif(cox_rhs2)

##      minrh      maxrh      mwimin      mwime      mwimax
## 4.041587  2.708100 11.123474 11.400562  2.588162

#mwimean has a lot of collinearity so we should remove it and do it again
cox_rhs3 <- coxph(Surv(total_lived, censored) ~ minrh + maxrh
+ mwimin + mwimax,
data= new_df_gdd)

summary(cox_rhs3)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ minrh + maxrh +
##        mwimin + mwimax, data = new_df_gdd)
##
##    n= 15154, number of events= 14541
##

```

```

##          coef exp(coef)   se(coef)      z Pr(>|z|)
## minrh -0.010058  0.989992  0.001100 -9.141 < 2e-16 ***
## maxrh  0.007866  1.007897  0.001478  5.321 1.03e-07 ***
## mwimin 0.702058  2.017902  0.050779 13.826 < 2e-16 ***
## mwimax -0.666852  0.513322  0.053259 -12.521 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## minrh     0.9900    1.0101    0.9879    0.9921
## maxrh     1.0079    0.9922    1.0050    1.0108
## mwimin    2.0179    0.4956    1.8267    2.2291
## mwimax    0.5133    1.9481    0.4624    0.5698
##
## Concordance= 0.54  (se = 0.003 )
## Likelihood ratio test= 289.5 on 4 df,  p=<2e-16
## Wald test           = 291.6 on 4 df,  p=<2e-16
## Score (logrank) test = 292.1 on 4 df,  p=<2e-16

```

```
rms::vif(cox_rhs3)
```

```

##    minrh    maxrh    mwimin    mwimax
## 3.441672 2.422584 2.502104 1.805632

```

#Shall we eliminate a variable here?

```
stats::step(cox_rhs3)
```

```

## Start:  AIC=250308.2
## Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwimax
##
##          Df    AIC
## <none>    250308
## - maxrh   1 250335
## - minrh   1 250391
## - mwimax   1 250457
## - mwimin   1 250504

## Call:
## coxph(formula = Surv(total_lived, censored) ~ minrh + maxrh +
##        mwimin + mwimax, data = new_df_gdd)
##
##          coef exp(coef)   se(coef)      z      p
## minrh -0.010058  0.989992  0.001100 -9.141 < 2e-16
## maxrh  0.007866  1.007897  0.001478  5.321 1.03e-07
## mwimin 0.702058  2.017902  0.050779 13.826 < 2e-16
## mwimax -0.666852  0.513322  0.053259 -12.521 < 2e-16
##
## Likelihood ratio test=289.5 on 4 df, p=< 2.2e-16
## n= 15154, number of events= 14541

```

```

#nop
summary(cox_rhs3)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ minrh + maxrh +
##        mwimin + mwimax, data = new_df_gdd)
##
##   n= 15154, number of events= 14541
##
##           coef exp(coef)    se(coef)      z Pr(>|z|)
## minrh -0.010058  0.989992  0.001100 -9.141 < 2e-16 ***
## maxrh  0.007866  1.007897  0.001478  5.321 1.03e-07 ***
## mwimin  0.702058  2.017902  0.050779 13.826 < 2e-16 ***
## mwimax -0.666852  0.513322  0.053259 -12.521 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##           exp(coef) exp(-coef) lower .95 upper .95
## minrh     0.9900    1.0101    0.9879    0.9921
## maxrh     1.0079    0.9922    1.0050    1.0108
## mwimin    2.0179    0.4956    1.8267    2.2291
## mwimax    0.5133    1.9481    0.4624    0.5698
##
## Concordance= 0.54  (se = 0.003 )
## Likelihood ratio test= 289.5 on 4 df,  p=<2e-16
## Wald test          = 291.6 on 4 df,  p=<2e-16
## Score (logrank) test = 292.1 on 4 df,  p=<2e-16

```

```

#Random effects - Separated
coxme_rh_s<- coxme(Surv(total_lived, censored) ~ minrh + meanrh
                      + maxrh + mwimin + mwime + mwimax +
                      (1|location) + (1|method), data= new_df_gdd)

summary(coxme_rh_s)

```

```

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124900.7 -124894.1
##
##             Chisq   df   p     AIC     BIC
## Integrated loglik 788.35 8.00 0 772.35 711.67
## Penalized loglik 801.43 7.99 0 785.45 724.84
##
## Model: Surv(total_lived, censored) ~ minrh + meanrh + maxrh + mwimin +
##        mwime + mwimax + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## minrh    0.01173971 1.0118089  0.003406294   3.45 5.7e-04
## meanrh   -0.03616013 0.9644858  0.005830306  -6.20 5.6e-10
## maxrh    0.01914568 1.0193301  0.003031163   6.32 2.7e-10
## mwimin   -0.61915996 0.5383965  0.127446806  -4.86 1.2e-06

```

```

## mwime   1.48018457 4.3937566 0.147550243  10.03 0.0e+00
## mwimax -1.04734875 0.3508668 0.067542793 -15.51 0.0e+00
##
## Random effects
##  Group      Variable Std Dev Variance
##  location Intercept 0.21724157 0.04719390
##  method    Intercept 0.18916413 0.03578307

rms::vif(coxme_rh_s)

##      minrh     meanrh     maxrh     mwimin     mwime     mwimax
## 28.316187 51.250996 9.737931 12.634918 15.097095 2.790398

#meanrh has a lot of collinearity so we should remove it and do it again
coxme_rh_s2<- coxme(Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwime + mwimax +
(1|location) + (1|method), data= new_df_gdd)

summary(coxme_rh_s2)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##           NULL Integrated Fitted
## Log-likelihood -125294.8 -124920.1 -124913.5
##
##          Chisq df p AIC BIC
## Integrated loglik 749.45 7.00 0 735.45 682.35
## Penalized loglik 762.64 6.99 0 748.65 695.63
##
## Model: Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwime + mwimax + (1 | location)
## Fixed coefficients
##        coef exp(coef) se(coef)   z     p
## minrh -0.007983438 0.9920483 0.001189122 -6.71 1.9e-11
## maxrh  0.002890211 1.0028944 0.001552513  1.86 6.3e-02
## mwimin -0.298814745 0.7416968 0.116208027 -2.57 1.0e-02
## mwime   1.042329950 2.8358166 0.128645267  8.10 5.6e-16
## mwimax -0.923210445 0.3972417 0.064526755 -14.31 0.0e+00
##
## Random effects
##  Group      Variable Std Dev Variance
##  location Intercept 0.22684908 0.05146051
##  method    Intercept 0.19020125 0.03617652

rms::vif(coxme_rh_s2)

##      minrh     maxrh     mwimin     mwime     mwimax
## 3.452495 2.582051 10.568160 11.603889 2.562920

#mwimean has a lot of collinearity, so we remove it and do it again
coxme_rh_s3<- coxme(Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwimax +
(1|location) + (1|method), data= new_df_gdd)
coxme_rh_s3

```

```

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##             NULL Integrated      Fitted
## Log-likelihood -125294.8     -124953 -124946.6
##
##          Chisq   df p    AIC    BIC
## Integrated loglik 683.64 6.00 0 671.64 626.13
## Penalized loglik 696.48 5.99 0 684.50 639.06
##
## Model: Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwimax + (1 | location) + (1 | m
## Fixed coefficients
##           coef exp(coef)   se(coef)      z      p
## minrh   -0.01162949 0.9884379 0.001094775 -10.62 0e+00
## maxrh    0.00729271 1.0073194 0.001450487   5.03 5e-07
## mwimin   0.54476566 1.7242043 0.052245328  10.43 0e+00
## mwimax  -0.62507279 0.5352225 0.053278651 -11.73 0e+00
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.19316956 0.03731448
## method   Intercept 0.18872443 0.03561691

exp(confint(coxme_rh_s3))

##           2.5 %    97.5 %
## minrh   0.9863192 0.9905611
## maxrh   1.0044597 1.0101872
## mwimin  1.5563864 1.9101172
## mwimax  0.4821514 0.5941351

rms::vif(coxme_rh_s3)

##      minrh     maxrh     mwimin     mwimax
## 2.968087 2.258754 2.194725 1.750572

#Random effects - Together
coxme_rh_t<- coxme(Surv(total_lived, censored) ~ minrh + meanrh
                     + maxrh + mwimin + mwime + mwimax +
                     (1|location/method), data= new_df_gdd)

summary(coxme_rh_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 7 31
##             NULL Integrated      Fitted
## Log-likelihood -125294.8     -124899.5 -124890.4
##
##          Chisq   df p    AIC    BIC

```

```

## Integrated loglik 790.64 8.00 0 774.64 713.96
## Penalized loglik 808.80 8.98 0 790.85 722.76
##
## Model: Surv(total_lived, censored) ~ minrh + meanrh + maxrh + mwimin + mwime + mwimax + (1 | location/method)
## Fixed coefficients
##          coef exp(coef)    se(coef)      z      p
## minrh   0.01188200 1.0119529 0.003407381  3.49 4.9e-04
## meanrh -0.03635544 0.9642975 0.005831688 -6.23 4.5e-10
## maxrh   0.01930663 1.0194942 0.003031961  6.37 1.9e-10
## mwimin -0.61361080 0.5413925 0.127450730 -4.81 1.5e-06
## mwime   1.47177630 4.3569675 0.147581246  9.97 0.0e+00
## mwimax -1.05475391 0.3482781 0.067596670 -15.60 0.0e+00
##
## Random effects
##  Group           Variable   Std Dev   Variance
##  location/method (Intercept) 0.226587237 0.051341776
##  location         (Intercept) 0.020093458 0.000403747

rms::vif(coxme_rh_t)

##      minrh     meanrh     maxrh     mwimin     mwime     mwimax
## 28.354265 51.271193  9.734499 12.636116 15.063889  2.781629

#meanrh has a lot of collinearity so we should remove it and do it again
coxme_rh_t2<- coxme(Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwime + mwimax +
                      (1|location/method), data= new_df_gdd)

summary(coxme_rh_t2)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 6 27
##          NULL Integrated Fitted
## Log-likelihood -125294.8 -124919.2 -124910
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 751.34 7.00 0 737.34 684.24
## Penalized loglik 769.67 7.98 0 753.71 693.20
##
## Model: Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwime + mwimax + (1 | location/method)
## Fixed coefficients
##          coef exp(coef)    se(coef)      z      p
## minrh  -0.00794886 0.9920826 0.001189503 -6.68 2.3e-11
## maxrh   0.00296216 1.0029666 0.001552885  1.91 5.6e-02
## mwimin -0.29136574 0.7472423 0.116192163 -2.51 1.2e-02
## mwime   1.03132504 2.8047798 0.128646934  8.02 1.1e-15
## mwimax -0.92958762 0.3947165 0.064560871 -14.40 0.0e+00
##
## Random effects
##  Group           Variable   Std Dev   Variance
##  location/method (Intercept) 0.2328043912 0.0541978845
##  location         (Intercept) 0.0201400621 0.0004056221

```

```

rms::vif(coxme_rh_t2)

##      minrh      maxrh      mwimin      mwime      mwimax
##  3.457083  2.581101 10.565311 11.573024  2.553363

#meanmwi has a lot of collinearity so we should remove it and do it again

coxme_rh_t3<- coxme(Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwimax +
                      (1|location/method), data= new_df_gdd)
exp(confint(coxme_rh_s3))

##              2.5 %    97.5 %
## minrh  0.9863192 0.9905611
## maxrh  1.0044597 1.0101872
## mwimin 1.5563864 1.9101172
## mwimax 0.4821514 0.5941351

coxme_rh_t3

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##           NULL Integrated   Fitted
## Log-likelihood -125294.8 -124951.4 -124942.5
##
##           Chisq   df p     AIC     BIC
## Integrated loglik 686.91 6.00 0 674.91 629.40
## Penalized loglik 704.68 6.98 0 690.73 637.83
##
## Model: Surv(total_lived, censored) ~ minrh + maxrh + mwimin + mwimax + (1 | location/method)
## Fixed coefficients
##           coef exp(coef)   se(coef)      z      p
## minrh -0.011554722 0.9885118 0.001095308 -10.55 0.0e+00
## maxrh  0.007323433 1.0073503 0.001450693   5.05 4.5e-07
## mwimin  0.543077781 1.7212965 0.052253221  10.39 0.0e+00
## mwimax -0.635549434 0.5296444 0.053396253 -11.90 0.0e+00
##
## Random effects
## Group           Variable   Std Dev     Variance
## location/method (Intercept) 0.2126804732 0.0452329837
## location       (Intercept) 0.0200477821 0.0004019136

```

Photoperiod

```

# No random effect
cox_ph<- coxph(Surv(total_lived, censored) ~ photoperiod,
                 data= new_df_gdd)

summary(cox_ph)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod, data = new_df_gdd)
##
##      n= 15154, number of events= 14541
##
##              coef exp(coef) se(coef)      z Pr(>|z|)
## photoperiod 0.159151  1.172515 0.006781 23.47 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## photoperiod     1.173      0.8529    1.157     1.188
##
## Concordance= 0.559  (se = 0.003 )
## Likelihood ratio test= 556.9 on 1 df,  p=<2e-16
## Wald test           = 550.9 on 1 df,  p=<2e-16
## Score (logrank) test = 553.7 on 1 df,  p=<2e-16

#Random effect - separated
coxme_phos<- coxme(Surv(total_lived, censored) ~ photoperiod +
                      (1|location) + (1|method), data= new_df_gdd)
summary(coxme_phos)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 7 31
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124870.2 -124864.3
##
##             Chisq   df p     AIC     BIC
## Integrated loglik 849.24 3.00 0 843.24 820.49
## Penalized loglik 861.16 2.99 0 855.19 832.55
##
## Model: Surv(total_lived, censored) ~ photoperiod + (1 | location) + (1 | method)
## Fixed coefficients
##          coef exp(coef) se(coef)      z p
## photoperiod 0.1459378 1.157124 0.006854719 21.29 0
##
## Random effects
## Group Variable Std Dev Variance
## location Intercept 0.12025165 0.01446046
## method Intercept 0.18942736 0.03588273

#Random effect - together
coxme_phot<- coxme(Surv(total_lived, censored) ~ photoperiod +
                      (1|location/method), data= new_df_gdd)

summary(coxme_phot)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154

```

```

## Iterations= 9 39
##          NULL Integrated Fitted
## Log-likelihood -125294.8 -124869.2 -124860.8
##
##          Chisq df p AIC BIC
## Integrated loglik 851.24 3.00 0 845.24 822.48
## Penalized loglik 868.04 3.97 0 860.10 830.01
##
## Model: Surv(total_lived, censored) ~ photoperiod + (1 | location/method)
## Fixed coefficients
##          coef exp(coef) se(coef) z p
## photoperiod 0.1464935 1.157767 0.006867567 21.33 0
##
## Random effects
## Group Variable Std Dev Variance
## location/method (Intercept) 0.1808051733 0.0326905107
## location (Intercept) 0.0198124749 0.0003925342

```

Complete models, adding all variables

```

#No random effect

coxph_allv<- coxph(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                      maxrh + mintemperature + meantemperature + maxtemperature +
                      mwimin + mwimax + daily_acc_gdd +location + method, data= new_df_gdd)
summary(coxph_allv)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + minrh +
##        meanrh + maxrh + mintemperature + meantemperature + maxtemperature +
##        mwimin + mwimax + daily_acc_gdd + location + method, data = new_df_gdd)
##
## n= 15154, number of events= 14541
##
##          coef exp(coef) se(coef) z Pr(>|z|)
## photoperiod 0.197022 1.217771 0.015387 12.804 < 2e-16 ***
## minrh 0.006739 1.006762 0.003240 2.080 0.03750 *
## meanrh -0.007931 0.992100 0.005255 -1.509 0.13126
## maxrh 0.005839 1.005856 0.003002 1.945 0.05178 .
## mintemperature 0.063421 1.065475 0.020790 3.051 0.00228 **
## meantemperature 0.002129 1.002131 0.026743 0.080 0.93654
## maxtemperature 0.082944 1.086481 0.021678 3.826 0.00013 ***
## mwimin -0.185496 0.830692 0.124093 -1.495 0.13496
## mwimax -0.379804 0.683996 0.058427 -6.500 8.01e-11 ***
## daily_acc_gdd -0.171911 0.842054 0.034502 -4.983 6.27e-07 ***
## locationUrban -0.222901 0.800194 0.022140 -10.068 < 2e-16 ***
## methodBG 0.258137 1.294516 0.018853 13.692 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95

```

```

## photoperiod      1.2178    0.8212    1.1816    1.2551
## minrh           1.0068    0.9933    1.0004    1.0132
## meanrh          0.9921    1.0080    0.9819    1.0024
## maxrh           1.0059    0.9942    1.0000    1.0118
## mintemperature   1.0655    0.9385    1.0229    1.1098
## meantemperature  1.0021    0.9979    0.9510    1.0561
## maxtemperature   1.0865    0.9204    1.0413    1.1336
## mwimin          0.8307    1.2038    0.6513    1.0594
## mwimax          0.6840    1.4620    0.6100    0.7670
## daily_acc_gdd   0.8421    1.1876    0.7870    0.9010
## locationUrban   0.8002    1.2497    0.7662    0.8357
## methodBG         1.2945    0.7725    1.2476    1.3432
##
## Concordance= 0.592  (se = 0.003 )
## Likelihood ratio test= 1060  on 12 df,  p=<2e-16
## Wald test          = 1105  on 12 df,  p=<2e-16
## Score (logrank) test = 1114  on 12 df,  p=<2e-16

```

```
rms::vif(coxph_allv) #gdd and meant with high vif
```

```

## photoperiod      5.611399    29.706846    45.567702    9.980555    100.780490
## minrh           159.192337   114.570097   14.352517    2.215245    238.232702
## meanrh          1.711774     1.005566
## maxrh           1.2178      0.8212      1.1816      1.2551
## mintemperature   1.0655      0.9385      1.0229      1.1098
## mwimin          0.8307      1.2038      0.6513      1.0594
## mwimax          0.6840      1.4620      0.6100      0.7670
## daily_acc_gdd   0.8421      1.1876      0.7870      0.9010
## locationUrban   0.8002      1.2497      0.7662      0.8357
## methodBG         1.2945      0.7725      1.2476      1.3432

```

```

cox_allv2<- coxph(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                     maxrh + mintemperature + maxtemperature +
                     mwimin + mwimax + meantemperature+ location + method, data= new_df_gdd)

```

```
summary(cox_allv2)
```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + minrh +
##        meanrh + maxrh + mintemperature + maxtemperature + mwimin +
##        mwimax + meantemperature + location + method, data = new_df_gdd)
##
## n= 15154, number of events= 14541
##
##             coef  exp(coef)   se(coef)      z Pr(>|z|)
## photoperiod  0.1911545  1.2106465  0.0153488  12.454 < 2e-16 ***
## minrh        0.0100733  1.0101242  0.0031546   3.193  0.00141 **
## meanrh       -0.0092621  0.9907807  0.0052302  -1.771  0.07658 .
## maxrh        0.0067022  1.0067247  0.0029930   2.239  0.02514 *
## mintemperature -0.0137238  0.9863699  0.0136577  -1.005  0.31497
## maxtemperature  0.0009704  1.0009708  0.0142301   0.068  0.94563
## mwimin       -0.4721448  0.6236632  0.1091645  -4.325  1.52e-05 ***
## mwimax        -0.3279104  0.7204276  0.0576399  -5.689  1.28e-08 ***
## meantemperature  0.0083222  1.0083569  0.0266855   0.312  0.75515
## locationUrban  -0.2379342  0.7882546  0.0220357 -10.798 < 2e-16 ***
## methodBG        0.2578754  1.2941775  0.0188529  13.678 < 2e-16 ***
## ---

```

```

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef)  exp(-coef) lower .95 upper .95
## photoperiod      1.2106     0.8260   1.1748   1.2476
## minrh           1.0101     0.9900   1.0039   1.0164
## meanrh          0.9908     1.0093   0.9807   1.0010
## maxrh           1.0067     0.9933   1.0008   1.0126
## mintemperature   0.9864     1.0138   0.9603   1.0131
## maxtemperature  1.0010     0.9990   0.9734   1.0293
## mwimin          0.6237     1.6034   0.5035   0.7725
## mwimax          0.7204     1.3881   0.6435   0.8066
## meantemperature 1.0084     0.9917   0.9570   1.0625
## locationUrban   0.7883     1.2686   0.7549   0.8230
## methodBG        1.2942     0.7727   1.2472   1.3429
##
## Concordance= 0.591  (se = 0.003 )
## Likelihood ratio test= 1034  on 11 df,  p=<2e-16
## Wald test          = 1071  on 11 df,  p=<2e-16
## Score (logrank) test = 1080  on 11 df,  p=<2e-16

```

```
rms::vif(cox_allv2) #meant with high vif
```

```

##      photoperiod            minrh            meanrh            maxrh            mintemperature
##      5.603575       28.189541       45.237344       9.938183      44.808667
##      maxtemperature         mwimin          mwimax meantemperature  locationUrban
##      49.233717       11.117570       2.135839      160.969038      1.695747
##      methodBG              1.005619
##
```

```

cox_allv3<- coxph(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                     maxrh + mintemperature + maxtemperature +
                     mwimin + mwimax +location + method, data= new_df_gdd)
summary(cox_allv3)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + minrh +
##        meanrh + maxrh + mintemperature + maxtemperature + mwimin +
##        mwimax + location + method, data = new_df_gdd)
##
##      n= 15154, number of events= 14541
##
##             coef exp(coef)  se(coef)      z Pr(>|z|)
## photoperiod  0.192574  1.212366  0.014660  13.136 < 2e-16 ***
## minrh        0.010151  1.010203  0.003144   3.228  0.00124 **
## meanrh       -0.009342  0.990702  0.005223  -1.788  0.07370 .
## maxrh        0.006790  1.006813  0.002979   2.279  0.02268 *
## mintemperature -0.009878  0.990171  0.005873  -1.682  0.09260 .
## maxtemperature  0.005071  1.005084  0.005438   0.932  0.35108
## mwimin       -0.470318  0.624804  0.108999  -4.315  1.60e-05 ***
## mwimax       -0.329355  0.719387  0.057452  -5.733  9.89e-09 ***
## locationUrban -0.238717  0.787638  0.021892 -10.904 < 2e-16 ***
## methodBG      0.257776  1.294049  0.018850  13.675 < 2e-16 ***
## ---

```

```

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## photoperiod     1.2124    0.8248    1.1780    1.2477
## minrh         1.0102    0.9899    1.0040    1.0164
## meanrh        0.9907    1.0094    0.9806    1.0009
## maxrh         1.0068    0.9932    1.0010    1.0127
## mintemperature 0.9902    1.0099    0.9788    1.0016
## maxtemperature 1.0051    0.9949    0.9944    1.0159
## mwimin        0.6248    1.6005    0.5046    0.7736
## mwimax        0.7194    1.3901    0.6428    0.8051
## locationUrban 0.7876    1.2696    0.7546    0.8222
## methodBG       1.2940    0.7728    1.2471    1.3428
##
## Concordance= 0.591  (se = 0.003 )
## Likelihood ratio test= 1034  on 10 df,   p=<2e-16
## Wald test          = 1071  on 10 df,   p=<2e-16
## Score (logrank) test = 1080  on 10 df,   p=<2e-16

```

```
rms::vif(cox_allv3) #meanrh with high vif
```

```

##      photoperiod           minrh           meanrh           maxrh           mintemperature
##      5.111272      28.016876      45.131385      9.850122      8.287367
##      maxtemperature        mwimin           mwimax locationUrban       methodBG
##      7.190808      11.086354      2.122566      1.673737      1.005331

```

```

cox_allv4<- coxph(Surv(total_lived, censored) ~ photoperiod + minrh +
                     maxrh + mintemperature +
                     mwimin + mwimax + maxtemperature + location + method, data= new_df_gdd)
summary(cox_allv4)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + minrh +
##        maxrh + mintemperature + mwimin + mwimax + maxtemperature +
##        location + method, data = new_df_gdd)
##
##      n= 15154, number of events= 14541
##
##          coef exp(coef)  se(coef)      z Pr(>|z|)
## photoperiod  0.194775  1.215037  0.014598  13.343 < 2e-16 ***
## minrh        0.005316  1.005330  0.001593   3.337 0.000848 ***
## maxrh        0.002223  1.002226  0.001544   1.440 0.149971
## mintemperature -0.008901  0.991139  0.005846  -1.523 0.127876
## mwimin       -0.473341  0.622918  0.108851  -4.349 1.37e-05 ***
## mwimax       -0.333285  0.716566  0.057371  -5.809 6.27e-09 ***
## maxtemperature  0.003286  1.003292  0.005341   0.615 0.538314
## locationUrban -0.243742  0.783690  0.021725 -11.219 < 2e-16 ***
## methodBG      0.258285  1.294708  0.018848  13.704 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## photoperiod     1.2150      0.8230     1.1808     1.2503

```

```

## minrh          1.0053    0.9947    1.0022    1.0085
## maxrh          1.0022    0.9978    0.9992    1.0053
## mintemperature 0.9911    1.0089    0.9798    1.0026
## mwimin         0.6229    1.6053    0.5032    0.7711
## mwimax         0.7166    1.3955    0.6404    0.8018
## maxtemperature 1.0033    0.9967    0.9928    1.0138
## locationUrban  0.7837    1.2760    0.7510    0.8178
## methodBG        1.2947    0.7724    1.2478    1.3434
##
## Concordance= 0.591 (se = 0.003 )
## Likelihood ratio test= 1031 on 9 df,   p=<2e-16
## Wald test       = 1066 on 9 df,   p=<2e-16
## Score (logrank) test = 1075 on 9 df,   p=<2e-16

rms::vif(cox_allv4)

##      photoperiod      minrh      maxrh mintemperature      mwimin
##      5.061077    7.182200    2.653815    8.199840    11.031121
##      mwimax maxtemperature locationUrban methodBG
##      2.118064    6.937224    1.648278    1.005066

cox_allv5<- coxph(Surv(total_lived, censored) ~ photoperiod + minrh +
                     maxrh + mintemperature +
                     mwimax + maxtemperature + location + method, data= new_df_gdd)
summary(cox_allv5)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + minrh +
##        maxrh + mintemperature + mwimax + maxtemperature + location +
##        method, data = new_df_gdd)
##
##      n= 15154, number of events= 14541
##
##              coef  exp(coef)   se(coef)      z Pr(>|z|)
## photoperiod  1.963e-01  1.217e+00  1.459e-02  13.456 < 2e-16 ***
## minrh        -1.512e-05 1.0000e+00  1.024e-03 -0.015  0.9882
## maxrh        3.777e-03  1.004e+00  1.502e-03  2.514  0.0119 *
## mintemperature -2.195e-02 9.783e-01  4.989e-03 -4.399 1.09e-05 ***
## mwimax        -4.361e-01 6.465e-01  5.239e-02 -8.325 < 2e-16 ***
## maxtemperature -1.478e-03 9.985e-01  5.226e-03 -0.283  0.7774
## locationUrban -2.308e-01 7.939e-01  2.152e-02 -10.727 < 2e-16 ***
## methodBG       2.575e-01 1.294e+00  1.885e-02  13.665 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##              exp(coef) exp(-coef) lower .95 upper .95
## photoperiod     1.2169     0.8218    1.1826    1.2521
## minrh           1.0000     1.0000    0.9980    1.0020
## maxrh           1.0038     0.9962    1.0008    1.0067
## mintemperature   0.9783     1.0222    0.9688    0.9879
## mwimax           0.6465     1.5467    0.5834    0.7165
## maxtemperature   0.9985     1.0015    0.9883    1.0088
## locationUrban    0.7939     1.2596    0.7611    0.8281

```

```

## methodBG      1.2937     0.7730     1.2468     1.3424
##
## Concordance= 0.589 (se = 0.003 )
## Likelihood ratio test= 1012 on 8 df, p=<2e-16
## Wald test       = 1039 on 8 df, p=<2e-16
## Score (logrank) test = 1046 on 8 df, p=<2e-16

rms::vif(cox_allv5)

##   photoperiod      minrh      maxrh mintemperature      mwimax
##   5.038611      2.998556      2.532253      6.053866      1.780818
##   maxtemperature locationUrban      methodBG
##   6.655568      1.616683      1.004930

cox_allv6<- coxph(Surv(total_lived, censored) ~ photoperiod + minrh +
                     maxrh + mintemperature +
                     mwimax + location + method, data= new_df_gdd)
rms::vif(cox_allv6) #we have removed maxtemperature and mwimin!

##   photoperiod      minrh      maxrh mintemperature      mwimax
##   3.761419      2.798073      2.379646      3.939168      1.765327
##   locationUrban      methodBG
##   1.265670      1.004926

## MODELS##
coxph_1<- coxph(Surv(total_lived, censored) ~ photoperiod + mwimax +
                  location + method, data= new_df_gdd)
summary(coxph_1)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + mwimax +
##        location + method, data = new_df_gdd)
##
## n= 15154, number of events= 14541
##
##           coef exp(coef)  se(coef)      z Pr(>|z|)
## photoperiod  0.135030  1.144571  0.006726  20.07 <2e-16 ***
## mwimax      -0.429385  0.650909  0.041245 -10.41 <2e-16 ***
## locationUrban -0.219278  0.803098  0.017798 -12.32 <2e-16 ***
## methodBG      0.261715  1.299156  0.018826  13.90 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##           exp(coef) exp(-coef) lower .95 upper .95
## photoperiod      1.1446     0.8737    1.1296    1.1598
## mwimax          0.6509     1.5363    0.6004    0.7057
## locationUrban    0.8031     1.2452    0.7756    0.8316
## methodBG         1.2992     0.7697    1.2521    1.3480
##
## Concordance= 0.589 (se = 0.003 )
## Likelihood ratio test= 966.6 on 4 df, p=<2e-16
## Wald test       = 982.3 on 4 df, p=<2e-16
## Score (logrank) test = 988.2 on 4 df, p=<2e-16

```

```

coxph_2<- coxph(Surv(total_lived, censored) ~ photoperiod + mwimin +
+ location + method,
  data= new_df_gdd)
summary(coxph_2)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + mwimin +
##       +location + method, data = new_df_gdd)
##
##   n= 15154, number of events= 14541
##
##              coef exp(coef)    se(coef)      z Pr(>|z|)
## photoperiod  0.170874  1.186341  0.007143  23.92 <2e-16 ***
## mwimin      -0.398355  0.671423  0.039041 -10.20 <2e-16 ***
## locationUrban -0.250204  0.778642  0.018826 -13.29 <2e-16 ***
## methodBG      0.265336  1.303869  0.018814  14.10 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##              exp(coef) exp(-coef) lower .95 upper .95
## photoperiod     1.1863     0.8429   1.1698   1.2031
## mwimin          0.6714     1.4894   0.6220   0.7248
## locationUrban    0.7786     1.2843   0.7504   0.8079
## methodBG         1.3039     0.7669   1.2567   1.3528
##
## Concordance= 0.591  (se = 0.003 )
## Likelihood ratio test= 965.5 on 4 df,  p=<2e-16
## Wald test          = 985.3 on 4 df,  p=<2e-16
## Score (logrank) test = 992 on 4 df,  p=<2e-16

library("texreg")

coxph_3<- coxph(Surv(total_lived, censored) ~ photoperiod + mintemperature +
+ minrh + location + method,
  data= new_df_gdd)
summary(coxph_3)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + mintemperature +
##       minrh + location + method, data = new_df_gdd)
##
##   n= 15154, number of events= 14541
##
##              coef exp(coef)    se(coef)      z Pr(>|z|)
## photoperiod  0.2072247  1.2302590  0.0124660  16.623 < 2e-16 ***
## mintemperature -0.0270089  0.9733526  0.0039954 -6.760 1.38e-11 ***
## minrh        -0.0013792  0.9986217  0.0007697 -1.792  0.0731 .
## locationUrban -0.2275839  0.7964556  0.0191221 -11.902 < 2e-16 ***
## methodBG      0.2649037  1.3033055  0.0188164  14.078 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##

```

```

## exp(coef) exp(-coef) lower .95 upper .95
## photoperiod 1.2303 0.8128 1.2006 1.2607
## mintemperature 0.9734 1.0274 0.9658 0.9810
## minrh 0.9986 1.0014 0.9971 1.0001
## locationUrban 0.7965 1.2556 0.7672 0.8269
## methodBG 1.3033 0.7673 1.2561 1.3523
##
## Concordance= 0.59 (se = 0.003 )
## Likelihood ratio test= 942.8 on 5 df, p=<2e-16
## Wald test = 953.2 on 5 df, p=<2e-16
## Score (logrank) test = 958.6 on 5 df, p=<2e-16

coxph_4<- coxph(Surv(total_lived, censored) ~ photoperiod + mintemperature +
+ maxrh + location + method,
data= new_df_gdd)
summary(coxph_4)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + mintemperature +
##       maxrh + location + method, data = new_df_gdd)
##
## n= 15154, number of events= 14541
##
##          coef exp(coef)  se(coef)      z Pr(>|z|)
## photoperiod 0.212042 1.236200 0.011155 19.009 < 2e-16 ***
## mintemperature -0.028725 0.971684 0.003572 -8.041 8.88e-16 ***
## maxrh -0.002104 0.997898 0.001027 -2.049 0.0404 *
## locationUrban -0.223943 0.799360 0.018397 -12.173 < 2e-16 ***
## methodBG 0.265167 1.303649 0.018817 14.092 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##          exp(coef) exp(-coef) lower .95 upper .95
## photoperiod 1.2362 0.8089 1.2095 1.2635
## mintemperature 0.9717 1.0291 0.9649 0.9785
## maxrh 0.9979 1.0021 0.9959 0.9999
## locationUrban 0.7994 1.2510 0.7711 0.8287
## methodBG 1.3036 0.7671 1.2564 1.3526
##
## Concordance= 0.59 (se = 0.003 )
## Likelihood ratio test= 943.8 on 5 df, p=<2e-16
## Wald test = 954.6 on 5 df, p=<2e-16
## Score (logrank) test = 960.4 on 5 df, p=<2e-16

coxph_5<- coxph(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
minrh + location + method,
data= new_df_gdd)
summary(coxph_5)

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
##       minrh + location + method, data = new_df_gdd)
##

```

```

## n= 15154, number of events= 14541
##
##             coef  exp(coef)   se(coef)      z Pr(>|z|)
## photoperiod  0.2232800  1.2501706  0.0142783  15.638 < 2e-16 ***
## daily_acc_gdd -0.0331602  0.9673836  0.0048140 -6.888 5.64e-12 ***
## minrh        -0.0020246  0.9979774  0.0007218 -2.805  0.00503 **
## locationUrban -0.1947650  0.8230280  0.0193375 -10.072 < 2e-16 ***
## methodBG       0.2657961  1.3044690  0.0188134  14.128 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##             exp(coef) exp(-coef) lower .95 upper .95
## photoperiod      1.2502     0.7999    1.2157    1.2857
## daily_acc_gdd    0.9674     1.0337    0.9583    0.9766
## minrh           0.9980     1.0020    0.9966    0.9994
## locationUrban    0.8230     1.2150    0.7924    0.8548
## methodBG         1.3045     0.7666    1.2572    1.3535
##
## Concordance= 0.59  (se = 0.003 )
## Likelihood ratio test= 944.4 on 5 df,  p=<2e-16
## Wald test          = 951.8 on 5 df,  p=<2e-16
## Score (logrank) test = 958.3 on 5 df,  p=<2e-16

```

```

coxph_6<- coxph(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                    maxrh + location + method,
                    data= new_df_gdd)
summary(coxph_6)

```

```

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
##        maxrh + location + method, data = new_df_gdd)
##
## n= 15154, number of events= 14541
##
##             coef  exp(coef)   se(coef)      z Pr(>|z|)
## photoperiod  0.232140  1.261296  0.013408  17.314 < 2e-16 ***
## daily_acc_gdd -0.035974  0.964666  0.004563 -7.883 3.19e-15 ***
## maxrh        -0.002249  0.997753  0.001020 -2.205  0.0275 *
## locationUrban -0.181382  0.834117  0.017959 -10.100 < 2e-16 ***
## methodBG       0.266236  1.305044  0.018814  14.151 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##             exp(coef) exp(-coef) lower .95 upper .95
## photoperiod      1.2613     0.7928    1.2286    1.2949
## daily_acc_gdd    0.9647     1.0366    0.9561    0.9733
## maxrh           0.9978     1.0023    0.9958    0.9998
## locationUrban    0.8341     1.1989    0.8053    0.8640
## methodBG         1.3050     0.7663    1.2578    1.3541
##
## Concordance= 0.59  (se = 0.003 )
## Likelihood ratio test= 941.4 on 5 df,  p=<2e-16
## Wald test          = 948.3 on 5 df,  p=<2e-16
## Score (logrank) test = 955.4 on 5 df,  p=<2e-16

```

Complete models, adding all variables, and with levels

```
#Random effect - separated
coxme_allv<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                      maxrh + mintemperature + meantemperature + maxtemperature +
                      mwimin + mwimax + daily_acc_gdd + (1|location) + (1|method),
                      data= new_df_gdd)
summary(coxme_allv)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 7 38
##             NULL Integrated     Fitted
## Log-likelihood -125294.8 -124771.2 -124765.1
##
##             Chisq    df p      AIC      BIC
## Integrated loglik 1047.20 12.00 0 1023.20 932.18
## Penalized loglik 1059.58 11.99 0 1035.61 944.70
##
## Model: Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +      maxrh + mintemperature + m
## Fixed coefficients
##             coef exp(coef)   se(coef)      z      p
## photoperiod 0.197413893 1.2182482 0.015380012 12.84 0.0e+00
## minrh        0.006759293 1.0067822 0.003239691  2.09 3.7e-02
## meanrh       -0.007996526 0.9920354 0.005255003 -1.52 1.3e-01
## maxrh        0.005890570 1.0059080 0.003001498  1.96 5.0e-02
## mintemperature 0.063615458 1.0656825 0.020793110  3.06 2.2e-03
## meantemperature 0.002360826 1.0023636 0.026740125  0.09 9.3e-01
## maxtemperature 0.082824146 1.0863508 0.021681924  3.82 1.3e-04
## mwimin       -0.183404537 0.8324313 0.124083925 -1.48 1.4e-01
## mwimax        -0.380430402 0.6835671 0.058425855 -6.51 7.4e-11
## daily_acc_gdd -0.172385678 0.8416545 0.034508059 -5.00 5.9e-07
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.15934541 0.02539096
## method   Intercept 0.18452042 0.03404778

rms::vif(coxme_allv) #gdd with high vif

##      photoperiod           minrh           meanrh           maxrh      mintemperature
##      5.457019        25.254471        40.670812        9.325341        91.896864
##      meantemperature maxtemperature      mwimin      mwimax daily_acc_gdd
##      155.119700       114.429499       11.681894       2.096065       234.068594

coxme_allv2<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                      maxrh + mintemperature + maxtemperature +
                      mwimin + mwimax + meantemperature+ (1|location) + (1|method),
                      data= new_df_gdd)
summary(coxme_allv2)
```

```

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 19 98
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124784.1 -124777.8
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 1021.53 11.00 0 999.53 916.10
## Penalized loglik 1034.04 10.99 0 1012.07 928.74
##
## Model: Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +      maxrh + mintemperature + m
## Fixed coefficients
##           coef exp(coef)   se(coef)      z      p
## photoperiod 0.1915288395 1.2110998 0.015342451 12.48 0.0e+00
## minrh        0.0100999989 1.0101512 0.003154632  3.20 1.4e-03
## meanrh       -0.0093274805 0.9907159 0.005229858 -1.78 7.5e-02
## maxrh        0.0067537420 1.0067766 0.002992614  2.26 2.4e-02
## mintemperature -0.0137476024 0.9863465 0.013656558 -1.01 3.1e-01
## maxtemperature 0.0006244466 1.0006246 0.014225178  0.04 9.6e-01
## mwimin       -0.4707932259 0.6245067 0.109163788 -4.31 1.6e-05
## mwimax        -0.3283701914 0.7200964 0.057638497 -5.70 1.2e-08
## meantemperature 0.0085717220 1.0086086 0.026682548  0.32 7.5e-01
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.16706822 0.02791179
## method   Intercept 0.18177465 0.03304202

rms::vif(coxme_allv2) #meantemperature with high vif

##      photoperiod            minrh            meanrh            maxrh      mintemperature
## 5.439519 23.924515 40.345141 9.277258 40.703016
##  maxtemperature      mwimin      mwimax meantemperature
## 49.143583 9.013277 2.011965 156.523608

coxme_allv3<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                      maxrh + mintemperature + maxtemperature +
                      mwimin + mwimax + (1|location) + (1|method), data= new_df_gdd)
summary(coxme_allv3)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 16 83
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124784.1 -124777.9
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 1021.43 10.00 0 1001.43 925.58
## Penalized loglik 1033.94  9.99 0 1013.97 938.23
##
## Model: Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +      maxrh + mintemperature + m
```

```

## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## photoperiod     0.192989214 1.2128697 0.014651904 13.17 0.0e+00
## minrh          0.010179923 1.0102319 0.003144308  3.24 1.2e-03
## meanrh         -0.009409407 0.9906347 0.005222974 -1.80 7.2e-02
## maxrh          0.006843757 1.0068672 0.002978984  2.30 2.2e-02
## mintemperature -0.009786929 0.9902608 0.005873001 -1.67 9.6e-02
## maxtemperature  0.004849066 1.0048608 0.005433566  0.89 3.7e-01
## mwimin         -0.468912250 0.6256825 0.108996541 -4.30 1.7e-05
## mwimax         -0.329857596 0.7190261 0.057450900 -5.74 9.4e-09
##
## Random effects
##   Group   Variable Std Dev Variance
##   location Intercept 0.16763930 0.02810293
##   method   Intercept 0.18170251 0.03301580

rms::vif(coxme_allv3) #meanrh with high vif

##      photoperiod      minrh      meanrh      maxrh mintemperature
##      4.960605      23.769878     40.238070     9.192841      7.529160
##      maxtemperature mwimin      mwimax
##      7.170278      8.984975     1.999198

coxme_allv4<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh +
                      maxrh + mwimin + mwimax + mintemperature + maxtemperature +
                      (1|location) + (1|method),
                      data= new_df_gdd,
                      refine.n = 500)
rms::vif(coxme_allv4) #removing maxtemperature

##      photoperiod      minrh      maxrh      mwimin      mwimax
##      4.913649      6.093384     2.477241     8.951244     1.995839
##      mintemperature maxtemperature
##      7.457659      6.914694

coxme_allv5<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh +
                      maxrh + mintemperature +mwimin +mwimax+ (1|location) + (1|method),
                      data= new_df_gdd,
                      refine.n = 500)
rms::vif(coxme_allv5) #we know now the variables that doesn't have collinearity

##      photoperiod      minrh      maxrh mintemperature      mwimin
##      3.701180      5.453081     2.283485     6.340041     8.581555
##      mwimax
##      1.941038

coxme_allv5_gdd <- coxme(Surv(total_lived, censored) ~ photoperiod + minrh +
                           maxrh + daily_acc_gdd +mwimin +mwimax+ (1|location) + (1|method),
                           data= new_df_gdd,
                           refine.n = 500)
rms::vif(coxme_allv5_gdd) #if we change temperature and put gdd, we still not

```

```

## photoperiod      minrh      maxrh daily_acc_gdd      mwimin
##        4.823310    6.378432    2.347918    9.120088    9.702627
##      mwimax
##        2.027815

#have collinearity

##Random effect - together
coxme_allv_t<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                         maxrh + mintemperature + meantemperature + maxtemperature +
                         mwimin + mwimax + (1|location/method), data= new_df_gdd)

summary(coxme_allv_t)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 43
##             NULL Integrated     Fitted
## Log-likelihood -125294.8 -124780.2 -124771.5
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 1029.37 11.00 0 1007.37 923.94
## Penalized loglik 1046.64 11.97 0 1022.71 931.94
##
## Model: Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +      maxrh + mintemperature + m
## Fixed coefficients
##            coef exp(coef)    se(coef)      z      p
## photoperiod 0.195015242 1.2153295 0.015375305 12.68 0.0e+00
## minrh       0.010295115 1.0103483 0.003155263  3.26 1.1e-03
## meanrh      -0.009582131 0.9904636 0.005229200 -1.83 6.7e-02
## maxrh       0.006959936 1.0069842 0.002992850  2.33 2.0e-02
## mintemperature -0.014518208 0.9855867 0.013657553 -1.06 2.9e-01
## meantemperature 0.009940342 1.0099899 0.026682157  0.37 7.1e-01
## maxtemperature -0.001085309 0.9989153 0.014226765 -0.08 9.4e-01
## mwimin      -0.468954109 0.6256563 0.109199226 -4.29 1.8e-05
## mwimax      -0.340907555 0.7111246 0.057763230 -5.90 3.6e-09
##
## Random effects
## Group           Variable   Std Dev   Variance
## location/method (Intercept) 0.1957273176 0.0383091829
## location         (Intercept) 0.0199897797 0.0003995913

rms::vif(coxme_allv_t) #meantemperature with high vif

## photoperiod      minrh      meanrh      maxrh  mintemperature
##        5.451218    23.957200    40.345791    9.274046    40.676917
## meantemperature  maxtemperature      mwimin      mwimax
##        156.422878    49.151454    9.021626    2.012517

```

```

coxme_allv_t2<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +
                         maxrh + mintemperature + maxtemperature +
                         mwimin + mwimax + (1|location/method), data= new_df_gdd)

summary(coxme_allv_t2)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 43
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124780.2 -124771.6
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 1029.23 10.00 0 1009.23 933.39
## Penalized loglik 1046.51 10.97 0 1024.58 941.39
##
## Model: Surv(total_lived, censored) ~ photoperiod + minrh + meanrh +      maxrh + mintemperature + m
## Fixed coefficients
##            coef exp(coef)    se(coef)      z      p
## photoperiod 0.196706512 1.2173867 0.014689735 13.39 0.0e+00
## minrh        0.010386772 1.0104409 0.003145105  3.30 9.6e-04
## meanrh       -0.009675862 0.9903708 0.005222419 -1.85 6.4e-02
## maxrh        0.007063916 1.0070889 0.002979308  2.37 1.8e-02
## mintemperature -0.009924674 0.9901244 0.005876591 -1.69 9.1e-02
## maxtemperature 0.003813155 1.0038204 0.005435569  0.70 4.8e-01
## mwimin       -0.466743856 0.6270407 0.109027071 -4.28 1.9e-05
## mwimax        -0.342624331 0.7099049 0.057577793 -5.95 2.7e-09
##
## Random effects
##   Group           Variable   Std Dev      Variance
##   location/method (Intercept) 0.1959844608 0.0384099089
##   location         (Intercept) 0.0199916371 0.0003996656

rms::vif(coxme_allv_t2) #meanrh with highest vif

##      photoperiod          minrh          meanrh          maxrh      mintemperature
##        4.975619        23.805320       40.240405       9.190233       7.532688
##      maxtemperature        mwimin          mwimax
##        7.175146        8.992428       1.999975

coxme_allv_t3<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh +
                         maxrh + mintemperature + maxtemperature +
                         mwimin + mwimax + (1|location/method), data= new_df_gdd)

summary(coxme_allv_t3)

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35

```

```

##                         NULL Integrated      Fitted
## Log-likelihood -125294.8 -124781.9 -124773.3
##
##                         Chisq   df p     AIC     BIC
## Integrated loglik 1025.80 9.00 0 1007.80 939.54
## Penalized loglik 1043.14 9.97 0 1023.21 947.60
##
## Model: Surv(total_lived, censored) ~ photoperiod + minrh + maxrh + mintemperature + maxtemperature
## Fixed coefficients
##                         coef exp(coef)    se(coef)      z      p
## photoperiod      0.198961821 1.2201354 0.014628290 13.60 0.0e+00
## minrh            0.005377198 1.0053917 0.001593662  3.37 7.4e-04
## maxrh            0.002333467 1.0023362 0.001544908  1.51 1.3e-01
## mintemperature -0.008916292 0.9911233 0.005849374 -1.52 1.3e-01
## maxtemperature  0.001969834 1.0019718 0.005337733  0.37 7.1e-01
## mwimin          -0.469757340 0.6251539 0.108875325 -4.31 1.6e-05
## mwimax          -0.346623785 0.7070713 0.057496289 -6.03 1.7e-09
##
## Random effects
## Group           Variable   Std Dev   Variance
## location/method (Intercept) 0.1979638976 0.0391897048
## location         (Intercept) 0.0199998428 0.0003999937

rms::vif(coxme_allv_t3) #maxtemperature with highest vif

##      photoperiod      minrh      maxrh mintemperature maxtemperature
##        4.929063      6.103088     2.477662      7.461492      6.920463
##      mwimin      mwimax
##        8.957995     1.996743

coxme_allv_t4<- coxme(Surv(total_lived, censored) ~ photoperiod + minrh +
                         maxrh + mintemperature +
                         mwimin + mwimax + (1|location/method), data= new_df_gdd)
rms::vif(coxme_allv_t4) #maxtemperature with highest vif

##      photoperiod      minrh      maxrh mintemperature      mwimin
##        3.707955      5.466050     2.283001      6.349184      8.588838
##      mwimax
##        1.940053

#Finally... which one? :))

```

We should check the AIC and BIC of each model, maybe taking only the option of (1|location) + (1|method) (1|location/method) (1|location) + (1|method) + (1|location/method) for:

1. model with MWImax, photoperiod
2. model with MWImin, photoperiod
3. model with MinT, minRH, photoperiod
4. model with MinT, maxRH, photoperiod
5. model with GDD, minRH, photoperiod
6. model with GDD, maxRH, photoperiod

Create tables with the HR, CI95%, var and sd + tables with the AIC + BIC + loglikelihood (integrated)

```
#model 1.
model1<- coxme(Surv(total_lived, censored) ~ photoperiod + mwimax +
                  (1|location)+ (1|method) +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model1))

##           2.5 %    97.5 %
## photoperiod 1.1300395 1.1602701
## mwimax      0.5960754 0.7008917

model1

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 15 63
##             NULL Integrated     Fitted
## Log-likelihood -125294.8    -124814 -124806.3
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 961.67 6.00 0 949.67 904.16
## Penalized loglik 977.15 4.89 0 967.36 930.25
##
## Model: Surv(total_lived, censored) ~ photoperiod + mwimax + (1 | location) + (1 | method) + (1 | location/method)
## Fixed coefficients
##          coef exp(coef)    se(coef)      z p
## photoperiod 0.1354527 1.1450550 0.006734892 20.11 0
## mwimax      -0.4363950 0.6463624 0.041323789 -10.56 0
##
## Random effects
##  Group            Variable    Std Dev     Variance
##  location         Intercept  0.1285202288 0.0165174492
##  method          Intercept  0.1842729262 0.0339565113
##  location/method (Intercept) 0.0593605277 0.0035236723
##  location         (Intercept) 0.0201747447 0.0004070203

model2<- coxme(Surv(total_lived, censored) ~ photoperiod + mwimin +
                  (1|location)+ (1|method) +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model2))

##           2.5 %    97.5 %
## photoperiod 1.1706882 1.2039775
## mwimin      0.6208004 0.7234193

model2

## Cox mixed-effects model fit by maximum likelihood
```

```

##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 9 39
##           NULL Integrated     Fitted
## Log-likelihood -125294.8  -124815.6 -124807.8
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 958.58 6.00 0 946.58 901.07
## Penalized loglik 974.18 4.88 0 964.43 927.45
##
## Model: Surv(total_lived, censored) ~ photoperiod + mwimin + (1 | location) +      (1 | method) + (1 |
## Fixed coefficients
##          coef exp(coef)    se(coef)      z     p
## photoperiod 0.1716112 1.1872162 0.00715290 23.99 0
## mwimin      -0.4002559 0.6701485 0.03902609 -10.26 0
##
## Random effects
##   Group       Variable     Std Dev     Variance
##   location   Intercept 0.109141698 0.011911910
##   method     Intercept 0.187466724 0.035143773
##   location/method (Intercept) 0.053285855 0.002839382
##   location   (Intercept) 0.109141628 0.011911895

model3<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ minrh +
                  (1|location)+(1|method) +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model3))

##          2.5 % 97.5 %
## photoperiod 1.2030320 1.263415
## mintemperature 0.9652319 0.980492
## minrh        0.9971845 1.000198

model3

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 9 39
##           NULL Integrated     Fitted
## Log-likelihood -125294.8  -124826.7 -124819
##
##          Chisq    df p     AIC     BIC
## Integrated loglik 936.30 7.00 0 922.30 869.21
## Penalized loglik 951.72 5.88 0 939.97 895.39
##
## Model: Surv(total_lived, censored) ~ photoperiod + mintemperature +      minrh + (1 | location) + (1 |
## Fixed coefficients
##          coef exp(coef)    se(coef)      z     p
## photoperiod 0.209331622 1.2328538 0.0124933661 16.76 0.0e+00
## mintemperature -0.027543831 0.9728320 0.0040016495 -6.88 5.9e-12
## minrh       -0.001310968 0.9986899 0.0007696826 -1.70 8.9e-02

```

```

## Random effects
## Group           Variable   Std Dev   Variance
## location       Intercept  0.096843288 0.009378622
## method         Intercept  0.187086231 0.035001258
## location/method (Intercept) 0.054388377 0.002958096
## location       (Intercept) 0.096843288 0.009378622

model4<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ maxrh +
                  (1|location)+ (1|method) +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
model4

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 9 39
##             NULL Integrated     Fitted
## Log-likelihood -125294.8      -124826 -124818.3
##
##             Chisq    df p     AIC     BIC
## Integrated loglik 937.60 7.00 0 923.60 870.50
## Penalized loglik 953.02 5.88 0 941.26 896.65
##
## Model: Surv(total_lived, censored) ~ photoperiod + mintemperature +      maxrh + (1 | location) + (1 | method)
## Fixed coefficients
##             coef exp(coef)    se(coef)      z      p
## photoperiod      0.213597301 1.2381240 0.011174416 19.11 0.0e+00
## mintemperature   -0.029088245 0.9713307 0.003575205 -8.14 4.4e-16
## maxrh            -0.002110154 0.9978921 0.001027156 -2.05 4.0e-02
##
## Random effects
## Group           Variable   Std Dev   Variance
## location       Intercept  0.094921320 0.009010057
## method         Intercept  0.187189077 0.035039750
## location/method (Intercept) 0.055478821 0.003077900
## location       (Intercept) 0.094921258 0.009010045

exp(confint(model4))

##               2.5 % 97.5 %
## photoperiod    1.2113020 1.265540
## mintemperature 0.9645482 0.978161
## maxrh          0.9958851 0.999903

model5<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                  minrh + (1|location)+ (1|method) +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
model5

```

```

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 9 39
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124825.4 -124817.9
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 938.82 7.00 0 924.82 871.73
## Penalized loglik 953.95 5.88 0 942.19 897.60
##
## Model: Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd + minrh + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## photoperiod 0.226570986 1.2542916 0.0143057025 15.84 0.0e+00
## daily_acc_gdd -0.034128961 0.9664469 0.0048215336 -7.08 1.5e-12
## minrh        -0.001948192 0.9980537 0.0007209165 -2.70 6.9e-03
##
## Random effects
## Group            Variable   Std Dev   Variance
## location         Intercept 0.1101525704 0.0121335888
## method           Intercept 0.1877169823 0.0352376654
## location/method (Intercept) 0.0565113032 0.0031935274
## location         (Intercept) 0.0200821798 0.0004032939

exp(confint(model5))

##           2.5 %    97.5 %
## photoperiod 1.2196114 1.2899580
## daily_acc_gdd 0.9573569 0.9756231
## minrh        0.9966445 0.9994649

model6<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                  maxrh + (1|location)+ (1|method) +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
model6

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##             NULL Integrated      Fitted
## Log-likelihood -125294.8 -124826.7 -124819.2
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 936.33 7.00 0 922.33 869.23
## Penalized loglik 951.34 5.88 0 939.58 894.97
##
## Model: Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd + maxrh + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## photoperiod 0.234914074 1.2648001 0.013435830 17.48 0.0e+00

```

```

## daily_acc_gdd -0.036782977 0.9638853 0.004570898 -8.05 8.9e-16
## maxrh          -0.002234293 0.9977682 0.001019907 -2.19 2.8e-02
##
## Random effects
##   Group           Variable     Std Dev     Variance
##   location        Intercept  0.0988189755 0.0097651899
##   method          Intercept  0.1885398049 0.0355472580
##   location/method (Intercept) 0.0572684653 0.0032796771
##   location        (Intercept) 0.0200136511 0.0004005462

exp(confint(model6))

##                  2.5 %    97.5 %
## photoperiod    1.2319279 1.2985494
## daily_acc_gdd 0.9552886 0.9725593
## maxrh         0.9957757 0.9997647

#model 1.
model1<- coxme(Surv(total_lived, censored) ~ photoperiod + mwimax +
                   (1|location/method),
                   data= new_df_gdd,
                   refine.n = 500)
exp(confint(model1))

##                  2.5 %    97.5 %
## photoperiod 1.1300733 1.1603089
## mwimax       0.5955683 0.7003171

model1

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 15 63
##                  NULL Integrated Fitted
## Log-likelihood -125294.8 -124814.8 -124806.2
##
##                  Chisq df p AIC BIC
## Integrated loglik 960.03 4.00 0 952.03 921.70
## Penalized loglik 977.21 4.97 0 967.27 929.56
##
## Model: Surv(total_lived, censored) ~ photoperiod + mwimax + (1 | location/method)
## Fixed coefficients
##      coef exp(coef)    se(coef)      z p
## photoperiod 0.1354843 1.1450913 0.006735782 20.11 0
## mwimax      -0.4372306 0.6458225 0.041331645 -10.58 0
##
## Random effects
##   Group           Variable     Std Dev     Variance
##   location/method (Intercept) 0.19264862 0.03711349
##   location        (Intercept) 0.01995370 0.00039815

```

```

model2<- coxme(Surv(total_lived, censored) ~ photoperiod + mwimin +
                  (1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model2))

##               2.5 %    97.5 %
## photoperiod 1.1707982 1.2040969
## mwimin      0.6206863 0.7232794

model2

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 8 35
##           NULL Integrated     Fitted
## Log-likelihood -125294.8 -124816.5 -124807.7
##
##           Chisq   df p     AIC     BIC
## Integrated loglik 956.72 4.00 0 948.72 918.38
## Penalized loglik 974.26 4.97 0 964.31 926.59
##
## Model: Surv(total_lived, censored) ~ photoperiod + mwimin + (1 | location/method)
## Fixed coefficients
##           coef exp(coef)    se(coef)      z p
## photoperiod 0.1717078 1.1873309 0.007154239 24.00 0
## mwimin      -0.4004446 0.6700221 0.039023601 -10.26 0
##
## Random effects
##   Group          Variable     Std Dev     Variance
##   location/method (Intercept) 0.2045801805 0.0418530503
##   location        (Intercept) 0.0200165318 0.0004006615

model3<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+
                  minrh +
                  (1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model3))

##               2.5 %    97.5 %
## photoperiod 1.2033181 1.2637304
## mintemperature 0.9651665 0.9804284
## minrh        0.9971897 1.0002029

model3

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154

```

```

## Iterations= 8 35
## NULL Integrated Fitted
## Log-likelihood -125294.8 -124827.6 -124818.9
##
## Chisq df p AIC BIC
## Integrated loglik 934.50 5.00 0 924.50 886.57
## Penalized loglik 951.79 5.97 0 939.85 894.57
##
## Model: Surv(total_lived, censored) ~ photoperiod + mintemperature + minrh + (1 | location/method)
## Fixed coefficients
## coef exp(coef) se(coef) z p
## photoperiod 0.209575370 1.2331543 0.0124964430 16.77 0.0e+00
## mintemperature -0.027610188 0.9727675 0.0040023592 -6.90 5.3e-12
## minrh -0.001305713 0.9986951 0.0007697027 -1.70 9.0e-02
##
## Random effects
## Group Variable Std Dev Variance
## location/method (Intercept) 0.196501057 0.038612666
## location (Intercept) 0.019980315 0.000399213

model4<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ maxrh
+(1|location/method),
data= new_df_gdd,
refine.n = 500)
model4

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 20 83
## NULL Integrated Fitted
## Log-likelihood -125294.8 -124827 -124818.3
##
## Chisq df p AIC BIC
## Integrated loglik 935.71 5.00 0 925.71 887.78
## Penalized loglik 953.07 5.96 0 941.15 895.93
##
## Model: Surv(total_lived, censored) ~ photoperiod + mintemperature + maxrh + (1 | location/method)
## Fixed coefficients
## coef exp(coef) se(coef) z p
## photoperiod 0.213791169 1.2383640 0.011176730 19.13 0.0e+00
## mintemperature -0.029122813 0.9712972 0.003575448 -8.15 3.3e-16
## maxrh -0.002105785 0.9978964 0.001027169 -2.05 4.0e-02
##
## Random effects
## Group Variable Std Dev Variance
## location/method (Intercept) 0.1707284026 0.0291481874
## location (Intercept) 0.0199523569 0.0003980965

exp(confint(model4))

## 2.5 % 97.5 %
## photoperiod 1.2115314 1.2657909

```

```

## mintemperature 0.9645144 0.9781277
## maxrh          0.9958895 0.9999074

model5<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                 minrh +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
model5

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 15 63
##             NULL Integrated     Fitted
## Log-likelihood -125294.8   -124826.3 -124817.8
##
##             Chisq    df   p     AIC     BIC
## Integrated loglik 937.04 5.00 0 927.04 889.11
## Penalized loglik 954.01 5.97 0 942.08 896.82
##
## Model: Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd + minrh + (1 | location/method)
## Fixed coefficients
##             coef  exp(coef)      se(coef)      z      p
## photoperiod 0.226774028 1.2545463 0.0143116948 15.85 0.0e+00
## daily_acc_gdd -0.034196769 0.9663813 0.0048229496 -7.09 1.3e-12
## minrh        -0.001952791 0.9980491 0.0007211123 -2.71 6.8e-03
##
## Random effects
## Group           Variable      Std Dev      Variance
## location/method (Intercept) 0.1866119549 0.0348240217
## location       (Intercept) 0.0199034091 0.0003961457

exp(confint(model5))

##             2.5 %    97.5 %
## photoperiod 1.2198448 1.2902351
## daily_acc_gdd 0.9572894 0.9755597
## minrh        0.9966395 0.9994607

model6<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                 maxrh +(1|location/method),
                  data= new_df_gdd,
                  refine.n = 500)
model6

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 9 39
##             NULL Integrated     Fitted
## Log-likelihood -125294.8   -124827.6 -124819.1
##

```

```

##          Chisq   df p     AIC     BIC
## Integrated loglik 934.53 5.00 0 924.53 886.61
## Penalized loglik 951.40 5.97 0 939.46 894.20
##
## Model: Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd + maxrh +      (1 | location/method)
## Fixed coefficients
##          coef exp(coef)    se(coef)      z      p
## photoperiod 0.235091170 1.2650241 0.013440504 17.49 0.0e+00
## daily_acc_gdd -0.036848417 0.9638222 0.004571936 -8.06 7.8e-16
## maxrh       -0.002246447 0.9977561 0.001020021 -2.20 2.8e-02
##
## Random effects
## Group           Variable   Std Dev   Variance
## location/method (Intercept) 0.1828429839 0.0334315568
## location         (Intercept) 0.0198360970 0.0003934707

exp(confint(model6))

##          2.5 %    97.5 %
## photoperiod 1.2321348 1.2987913
## daily_acc_gdd 0.9552242 0.9724977
## maxrh       0.9957633 0.9997528

model1<- coxme(Surv(total_lived, censored) ~ photoperiod + mwimax +
                  (1|location)+ (1|method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model1))

##          2.5 %    97.5 %
## photoperiod 1.1297074 1.1598882
## mwimax      0.6008167 0.7062354

model1

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 7 31
##          NULL Integrated Fitted
## Log-likelihood -125294.8 -124817.7 -124811.6
##
##          Chisq   df p     AIC     BIC
## Integrated loglik 954.19 4.00 0 946.19 915.85
## Penalized loglik 966.57 3.99 0 958.60 928.34
##
## Model: Surv(total_lived, censored) ~ photoperiod + mwimax + (1 | location) +      (1 | method)
## Fixed coefficients
##          coef exp(coef)    se(coef)      z      p
## photoperiod 0.1351411 1.144698 0.006725865 20.09 0
## mwimax      -0.4286360 0.651397 0.041240251 -10.39 0
##

```

```

## Random effects
## Group      Variable  Std Dev   Variance
## location Intercept 0.15703634 0.02466041
## method    Intercept 0.18696861 0.03495726

model2<- coxme(Surv(total_lived, censored) ~ photoperiod + mwimin +
                  (1|location)+(1|method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model2))

##                      2.5 % 97.5 %
## photoperiod 1.1698696 1.203090
## mwimin      0.6226763 0.725606

model2

## Cox mixed-effects model fit by maximum likelihood
## Data: new_df_gdd
## events, n = 14541, 15154
## Iterations= 8 35
##                   NULL Integrated     Fitted
## Log-likelihood -125294.8 -124818.4 -124812.1
##
##                   Chisq   df p    AIC    BIC
## Integrated loglik 952.86 4.00 0 944.86 914.52
## Penalized loglik 965.53 3.99 0 957.56 927.30
##
## Model: Surv(total_lived, censored) ~ photoperiod + mwimin + (1 | location) + (1 | method)
## Fixed coefficients
##             coef exp(coef)    se(coef)      z p
## photoperiod 0.1708929 1.1863636 0.007143294 23.92 0
## mwimin      -0.3972383 0.6721738 0.039026294 -10.18 0
##
## Random effects
## Group      Variable  Std Dev   Variance
## location Intercept 0.17838417 0.03182091
## method    Intercept 0.18860585 0.03557217

model3<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ minrh +
                  (1|location)+(1|method),
                  data= new_df_gdd,
                  refine.n = 500)
exp(confint(model3))

##                      2.5 % 97.5 %
## photoperiod     1.2006985 1.2608279
## mintemperature  0.9657730 0.9810171
## minrh           0.9971385 1.0001506

```

```
model3
```

```
## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
## Iterations= 7 31
##               NULL Integrated Fitted
## Log-likelihood -125294.8 -124829.7 -124823.4
##
##          Chisq df p    AIC    BIC
## Integrated loglik 930.30 5.00 0 920.30 882.38
## Penalized loglik 942.78 4.99 0 932.81 894.97
##
## Model: Surv(total_lived, censored) ~ photoperiod + mintemperature +      minrh + (1 | location) + (1 | method)
## Fixed coefficients
##             coef exp(coef)     se(coef)      z      p
## photoperiod    0.207336042 1.2303960 0.0124658166 16.63 0.0e+00
## mintemperature -0.026995897 0.9733652 0.0039952458 -6.76 1.4e-11
## minrh         -0.001357516 0.9986434 0.0007694615 -1.76 7.8e-02
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.16321155 0.02663801
## method   Intercept 0.18919189 0.03579357
```

```
model4<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ maxrh +
                  (1|location)+(1|method),
                  data= new_df_gdd,
                  refine.n = 500)
```

```
model4
```

```
## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
## Iterations= 7 31
##               NULL Integrated Fitted
## Log-likelihood -125294.8 -124829.2 -124823
##
##          Chisq df p    AIC    BIC
## Integrated loglik 931.30 5.00 0 921.30 883.37
## Penalized loglik 943.74 4.99 0 933.77 895.93
##
## Model: Surv(total_lived, censored) ~ photoperiod + mintemperature +      maxrh + (1 | location) + (1 | method)
## Fixed coefficients
##             coef exp(coef)     se(coef)      z      p
## photoperiod    0.212027651 1.2361821 0.011155033 19.01 0.0e+00
## mintemperature -0.028670079 0.9717370 0.003571549 -8.03 1.0e-15
## maxrh         -0.002085955 0.9979162 0.001026868 -2.03 4.2e-02
##
## Random effects
## Group   Variable Std Dev Variance
## location Intercept 0.16046354 0.02574855
## method   Intercept 0.18937600 0.03586327
```

```

exp(confint(model4))

##           2.5 %    97.5 %
## photoperiod 1.2094482 1.2635069
## mintemperature 0.9649585 0.9785631
## maxrh        0.9959098 0.9999267

model5<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                 minrh + (1|location)+(1|method),
                 data= new_df_gdd,
                 refine.n = 500)
model5

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd
##   events, n = 14541, 15154
##   Iterations= 7 31
##           NULL Integrated     Fitted
## Log-likelihood -125294.8 -124828.7 -124822.6
##
##           Chisq   df p     AIC     BIC
## Integrated loglik 932.24 5.00 0 922.24 884.32
## Penalized loglik 944.41 4.99 0 934.44 896.63
##
## Model: Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd + minrh + (1 | location) + (1 | method)
## Fixed coefficients
##           coef exp(coef)      se(coef)      z      p
## photoperiod 0.223690982 1.2506845 0.0142709410 15.67 0.0e+00
## daily_acc_gdd -0.033252344 0.9672944 0.0048123984 -6.91 4.9e-12
## minrh       -0.001991426 0.9980106 0.0007211321 -2.76 5.8e-03
##
## Random effects
##   Group   Variable Std Dev Variance
##   location Intercept 0.13652897 0.01864016
##   method    Intercept 0.18758851 0.03518945

exp(confint(model5))

##           2.5 %    97.5 %
## photoperiod 1.2161869 1.2861606
## daily_acc_gdd 0.9582137 0.9764612
## minrh        0.9966010 0.9994221

model6<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
                 maxrh + (1|location)+(1|method),
                 data= new_df_gdd,
                 refine.n = 500)
model6

## Cox mixed-effects model fit by maximum likelihood
##   Data: new_df_gdd

```

```

##   events, n = 14541, 15154
##   Iterations= 7 31
##           NULL Integrated     Fitted
## Log-likelihood -125294.8 -124830.2 -124824.2
##
##           Chisq    df p     AIC     BIC
## Integrated loglik 929.35 5.00 0 919.35 881.43
## Penalized loglik 941.38 4.99 0 931.41 893.60
##
## Model: Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd + maxrh +      (1 | location) + (1 |
## Fixed coefficients
##           coef exp(coef)    se(coef)      z      p
## photoperiod    0.232384329 1.2616045 0.013404758 17.34 0e+00
## daily_acc_gdd -0.036011444 0.9646293 0.004562784 -7.89 3e-15
## maxrh        -0.002218578 0.9977839 0.001019847 -2.18 3e-02
##
## Random effects
## Group      Variable Std Dev Variance
## location Intercept 0.12737395 0.01622412
## method     Intercept 0.18760716 0.03519644

exp(confint(model6))

##           2.5 %    97.5 %
## photoperiod 1.2288902 1.2951897
## daily_acc_gdd 0.9560411 0.9732945
## maxrh        0.9957914 0.9997803

```

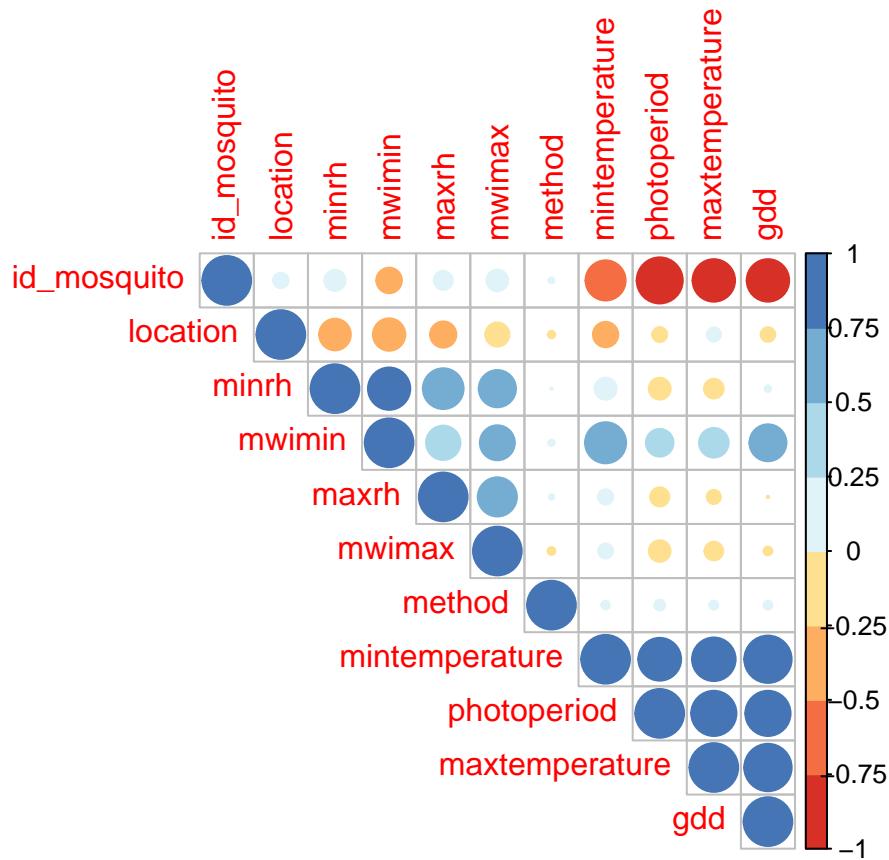
looking for correlation

```

library(corrplot)
library(RColorBrewer)

t = cbind(new_df_gdd$id_mosquito, new_df_gdd$method, new_df_gdd$location, new_df_gdd$maxtemperature,
          new_df_gdd$mintemperature, new_df_gdd$minrh, new_df_gdd$maxrh, new_df_gdd$photoperiod,new_df_gdd$mwimax,
          new_df_gdd$mwimin)
colnames(t) <- c("id_mosquito", "method", "location", "maxtemperature", "mintemperature", "minrh","maxrh")
t<- as.data.frame(t)
M <- cor(t)
corrp<- corrplot(M, type="upper", order="hclust",
                  col=brewer.pal(n=8, name="RdYlBu"))

```



```
#loglik calculation in normal cox

cox3 <- coxph(formula = Surv(total_lived, censored) ~ photoperiod + mintemperature +
    minrh, data = new_df_gdd)
cox3$loglik #-124994.3
```

```
## [1] -125294.8 -124994.3
```

```
cox6 <- coxph(formula = Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
    maxrh, data = new_df_gdd)
cox6$loglik #-124975.3
```

```
## [1] -125294.8 -124975.3
```

```
#loglik calculation with levels: COX vs INTERACTION+LEVELS
model3all<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ minrh +
    (1|location)+(1|method) +(1|location/method),
    data= new_df_gdd,
    refine.n = 500) #loglik -124826.7
2*(-124826.7+124994.3) #335.2
```

```
## [1] 335.2
```

```

pchisq(335.2,5,lower.tail = F) #2.684731e-70

## [1] 2.684731e-70

model6all<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
  maxrh + (1|location)+(1|method)+(1|location/method),
  data= new_df_gdd,
  refine.n = 500) #loglik -124826.7
2*(-124826.7+124975.3) #297.2

## [1] 297.2

pchisq(297.2,5,lower.tail = F) #4.005055e-62

## [1] 4.005055e-62

#loglik calculation with levels: Cox with separated interactions
model3sep<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ minrh +
  (1|location)+(1|method),
  data= new_df_gdd,
  refine.n = 500) #loglik -124829.7
2*(-124829.7+124994.3) #329.2

## [1] 329.2

pchisq(329.2,5,lower.tail = F) #5.249144e-69

## [1] 5.249144e-69

model6sep<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
  maxrh + (1|location)+(1|method),
  data= new_df_gdd,
  refine.n = 500) #loglik -124830.2
2*(-124830.2+124975.3) #290.2

## [1] 290.2

pchisq(290.2,5,lower.tail = F) #1.280022e-60

## [1] 1.280022e-60

#loglik calculations with levels: COX vs interaction
model3all<- coxme(Surv(total_lived, censored) ~ photoperiod + mintemperature+ minrh +
  (1|location/method),
  data= new_df_gdd,
  refine.n = 500) #loglik -124827.6
2*(-124827.6+124994.3) #333.4

## [1] 333.4

```

```

pchisq(333.4,5,lower.tail = F) #6.550569e-70

## [1] 6.550569e-70

model6all<- coxme(Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
  maxrh +(1|location/method),
  data= new_df_gdd,
  refine.n = 500) #loglik -124827.6
2*(-124827.6+124975.3) #295.4

## [1] 295.4

pchisq(295.4,5,lower.tail = F) #9.762086e-62

## [1] 9.762086e-62

##CHECK ASSUMPTIONS

#cox.zph(model6)
#gcox.zph(cox.zph(model6))

#cox.zph(model3)
#gcox.zph(cox.zph(model3))

sample <- sample_n(new_df_gdd, 1850)
coxph_sample <- coxph(formula = Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
  maxrh, data = sample)
coxph_sample

## Call:
## coxph(formula = Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
##       maxrh, data = sample)
##
##             coef exp(coef)   se(coef)      z      p
## photoperiod    0.270691  1.310870  0.036614  7.393 1.44e-13
## daily_acc_gdd -0.040107  0.960687  0.012202 -3.287  0.00101
## maxrh          0.006589  1.006611  0.002805  2.349  0.01882
##
## Likelihood ratio test=83.45 on 3 df, p=< 2.2e-16
## n= 1850, number of events= 1774

cox.zph(coxph_sample)

##            chisq df     p
## photoperiod 1.639  1 0.20
## daily_acc_gdd 0.772  1 0.38
## maxrh        0.336  1 0.56
## GLOBAL       2.418  3 0.49

```

```
# samplerandom<- function(location, method){
#   new_df_gdd2<- new_df_gdd %>%
#     group_by(location) %>%
#     case_when(method=="BG" ~ 0)
#   sample <- sample_n(new_df_gdd, 50)
#   coxph_sample <- coxph(formula = Surv(total_lived, censored) ~ photoperiod + daily_acc_gdd +
#     maxrh, data = sample)
# }
```