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title: "Supplemental material 1 - Processing GPS data and extracting environmental
variables"
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output: html_document
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```{r}

library(terra)
library(track2KBA)
library(ggplot2)
library(adehabitatLT)
library(lubridate)
library(dplyr)
library(EMbC)
library(patchwork)

library(sf)
library(sp)
library(magrittr)
library(reshape2)

library(matrixStats)

library(raster)
library(sf)
library(ncdf4)

```

# load and process GPS data

```{r}

raw tracking data

setwd("C:/GiantSuperModel/SGP Tracking/") # working directory

hpdf<-readRDS("Tracking Data/tracking_data_2021_2022_2023.Rds") # harmony point data
some birds are repeated in both season, so ID should consider that

hpdf$idY<-paste(hpdf$BirdId,hpdf$Season)

summary(as.factor(hpdf$Season))
summary(as.factor(hpdf$idY))

hpdf2<- hpdf[!duplicated(hpdf[, c("idY", "TS")]),]

epsg4326<-CRS("+init=epsg:4326")

epsg6329<-CRS("+proj=ortho +lat_0=-90 +lon_0=0")

spdf<-SpatialPointsDataFrame(hpdf2[4:5],hpdf2,proj4string = epsg4326)
spdfP<-spTransform(spdf,CRSobj = epsg6329)

```

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lt<-as.ltraj(xy=hpdf2[4:5],date=hpdf2$TS,id=hpdf2$idY,slsp = "remove",
 infolocs=hpdf2,typeII=T,proj4string = epsg6329)

rtd<-ld(lt)
head(rtd)
summary(rtd$abs.angle)
rtd$abs.dir<-((rtd$abs.angle*180)/max(na.omit(rtd$abs.angle)))+180
summary(rtd$abs.dir)

some issues with these trips below, let's eliminate them

#rtd<-subset(rtd, burst!="TT00672 22/23" & burst!="TT00692 22/23" &
burst!="V00629 22/23" & burst!="V00648 21/22" &
burst!="V00648 22/23" & burst!="V00649 22/23")

lets classify trips and also eliminate points in the colony using track2kba

tkd<-data.frame(track_id=rtd$burst,
 date_gmt=paste(year(rtd$date),month(rtd$date),day(rtd$date),sep="-"),
 time_gmt=paste(hour(rtd$date),minute(rtd$date),second(rtd$date),sep=":"),
 lon=rtd$x,lat=rtd$y,abs.dir=rtd$abs.dir)

dataGroup <- formatFields(
 dataGroup = tkd,
 fieldID = "track_id",
 fieldDate = "date_gmt",
 fieldTime = "time_gmt",
 fieldLon = "lon",
 fieldLat = "lat"
)

colony <- dataGroup %>%
 summarise(
 Longitude = (-59.196),
 Latitude = (-62.307)
)

trips <- tripSplit(
 dataGroup = dataGroup,
 colony = colony,
 innerBuff = 0.3, # kilometers
 returnBuff = 0.3,
 duration = 1, # hours
 rmNonTrip = TRUE
)

plot(trips)

mapTrips(trips = trips, colony = colony)

head(trips)
summary(trips$ColDist)

trips2 <- subset(trips, ColDist>500)

summary(trips2)
length(unique(trips2$tripID))

```

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length(unique(trips2$ID))
length(unique(trips2$date_gmt))

sumTrips <- tripSummary(trips = trips, colony = colony)

sumTrips

head(trips2)

summary(sumTrips)
summary(sumTrips$duration/24)

tdf<-merge(trips2,sumTrips,by=c("ID","tripID"))
head(tdf)
summary(tdf$DateTime)

#tdf<-subset(tdf,DateTime<'2022-06-06 00:00:00')

summary(tdf$total_dist)

length(unique(tdf$ID)) # 40 animals
length(unique(tdf$tripID)) # 172 trips

summary(tdf$DateTime)

df<-data.frame(tdf)

head(df)

...

use EMbC package to classify behavioral modes

```{r}
head(df)

em<-data.frame(timeStamp=df$DateTime,lon=df$Longitude,
               lat=df$Latitude,id=df$tripID,bursted=TRUE)

mybc<-stbc(em)

EMbC::stts(mybc) # behavioral states classification

expth<-data.frame(mybc@pth,mybc@X)

head(expth)

embc.out<-embc(mybc@X,U=mybc@U)
embc.out
stts(embc.out)

summary(as.factor(embc.out@A))/65890

expth$embc[embc.out@A=="1"]<-"LL"
expth$embc[embc.out@A=="2"]<-"LH"
expth$embc[embc.out@A=="3"]<-"HL"
expth$embc[embc.out@A=="4"]<-"HH"
expth$embc[embc.out@A=="5"]<-"NA"

summary(as.factor(expth$embc))/65890

```

```

expth$BehMode[expth$embc=="HH" | expth$embc=="HL" ] <-"Transit"
expth$BehMode[expth$embc=="LL"] <-"Foraging"
expth$BehMode[expth$embc=="LH"] <-"Scavenging/Resting"

(summary(as.factor(expth$BehMode))/65890)*100

exp<-data.frame(tripID=expth$id,speed.ms=expth$velocity..m.s.,
               turn=expth$turn..rad.,beh.state=expth$BehMode,
               Longitude=expth$lon, Latitude=expth$lat,
               DateTime=expth$dTm)

edf<-merge(df,exp,by=c("DateTime","tripID","Longitude","Latitude"))

## now lets calculate heading direction

lt<-as.ltraj(xy=edf[3:4],date=edf$DateTime,id=edf$ID,slsp = "remove",
            infolocs=edf,typeII=T,proj4string = epsg4326)

rtd<-ld(lt)
head(rtd)
summary(rtd$abs.angle)

edf$abs.dir<-((rtd$abs.angle*180)/max(na.omit(rtd$abs.angle)))+180
edf$dist<-rtd$dist # distance between consecutive points

summary(edf$abs.dir)

length(rtd$x)
length(df$X)
gc()

### wind timestamp is in hours, so:

edf$hourstamp<-as.POSIXct(strptime(paste(paste(year(edf$DateTime),
                                             month(edf$DateTime),
                                             day(edf$DateTime),

                                             sep="-"),
                                     paste(hour(edf$DateTime),c("00"),c("00"))),
                             format="%Y-%m-%d %H"))

### OBS: the date format needs to match the format of the Copernicus netcdf files!

head(edf)

# sea ice and CHL timestamps are in days

edf$daystamp<-as.POSIXct(strptime(paste(year(edf$DateTime),
                                         month(edf$DateTime),
                                         day(edf$DateTime),sep="-"),
                                 format="%Y-%m-%d", tz="GMT"))

### use this bounding box to download data from copernicus
(https://data.marine.copernicus.eu/):

```

```

summary(edf$Longitude)
summary(edf$Latitude)

summary(edf$DateTime)

# subset seasons and check time range to download data
dfS1<-subset(edf,DateTime<'2022-06-06 00:00:00') # 2021/22
dfS2<-subset(edf,DateTime>'2022-06-06 00:00:00') # 2022/23

summary(dfS1$DateTime)
summary(dfS2$DateTime)

...

# load, process and extract environemtnal variables into tracking data
# wind is matched by the hour, sea ice cover and chlorophyll by the day
# this can be time consuming depending on the capacity of your computer

```{r}

given the resolution of wind (in hours) two netcdf files needed to be
downloaded separately, one for each season. Each file has over 600mb! XO

----- eastward wind component -----

ncpath <- "C:/GiantSuperModel/WindUse/GiantsOnIce/Copernicus/"
ncname1 <- "cmems_obs-wind_glo_phy_nrt_l4_0.125deg_PT1H_1707309523210"
ncname2 <- "cmems_obs-wind_glo_phy_nrt_l4_0.125deg_PT1H_1707309891816"
ncfname1 <- paste(ncpath, ncname1, ".nc", sep="")
ncfname2 <- paste(ncpath, ncname2, ".nc", sep="")
dname <- "eastward_wind"
tmp_raster1 <- brick(ncfname1, varname=dname)
tmp_raster1 <- brick(ncfname2, varname=dname)
tmp_brick1 <- brick(ncfname1, varname=dname)
tmp_brick2 <- brick(ncfname2, varname=dname)

plot(tmp_brick1)

save each raster to a file, just in case
Loop through each layer (hour) in the brick
for (i in 1:nlayers(tmp_brick1)) {
 # Extract the raster for the current day
 tmp_raster1 <- tmp_brick1[[i]]

 # Save raster to file
 writeRaster(tmp_raster1, filename =
paste0("C:/GiantSuperModel/WindUse/WindNetCdfs/Ewind_output_hours_2021_22", i, ".tif"),
format = "GTiff", overwrite = TRUE)
}

for (i in 1:nlayers(tmp_brick2)) {
 # Extract the raster for the current day
 tmp_raster2 <- tmp_brick2[[i]]

 # Save raster to file
 writeRaster(tmp_raster2, filename =
paste0("C:/GiantSuperModel/WindUse/WindNetCdfs/Ewind_output_hours_2022_23", i, ".tif"),
format = "GTiff", overwrite = TRUE)
}

```



```
Convert the list to a data frame
result_EwindS1 <- data.frame(do.call(rbind, extracted_values))
summary(result_EwindS1$value)
write.csv(result_EwindS1,"result_EwindS1.csv")
```

```
for (i in 1:nrow(dfS2)) {
 # Extract the timestamp, lat, and lon for the current row
 current_timestamp <- dfS2$hourstamp[i]
 current_lat <- dfS2$Latitude[i]
 current_lon <- dfS2$Longitude[i]

 # Find the index where the timestamp matches
 timestamp_index <- which(as.character(tmp_brick2@z$`Date/time`) ==
as.character(current_timestamp))

 # Use the index to get the raster layer
 current_raster <- tmp_brick2[[timestamp_index]]

 # Create a SpatialPoints object
 spatial.point<-SpatialPoints(matrix(c(current_lon, current_lat), ncol = 2))

 # Extract the value at the specified coordinates, removing missing values
 extracted_value <- raster::extract(current_raster, spatial.point,
 method="bilinear",fun="mean")

 # Store the extracted value in the list
 extracted_values[[i]] <- c(timestamp = current_timestamp, value = extracted_value)
}

Convert the list to a data frame
result_EwindS2 <- data.frame(do.call(rbind, extracted_values))

#summary(as.numeric(result_EwindS1))

write.csv(result_EwindS2,"result_EwindS2.csv")
```

```

dfS2$Ewind<-result_EwindS2$value
summary(dfS2$Ewind)
summary(dfS1$Ewind)

if we got here without issues, I recommend saving the data we have so far, just in case
saveRDS(dfS1, "dfS1.Rds")
saveRDS(dfS2, "dfS2.Rds")

###-----Northward wind component-----

now the same stuff for the northward wind component X0

ncpath <- "C:/GiantSuperModel/WindUse/GiantsOnIce/Copernicus/"
ncname1 <- "cmems_obs-wind_glo_phy_nrt_l4_0.125deg_PT1H_1707309523210"
ncname2 <- "cmems_obs-wind_glo_phy_nrt_l4_0.125deg_PT1H_1707309891816"
ncfname1 <- paste(ncpath, ncname1, ".nc", sep="")
ncfname2 <- paste(ncpath, ncname2, ".nc", sep="")
dname <- "northward_wind"
tmp_raster1 <- brick(ncfname1, varname=dname)
tmp_raster1 <- brick(ncfname2, varname=dname)
tmp_brick1 <- brick(ncfname1, varname=dname)
tmp_brick2 <- brick(ncfname2, varname=dname)

plot(tmp_brick1)

save each raster to a file, just in case
Loop through each layer (hour) in the brick
for (i in 1:nlayers(tmp_brick1)) {
 # Extract the raster for the current day
 tmp_raster1 <- tmp_brick1[[i]]

 # Save raster to file
 writeRaster(tmp_raster1, filename =
paste0("C:/GiantSuperModel/WindUse/WindNetCdfs/Nwind_output_hours_2021_22", i, ".tif"),
format = "GTiff", overwrite = TRUE)
}

for (i in 1:nlayers(tmp_brick2)) {
 # Extract the raster for the current day
 tmp_raster2 <- tmp_brick2[[i]]

 # Save raster to file
 writeRaster(tmp_raster2, filename =
paste0("C:/GiantSuperModel/WindUse/WindNetCdfs/Nwind_output_hours_2022_23", i, ".tif"),
format = "GTiff", overwrite = TRUE)
}

#tmp_brick<-brick(tmp_brick1,tmp_brick2) # join the two bricks didnt work, so lets move
each season separately

extracted_values <- list()

extract data for season 2021/22

for (i in 1:nrow(dfS1)) {
 # Extract the timestamp, lat, and lon for the current row
 current_timestamp <- as.character(dfS1$hourstamp[i])
 current_lat <- dfS1$Latitude[i]
 current_lon <- dfS1$Longitude[i]

```





```
timestamp_index <- which(as.character(tmp_brick2@z$`Date/time`) ==
as.character(current_timestamp))

Use the index to get the raster layer
current_raster <- tmp_brick2[[timestamp_index]]

Create a SpatialPoints object
spatial.point<-SpatialPoints(matrix(c(current_lon, current_lat), ncol = 2))

Extract the value at the specified coordinates, removing missing values
extracted_value <- raster::extract(current_raster, spatial.point,
 method="bilinear", fun="mean")

Store the extracted value in the list
extracted_values[[i]] <- c(timestamp = current_timestamp, value = extracted_value)
}

wait a bit longer
) (
())
) (
) (
_____) _
.-'-----|
#(C |/\ /\ /\ /\ |\
'-./\ /\ /\ /\ |\
'_____|'
'-----'

Convert the list to a data frame
result_NwindS2 <- data.frame(do.call(rbind, extracted_values))
summary(result_NwindS2)
write.csv(result_NwindS2,"result_NwindS2.csv")

dfS2$Nwind<-result_NwindS2$value

dfS<-rbind(dfS1,dfS2)

calcualte wind speed

dfS$windspeed<-sqrt((dfS$Ewind*dfS$Ewind)+(dfS$Nwind*dfS$Nwind))

calcualte wind direction

dfS$wind.atan<-atan(dfS$Ewind/dfS$Nwind)
dfS$wind.dir<-((dfS$wind.atan*180)/1.58)+180

calculate tail and head winds

Convert wind direction to radians
dfS$wind_direction_rad <-dfS$wind.dir * (pi / 180)

Calculate tail and head winds in bird flight direction
dfS$taiL_wind <- cos(dfS$abs.dir) - cos(dfS$wind_direction_rad)*dfS$windspeed
dfS$head.tails<-ifelse(dfS$taiL_wind<0,"Head","Tail")

dfS$heaedtaliN<-sqrt(dfS$taiL_wind*dfS$taiL_wind)
```

```
now that we achieved illumination through suffering, we can move on
```

```
###-----sea ice-----
```

```
ncname <- "cmems_mod_glo_phy_anfc_0.083deg_P1D-m_1707308192914"
ncfname <- paste(ncpath, ncname, ".nc", sep="")
dname <- "siconc"
tmp_raster <- brick(ncfname, varname=dname)
tmp_brick <- brick(ncfname, varname=dname)
plot(tmp_brick)
```

```
Loop through each layer (hour) in the brick
for (i in 1:nlayers(tmp_brick)) {
 # Extract the raster for the current day
 tmp_raster <- tmp_brick[[i]]
```

```
 # Save raster to file
 writeRaster(tmp_raster, filename =
paste0("C:/GiantSuperModel/WindUse/SICNetCdfs/Siconc_output_days_", i, ".tif"), format =
"GTiff", overwrite = TRUE)
}
```

```
tmp_brick@z$`Date/time`
```

```
plot(tmp_brick)
```

```
extracted_values <- list()
```

```
for (i in 1:nrow(dfS)) {
 # Extract the timestamp, lat, and lon for the current row
 current_timestamp <- dfS$daystamp[i]
 current_lat <- dfS$Latitude[i]
 current_lon <- dfS$Longitude[i]
```

```
 # Find the index where the timestamp matches
 timestamp_index <- which(as.character(tmp_brick@z$`Date/time`) ==
as.character(current_timestamp))
```

```
 # Use the index to get the raster layer
 current_raster <- tmp_brick[[timestamp_index]]
```

```
 # Create a SpatialPoints object
 spatial.point<-SpatialPoints(matrix(c(current_lon, current_lat), ncol = 2))
```

```
 # Extract the value at the specified coordinates, removing missing values
 extracted_value <- raster::extract(current_raster, spatial.point,
 method="bilinear", fun="mean", na.rm=T)
```

```
 # Store the extracted value in the list
 extracted_values[[i]] <- c(timestamp = current_timestamp, value = extracted_value)
}
```

```
Convert the list to a data frame
result_SIC <-data.frame(do.call(rbind, extracted_values))
summary(result_SIC)
```

```

write.csv(result_SIC,"result_SIC.csv")

dfS$SIC<-result_SIC$value

-----Chlorophyll-a concentration -----

ncname <- "cmems_mod_glo_bgc-pft_anfc_0.25deg_P1D-m_1707308783337"
ncfname <- paste(ncpath, ncname, ".nc", sep="")
dname <- "chl"
tmp_raster <- brick(ncfname, varname=dname)
tmp_brick <- brick(ncfname, varname=dname)
plot(tmp_brick)

Loop through each layer (hour) in the brick
for (i in 1:nlayers(tmp_brick)) {
 # Extract the raster for the current day
 tmp_raster <- tmp_brick[[i]]

 # Save raster to file
 writeRaster(tmp_raster, filename =
paste0("C:/GiantSuperModel/WindUse/CHLNetCdfs/CHL_output_days_", i, ".tif"), format =
"GTiff", overwrite = TRUE)
}

extracted_values <- list()

for (i in 1:nrow(dfS)) {
 # Extract the timestamp, lat, and lon for the current row
 current_timestamp <- dfS$daystamp[i]
 current_lat <- dfS$Latitude[i]
 current_lon <- dfS$Longitude[i]

 # Find the index where the timestamp matches
 timestamp_index <- which(as.character(tmp_brick@z$`Date/time`) ==
as.character(current_timestamp))

 # Use the index to get the raster layer
 current_raster <- tmp_brick[[timestamp_index]]

 # Create a SpatialPoints object
 spatial.point<-SpatialPoints(matrix(c(current_lon, current_lat), ncol = 2))

 # Extract the value at the specified coordinates, removing missing values
 extracted_value <- raster::extract(current_raster, spatial.point,
method="bilinear", fun="mean", na.rm=T)

 # Store the extracted value in the list
 extracted_values[[i]] <- c(timestamp = current_timestamp, value = extracted_value)
}

Convert the list to a data frame
result_CHL <-data.frame(do.call(rbind, extracted_values))
summary(result_CHL)
write.csv(result_CHL,"result_CHL.csv")

dfS$CHL<-result_CHL$value

```

```

write.csv(dfS,"C:/GiantSuperModel/WindUse/tracking_data_filtered.csv")

we finally have the data to start the analysis!

some last editing and it's done

dfS$Trip<-stringr::str_sub(dfS$tripID,-2,-1) # Trip number from trip ID

dfS$Ring<-substring(dfS$ID,first=1,last=6) # ring number from trip ID

head(dfS)

saveRDS(dfS,"C:/GiantSuperModel/WindUse/GiantsOnIce/GiantPetrels_processed_trips.Rds")

next code is for figure 2:

head(sumTrips)
sumTrips$days<-as.numeric(sumTrips$return-sumTrips$departure)/24

ggplot(subset(df,DateTime<'2022-06-06 00:00:00'),
 aes(DateTime,ColdDist/1000,colour=ID))+geom_line(linewidth=1,alpha=0.5)+
 theme_bw()+ylab("Straight line distance from colony (km)")+

 ggplot(subset(df,DateTime>'2022-06-06 00:00:00'),
 aes(DateTime,ColdDist/1000,colour=ID))+geom_line(linewidth=1,alpha=0.5)+
 theme_bw()+ylab("Straight line distance from colony (km)")+

ggplot(subset(sumTrips,departure<'2022-06-06 00:00:00'),
 aes(direction,total_dist+1/1000,colour=days,size=days))+geom_point()+
 scale_y_log10(limits=c(1,10000))+theme_bw()+
 scale_colour_distiller(palette="Spectral",name="Duration (days)")+
 coord_polar()+
 scale_x_continuous(limits=c(0, 360),breaks = c(0,90,180,270))+
 theme_bw()+ylab("Total trip distance (km)")+

ggplot(subset(sumTrips,departure>'2022-06-06 00:00:00'),
 aes(direction,total_dist+1/1000,colour=days,size=days))+geom_point()+
 scale_y_log10(limits=c(1,10000))+theme_bw()+
 scale_colour_distiller(palette="Spectral",name="Duration (days)")+
 coord_polar()+
 scale_x_continuous(limits=c(0, 360),breaks = c(0,90,180,270))+
 theme_bw()+ylab("Total trip distance (km)")

...

```