# EBM Nature Communications main script

# Kirstin Holsman

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# Data and code are under review and subject to change. Do not use without permission from lead author: kirstin.holsman@noaa.gov

Kirstin Holsman

kirstin.holsman@noaa.gov

Alaska Fisheries Science Center, National Marine Fisheries Service, NOAA, 7600 Sand Point Way N.E., Bld. 4, Seattle, Washington 98115

Code used to generate intermediate and final data for Holsman et al. in review Nature Communications paper

# Input data:

#### Option 1: Re-generate final data for plots

If running plotting code below (recommended) you will need to download the final data "EBM\_ceattlenew.Rdata" from figshare and place it in the main directory: "EBM\_Holsman\_NatComm/EBM\_ceattlenew.Rdata".

• access EBM\_ceattlenew.Rdata here: https://figshare.com/s/6dea7722df39e07d79f0 and place it in the directory: EBM\_Holsman\_NatComm/EBM\_ceattlenew.Rdata. (Data DOI:10.6084/m9.figshare. 11864505)

# Option 2: Re-running the intermediate data (not recommended)

If re-running the intermediate data analysis (not recommended) the following files will need to be downloaded unzipped and placed in the assessment\_files folder:

- access aclim\_00\_JunV2\_2019\_2.zip here: https://figshare.com/s/3a1aaa86837b79d6aa07 and place it in the EBM\_Holsman\_NatComm/data/runs/aclim\_00\_JunV2\_2019\_2.zip and unzip. (Data DOI: 10.6084/m9.figshare.11864586)
- access aclim\_00\_JunV2\_2019\_0.zip here: https://figshare.com/s/d9c35dbe0880f4169041 and place it in the EBM\_Holsman\_NatComm/data/runs/aclim\_00\_JunV2\_2019\_0.zip and unzip (Data DOI:  $10.6084/\mathrm{m}9.\mathrm{figshare}.11864577)$

# Intermediate data:

Intermediate data can be found in the main EBM\_Holsman\_NatComm in the form of .Rdata files but can be recreated (although this is not recommended; see below) from the ADMB model using the EBM\_Holsman\_NatComm/assessment\_scripts/README\_EBM\_Holsman\_Analysis.pdf.

# Figures and tables:

Final figures and tables (including illustrator files that were used to add fish icons) can be found in the **Figures** folder.

This is the main script for running analysis and plotting results and requires R version 3.5.3 (available at https://cran.r-project.org/bin/macosx/el-capitan/base/). To update the analysis using .Rdata outputs run the R() code below as is currently configured. If you want to update the intermediate data, set "readdat" to TRUE in line 80 below. The CEATTLE stock assessment is also included but requires AD Model builder (http://www.admb-project.org). To run the assessment scripts (not recommended or tested outside of macOSX) see "README\_EBM\_Holsman\_Analysis.pdf".

### EMB\_paper.R script:

```
## plotting code for EBM paper
## Kirstin Holsman
## Feb 2020
## Kirstin.holsman@noaa.gov
## -----
# 1. Set up
# 2. load data
# 3. make figures
   rm(list=ls())
   graphics.off()
 # 1. SET THINGS UP
  #-----
  # library(RmarineHeatWaves)
  # library(plyr)
   if(!require(dplyr)){ install.packages(dplyr)}else{library(dplyr)}
   if(!require(ggplot2)){ install.packages(ggplot2)}else{library(ggplot2)}
   if(!require(svMisc)){ install.packages(svMisc)}else{library(svMisc)}
   if(!require(quantmod)){ install.packages(quantmod)}else{library(quantmod)}
   main <- path.expand("~/GitHub_new/EBM_Holsman_NatComm/")</pre>
   setwd(main)
   update.figs
                  <- FALSE
   fldr
                  <- "aclim_00_JunV2_2019" # folder with the CEATTLE assessment runs
   UpdateMCMC
                  <- 1
                            # update MCMC?
   readdat
                  <- FALSE # re-read in new data?
                  <- TRUE
                            # print updates
   status
```

```
<- 150
   update.simlist <- FALSE # only TRUE when re-running enitre CEATTLE fitting
   getnm<-function(nm=mclist0[1]){</pre>
     nmi<-strsplit(nm,split=paste0("Summary_proj_",fldr))[[1]][2]</pre>
     nmi<-strsplit(nmi,split="_mc")[[1]][1]</pre>
     return(paste0("dat",nmi,"_mc"))
   }
  # 2. LOAD DATA
    source("FUN_GG_EBM_paper.R")
   source("FUN_EBM_paper.R")
   if(readdat==FALSE){
      if(!any(dir()%in%"EBM_ceattlenew.Rdata"))
        stop("EBM_ceattlenew.Rdata file not found, please go to
          https://figshare.com/s/6dea7722df39e07d79f0
          and download file into EBM_Holsman_NatComm/EBM_ceattlenew.Rdata")
        #download.file("https://figshare.com/s/6dea7722df39e07d79f0",destfile="EBM_ceattlenew.Rdata")
     load("EBM ceattlenew.Rdata")
        source("SUB_EBM_paper.R")
        save.image(file = "EBM_ceattlenew.Rdata")
   }
                    <- c("10% decline", "50% decline", "80% decline")
   riskTypes
                    <- list("no cap" = risk12,"2 MT cap" = risk13)
   RISK
   timeF
                   <- levels(risk12$timeframe)</pre>
                    <- dir("data/runs",paste0(fldr,"_0"))
   flList
                    <- c("no cap"="_219_CENaivecf_2_5_12","2MT cap"="_2MT_219_CENaivecf1_2_5_13")</pre>
   txt
                    <- (paste0("data/runs/",fldr,"_2/projections/",fldr,txt,"/",fldr,txt,".ctl")) # KE
   fldin
                    <- rbind(
   target_B_2
                          getBtarget(fldrIN=fldin[1],nm="B0_set"),
                          getBtarget(fldrIN=fldin[2],nm="B0_set"))
   rownames(target_B_2) <- names(txt)</pre>
                     <- c("no cap"="_019_CENaivecf_0_5_12","2MT cap"="_2MT_019_CENaivecf1_0_5_13")</pre>
   txt
   fldin
                     <- (paste0("data/runs/",fldr,"_0/projections/",fldr,txt,"/",fldr,txt,".ctl")) # K
   target_B_0
                     <- rbind(
                          getBtarget(fldrIN=fldin[1],nm="B0_set"),
                          getBtarget(fldrIN=fldin[2],nm="B0_set"))
   rownames(target_B_0)<-names(txt)</pre>
# set the color scheme
                     <- c(colors()[320],col2(6)[c(2,3,4)],col3(6)[c(3,4,6)])
   coll_use
```

```
# set up some plotting labels
                        <- grep("A1B", simnames)
   A1B_n_sim
                        <- grep("bio", simnames)
   bio n sim
                        <- grep("rcp45", simnames)
   rcp45 n sim
                        <- grep("rcp85", simnames)
   rcp85_n_sim
                        <- setdiff(rcp85_n_sim,bio_n_sim)</pre>
   rcp85NoBio n sim
   meanhistT
                        <- mean(TempC_219_CENaivecf_2_5_12_mc[s,,,1][1,][hind_yrs])</pre>
    # get target biomass from ctl files:
    cumlyr <- function(x,sumyr=3){</pre>
      x<-as.numeric(x)
     x2<-x*0
      for(i in sumyr:length(x)){
        x2[i] < -ifelse(sum(x[i-(1:sumyr)+1]) = -sumyr,1,0)
     return(x2==1)
   }
# plot cumulative years above threshold:
   plot_figS6<-function(){</pre>
      dev.new(height=3.25*1.3, width=4.5*1.3)
     head(TempC_019_CENaivecf_0_5_3_mc[1,1,,])
                    <- TempC 019 CENaivecf 0 5 3 mc[1,1,,]>2.16
      tt1
                    <- apply(above,2,cumlyr,sumyr=5)</pre>
      tt
                    <- apply(tt1,2,cumsum)/length(above[,1])
                    <- as.numeric(rownames(above))
     yrs2
                    <- function(x,thrsh=.25,yrsIN=yrs2){</pre>
      findthrsh
       yrsIN[as.numeric(x)>thrsh][1]
     }
                    <- apply(tt,2,findthrsh)
     vrt
      plot(yrs2,tt)
     yrt[rcp85NoBio_n-1]
     yrt[rcp45_n-1]
                    <- length(c(rcp45_n,rcp85NoBio_n))
      nscen
     plot(yrs2,tt[,2],vlim=c(0,nscen*1.2),xlim=c(1965,2100),type="1",col=NA,axes=F,ylab="",xlab="")
     firstY<-rep(2017,nscen);names(firstY)<-colnames(tt1)[c(rcp45_n,rcp85NoBio_n)-1]</pre>
      for(i in 1:nscen){
                        <- (c(rcp45_n,rcp85NoBio_n)-1)[i]
        CC
                        <- NA*tt1[,cc]
        11
        ll[tt1[,cc]]
                        <- i
        subv
                        <- yrs2[tt1[,cc]]
        if(any(suby>2017))
                      <- suby[suby>2017][1]
          firstY[i]
        points(yrs2,11,pch=16,cex=1.5,col=makeTransparent((wes(6))[i],alpha=250))
   }
   text(rep(1980,nscen),1:nscen,colnames(tt1)[c(rcp45_n,rcp85NoBio_n)-1],cex=.8,col=(wes(6))[1:nscen])
   mean(firstY[1:3],na.rm=T)
```

```
mean(firstY[4:6],na.rm=T)
# 3. Final figures:
#----
#fig 2: temperature
  graphics.off()
     GGplot_aclimTS(dat=allDat,h=2*1.3,w=4.75*1.3,
       ylabb=expression(paste("Bottom temperature",'('^{o},"C)")),
       ltyy=c("solid",rep("solid",6)),
       subtitle face="plain",
       plotSet=list(c(1,rcp45_n),c(1,rcp85NoBio_n)),
       coll=coll_use,tline=2,talpha=.5,
       xlabb="",lgnpos= "right",plot_marginIN=c(-10,-1,-10,1))
   if(update.figs) ggsave(file=paste0("Figures/Fig2.tiff"), device = "tiff",
     scale = 1, width = NA, height = NA, units = "in",
     dpi = dpiIN)
#fig 3: delta B
    # 50% quantiles
 graphics.off()
     GGplot aclimCEATTLE delta(h=4.75*1.3, w=4.75*1.3,
       nmLIST = list("SSB0"="dat_219_CENaivecf_2_5_12","SSB0"="dat_219_CENaivecf_2_5_12"),
       datLIST = list(dat1=B0_219_CENaivecf_2_5_12_mc,dat2=B0_219_CENaivecf_2_5_12_mc),
       valLIST = list(valIn1="SSBO_total_biom", valIn2="SSBO_total_biom"),
       prob= c(.01,.50,.9),plot_marginIN=c(-15,5,-10,5),alpha=c(10,5),lgnpos= "bottom",coll=coll_use)
 if(update.figs) ggsave(file=paste0("Figures/Fig3.tiff"), device = "tiff",
     scale = 1, width = NA, height = NA, units = "in",
     dpi = dpiIN)
#fig 4: delta C
    # 50% quantiles
 graphics.off()
     GGplot aclimCEATTLE delta(deltaIN=TRUE, h=4.75*1.3, w=4.75*1.3, ydiv=1,
       ylimm_up=c(100,100,100), ylimm_dwn=c(-200,-200,-200),
       plot_marginIN=c(-15,5,-10,5), alpha=c(0,0), lwdd=c(.7,.3), plotpersist = FALSE,
       coll = coll use,
       ylabb = expression(paste(Delta, "Catch (%)")),
       xlimmIN = c(2010, 2100),
       nmLIST = list("2 MT cap"="dat_2MT_219_CENaivecf1_2_5_13","no cap"="dat_219_CENaivecf_2_5_12"),
       valLIST = list(valIn1="Catch_total_biom", valIn2="Catch_total_biom"),
       datLIST = list(dat1=B_219_CENaivecf_2_5_12_mc,dat2=B_219_CENaivecf_2_5_12_mc),
       lgnpos= "bottom",scalesIN="fixed")
 if(update.figs) ggsave(file=paste0("Figures/Fig4.tiff"), device = "tiff",
     scale = 1, width = NA, height = NA, units = "in",
```

```
dpi = dpiIN)
  #fiq 5: risk
  graphics.off()
      GGplot_aclimCEATTLE_risk(h=2*1.3,w=4*1.3,coll= c(col2(6)),sp=1,colvar="type",rowvar="sp",alpha=c(
        plot_marginIN=c(-15,0,-10,5),mode="MSM",lwdd=c(.7,.4,.4),rcpIN=c("RCP 8.5"="rcp85"),
        nrowlg = c(1,1), pchh=c(16,15),
        lgnpos= "bottom",RISKTYPES = riskTypes[c(1,2,3)],ltyy=c("solid","solid","solid"))
        grid.force()
        # change shape of arrows
        grid.gedit("segments", gp=gpar(linejoin ='mitre'))
        # change the shape in legend also
        grid.gedit("layout", gp=gpar(linejoin ='mitre'))
  if(update.figs) ggsave(file=paste0("Figures/Fig5.tiff"), device = "tiff",
      scale = 1, width = NA, height = NA, units = "in",
      dpi = dpiIN)
  #fiq 6: Threshold
dev.new(height=4.75*1.3, width=4.5*1.3)
PLOT_THRESHOLD2(
  multIN=10,
 firstdiff=T,
 ntemps=3,
  ylimmIN =c(-1,1.5),
  xlimmIN = c(1,7),
  trndln = "white",
  trndln2 = Ornjazz[3],
  tipping = Ornjazz[5],
  sizeIN=c(0.1,.3,.75,2))
 if(update.figs) ggsave(file=paste0("Figures/Fig6.tiff"), device = "tiff",
      scale = 1, width = NA, height = NA, units = "in",
      dpi = dpiIN)
# Fig S1: HCR
  graphics.off()
  GG_HCRplot(h=3.5,w=8,futScen="GFDL_rcp45",fontSize=3,yfont=c(2070,2073))
 if(update.figs) ggsave(file=paste0("Figures/FigS1.tiff"), device = "tiff",
      scale = 1, width = NA, height = NA, units = "in",
      dpi = dpiIN)
# Fig S2: SSB with and without cap
      GGplot_aclimCEATTLE_delta(deltaIN=F,h=4.75*1.3,w=4.75*1.3,ydiv=1e6,
        plot_marginIN=c(-15,5,-10,5), alpha=c(0,0), lwdd=c(.7,.3),
```

```
ylabb = "Spawning biomass (million tons)",
        nmLIST = list("2 MT cap"="dat_2MT_219_CENaivecf1_2_5_13", "no cap"="dat_219_CENaivecf_2_5_12"),
        valLIST = list(valIn1="SSB_total_biom", valIn2="SSB_total_biom"),
        datLIST = list(dat1=B_219_CENaivecf_2_5_12_mc,dat2=B_219_CENaivecf_2_5_12_mc),
        lgnpos= "bottom",scalesIN="free_y")
  if(update.figs) ggsave(file=paste0("Figures/FigS2.tiff"), device = "tiff",
      scale = 1, width = NA, height = NA, units = "in",
      dpi = dpiIN)
# Fig S3: effective F
  graphics.off()
  dev.new(height=3.5, weight=5)
  plot_Feffective()
 if(update.figs) ggsave(file=paste0("Figures/FigS3.tiff"), device = "tiff",
      scale = 1, width = NA, height = NA, units = "in",
      dpi = dpiIN)
# Fig S4: risk plot
    graphics.off()
      GGplot_aclimCEATTLE_risk(h=4.75*1.3,w=3.2*1.3,coll= c(col2(6)),colvar="type",rowvar="sp",alpha=c(
        plot_marginIN=c(-15,5,-10,5),mode="MSM",lwdd=c(.7,.4,.4),rcpIN=c("RCP 8.5"="rcp85"),pchh=c(16,1
        lgnpos= "bottom",RISKTYPES = riskTypes[c(1,3)],ltyy=c("solid","solid"))
        grid.force()
        # change shape of arrows
        grid.gedit("segments", gp=gpar(linejoin ='mitre'))
        # change the shape in legend also
        grid.gedit("layout", gp=gpar(linejoin ='mitre'))
if(update.figs) ggsave(file=paste0("Figures/FigS4.tiff"), device = "tiff",
      scale = 1, width = NA, height = NA, units = "in",
      dpi = dpiIN)
# Fig S5: threshold 1
graphics.off()
dev.new(height=3*1.3, width=4.75*1.3)
PLOT THRESHOLD (
  dataIN_1=tmpall12_1,
  dataIN_2=tmpall12_2,
  dataIN_3=tmpall12_3,
  firstdiff=F,
  ntemps=3,
  multIN=10,
  #ylimmIN = c(-1.5, 1.5),
  \#xlimmIN = c(.5,7),
```