Analysis of octopus behavior from motion-activated camera trap data

Jefferson Humbert and Kirt L Onthank

11/4/2021

Contents

1	Loa	aing r	equired libraries for the analysis	2	
2	Rea	ding i	n data and cleaning it up	9	
	2.1	Fixing	g times	9	
3	Der	ı Use 1	Dynamics	3	
	3.1	Visita	tion and excursion durations	:	
		3.1.1	Extracting visitation durations	4	
		3.1.2	Adding Day/Night to the visitation data based on sunrise and sunset times	6	
		3.1.3	Adding day night and probabilities to each entry in the event log	7	
	3.2	Day v	ersus Night Analysis	7	
		3.2.1	octopus departures: day vs night	7	
		3.2.2	octopus den fortification: day vs. night	8	
		3.2.3	octopus periscope: day vs night	8	
		3.2.4	octopus bottle enter and exit: day vs night	ć	
		3.2.5	Time histogram figure	ę	
4	Conspecific interactions				
	4.1	Reside	ent/Non-resident interaction	11	
		4.1.1	Finding times when resident octopuses are present and absent	11	
		4.1.2	non-resident octopus visit duration and frequency when resident octopuses are absent versus present	14	
		4.1.3	Non-resident octopus frequency chi-square analysis	16	
		4.1.4	Non-resident octopus visit duration T-test		
		4.1.5	Frequency of Bottle reaching		

5	Inte	erspecific Interaction Analysis	19		
	5.1	Finding times when octopuses are present or absent			
5.2 Kelp Greenling Analysis		Kelp Greenling Analysis	22		
		5.2.1 Kelp Greenling visitation frequency with octopuses absent vs. present	22		
		5.2.2 Kelp greenling visitation duration when octopuses are absent versus present	23		
	5.3	Lingcod Analysis	27		
		5.3.1 Lingcod visitation frequency with octopuses absent vs. present	27		
		5.3.2 lingcod visitation duration when octopuses are absent versus present	28		
	5.4	Rockfish Analysis	32		
		5.4.1 rockfish visitation duration when octopuses are absent versus present	32		
	5.5	Red Rock Crab Analysis	35		
		5.5.1 crab visitation duration when octopuses are absent versus present	35		
6	Plo	tting intraspecific and conspecific octopus interactions	39		
7	Are you more likely to encounter an octopus in the frame at a random time at night or during the day?				
8	Free	Frequency of periscoping and fortifying when 1 octopus is present versus multiple			
	8.1	Probabilities of 1 versus $>$ 1 octopus present	45		
	8.2	Finding number of fortify events with 1 octopus present versus more than $1 \ldots \ldots \ldots$	45		
	8.3	Finding number of periscope events with 1 octopus present versus more than 1 $\dots \dots$	46		

1 Loading required libraries for the analysis

Included in these packages is a custom package that Kirt Onthank authored for easily plotting circular time histograms titled "CircularTimeHistogram". This can be installed from github. The code for installing that package is in this chunk.

```
library(remotes)
#install_github("KirtOnthank/CircularTimeHistogram")
library(CircularTimeHistogram)
library(googlesheets4)
library(googledrive)
library(lubridate)
library(maptools)
library(circular)
library(plotrix)
library(perm)
library(vcd)
library(corrplot)
library(png)
```

2 Reading in data and cleaning it up

Cleaning out unfilled rows.

```
events=events[complete.cases(events$Date),]
events=events[complete.cases(events$Behavior),]
```

Reformatting time to POSIX class to make it easier to calculate times. There seems to be two different formats for dates used in the dataset, so I run this command twice.

2.1 Fixing times

Some of the cameras had the incorrect time onboard, so timestamps on the pictures are incorrect. We fix this by using the onset daylight and dark, along with the calculated sunrise and sunset at these locations to correct the times of these deployments.

3 Den Use Dynamics

3.1 Visitation and excursion durations

First we extract data for how long octopuses visited the bottles, and how long they left when they left the bottles and camera field of view ### Making the visitation dataframe First we make datasets that can store

all of that data. This include dataframes for two subsequent arrivals (badarrival) or departures (baddepar) of the same octopus.

```
visit=data.frame(deployment=as.numeric(NA),
           octoID=as.character(NA),
           time=as.POSIXct(NA),
           duration=as.numeric(NA))
excursion=data.frame(deployment=as.numeric(NA),
           octoID=as.character(NA),
           time=as.POSIXct(NA),
           duration=as.numeric(NA))
badarrival=data.frame(deployment=as.numeric(NA),
           octoID=as.character(NA),
           time1=as.POSIXct(NA),
           time2=as.POSIXct(NA),
           duration=as.numeric(NA))
baddepar=data.frame(deployment=as.numeric(NA),
           octoID=as.character(NA),
           time1=as.POSIXct(NA),
           time2=as.POSIXct(NA),
           duration=as.numeric(NA))
```

3.1.1 Extracting visitation durations

Next, we fill those datasets by finding arrivals followed by departures for visitations, and take the duration, or departures followed by arrivals for excursions and take those durations.

```
deployments=unique(events$`Deployment #`)
for (i in 1:length(deployments)){
  arrivals=events$realtime[events$Species=="octopus_rubescens"&
                    events$Event type=="resident non-interaction"&
                    events$Behavior=="frame arrival"&
                    events$`Deployment #`==deployments[i]]
  arrivals.ID=events$OctoID[events$Species=="octopus_rubescens"&
                    events$Event type=="resident non-interaction"&
                    events$Behavior=="frame_arrival"&
                    events$`Deployment #`==deployments[i]]
  departures=events$realtime[events$Species=="octopus_rubescens"&
                    events$Event_type=="resident non-interaction"&
                    events$Behavior=="frame_departure"&
                    events$`Deployment #`==deployments[i]]
  departures.ID=events$OctoID[events$Species=="octopus_rubescens"&
                    events$Event_type=="resident non-interaction"&
                    events$Behavior=="frame departure"&
                    events$`Deployment #`==deployments[i]]
```

```
depar.tags=c(rep("arrive",length(arrivals)),rep("depart",length(departures)))
deploy.sub=data.frame(time=c(arrivals,departures),octoID=c(arrivals.ID,departures.ID),
                                       type=depar.tags)
deploy.sub=deploy.sub[order(deploy.sub$time),]
octos.present=unique(deploy.sub$octoID)
for (j in 1:length(octos.present)){
   if(sum(deploy.sub$octoID==octos.present[j],na.rm=T)>1){
       deploy.single.octo=
          deploy.sub[deploy.sub$octoID==octos.present[j],] #selecting only one octopus at a time
       #Finding which arrivals are immediately followed by a departure
       \label{thm:conto}  \mbox{visit.depar=which(deploy.single.octo\$type[1:(nrow(deploy.single.octo)-1)]=="arrive"\& linear contower for the contow
                                          deploy.single.octo$type[2:nrow(deploy.single.octo)] == "depart")
       visit.dura=difftime(deploy.single.octo$time[visit.depar+1],
                                          deploy.single.octo$time[visit.depar],units = "min")
       visit.stub=data.frame(deployment=rep(deployments[i],length(visit.dura)),
                          octoID=rep(octos.present[j],length(visit.dura)),
                          time=deploy.single.octo$time[visit.depar],
                          duration=as.numeric(visit.dura))
       visit=rbind(visit, visit.stub)
       # Finding which departures are immediately followed by an arrival
       excur.depar=which(deploy.single.octo$type[1:(nrow(deploy.single.octo)-1)]=="depart"&
                                          deploy.single.octo$type[2:nrow(deploy.single.octo)] == "arrive")
       excur.dura=difftime(deploy.single.octo$time[excur.depar+1],
                                          deploy.single.octo$time[excur.depar],units = "min")
       excur.stub=data.frame(deployment=rep(deployments[i],length(excur.dura)),
                          octoID=rep(octos.present[j],length(excur.dura)),
                          time=deploy.single.octo$time[excur.depar],
                          duration=as.numeric(excur.dura))
       excursion=rbind(excursion,excur.stub)
       # Finding arrivals followed immediately by another arrival
       #(This should not be possible, so this is error locating)
       badarrival.depar=which(deploy.single.octo$type[1:(nrow(deploy.single.octo)-1)]=="arrive"&
                                                   deploy.single.octo$type[2:nrow(deploy.single.octo)] == "arrive")
       badarrival.dura=difftime(deploy.single.octo$time[badarrival.depar+1],
                                                   deploy.single.octo$time[badarrival.depar],units = "min")
       badarrival.stub=data.frame(deployment=rep(deployments[i],length(badarrival.dura)),
                          octoID=rep(octos.present[j],length(badarrival.dura)),
                          time1=deploy.single.octo$time[badarrival.depar],
                          time2=deploy.single.octo$time[badarrival.depar+1],
                          duration=as.numeric(badarrival.dura))
       badarrival=rbind(badarrival,badarrival.stub)
       baddepar.depar=which(deploy.single.octo$type[1:(nrow(deploy.single.octo)-1)]=="depart"&
                                               deploy.single.octo$type[2:nrow(deploy.single.octo)] == "depart")
       baddepar.dura=difftime(deploy.single.octo$time[baddepar.depar+1],
                                               deploy.single.octo$time[baddepar.depar],units = "min")
       baddepar.stub=data.frame(deployment=rep(deployments[i],length(baddepar.dura)),
```

```
octoID=rep(octos.present[j],length(baddepar.dura)),
    time1=deploy.single.octo$time[baddepar.depar],
    time2=deploy.single.octo$time[baddepar.depar+1],
    duration=as.numeric(baddepar.dura))
    baddepar=rbind(baddepar,baddepar.stub)

}

visit=visit[complete.cases(visit),]
excursion=excursion[complete.cases(excursion),]
```

3.1.2 Adding Day/Night to the visitation data based on sunrise and sunset times.

We also want to look at the differences is how octopuses are behaving between night and day. Therefore, we added if each visitation or excursion occurred during the night or the day. We defined visitations or excursions as happening during the day if they began anytime between sunrise and sunset and determined for the specific day it occurred and at the specific location of Driftwood Park using the sunriset() function in the maptools package. Night, therefore, was defined as any occurring between sunset and sunrise.

```
driftwood=matrix(c(-122.6396394,48.1639127), nrow=1)
bay=SpatialPoints(driftwood, proj4string=CRS("+proj=longlat +datum=WGS84"))
visit$daynight="night"
excursion$daynight="night"
visit$day_expected=0
excursion$day_expected=0
for (i in 1:nrow(visit)){
  sunrise=sunriset(bay, as.POSIXct(visit$time[i]), direction="sunrise", POSIXct.out=TRUE)$time
  sunset=sunriset(bay, as.POSIXct(visit$time[i]), direction="sunset", POSIXct.out=TRUE)$time
  if (visit$time[i]>sunrise&visit$time[i]<sunset) {</pre>
    visit$daynight[i]="day"
  visit$day_expected[i]=as.numeric(difftime(sunset,sunrise,units="hours"))/24
for (i in 1:nrow(excursion)){
  sunrise=sunriset(bay, as.POSIXct(excursion$time[i]), direction="sunrise", POSIXct.out=TRUE)$time
  sunset=sunriset(bay, as.POSIXct(excursion$time[i]), direction="sunset", POSIXct.out=TRUE)$time
  if (excursion$time[i]>sunrise&excursion$time[i]<sunset) {</pre>
    excursion$daynight[i]="day"
  }
  excursion$day_expected[i]=as.numeric(difftime(sunset,sunrise,units="hours"))/24
}
```

What was the mean visitation duration?

```
mean(visit$duration)
```

```
## [1] 264.5949
```

What was the mean excursion duration?

```
mean(excursion$duration)
```

```
## [1] 3.022222
```

3.1.3 Adding day night and probabilities to each entry in the event log

Next, we add day or night categories for each event based on when it occurred. Finally, for statistical analysis we need to find the expected probability of events occurring during the day or night. Because the periods of night and day are not equal length, we would not expect an equal distribution of randomly occuring events between night and day. Therefore, for each event recorded in the event log we are calculating the likelihood of that event happening during the day be calculating the proportion of the daylight hours (from sunrise to sunset) of a whole 24 hour period. Again, this is calculated for the specific location of Driftwood Park and for the specific day on which the event occurred.

```
events$daynight="night"
events$day_expected=0

for (i in 1:nrow(events)){
   sunrise=sunriset(bay, as.POSIXct(events$realtime[i]), direction="sunrise", POSIXct.out=TRUE)$time
   sunset=sunriset(bay, as.POSIXct(events$realtime[i]), direction="sunset", POSIXct.out=TRUE)$time
   if (events$realtime[i]>sunrise&events$realtime[i]<sunset) {
      events$daynight[i]="day"
   }
   events$day_expected[i]=as.numeric(difftime(sunset,sunrise,units="hours"))/24
}</pre>
```

3.2 Day versus Night Analysis

3.2.1 octopus departures: day vs night

We first looked at octopus departures from the frame. We decided that frame departures was a good proxy for activity, as this represents either a resident leaving their "home" bottle den, or a non-resident coming and going.

```
##
## Chi-squared test for given probabilities
```

```
##
## data: depart.daynight
## X-squared = 6.0401, df = 1, p-value = 0.01398
```

3.2.2 octopus den fortification: day vs. night

Next, we looked at fortification behavior in the day versus in the night. Fortification is when an octopus pulls material over the entrance of their end, effectively closing themselves inside.

3.2.3 octopus periscope: day vs night

data: periscope.daynight

X-squared = 9.2429, df = 1, p-value = 0.002364

Periscoping is when an octopus reaches it's eyes outside of the den, but leaves it's arms and body inside.

3.2.4 octopus bottle enter and exit: day vs night

Another good proxy we thought for general octopus activity would be entering or exiting the bottle den. So, we are also looking at that between day and night to see if there is a difference in frequency.

```
enterexit.daynight=as.numeric(table(events$daynight[events$Behavior=="enter_bottle"&
                                                      events$Species=="octopus_rubescens"|
                                                      events$Behavior=="exit_bottle"&
                                                      events$Species=="octopus_rubescens"]))
enterexit.probs=c(
mean(events$day_expected[events$Behavior=="enter_bottle"&
                           events$Species=="octopus_rubescens"|
                           events$Behavior=="exit_bottle"&
                           events$Species=="octopus rubescens"]),
1-mean(events$day_expected[events$Behavior=="enter_bottle"&
                             events$Species=="octopus_rubescens"|
                             events$Behavior=="exit_bottle"&
                             events$Species=="octopus rubescens"])
)
enterexit.chi=chisq.test(enterexit.daynight,p=enterexit.probs)
enterexit.chi
##
   Chi-squared test for given probabilities
##
## data: enterexit.daynight
## X-squared = 4.6117, df = 1, p-value = 0.03176
```

3.2.5 Time histogram figure

```
moon=readPNG("moon.png")
sun=readPNG("sun.png")
svg(filename="Figure2.svg")
par(fig=c(0,0.5,0.5,1))
DayHist(events$realtime[events$Species=="octopus_rubescens"&
                          events$Behavior=="fortify"],
        date="07/10/2021",hist.zoom=4,
        night.col="lightskyblue3")
rasterImage(moon, -0.15, 0.6, 0.15, 0.9)
rasterImage(sun, -0.15, -0.6, 0.15, -0.9)
mtext("Fortification", side=3, line=1.5, cex=1.5)
mtext("A",side=3,line=1.5,cex=2,adj=0)
if(fort.chi$p.value>0.0001){
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                  events$Behavior=="fortify",]),
              " p=",format(signif(fort.chi$p.value,1),scientific = F),sep=""),
      side=3,line=0.6,cex=1)
} else{
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
```

```
events$Behavior=="fortify",]),
              " p<0.0001",sep=""),
      side=3,line=0.6,cex=1)
}
par(fig=c(0.5,1,0.5,1),new=T)
DayHist(events$realtime[events$Species=="octopus_rubescens"&
                          events$Behavior=="frame departure"],
        date="07/10/2021",hist.zoom=8,
        night.col="lightskyblue3")
rasterImage(moon,-0.15,0.6,0.15,0.9)
rasterImage(sun,-0.15,-0.6,0.15,-0.9)
mtext("B",side=3,line=1.5,cex=2,adj=0)
mtext("Departures",side=3,line=1.5,cex=1.5)
if(depart.chi$p.value>0.0001){
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                 events$Behavior=="frame_departure",]),
              " p=",format(signif(depart.chi$p.value,1),scientific = F),sep=""),
      side=3,line=0.6,cex=1)
} else{
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                 events$Behavior=="frame departure",]),
              " p<0.0001",sep=""),
      side=3,line=0.6,cex=1)
}
par(fig=c(0,0.5,0,0.5),new=T)
DayHist(events$realtime[events$Species=="octopus_rubescens"&
                          events$Behavior=="periscope"],
        date="07/10/2021",hist.zoom=4.5,
        night.col="lightskyblue3")
rasterImage(moon,-0.15,0.6,0.15,0.9)
rasterImage(sun, -0.15, -0.6, 0.15, -0.9)
mtext("C",side=3,line=1.5,cex=2,adj=0)
mtext("Periscoping",side=3,line=1.5,cex=1.5)
if(peri.chi$p.value>0.0001){
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                 events$Behavior=="periscope",]),
              " p=",format(signif(peri.chi$p.value,1),scientific = F),sep=""),
      side=3,line=0.6,cex=1)
} else{
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                 events$Behavior=="periscope",]),
              " p<0.0001",sep=""),
      side=3,line=0.6,cex=1)
}
par(fig=c(0.5,1,0,0.5),new=T)
DayHist(events$realtime[events$Species=="octopus_rubescens"&
                          events$Behavior=="enter_bottle"|
```

```
events$Species=="octopus_rubescens"&
                          events$Behavior=="exit_bottle"],
        date="07/10/2021",hist.zoom=4.5,
        night.col="lightskyblue3")
rasterImage(moon,-0.15,0.6,0.15,0.9)
rasterImage(sun,-0.15,-0.6,0.15,-0.9)
mtext("D",side=3,line=1.5,cex=2,adj=0)
mtext("Enter/exit bottle", side=3, line=1.5, cex=1.5)
if(enterexit.chi$p.value>0.0001){
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                  events$Behavior=="enter bottle"|
                                  events$Species=="octopus_rubescens"&
                                  events$Behavior=="exit bottle",]),
              " p=",format(signif(enterexit.chi$p.value,1),scientific = F),sep=""),
      side=3,line=0.6,cex=1)
} else{
  mtext(paste("n=",nrow(events[events$Species=="octopus_rubescens"&
                                  events$Behavior=="enter_bottle"|
                                  events$Species=="octopus_rubescens"&
                                  events$Behavior=="exit_bottle",]),
              " p<0.0001",sep=""),
      side=3,line=0.6,cex=1)
}
dev.off()
```

pdf ## 2

This is bash code to convert the svg to png that can be displayed in the RMarkdown pdf.

```
cairosvg Figure2.svg -o Figure2.png -d 100
```

And this is bash code to convert the svg to eps for publication.

```
inkscape Figure2.svg -o Figure2.eps --export-ignore-filters --export-ps-level=3
```

4 Conspecific interactions

Next up, we look at interactions between octopuses. Specifically we want to look at frequency and duration of non-resident octopus visits. Non-resident octopuses are defined as those that do not enter a bottle in the camera field of view at any time during the deployment.

4.1 Resident/Non-resident interaction

4.1.1 Finding times when resident octopuses are present and absent

We would like to examine if the presence or absence of a resident octopus changes the behavior of non-resident octopuses. In order to do this, we need to look at when resident octopuses are present and absent.

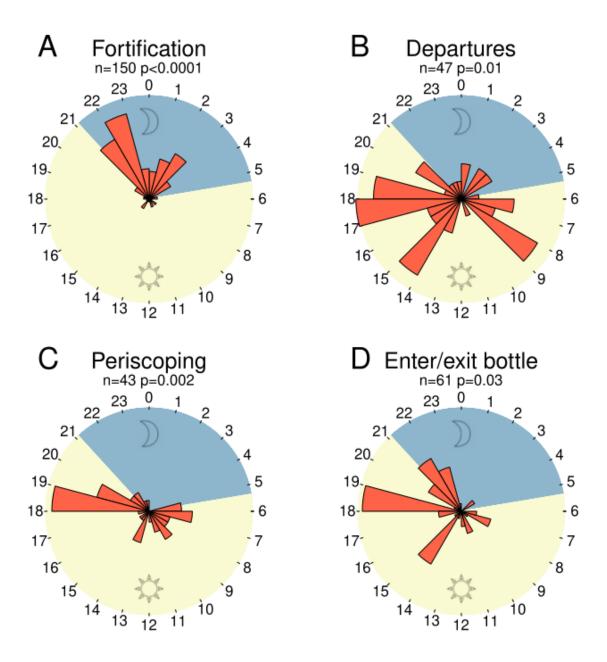


Figure 1: Radial histograms representing the absolute frequencies of hourly daily activities for O. rubescens recorded by marine camera traps throughout the day.

```
residents.present=events[events$Behavior=="deploy_start"|
        events$Species=="octopus_rubescens"&
        events$Behavior=="frame_arrival"&
        events$Event_type=="resident non-interaction"|
        events$Species=="octopus_rubescens"&
        events$Behavior=="frame_departure"&
        events$Event_type=="resident non-interaction"|
        events$Species=="octopus_rubescens"&
        events$Behavior=="deploy_start"&
        events$Event_type=="resident non-interaction"|
        events$Behavior=="deploy_end",
        ]
    events$Behavior[events$Behavior=="second_departure"]="frame_departure"
```

Next, I make sure that the entries in this dataframe are in chronological order within each deployment.

```
for (i in 1:length(deployments)){
  temp=residents.present[residents.present$`Deployment #`==deployments[i],]
  temp=temp[order(temp$realtime),]
  residents.present[residents.present$`Deployment #`==deployments[i],]=temp
}
```

Now, I add a column to the dataframe called "number" that will be a tally of how many octopuses are in the frame. I will start each deployment with the number at 0, add an octopus for each frame arrival and substract one octopus for each frame departure.

```
residents.present$number=0

for (i in 1:length(deployments)){
    behaviors=residents.present$Behavior[residents.present$`Deployment #`==deployments[i]]
    present=rep(0,length(behaviors))
    for (j in 2:length(behaviors)){
        if (behaviors[j]=="frame_arrival"){
            present[j]=present[j-1]+1
        }
        if (behaviors[j]=="frame_departure"){
            present[j]=present[j-1]-1
        }
        if (behaviors[j]=="deploy_end"){
            present[j]=present[j-1]
        }
    }
    residents.present$number[residents.present$`Deployment #`==deployments[i]]=present
}
```

The dataframe I made has the start time for each time period, but not the end. I will add the end by taking the starting time of the next time period.

```
residents.present$endtime=residents.present$realtime[1]
for (i in 1:length(deployments)){
```

```
#All of the times excepts the last (which is the end of deployment)
residents.present$endtime[head(which(residents.present$Deployment #`==deployments[i]),-1)]=
    #is replaced by all of the times except the first
    residents.present$realtime[tail(which(residents.present$Deployment #`==deployments[i]),-1)]}

residents.present=residents.present[!residents.present$Behavior=="deploy_end",]

Finding durations of each time period

residents.present$duration=
    as.numeric(difftime(residents.present$endtime,residents.present$realtime,units = "min"))

finding total time with and without octopuses

min.res.absent=sum(residents.present$duration[residents.present$number==0])
min.res.present=sum(residents.present$duration[residents.present$number>0])
min.res.absent

## [1] 23534.63

min.res.present
```

4.1.2 non-resident octopus visit duration and frequency when resident octopuses are absent versus present.

First, I make dataframes to hold my visit duration information and catalog potential bad arrivals and departure entries.

Next, I calculate the duration of each octopus visit.

[1] 19353.98

```
events$Event_type=="non-resident non-interaction"&
                    events$`Deployment #`==deployments[i]]
  departures=events$realtime[events$Species=="octopus_rubescens"&
                    events$Behavior=="frame_departure"&
                    events$Event type=="non-resident non-interaction"&
                    events$`Deployment #`==deployments[i]]
  if (length(arrivals)>0){
  depar.tags=c(rep("arrive",length(arrivals)),rep("depart",length(departures)))
  deploy.sub=data.frame(time=c(arrivals,departures),type=depar.tags)
  deploy.sub=deploy.sub[order(deploy.sub$time),]
      #Finding which arrivals are immediately followed by a departure
      visit.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)] == "arrive"&
                          deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      # Now calculating the
      visit.dura=difftime(deploy.sub$time[visit.depar+1],
                          deploy.sub$time[visit.depar],units = "min")
      visit.stub=data.frame(deployment=rep(deployments[i],length(visit.dura)),
                 time=deploy.sub$time[visit.depar],
                 duration=as.numeric(visit.dura))
      octo.visit=rbind(octo.visit,visit.stub)
      # Finding arrivals followed immediately by another arrival
      #(This should not be possible, so this is error locating)
      badarrival.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="arrive"&
                               deploy.sub$type[2:nrow(deploy.sub)] == "arrive")
      badarrival.dura=difftime(deploy.sub$time[badarrival.depar+1],
                               deploy.sub$time[badarrival.depar],units = "min")
      badarrival.stub=data.frame(deployment=rep(deployments[i],length(badarrival.dura)),
                 time1=deploy.sub$time[badarrival.depar],
                 time2=deploy.sub$time[badarrival.depar+1],
                 duration=as.numeric(badarrival.dura))
      octo.badarrival=rbind(octo.badarrival,badarrival.stub)
      baddepar.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="depart"&
                             deploy.sub$type[2:nrow(deploy.sub)]=="depart")
      baddepar.dura=difftime(deploy.sub$time[baddepar.depar+1],
                             deploy.sub$time[baddepar.depar],units = "min")
      baddepar.stub=data.frame(deployment=rep(deployments[i],length(baddepar.dura)),
                 time1=deploy.sub$time[baddepar.depar],
                 time2=deploy.sub$time[baddepar.depar+1],
                 duration=as.numeric(baddepar.dura))
      octo.baddepar=rbind(octo.baddepar,baddepar.stub)
   }
}
octo.visit=octo.visit[complete.cases(octo.visit),]
```

Adding if resident octopuses are present or absent during each visit to my dataframe

Adding if each octo visit was during the day or the night

4.1.3 Non-resident octopus frequency chi-square analysis

Getting distribution of observations for chi-squared test

```
octo.tab=
  as.vector(table(octo.visit$resident))
octo.tab
```

```
## [1] 28 19
```

Setting up probabilities for chi-squared test based on the proportion of time that resident octopuses were present or absent.

```
octo.probs=
    c(min.res.absent/(min.res.absent+min.res.present),
        min.res.present/(min.res.absent+min.res.present))
octo.probs
```

```
## [1] 0.5487385 0.4512615
```

Running chi-squared test

```
octo.chi=chisq.test(octo.tab,p=octo.probs)
octo.chi

##
## Chi-squared test for given probabilities
##
## data: octo.tab
## X-squared = 0.41939, df = 1, p-value = 0.5172

Extracting residuals for plotting later.

octo.res=matrix(octo.chi$residuals,ncol=2)
colnames(octo.res)=c("resident absent","resident present")
```

4.1.4 Non-resident octopus visit duration T-test

Testing my assumptions for T-Test

```
shapiro.test(octo.visit$duration[octo.visit$resident=="present"])
```

```
##
## Shapiro-Wilk normality test
##
## data: octo.visit$duration[octo.visit$resident == "present"]
## W = 0.83763, p-value = 0.004248
shapiro.test(octo.visit$duration[octo.visit$resident=="absent"])
```

```
##
## Shapiro-Wilk normality test
##
## data: octo.visit$duration[octo.visit$resident == "absent"]
## W = 0.91957, p-value = 0.03386
```

```
bartlett.test(octo.visit$duration,octo.visit$resident)
```

```
##
## Bartlett test of homogeneity of variances
##
## data: octo.visit$duration and octo.visit$resident
## Bartlett's K-squared = 19.155, df = 1, p-value = 1.205e-05
```

Assumptions fail, so I am using a permutation two-sample test.

So, it appears that non-resident octopus visit duration is significantly different if a resident octopus is present.

Seeing what the mean difference is between non-resident visit duration when octopuses are absent versus octopuses are present.

```
aggregate(duration~resident, data=octo.visit, FUN="mean")
```

```
## resident duration
## 1 absent 1.095833
## 2 present 2.264035
```

4.1.5 Frequency of Bottle reaching

Adding a field to the octo. visit object called "reach", and then filling it with simply if there is a reach event into

Frequency of reaching and no reaching inside a bottle when a resident is present and absent.

```
table(octo.visit$resident,octo.visit$reach)
##
             no_reach reach
##
##
                    16
                           12
     absent
     present
Getting distribution of reach and no reach when resident octopus is present for chi-squared test
reach.tab=
  table(octo.visit$reach[octo.visit$resident=="present"])
reach.tab
##
## no_reach
                reach
                   13
Setting up probabilities for chi-squared test. I am doing this such that the expected is the ratio when resident
is absent.
absent.tab=table(octo.visit$reach[octo.visit$resident=="absent"])
reach.probs=c(absent.tab[1]/sum(absent.tab),absent.tab[2]/sum(absent.tab))
reach.probs
## no_reach
                  reach
## 0.5714286 0.4285714
Running chi-squared test
reach.chi=chisq.test(reach.tab,p=reach.probs)
reach.chi
##
##
    Chi-squared test for given probabilities
##
## data: reach.tab
## X-squared = 5.0702, df = 1, p-value = 0.02434
reach.res=matrix(reach.chi$residuals,ncol=2)
colnames(reach.res)=c("resident absent", "resident present")
reach.res
##
        resident absent resident present
## [1,]
              -1.474087
                                  1.702129
```

5 Interspecific Interaction Analysis

Turning all rockfish species into just "rockfish". I am doing this down here so I don't break your code above that relies on your sorting with different rockfish. If you change that, we can put this earlier in the code.

```
events$Species[grep("rockfish",events$Species)]="rockfish"
```

Now I am taking a quick look at how many time each species appears in the data.

```
table(events$Species[events$Behavior=="frame_arrival"])
```

```
##
##
     buffalo sculpin
                                                      chimera
                                                                  dungeness crab
                             cancer crab
##
                                       10
                                                                               22
                   19
##
             flatfish
                             helmet_crab
                                              kelp greenling
                                                                         lingcod
##
                   21
                                        3
                                                          302
                                                                              215
##
   octopus_rubescens painted greenling
                                                  pile_perch
                                                                   red rock crab
                   78
                                                                              390
##
                                       60
                                                           30
             rockfish
##
                         sailfin sculpin
                                                sea_cucumber
                                                                        sea_star
##
                  640
                                                                                3
                                       11
                                                            3
##
       spiny dogfish
                                 unknown
                                                      urchin
                                                                        wolf eel
##
                                                            1
                                                                                7
```

It looks like we have enough data to do this analysis on rockfish, red rock crabs, kelp greenling, and lingcod. I think everything else doesn't have enough sightings to be worthwile.

5.1 Finding times when octopuses are present or absent

We are interested in how the presence of an octopus near the den affects the behavior of other commonly seen animals. In particularly we are curious is visitation frequency or duration is different when an octopus is present versus absent. In order to investigate this, we first need to build a dataset of when octopuses are present and absent.

Next, I make sure that the entries in this dataframe are in chonological order within each deployment.

```
for (i in 1:length(deployments)){
  temp=octos.present[octos.present$`Deployment #`==deployments[i],]
  temp=temp[order(temp$realtime),]
  octos.present[octos.present$`Deployment #`==deployments[i],]=temp
}
```

Now, I add a column to the dataframe called "number" that will be a tally of how many octopuses are in the frame. I will start each deployment with the number at 0, add an octopus for each frame arrival and substract one octopus for each frame departure.

```
octos.present$number=0
for (i in 1:length(deployments)){
  behaviors=octos.present$Behavior[octos.present$`Deployment #`==deployments[i]]
  present=rep(0,length(behaviors))
  for (j in 2:length(behaviors)){
    if (behaviors[j]=="frame_arrival"){
      present[j]=present[j-1]+1
   }
    if (behaviors[j]=="frame_departure"){
      present[j]=present[j-1]-1
    if (behaviors[j]=="deploy_end"){
      present[j]=present[j-1]
   }
  }
  octos.present$number[octos.present$\frac{Deployment #\displayments[i]]=present
}
```

The dataframe I made has the start time for each time period, but not the end. I will add the end by taking the starting time of the next time period.

```
for (i in 1:length(deployments)){
  octos.present$endtime[head(which(octos.present$`Deployment #`==deployments[i]),-1)]=
    #All of the times excepts the last (which is the end of deployment)
    octos.present$realtime[tail(which(octos.present$`Deployment #`==deployments[i]),-1)]
    #is replaced by all of the times except the first
}
octos.present=octos.present[!octos.present$Behavior=="deploy_end",]
```

Finding durations of each time period

finding total time with and without octopuses

```
min.absent=sum(octos.present$duration[octos.present$number==0])
min.present=sum(octos.present$duration[octos.present$number>0])
min.absent
```

```
## [1] 26916.37
```

```
min.present
```

```
## [1] 15972.25
```

Finding the proportion of times when octopuses are present, in which there is more than one octopus present.

```
sum(octos.present$duration[octos.present$number>=1])
## [1] 15972.25
```

```
sum(octos.present$duration[octos.present$number>1])
```

```
## [1] 6535.933
```

What is the proportion of total time when at least one octopus is present?

```
sum(octos.present$duration[octos.present$number>1])/
sum(octos.present$duration[octos.present$number>=1])
```

```
## [1] 0.4092055
```

Finding total number of conspecific interactions

```
sum(octos.present$number>=2)
```

[1] 43

5.2 Kelp Greenling Analysis

5.2.1 Kelp Greenling visitation frequency with octopuses absent vs. present.

In this chunk I am tallying kelp greenling arrivals when octopuses are present versus absent.

```
kelpies=numeric()

for (i in 1:nrow(octos.present)){
   kelpies[i]=sum(events$Species=="kelp greenling"&
        events$Behavior=="frame_arrival"&
        events$`Deployment #`==octos.present$`Deployment #`[i]&
        events$realtime>octos.present$realtime[i]&
        events$realtime<octos.present$endtime[i])
}

kelpies.absent=sum(kelpies[octos.present$number==0])
kelpies.present=sum(kelpies[octos.present$number>0])
kelpies.absent
```

```
## [1] 172
```

```
kelpies.present
```

```
## [1] 130
```

Next I perform a chi square test to see if the kelp greenling visitation frequency is significantly different that random. Here, I am using the probability in each category (absent vs. present) as the proportion of time octopuses were absent versus present.

```
probs=c(min.absent/(min.absent+min.present),min.present/(min.absent+min.present))
chisq.test(c(kelpies.absent,kelpies.present),p=probs)

##
## Chi-squared test for given probabilities
##
## data: c(kelpies.absent, kelpies.present)
## X-squared = 4.3544, df = 1, p-value = 0.03691
```

5.2.2 Kelp greenling visitation duration when octopuses are absent versus present.

First, I make dataframes to hold my visit duration information and catalog potential bad arrivals and departure entries.

Next, I calculate the duration of each kelp greenling visit.

```
deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      # Now calculating the
      visit.dura=difftime(deploy.sub$time[visit.depar+1],deploy.sub$time[visit.depar],units = "min")
      visit.stub=data.frame(deployment=rep(deployments[i],length(visit.dura)),
                 time=deploy.sub$time[visit.depar],
                 duration=as.numeric(visit.dura))
      kelpie.visit=rbind(kelpie.visit,visit.stub)
      # Finding arrivals followed immediately by another arrival
      #(This should not be possible, so this is error locating)
      badarrival.depar=which(deploy.sub\$type[1:(nrow(deploy.sub)-1)]=="arrive"\&
                               deploy.sub$type[2:nrow(deploy.sub)] == "arrive")
      badarrival.dura=difftime(deploy.sub$time[badarrival.depar+1],
                               deploy.sub$time[badarrival.depar],units = "min")
      badarrival.stub=data.frame(deployment=rep(deployments[i],length(badarrival.dura)),
                 time1=deploy.sub$time[badarrival.depar],
                 time2=deploy.sub$time[badarrival.depar+1],
                 duration=as.numeric(badarrival.dura))
      kelpie.badarrival=rbind(kelpie.badarrival,badarrival.stub)
      baddepar.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="depart"&
                             deploy.sub$type[2:nrow(deploy.sub)]=="depart")
      baddepar.dura=difftime(deploy.sub$time[baddepar.depar+1],
                             deploy.sub$time[baddepar.depar],units = "min")
      baddepar.stub=data.frame(deployment=rep(deployments[i],length(baddepar.dura)),
                 time1=deploy.sub$time[baddepar.depar],
                 time2=deploy.sub$time[baddepar.depar+1],
                 duration=as.numeric(baddepar.dura))
      kelpie.baddepar=rbind(kelpie.baddepar,baddepar.stub)
   }
}
kelpie.visit=kelpie.visit[complete.cases(kelpie.visit),]
```

Adding if octopuses are present or absent during each visit to my dataframe

```
kelpie.visit=kelpie.visit[!kelpie.visit$octopus=="unknown",]
```

Adding if each kelpie visit was during the day or the night

Getting distribution of observations for chi-squared test

```
kelpie.tab=
  as.vector(table(kelpie.visit$octopus))
kelpie.tab
```

```
## [1] 164 127
```

Setting up probabilities for chi-squared test

```
kelpie.probs=
  c(min.absent/(min.absent+min.present), min.present/(min.absent+min.present))
kelpie.probs
```

```
## [1] 0.6275877 0.3724123
```

Running chi-squared test

```
kelpie.chi=chisq.test(kelpie.tab,p=kelpie.probs)
kelpie.chi
```

```
##
## Chi-squared test for given probabilities
##
## data: kelpie.tab
## X-squared = 5.102, df = 1, p-value = 0.0239
```

Putting residuals into object for later plotting

```
kelpie.res=matrix(kelpie.chi$residuals,ncol=2)
colnames(kelpie.res)=c("octopus absent","octopus present")
Getting Kelpie observations per hour
kelpie.tab[1]/(min.absent/60/24)
## [1] 8.773844
kelpie.tab[2]/(min.present/60/24)
## [1] 11.44986
Testing my assumptions for T-Test
shapiro.test(kelpie.visit$duration[kelpie.visit$octopus=="present"])
##
##
   Shapiro-Wilk normality test
## data: kelpie.visit$duration[kelpie.visit$octopus == "present"]
## W = 0.57982, p-value < 2.2e-16
shapiro.test(kelpie.visit$duration[kelpie.visit$octopus=="absent"])
##
##
   Shapiro-Wilk normality test
## data: kelpie.visit$duration[kelpie.visit$octopus == "absent"]
## W = 0.49472, p-value < 2.2e-16
bartlett.test(kelpie.visit$duration,kelpie.visit$octopus)
##
  Bartlett test of homogeneity of variances
##
## data: kelpie.visit$duration and kelpie.visit$octopus
## Bartlett's K-squared = 133.96, df = 1, p-value < 2.2e-16
Assumptions fail, so I am using a permutation two-sample test.
kelpie.permTS=permTS(kelpie.visit$duration[kelpie.visit$octopus=="absent"],
                     kelpie.visit$duration[kelpie.visit$octopus=="present"],
       alternative="two.sided",method="exact.mc",control=permControl(nmc=10000))
kelpie.permTS
```

Very significant!

Seeing what the mean difference in seconds is between kelp greenling visit duration when octopuses are absent versus octopuses are present.

```
aggregate(duration*60~octopus, data=kelpie.visit, FUN="mean")
```

```
## octopus duration * 60
## 1 absent 10.85366
## 2 present 36.46457
```

5.3 Lingcod Analysis

5.3.1 Lingcod visitation frequency with octopuses absent vs. present.

In this chunk I am tallying Lingcod arrivals when octopuses are present versus absent.

```
lings=numeric()

for (i in 1:nrow(octos.present)) {
    lings[i]=sum(events$Species=="lingcod"&
        events$Behavior=="frame_arrival"&
        events$`Deployment #`==octos.present$`Deployment #`[i]&
        events$realtime>octos.present$realtime[i]&
        events$realtime<octos.present$endtime[i])
}

lings.absent=sum(lings[octos.present$number==0])
lings.present=sum(lings[octos.present$number>0])
lings.absent
```

```
## [1] 138
```

```
lings.present
```

[1] 76

Next I perform a chi square test to see if the lingcod visitation frequency is significantly different that random. Here, I am using the probability in each category (absent vs. present) as the proportion of time octopuses were absent versus present.

```
probs=c(min.absent/(min.absent+min.present), min.present/(min.absent+min.present))
chisq.test(c(lings.absent,lings.present), p=probs)

##
## Chi-squared test for given probabilities
##
## data: c(lings.absent, lings.present)
## X-squared = 0.27315, df = 1, p-value = 0.6012
```

5.3.2 lingcod visitation duration when octopuses are absent versus present.

First, I make dataframes to hold my visit duration information and catalog potential bad arrivals and departure entries.

Next, I calculate the duration of each lingcod visit.

```
deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      # Now calculating the
      visit.dura=difftime(deploy.sub$time[visit.depar+1],deploy.sub$time[visit.depar],units = "min")
      visit.stub=data.frame(deployment=rep(deployments[i],length(visit.dura)),
                 time=deploy.sub$time[visit.depar],
                 duration=as.numeric(visit.dura))
      ling.visit=rbind(ling.visit,visit.stub)
      # Finding arrivals followed immediately by another arrival
      #(This should not be possible, so this is error locating)
      badarrival.depar=which(deploy.sub\$type[1:(nrow(deploy.sub)-1)]=="arrive"\&
                               deploy.sub$type[2:nrow(deploy.sub)] == "arrive")
      badarrival.dura=difftime(deploy.sub$time[badarrival.depar+1],
                               deploy.sub$time[badarrival.depar],units = "min")
      badarrival.stub=data.frame(deployment=rep(deployments[i],length(badarrival.dura)),
                 time1=deploy.sub$time[badarrival.depar],
                 time2=deploy.sub$time[badarrival.depar+1],
                 duration=as.numeric(badarrival.dura))
      ling.badarrival=rbind(ling.badarrival,badarrival.stub)
      baddepar.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="depart"&
                             deploy.sub$type[2:nrow(deploy.sub)]=="depart")
      baddepar.dura=difftime(deploy.sub$time[baddepar.depar+1],
                             deploy.sub$time[baddepar.depar],units = "min")
      baddepar.stub=data.frame(deployment=rep(deployments[i],length(baddepar.dura)),
                 time1=deploy.sub$time[baddepar.depar],
                 time2=deploy.sub$time[baddepar.depar+1],
                 duration=as.numeric(baddepar.dura))
      ling.baddepar=rbind(ling.baddepar,baddepar.stub)
   }
}
ling.visit=ling.visit[complete.cases(ling.visit),]
```

Adding if octopuses are present or absent during each visit to my dataframe

```
}
ling.visit=ling.visit[!ling.visit$octopus=="unknown",]
Adding if each ling visit was during the day or the night
ling.visit$daynight="night"
ling.visit$day_expected=0
for (i in 1:nrow(ling.visit)){
  sunrise=sunriset(bay, as.POSIXct(ling.visit$time[i]),
                    direction="sunrise", POSIXct.out=TRUE)$time
  sunset=sunriset(bay, as.POSIXct(ling.visit$time[i]),
                   direction="sunset", POSIXct.out=TRUE)$time
  if (ling.visit$time[i]>sunrise&ling.visit$time[i]<sunset) {</pre>
    ling.visit$daynight[i]="day"
  }
  ling.visit$day_expected[i]=as.numeric(difftime(sunset,sunrise,units="hours"))/24
}
Getting distribution of observations for chi-squared test
ling.tab=
 as.vector(table(ling.visit$octopus))
Setting up probabilities for chi-squared test
ling.probs=
  c(min.absent/(min.absent+min.present), min.present/(min.absent+min.present))
Running chi-squared test
ling.chi=chisq.test(ling.tab,p=ling.probs)
ling.chi
##
##
    Chi-squared test for given probabilities
## data: ling.tab
## X-squared = 0.27315, df = 1, p-value = 0.6012
Plotting chi-squared residuals
```

Testing my assumptions for T-Test

ling.res=matrix(ling.chi\$residuals,ncol=2)

colnames(ling.res)=c("octopus absent","octopus present")

shapiro.test(ling.visit\$duration[ling.visit\$octopus=="present"])

```
##
## Shapiro-Wilk normality test
##
## data: ling.visit$duration[ling.visit$octopus == "present"]
## W = 0.27692, p-value < 2.2e-16
shapiro.test(ling.visit$duration[ling.visit$octopus=="absent"])
##
##
    Shapiro-Wilk normality test
##
## data: ling.visit$duration[ling.visit$octopus == "absent"]
## W = 0.36405, p-value < 2.2e-16
bartlett.test(ling.visit$duration,ling.visit$octopus)
##
##
   Bartlett test of homogeneity of variances
## data: ling.visit$duration and ling.visit$octopus
## Bartlett's K-squared = 160.76, df = 1, p-value < 2.2e-16
Assumptions fail, so I am using a permutation two-sample test.
ling.permTS=permTS(ling.visit$duration[ling.visit$octopus=="absent"],
                   ling.visit$duration[ling.visit$octopus=="present"],
       alternative="two.sided",method="exact.mc",control=permControl(nmc=10000))
ling.permTS
##
##
   Exact Permutation Test Estimated by Monte Carlo
##
## data: GROUP 1 and GROUP 2
## p-value = 0.07099
\#\# alternative hypothesis: true mean GROUP 1 - mean GROUP 2 is not equal to 0
## sample estimates:
## mean GROUP 1 - mean GROUP 2
                    -0.1916317
##
## p-value estimated from 10000 Monte Carlo replications
## 99 percent confidence interval on p-value:
## 0.06162466 0.08087184
Not significant
Seeing what the mean difference is between lingcod visit duration when octopuses are absent versus octopuses
are present.
aggregate(duration~octopus, data=ling.visit, FUN="max")
##
     octopus duration
## 1 absent 2.366667
## 2 present 8.800000
```

5.4 Rockfish Analysis

5.4.1 rockfish visitation duration when octopuses are absent versus present.

First, I make dataframes to hold my visit duration information and catalog potential bad arrivals and departure entries.

Next, I calculate the duration of each rockfish visit.

```
for (i in 1:length(deployments)){
  arrivals=events$realtime[events$Species=="rockfish"&
                    events$Behavior=="frame_arrival"&
                    events$`Deployment #`==deployments[i]]
  departures=events$realtime[events$Species=="rockfish"&
                    events$Behavior=="frame_departure"&
                    events$`Deployment #`==deployments[i]]
  if (length(arrivals)>0){
  depar.tags=c(rep("arrive",length(arrivals)),rep("depart",length(departures)))
  deploy.sub=data.frame(time=c(arrivals,departures),type=depar.tags)
  deploy.sub=deploy.sub[order(deploy.sub$time),]
      #Finding which arrivals are immediately followed by a departure
      visit.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="arrive"&
                          deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      # Now calculating the
      visit.dura=difftime(deploy.sub$time[visit.depar+1],
                          deploy.sub$time[visit.depar],units = "min")
      visit.stub=data.frame(deployment=rep(deployments[i],length(visit.dura)),
                 time=deploy.sub$time[visit.depar],
                 duration=as.numeric(visit.dura))
      rock.visit=rbind(rock.visit,visit.stub)
      # Finding arrivals followed immediately by another arrival
      #(This should not be possible, so this is error locating)
      badarrival.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="arrive"&
                               deploy.sub$type[2:nrow(deploy.sub)] == "arrive")
      badarrival.dura=difftime(deploy.sub$time[badarrival.depar+1],
```

```
deploy.sub$time[badarrival.depar],units = "min")
      badarrival.stub=data.frame(deployment=rep(deployments[i],length(badarrival.dura)),
                 time1=deploy.sub$time[badarrival.depar],
                 time2=deploy.sub$time[badarrival.depar+1],
                 duration=as.numeric(badarrival.dura))
      rock.badarrival=rbind(rock.badarrival,badarrival.stub)
      baddepar.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="depart"&
                             deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      baddepar.dura=difftime(deploy.sub$time[baddepar.depar+1],
                             deploy.sub$time[baddepar.depar],units = "min")
      baddepar.stub=data.frame(deployment=rep(deployments[i],length(baddepar.dura)),
                 time1=deploy.sub$time[baddepar.depar],
                 time2=deploy.sub$time[baddepar.depar+1],
                 duration=as.numeric(baddepar.dura))
      rock.baddepar=rbind(rock.baddepar,baddepar.stub)
   }
}
rock.visit=rock.visit[complete.cases(rock.visit),]
```

Adding if octopuses are present or absent during each visit to my dataframe

Adding if each rock visit was during the day or the night

```
direction="sunset", POSIXct.out=TRUE)$time
  if (rock.visit$time[i]>sunrise&rock.visit$time[i]<sunset) {</pre>
    rock.visit$daynight[i]="day"
  }
  rock.visit$day_expected[i]=as.numeric(difftime(sunset,sunrise,units="hours"))/24
Getting distribution of observations for chi-squared test
rock.tab=
  as.vector(table(rock.visit$octopus))
Setting up probabilities for chi-squared test
rock.probs=
  c(min.absent/(min.absent+min.present), min.present/(min.absent+min.present))
Running chi-squared test
rock.chi=chisq.test(rock.tab,p=rock.probs)
rock.chi
##
##
   Chi-squared test for given probabilities
##
## data: rock.tab
## X-squared = 39.238, df = 1, p-value = 3.752e-10
Plotting chi-squared residuals
rock.res=matrix(rock.chi$residuals,ncol=2)
colnames(rock.res)=c("octopus absent","octopus present")
Testing my assumptions for T-Test
shapiro.test(rock.visit$duration[rock.visit$octopus=="present"])
##
##
   Shapiro-Wilk normality test
## data: rock.visit$duration[rock.visit$octopus == "present"]
## W = 0.4087, p-value < 2.2e-16
shapiro.test(rock.visit$duration[rock.visit$octopus=="absent"])
##
##
   Shapiro-Wilk normality test
## data: rock.visit$duration[rock.visit$octopus == "absent"]
## W = 0.36315, p-value < 2.2e-16
```

```
bartlett.test(rock.visit$duration,rock.visit$octopus)
```

```
##
## Bartlett test of homogeneity of variances
##
## data: rock.visit$duration and rock.visit$octopus
## Bartlett's K-squared = 0.23026, df = 1, p-value = 0.6313

Assumptions fail, so I am using a permutation two-sample test.
```

Not Significant

Seeing what the mean difference is between Rockfish visit duration when octopuses are absent versus octopuses are present.

```
aggregate(duration~octopus, data=rock.visit, FUN="mean")
```

```
## octopus duration
## 1 absent 0.2311910
## 2 present 0.2611111
```

5.5 Red Rock Crab Analysis

5.5.1 crab visitation duration when octopuses are absent versus present.

First, I make dataframes to hold my visit duration information and catalog potential bad arrivals and departure entries.

Next, I calculate the duration of each crab visit.

```
for (i in 1:length(deployments)){
  arrivals=events$realtime[events$Species=="red rock crab"&
                    events$Behavior=="frame_arrival"&
                    events$`Deployment #`==deployments[i]]
  departures=events$realtime[events$Species=="red rock crab"&
                    events$Behavior=="frame departure"&
                    events$`Deployment #`==deployments[i]]
  if (length(arrivals)>0){
  depar.tags=c(rep("arrive",length(arrivals)),rep("depart",length(departures)))
  deploy.sub=data.frame(time=c(arrivals,departures),type=depar.tags)
  deploy.sub=deploy.sub[order(deploy.sub$time),]
      #Finding which arrivals are immediately followed by a departure
      visit.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="arrive"&
                          deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      # Now calculating the
      visit.dura=difftime(deploy.sub$time[visit.depar+1],
                          deploy.sub$time[visit.depar],units = "min")
      visit.stub=data.frame(deployment=rep(deployments[i],length(visit.dura)),
                 time=deploy.sub$time[visit.depar],
                 duration=as.numeric(visit.dura))
      crab.visit=rbind(crab.visit,visit.stub)
      # Finding arrivals followed immediately by another arrival
      #(This should not be possible, so this is error locating)
      badarrival.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="arrive"&
                               deploy.sub$type[2:nrow(deploy.sub)]=="arrive")
      badarrival.dura=difftime(deploy.sub$time[badarrival.depar+1],
                               deploy.sub$time[badarrival.depar],units = "min")
      badarrival.stub=data.frame(deployment=rep(deployments[i],length(badarrival.dura)),
                 time1=deploy.sub$time[badarrival.depar],
                 time2=deploy.sub$time[badarrival.depar+1],
                 duration=as.numeric(badarrival.dura))
      crab.badarrival=rbind(crab.badarrival,badarrival.stub)
      baddepar.depar=which(deploy.sub$type[1:(nrow(deploy.sub)-1)]=="depart"&
                             deploy.sub$type[2:nrow(deploy.sub)] == "depart")
      baddepar.dura=difftime(deploy.sub$time[baddepar.depar+1],
```

Adding if octopuses are present or absent during each visit to my dataframe

Adding if each crab visit was during the day or the night

Getting distribution of observations for chi-squared test

```
crab.tab=
  as.vector(table(crab.visit$octopus))
Setting up probabilities for chi-squared test
crab.probs=
  c(min.absent/(min.absent+min.present), min.present/(min.absent+min.present))
Running chi-squared test
crab.chi=chisq.test(crab.tab,p=crab.probs)
crab.chi
##
##
   Chi-squared test for given probabilities
##
## data: crab.tab
## X-squared = 14.281, df = 1, p-value = 0.0001574
Plotting chi-squared residuals
crab.res=matrix(crab.chi$residuals,ncol=2)
colnames(crab.res)=c("octopus absent","octopus present")
Testing my assumptions for T-Test
shapiro.test(crab.visit$duration[crab.visit$octopus=="present"])
##
##
    Shapiro-Wilk normality test
## data: crab.visit$duration[crab.visit$octopus == "present"]
## W = 0.35578, p-value < 2.2e-16
shapiro.test(crab.visit$duration[crab.visit$octopus=="absent"])
##
##
    Shapiro-Wilk normality test
##
## data: crab.visit$duration[crab.visit$octopus == "absent"]
## W = 0.3447, p-value < 2.2e-16
bartlett.test(crab.visit$duration,crab.visit$octopus)
##
##
    Bartlett test of homogeneity of variances
##
## data: crab.visit$duration and crab.visit$octopus
## Bartlett's K-squared = 1.1881, df = 1, p-value = 0.2757
```

Assumptions fail, so I am using a permutation two-sample test.

Not significant!

Seeing what the mean difference is between lingcod visit duration when octopuses are absent versus octopuses are present.

```
aggregate(duration~octopus,data=crab.visit,FUN="mean")

## octopus duration
## 1 absent 2.272619
## 2 present 2.586275
```

6 Plotting intraspecific and conspecific octopus interactions

We first append together all of the Pearson residuals from frequency chi square tests

```
all.res=
  cbind(
    kelpie.res,
    ling.res,
    rock.res,
    crab.res,
    octo.res
)
```

Then, we append together all of the p-values.

```
all.chi.p=
  cbind(
    kelpie.chi$p.value,
    ling.chi$p.value,
    rock.chi$p.value,
    crab.chi$p.value,
    octo.chi$p.value
)
```

```
colnames(all.res)=rep("",ncol(all.res))
rownames(all.res)=rep("",nrow(all.res))
```

Finally, we plot the data into a large boxplot.

```
svg(filename="Figure3.svg",width=9,height=7)
plot(c(0,1),c(0,1),type="n",axes=F,ylab="",xlab="")
par(fig=c(0.076,0.957,0,0.5),new=T)
```

```
corrplot(all.res,is.cor=F,col.lim=c(-5,5),tl.col="black",
         addCoef.col = "black",cl.pos=F,addgrid.col=NA)
for (i in c(0,2,4,6,8)){
  lines(c(.5+i,.5+i,2.5+i,2.5+i,.5+i), c(.5,1.9,1.9,.5,.5), lwd=3)
}
for (i in 0:4){
  text(2*i+1.15,0.4,"absent",srt=90,pos=2)
  text(2*i+2.15,0.4,"present",srt=90,pos=2)
for (i in 0:4){
  if (all.chi.p[i+1] <= 0.05) {</pre>
    lines(c((i*2)+1,(i*2)+2),c(1.5,1.5),lwd=2)
    text((i*2)+1.5,1.7,paste("p=",format(signif(all.chi.p[i+1],2),scientific=F),sep=""))
  }
}
start=0.001
box.width=0.310
box.next=0.171
lower.box.bottom=0.21
lower.box.top=0.8
upper.box.bottom=0.536
upper.box.top=1
bottom.max=0.7
top.min=0.82
top.max=100
top.at=c(1)
top.log="y"
par(fig=c(start,start+box.width,lower.box.bottom,lower.box.top),new=T)
boxplot(duration~octopus, data=kelpie.visit, range=0, ylim=c(0, bottom.max), axes=F,
        ylab="",xlab="")
axis(2,at=c(0,0.3,0.6),las=1)
box(1wd=3)
text(1,mean(kelpie.visit$duration[kelpie.visit$octopus=="absent"]),"+",cex=2)
text(2,mean(kelpie.visit$duration[kelpie.visit$octopus=="present"]),"+",cex=2)
par(fig=c(start,start+box.width,upper.box.bottom,upper.box.top),new=T)
boxplot(duration~octopus, data=kelpie.visit, range=0, ylim=c(top.min,top.max), axes=F,
        ylab="",xlab="",log=top.log)
axis(2,at=c(1,10,100),labels=c("1","10","100"),las=1)
box(1wd=3)
if (kelpie.permTS$p.value<=0.05){</pre>
  lines(c(1,2),c(exp(log(max(kelpie.visit$duration))+0.5),
                 exp(log(max(kelpie.visit$duration))+0.5)),lwd=2)
  text(1.5,exp(log(max(kelpie.visit$duration))+1),
       paste("p=",format(signif(kelpie.permTS$p.value,2),scientific = F),sep=""))
}
```

```
par(fig=c(start+box.next*1,start+box.next*1+box.width,lower.box.bottom,lower.box.top),new=T)
boxplot(duration~octopus, data=ling.visit, range=0, ylim=c(0, bottom.max), axes=F, ylab="", xlab="")
box(1wd=3)
text(1,mean(ling.visit$duration[ling.visit$octopus=="absent"]),"+",cex=2)
text(2,mean(ling.visit$duration[ling.visit$octopus=="present"]),"+",cex=2)
par(fig=c(start+box.next*1,start+box.next*1+box.width,upper.box.bottom,upper.box.top),new=T)
boxplot(duration~octopus, data=ling.visit, range=0, ylim=c(top.min,top.max), axes=F, ylab="",
        xlab="",log=top.log)
box(1wd=3)
if (ling.permTS$p.value<=0.05){</pre>
  lines(c(1,2),c(exp(log(max(ling.visit$duration))+0.5),
                 exp(log(max(ling.visit$duration))+0.5)),lwd=2)
 text(1.5,exp(log(max(ling.visit$duration))+1),
       paste("p=",format(signif(ling.permTS$p.value,2),scientific=F),sep=""))
}
par(fig=c(start+box.next*2,start+box.next*2+box.width,lower.box.bottom,lower.box.top),new=T)
boxplot(duration~octopus, data=rock.visit, range=0, ylim=c(0, bottom.max), axes=F,
        ylab="",xlab="")
box(1wd=3)
text(1,mean(rock.visit$duration[rock.visit$octopus=="absent"]),"+",cex=2)
text(2,mean(rock.visit$duration[rock.visit$octopus=="present"]),"+",cex=2)
par(fig=c(start+box.next*2,start+box.next*2+box.width,upper.box.bottom,upper.box.top),new=T)
boxplot(duration~octopus, data=rock.visit, range=0, ylim=c(top.min,top.max), axes=F, ylab="",
        xlab="",log=top.log)
box(1wd=3)
if (rock.permTS$p.value<=0.05){</pre>
  lines(c(1,2), c(exp(log(max(rock.visit\$duration))+0.5),
                 exp(log(max(rock.visit$duration))+0.5)),lwd=2)
 text(1.5,exp(log(max(rock.visit$duration))+1),
       paste("p=",format(signif(rock.permTS$p.value,2),scientific=F),sep=""))
par(fig=c(start+box.next*3,start+box.next*3+box.width,lower.box.bottom,lower.box.top),new=T)
boxplot(duration~octopus, data=crab.visit, range=0, ylim=c(0, bottom.max), axes=F, ylab="", xlab="")
box(1wd=3)
par(fig=c(start+box.next*3,start+box.next*3+box.width,upper.box.bottom,upper.box.top),new=T)
boxplot(duration~octopus, data=crab.visit, range=0, ylim=c(top.min,top.max), axes=F, ylab="",
        xlab="",log=top.log)
box(1wd=3)
if (crab.permTS$p.value<=0.05){</pre>
  lines(c(1,2),c(exp(log(max(crab.visit$duration))+0.5),
                 exp(log(max(crab.visit$duration))+0.5)), lwd=2)
  text(1.5,exp(log(max(crab.visit$duration))+1),
       paste("p=",format(signif(crab.permTS$p.value,2),scientific=F),sep=""))
text(1,mean(crab.visit$duration[crab.visit$octopus=="absent"]),"+",cex=2)
text(2,mean(crab.visit$duration[crab.visit$octopus=="present"]),"+",cex=2)
```

```
par(fig=c(start+box.next*4,start+box.next*4+box.width,lower.box.bottom,lower.box.top),new=T)
boxplot(duration~resident, data=octo.visit, range=0, vlim=c(0, bottom.max), axes=F,
        ylab="",xlab="")
box(1wd=3)
par(fig=c(start+box.next*4,start+box.next*4+box.width,upper.box.bottom,upper.box.top),new=T)
boxplot(duration~resident,data=octo.visit,range=0,ylim=c(top.min,top.max),axes=F,ylab="",
        xlab="",log=top.log)
box(1wd=3)
if (octo.permTS$p.value<=0.05){</pre>
  lines(c(1,2),c(exp(log(max(octo.visit$duration))+0.5),
                 exp(log(max(octo.visit$duration))+0.5)),lwd=2)
  text(1.5,exp(log(max(octo.visit$duration))+1),
       paste("p=",format(signif(octo.permTS$p.value,2),scientific=F),sep=""))
}
text(1,mean(octo.visit$duration[octo.visit$resident=="absent"]),"+",cex=2)
text(2,mean(octo.visit$duration[octo.visit$resident=="present"]),"+",cex=2)
species.line1=1
species.line2=2
n.line=0
par(fig=c(0,1,0,1),new=T)
plot(c(0,1),c(0,1),type="n",axes=F,ylab="",xlab="")
mtext("Visit duration (min)",side=2,line=2.5,cex=1.5,adj=0.7)
mtext(paste("n=",nrow(kelpie.visit),sep=""),side=3,line=n.line,cex=1,adj=0.08)
mtext("decagrammus",side=3,line=species.line1,cex=1,adj=0.05,font=3)
mtext("Hexagrammos",side=3,line=species.line2,cex=1,adj=0.05,font=3)
mtext(paste("n=",nrow(ling.visit),sep=""),side=3,line=n.line,cex=1,adj=0.28)
mtext("elongatus",side=3,line=species.line1,cex=1,adj=0.27,font=3)
mtext("Ophiodon", side=3, line=species.line2, cex=1, adj=0.27, font=3)
mtext(paste("n=",nrow(rock.visit),sep=""),side=3,line=n.line,cex=1,adj=0.5)
mtext("Sebastes sp.",side=3,line=species.line1,cex=1,adj=0.5,font=3)
mtext(paste("n=",nrow(crab.visit),sep=""),side=3,line=n.line,cex=1,adj=0.71)
mtext("Cancer productus",side=3,line=species.line1,cex=1,adj=0.73,font=3)
mtext(paste("n=",nrow(octo.visit),sep=""),side=3,line=n.line,cex=1,adj=0.92)
mtext("Octopus rubescens", side=3, line=species.line1, cex=1, adj=0.99, font=3)
mtext("non-resident", side=3, line=species.line2, cex=1, adj=0.95, font=3)
mtext("octopus present or absent",side=1,line=3.5,cex=1.5)
dev.off()
```

pdf ## 2

Next, we convert the image to a png so that it can be inserted into the RMarkdown

```
cairosvg Figure3.svg -o Figure3.png -d 300
```

Then, we convert it to an eps for publication.

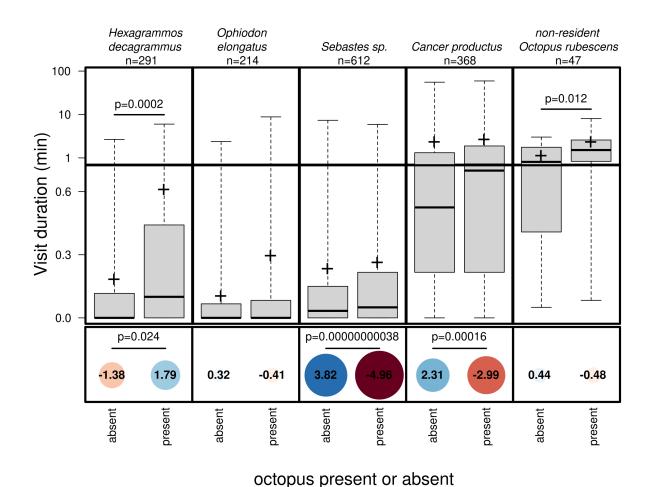


Figure 2: Commonly encountered species were evaluated for visitation duration and frequency, with and without a resident octopus present. Four non-octopus species were examined with a fifth comparison of non- resident octopus visitations. Top panel displays boxplot of visitation durations for each species when an octopus was not present or present in the camera field of view. Plusses (+) indicate average visitation durations. Y-axis is broken at 0.7 mins, above which is logarithmic in order to display long tails. Bottom panel displays Pearson residuals of chi-square analysis of visitation frequency when octopuses were not present in the camera field of view.

7 Are you more likely to encounter an octopus in the frame at a random time at night or during the day?

First, make a list of every minute from every duration from the octos.present object,

```
times=seq(from=octos.present$realtime[1],to=octos.present$endtime[1],by="1 min")
octos=rep(octos.present$number[1],length(times))
for (i in 2:nrow(octos.present)){
```

```
times=c(times,seq(from=octos.present$realtime[i],to=octos.present$endtime[i],by="1 min"))
octos=c(octos,rep(octos.present$number[i],length(seq(from=octos.present$realtime[i],to=octos.present$
}
```

Next, for each of those times, I will determine if it is during day or night.

data: daynight.samp

X-squared = 0.43946, df = 1, p-value = 0.5074

```
daynight=rep("night",length(times))

dates=unique(as.Date(times))

for (i in 1:length(dates)){
    sunrise=sunriset(bay, as.POSIXct(dates[i]), direction="sunrise", POSIXct.out=TRUE)$time
    sunset=sunriset(bay, as.POSIXct(dates[i]), direction="sunset", POSIXct.out=TRUE)$time
    daynight[times>sunrise&times<sunset]="day"
}</pre>
```

Sampling 612 night times and 612 day times to see if an octopus is present, and then comparing if the number of samples with an octopus is present is different between the two samples. Essentially what we are trying to look at here: If you were to visit the octopus dens randomly 612 times during the night, or visit the octopus dens 612 times during the day, would you be more likely to encounter and octopus during the day or night?

```
daynight.samp=c(sum(sample(octos[daynight=="night"]>0,612)),sum(sample(octos[daynight=="day"]>0,612)))
daynight.samp.chi=chisq.test(daynight.samp)
daynight.samp.chi
##
## Chi-squared test for given probabilities
##
```

The frequency of octopus encounters is not significantly different between day and night. It appears the answer is no, you would not be more likely to encounter an octopus on a random visit to the bottle dens in the day or night.

8 Frequency of periscoping and fortifying when 1 octopus is present versus multiple

These two behaviors by octopuses seem like they could be influenced by the presence or absence of other octopuses. In this analysis we look to see if they happen more or less frequently when the octopus doing the behavior is alone in the camera field of view, or if it is not alone. First, we get the relative amounts of time when there is only one octopus present versus multiple octopuses present. In this calculation, we multiply the minutes that multiple how many octopuses are present to account for the multiple octopuses present and the multiplication of the probability that you would observe a specific octopus behavior in that time (for instance: you are twice as likely to observe any specific octopus behavior when two octopuses are present).

```
## [1] 9436.317
octo.more
## [1] 13119.7
     Probabilities of 1 versus >1 octopus present
perifort.probs=c(octo.one/(octo.one+octo.more),octo.more/(octo.one+octo.more))
perifort.probs
## [1] 0.4183503 0.5816497
     Finding number of fortify events with 1 octopus present versus more than
     1
fort=numeric()
for (i in 1:nrow(octos.present)){
  fort[i]=sum(events$Behavior=="fortify"&
    events Deployment # == octos.present Deployment # [i]&
    events$realtime>octos.present$realtime[i]&
    events$realtime<octos.present$endtime[i])</pre>
}
fort.none=sum(fort[octos.present$number==0]) #negative control... kinda...
fort.one=sum(fort[octos.present$number==1])
fort.more=sum(fort[octos.present$number>1])
fort.none
## [1] O
fort.one
## [1] 68
fort.more
## [1] 82
fort.multi.chi=chisq.test(c(fort.one,fort.more),p=perifort.probs)
fort.multi.chi
##
   Chi-squared test for given probabilities
```

data: c(fort.one, fort.more)

It appears

X-squared = 0.7544, df = 1, p-value = 0.3851

8.3 Finding number of periscope events with 1 octopus present versus more than 1

```
peri=numeric()
for (i in 1:nrow(octos.present)){
  peri[i]=sum(events$Behavior=="periscope"&
   events$Species=="octopus_rubescens"&
   events\[^Deployment #^==octos.present\[^Deployment #^[i]\&
   events$realtime>octos.present$realtime[i]&
    events$realtime<octos.present$endtime[i])</pre>
}
peri.none=sum(peri[octos.present$number==0]) #negative control... kinda...
peri.one=sum(peri[octos.present$number==1])
peri.more=sum(peri[octos.present$number>1])
peri.none
## [1] 0
peri.one
## [1] 31
peri.more
## [1] 12
peri.multi.chi=chisq.test(c(peri.one,peri.more),p=perifort.probs)
peri.multi.chi
##
   Chi-squared test for given probabilities
##
##
## data: c(peri.one, peri.more)
## X-squared = 16.179, df = 1, p-value = 5.763e-05
```

8.4 Chi square residuals plots

Now, making a plot of all of those final chi-squared analyses.

```
daynight.samp.plot=t(as.matrix(daynight.samp.chi$residuals))
colnames(daynight.samp.plot)=c("","")
rownames(daynight.samp.plot)=""

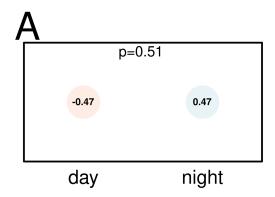
perifort.plot=as.matrix(rbind(fort.multi.chi$residuals,
peri.multi.chi$residuals))
colnames(perifort.plot)=c("","")
rownames(perifort.plot)=c("","")
```

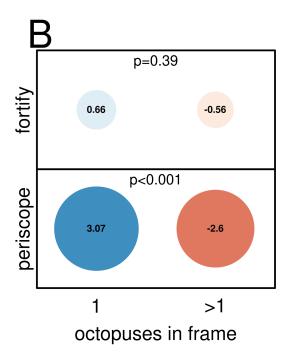
```
svg(filename="Figure4.svg",width=7,height=15)
par(fig=c(0,1,0.1,0.95))
corrplot(testcorr,is.cor=F,tl.col="black",
         addCoef.col="black",addgrid.col=NA,col.lim=c(-5,5),
          cl.cex=1.5,cl.ratio=0.3
          cl.pos="n"
         )
for (i in c(0,2,3,5)){
  lines(c(.5,.5,2.5,2.5,.5),c(.5+i,1.5+i,1.5+i,.5+i,.5+i),lwd=3)
axis(1,at=c(1,2),lwd=0,labels = c("present","absent"),cex.axis=2,padj=3.5)
points(c(1,2,1,2),c(2,2,5,5),pch=21,bg="white",col="white",cex=3)
# This code above is a real janky way to hide the questions marks
text(c(1,2),c(5.35,5.35),c("day","night"),cex=2)
text(c(1,2),c(2.35,2.35),c("1",">1"),cex=2)
text(c(1.5),c(2.1),c("octopuses in frame"),cex=2)
mtext("resident octopus",side=1,cex=2,line=8)
text(0.4,4,"fortify",srt=90,cex=2)
text(0.4,3,"periscope",srt=90,cex=2)
if (reach.chi$p.value>=0.001){
 text(1.5,1.4,paste0("p=",signif(reach.chi$p.value,digits=2)),cex=1.5)
} else (\text{text}(1.5, 1.4, \text{"p<0.001"}, \text{cex=1.5}))
if (peri.multi.chi$p.value>=0.001){
 text(1.5,3.4,paste0("p=",signif(peri.multi.chi$p.value,digits=2)),cex=1.5)
} else (\text{text}(1.5, 3.4, \text{"p<0.001"}, \text{cex=1.5}))
## NULL.
if (fort.multi.chi$p.value>=0.001){
 text(1.5,4.4,paste0("p=",signif(fort.multi.chi$p.value,digits=2)),cex=1.5)
} else (\text{text}(1.5, 4.4, "p<0.001", cex=1.5))
if (daynight.samp.chi$p.value>=0.001){
  mtext(paste0("p=",signif(daynight.samp.chi$p.value,digits=2)),side=3,line=1.7,cex=1.5)
} else (mtext("p<0.001",side=3,line=1.7,cex=1.5))</pre>
mtext("A",side=3,line=3.2,cex=4,adj=0.2)
text(0.53, 4.64, "B", cex=4)
text(0.53, 1.64, "C", cex=4)
#mtext("Pearson residuals", side=4, cex=2, line=-3)
#text(0.2,6,"A",cex=3)
dev.off()
```

```
## pdf
## 2
```

```
cairosvg Figure4.svg -o Figure4.png -d 300
```

inkscape Figure4.svg -o Figure4.eps --export-ignore-filters --export-ps-level=3





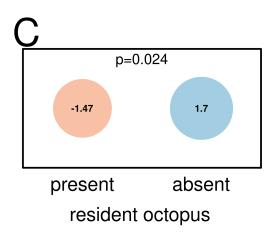


Figure 3: Pearson residuals for various chi-square analyses. (A) Relationship of octopus presence during day vs. night, checking for potential bias in frequency of octopus presence. (B) Influence of conspecific presence on octopus behaviors (# of octopuses within the camera frame 1 vs. more than 1); fortification and periscoping. (C) Frequency of non-resident (visiting) octopus interacting with bottle interior with and without a resident octopus present.