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## Example script
### Analysis of change in Pileated woodpecker (PIWO) abundance versus forest habitat
### Script written 11/21/2017
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### ENS 495 CalU
## Load PIWO data
BBS_PA_PIWO_4 <- read.csv(file = "Brouwer_NL_PIWO_vs_forest_cover.csv")
## Data Exploration
### Load libraries
library(ggplot2)
library(ggpubr)
### Exploring abundance-habitat data
#### Boxplots
## number of birds seen
### saved as object; displayed laterwith plot grid
plot1.spp.total <- ggboxplot(data = BBS PA PIWO 4,
  y = "SpeciesTotal",
  xlab = "")
## Deciduous landcover
plot2.decid.percent <- ggboxplot(data = BBS_PA_PIWO_4,
  y = "decid.percent",
  xlab = "")
## Coniferous landcover
plot3.confir.percent <- ggboxplot(data = BBS_PA_PIWO_4,
  y = "conifer.percent", xlab = "")
## Mixed forest landcover
plot4.mixed.percent <- ggboxplot(data = BBS_PA_PIWO_4,
  y = "mixed.forest.percent", xlab = "")
### Plot as grid
library(cowplot)
### This plot shows the distribution of the y variable (SpeciesTOtal) and 3 different predictor
### variables that represent different amounts of forest dover.
plot_grid(plot1.spp.total,
     plot2.decid.percent,
     plot3.confir.percent,
     plot4.mixed.percent,
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labels = c("A", "B", "C", "D"))

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#### Histograms
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# Make each plot with gghistogram() and save to an R object
## number of birds seen
plot1.spp.total <- gghistogram(data = BBS_PA_PIWO_4,
                x = "SpeciesTotal",
                xlab = "")
## Deciduous landcover
plot2.decid.percent <- gghistogram(data = BBS_PA_PIWO_4,
                  x = "decid.percent",
                  xlab = "")
## Coniferous landcover
plot3.confir.percent <- gghistogram(data = BBS_PA_PIWO_4,
                   x = "conifer.percent", xlab = "")
## Mixed forest landcover
plot4.mixed.percent <- gghistogram(data = BBS_PA_PIWO_4,
                  x = "mixed.forest.percent", xlab = "")
## Layout the four plots in a grid.
### This plot shows the distribution of the y variable (SpeciesTOtal) and 3 different predictor
### variables that represent different amounts of forest dover.
plot_grid(plot1.spp.total,
     plot2.decid.percent,
     plot3.confir.percent,
     plot4.mixed.percent,
     labels = c("A", "B",
           "C","D"))
## Data modeling
### Modeling habitat
### Null model representing not change in number of PIWO observed as habitat changes
m.null <- lm(SpeciesTotal ~ 1, BBS_PA_PIWO_4)
### Alternative model of how PIWO counts change as deciduous forest cover increases
m.decid <- Im(SpeciesTotal ~ decid.percent, BBS PA PIWO 4)
### Alternative model of how PIWO counts change as mixed forest cover increases
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m.mixed <- lm(SpeciesTotal ~ mixed.forest.percent, BBS_PA_PIWO_4)

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### Results
## Compare two alt model against null model
#### Significance test with anova()
#### null vs. deciduous forest model
##### p value is "sig" (0.001424)
##### reject the null, slope is sig diff than zero
anova(m.null, m.decid)
 # Analysis of Variance Table
 # Model 1: SpeciesTotal ~ 1
 # Model 2: SpeciesTotal ~ decid.percent
 # Res.Df RSS Df Sum of Sq
 #1 136 169.12
 # 2 135 156.80 1 12.321 10.608 0.001424 **
 # Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 '' 1
#### null vs. mixed forest model
##### p value is sig
anova(m.null, m.mixed)
 # Analysis of Variance Table
 # Model 1: SpeciesTotal ~ 1
 # Model 2: SpeciesTotal ~ mixed.forest.percent
 # Res.Df RSS Df Sum of Sq F Pr(>F)
 #1 136 169.12
 # 2 135 127.16 1 41.961 44.547 5.888e-10 ***
#### Model comparison
### anova() only allows you to compare 1 model at a time
### AIC allows you to compare multiple models at the
### same time
library(bbmle)
AICtab(m.null,
   m.decid,
    m.mixed)
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### BOth mixed and decid slopes sig but
#### m.mixed fits the data much better (delta AIC much more then 2)
      dAIC df
 # m.mixed 0.0 3
 # m.decid 28.7 3
 # m.null 37.12
### Summary of "best" model
#### Use summary() command to get slopes, SEs, R^2 etc
summary(m.mixed)
## Key output pasted below
   # Coefficients:
   # Estimate Std. Error t value Pr(>|t|)
   # (Intercept)
                     # mixed.forest.percent 16.1218 2.4155 6.674 5.89e-10 ***
   # Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 '' 1
   # Residual standard error: 0.9705 on 135 degrees of freedom
   # Multiple R-squared: 0.2481,
                                     Adjusted R-squared: 0.2425
   # F-statistic: 44.55 on 1 and 135 DF, p-value: 5.888e-10
### Create focal figure
#### Scatterplot with regression line for best model
##### Error band is 95% confidence interval
ggscatter(data = BBS PA PIWO 4,
     y = "SpeciesTotal",
     x = "mixed.forest.percent",
     add = "reg.line",
     conf.int = TRUE,
     xlab = "Percent mixed forest landcover",
     ylab = "Number of PIWO observed on BBS route")
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