World_insects_estimate

Load libraries and ../Data

```
library(SpadeR)
library(dplyr)
library(stringr)
library(pairwiseCI)
#library(remotes)
#install_version("CARE1", "1.1.0")
library(CARE1)
## Load Data
#Microgastrinae
reared <- read.csv("../Data/Microgastrinae ACG Reared.csv") %>%
  select(BOLD.code, Frequency)
core <- read.csv("../Data/Microgastrinae ACG Core Malaise.csv") %>%
  select(BOLD.code, Frequency)
peri <- read.csv(".../Data/Microgastrinae ACG Peripheral Malaise.csv") %>%
  select(BOLD.code, Frequency)
# All insecta core
insc <- read.csv("../Data/Insecta ACG Core Malaise.csv") %>%
  select(BOLD.code, Frequency)
## highlight estimator
estimator <- " iChao1 (Chiu et al. 2014)"
```

```
## adding in the trees

#TA = number of tree species in ACG
TA <- 1500

#Tc = number of tree species in CR

TC <- 2500
#Tw = number of tree species on Earth

## estimated tree species

TW <- 73274
TW_CI <- c(73271, 73276)

## described number of tree species

TW_d <- 60065

### Number of Saturniid moths

SA <- 106
SW <- 4535</pre>
```

Approach 1: Calculate insect richness worldwide using the CARE estimator for Microgastrinae

```
### Total number of BINS
reared %>% nrow()

[1] 886

core %>% nrow()

[1] 388
```

```
peri %>% nrow()
[1] 576
###
```

Step 1: Combining Malaise and Reared samples of Microgastrinae and estimating the true richness of ACG Microgastrinae

```
full_micro_table <- reared %>%
    rename(reared = Frequency) %>%
    full_join(rename(core, core = Frequency)) %>%
    full_join(rename(peri, peri = Frequency)) %>%
    mutate(reared = ifelse(is.na(reared), 0, 1)) %>%
    mutate(core = ifelse(is.na(core), 0, 1)) %>%
    mutate(peri = ifelse(is.na(peri), 0, 1))
Joining with `by = join_by(BOLD.code)`
Joining with `by = join_by(BOLD.code)`
  head(full_micro_table)
    BOLD.code reared core peri
1 BOLD: AAA1266
                   1
2 BOLD: AAA1634
                   1
                         1
                              1
3 BOLD:AAA2143
                   1
                             0
                   1 0 0
4 BOLD: AAA2511
5 BOLD: AAA2668
                             0
6 BOLD: AAA3229
  nrow(full_micro_table)
[1] 1411
```

```
# Transform observed ../Data to CARE1 input format
micro_care <- as.record(full_micro_table[,-1])
micro_care</pre>
```

001 010 011 100 101 110 111 246 133 146 663 114 39 70

Main step to obtain population size estimates
CARE1.print(micro_care)

Warning in ni/nhat: Recycling array of length 1 in vector-array arithmetic is deprecated. Use c() or as.vector() instead.

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Use c() or as.vector() instead.

(1) NUMBER OF IDENTIFIED CASES IN EACH LIST:

n1 n2 n3 886 388 576

(2) ESTIMATES BASED ON ANY PAIR OF SAMPLES:

Petersen Chapman se cil ciu pa12 3154 3136 236 2725 3655 pa13 2774 2765 149 2501 3087 pa23 1035 1033 37 970 1115

Note1: Refer to Seber(1982,pages 59 and 60) for Petersen estimator and Chapman estimators as well as s.e formula.

Note2: A log-transformation is used is used to obtain the confidence interval so that the lower limit is always greater than the number of ascertained. Refer to Chao(1987, Biometrics, 43, 783-791) for the construction of the confidence interval.

(3) SAMPLE COVERAGE APPROACH:

M D Chat est se cil ciu

```
Nhat-0 1411 1063.667 0.494 2153 67 2033 2297
Nhat 1411 1063.667 0.494 3480 575 2624 4942
Nhat-1 1411 1063.667 0.494 2402 101 2224 2621
```

Warning: The estimated sample coverage(overlapping information)is too low so that Nhat is unstable. Recommend the use of Nhat-0 or Nhat-1. Parameter estimates:

```
u1 u2 u3 r12 r13 r23
Nhat-0 0.41 0.18 0.27 -0.32 -0.22 1.08
Nhat 0.25 0.11 0.17 0.10 0.25 2.36
Nhat-1 0.37 0.16 0.24 -0.24 -0.13 1.32
```

Definitions for the sample coverage approach:

estimate of N.

M: number of individuals ascertained in at least one list.

D: the average of the number of invididuals listed in the combination of any two lists omitting the other one.

C^: sample coverage estimate, see Equation (14) of Chao and Tsay(1998). est: population size estimate.

se: estimated standard error of the population size estimation based on bootstrap replications.

cil: 95% confidence interval lower limit(using a log-transformation).

ciu: 95% confidence interval upper limit(using a log-transformation).

Nhat: Population size estimate for sufficiently high sample coverage cases, see Equation (20) of Chao and Tsay (1998).

Nhat-1: One-step population size estimate for low sample coverage cases; see Equation (2.21) of Chao et al. (1996). This estimator is suggested for use when the estimated se of Nhat is relatively large. u1,u2,u3: estimated mean probabilities depending on the estimate of N. r12,r13,r23 etc.: estimated coefficient of covariation(CCV) depending on the

```
# Print the CARE1 input format

## n1 = reared = 886
## n2 = core = 388
## n3 = peripheral = 576

## Using Nhat-1

Nhat1 <- round(estN(micro_care, method = "LSC", se = TRUE, nboot = 200))</pre>
```

```
micro_all_estimate <- Nhat1[1]
micro_all_CI <- c(Nhat1[3], Nhat1[4])</pre>
```

Step 2. Estimating the undersampling ratio for Core Microgastrinae.

```
## proportion of core malaise of the ichao total
proportion_core <- nrow(core)/micro_all_estimate
proportion_core

[1] 0.1615321

CI_proportion_core <- nrow(core)/micro_all_CI
CI_proportion_core</pre>
```

[1] 0.1746175 0.1479222

Step 3 Calculate total number of insects in ACG

```
## Total number of insecta bins in ACG core malaise
n_insects_core <- nrow(insc)
n_insects_core

[1] 53945

total_insec_acg <- n_insects_core*(1/proportion_core)
total_insec_acg</pre>
```

```
CI_total_insect_acg <- n_insects_core*(1/round(CI_proportion_core,3))</pre>
  n_insects_core*(1/round(CI_proportion_core,3))
[1] 308257.1 364493.2
  n_insects_core*(1/CI_proportion_core)
[1] 308932.4 364684.9
  CI_total_insect_acg
[1] 308257.1 364493.2
Step 4. Estimating global insect richness – based on trees
  ##### Total insects
  print("Total world insects estimated tree richness")
[1] "Total world insects estimated tree richness"
  total_insect_world <- (TW*total_insec_acg)/TA</pre>
  total_insect_world
[1] 16313649
  CI_total_insect_world <- (TW*CI_total_insect_acg)/TA</pre>
  CI_total_insect_world
[1] 15058156 17805252
```

```
print("Total world insects described trees")
[1] "Total world insects described trees"
  total_insect_world <- (TW_d*total_insec_acg)/TA</pre>
  total_insect_world
[1] 13372811
  CI_total_insect_world <- (TW_d*CI_total_insect_acg)/TA</pre>
  CI_total_insect_world
[1] 12343644 14595524
Step 4. Estimating global insect richness – based on saturniid moths
  ##### Total insects
  print("Total world insects")
[1] "Total world insects"
  total_insect_world <- (SW*total_insec_acg)/SA</pre>
  total_insect_world
[1] 14287752
  CI_total_insect_world <- (SW*CI_total_insect_acg)/SA</pre>
  CI_total_insect_world
[1] 13188171 15594121
```

Approach 2: Calculate insect richness worldwide using the Chao estimator for Microgastrinae and for ACG malaise insects

Step 1: Combining Malaise and Reared samples of Microgastrinae and estimating the true richness of ACG Microgastrinae

```
full_micro_table <- reared %>%
    rename(reared = Frequency) %>%
    full_join(rename(core, core = Frequency)) %>%
    full_join(rename(peri, peri = Frequency)) %>%
    mutate(reared = ifelse(is.na(reared), 0, 1)) %>%
    mutate(core = ifelse(is.na(core), 0, 1)) %>%
    mutate(peri = ifelse(is.na(peri), 0, 1))
Joining with `by = join_by(BOLD.code)`
Joining with `by = join_by(BOLD.code)`
  head(full_micro_table)
    BOLD.code reared core peri
1 BOLD: AAA1266 1
2 BOLD: AAA1634
                  1 1
                  1 0
3 BOLD: AAA2143
                  1 0 0
4 BOLD: AAA2511
5 BOLD: AAA2668
6 BOLD:AAA3229 1 0 1
  nrow(full_micro_table)
[1] 1411
  # Transform observed ../Data to CARE1 input format
  micro_care <- as.record(full_micro_table[,-1])</pre>
  micro_care
001 010 011 100 101 110 111
246 133 146 663 114 39 70
```

Main step to obtain population size estimates
CARE1.print(micro_care)

Warning in ni/nhat: Recycling array of length 1 in vector-array arithmetic is deprecated. Use c() or as.vector() instead.

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(1) NUMBER OF IDENTIFIED CASES IN EACH LIST:

n1 n2 n3 886 388 576

(2) ESTIMATES BASED ON ANY PAIR OF SAMPLES:

Petersen Chapman se cil ciu pa12 3154 3136 236 2725 3655 pa13 2774 2765 149 2501 3087 pa23 1035 1033 37 970 1115

Note1: Refer to Seber(1982,pages 59 and 60) for Petersen estimator and Chapman estimators as well as s.e formula.

Note2: A log-transformation is used is used to obtain the confidence interval so that the lower limit is always greater than the number of ascertained. Refer to Chao(1987, Biometrics, 43, 783-791) for the construction of the confidence interval.

(3) SAMPLE COVERAGE APPROACH:

M D Chat est se cil ciu Nhat-0 1411 1063.667 0.494 2153 68 2032 2299 Nhat 1411 1063.667 0.494 3480 506 2701 4730 Nhat-1 1411 1063.667 0.494 2402 93 2236 2603

Warning: The estimated sample coverage(overlapping information)is too low so that Nhat is unstable. Recommend the use of Nhat-0 or Nhat-1. Parameter estimates:

u1 u2 u3 r12 r13 r23 Nhat-0 0.41 0.18 0.27 -0.32 -0.22 1.08

```
Nhat 0.25 0.11 0.17 0.10 0.25 2.36
Nhat-1 0.37 0.16 0.24 -0.24 -0.13 1.32
```

Definitions for the sample coverage approach: M: number of individuals ascertained in at least one list. D: the average of the number of invididuals listed in the combination of any two lists omitting the other one. C^: sample coverage estimate, see Equation (14) of Chao and Tsay(1998). est: population size estimate. se: estimated standard error of the population size estimation based on bootstrap replications. cil: 95% confidence interval lower limit(using a log-transformation). ciu: 95% confidence interval upper limit(using a log-transformation). Nhat: Population size estimate for sufficiently high sample coverage cases, see Equation (20) of Chao and Tsay (1998). Nhat-1: One-step population size estimate for low sample coverage cases; see Equation (2.21) of Chao et al. (1996). This estimator is suggested for use when the estimated se of Nhat is relatively large. u1,u2,u3: estimated mean probabilities depending on the estimate of N. r12,r13,r23 etc.: estimated coefficient of covariation(CCV) depending on the estimate of N.

```
# Print the CARE1 input format

## n1 = reared = 886
## n2 = core = 388
## n3 = peripheral = 576

## Using Nhat-1

Nhat1 <- round(estN(micro_care, method = "LSC", se = TRUE, nboot = 200))
micro_all_estimate <- Nhat1[1]
micro_all_CI <- c(Nhat1[3], Nhat1[4])</pre>
```

Step 2. Estimating the undersampling ratio for Core Microgastrinae.

```
## proportion of core malaise of the ichao total
proportion_core <- nrow(core)/micro_all_estimate
proportion_core

[1] 0.1615321

CI_proportion_core <- nrow(core)/micro_all_CI
CI_proportion_core</pre>
```

Step 3 Estimate using iChao1 total number of insects in ACG

Estimate 522589.5

```
lower.Estimate upper.Estimate
      483639.7
                     566503.3
Step 4. Estimating global insect richness – based on trees
  ##### Total insects
  print("Total insects estimated tree richness ")
[1] "Total insects estimated tree richness "
  total_insect_world <- (TW*total_insec_acg$estimate)/TA</pre>
  total_insect_world
Estimate
25528149
  CI_total_insect_world <- (TW*total_insec_acg$conf.int)/TA</pre>
  CI_total_insect_world
lower.Estimate upper.Estimate
      23625478
                     27673310
  print("Total insects described tree richness")
[1] "Total insects described tree richness"
  total_insect_world <- (TW_d*total_insec_acg$estimate)/TA</pre>
  total_insect_world
Estimate
20926226
```

total_insec_acg\$conf.int

Step 4. Estimating global insect richness – based saturniidae moths

```
##### Total insects

total_insect_world <- (SW*total_insec_acg$estimate)/SA
total_insect_world

Estimate
22357957

CI_total_insect_world <- (SW*total_insec_acg$conf.int)/SA
CI_total_insect_world

lower.Estimate upper.Estimate
20691567 24236723</pre>
```

Additional Information

For Pooled Microgastrinae CV and Sample Coverage: 1-[number singletons]/[number specimens].

```
### Combine all microgastrinae

micro_all <- rbind(reared, core, peri) %>%
  group_by(BOLD.code) %>%
  summarise(new_freq = sum(Frequency)) %>%
  select(BOLD.code, new_freq)

## number of pooled micros
```

```
nrow(micro_all)
[1] 1411
  ## use chao on microgastrinae
  micro_all_estimate <- ChaoSpecies(micro_all$new_freq,"abundance",k=10,conf=0.95)
  micro_all_estimate$Species_table[estimator,]
Estimate
             s.e. 95%Lower 95%Upper
           35.582 1846.715 1986.466
1911.739
  ## from spade R
  micro_all_estimate$Basic_data_information[c("
                                                     CV for entire ../Dataset",
                                                      Coverage estimate for entire ../Dataset")
     Variable Value
NA
         <NA> <NA>
NA.1
         <NA> <NA>
  ## based on coverage spreadsheet
  total_bins <- nrow(micro_all)</pre>
  total_bins
[1] 1411
  total_singletons_micro_all <- sum(micro_all$new_freq ==1)</pre>
  total_singletons_micro_all
[1] 406
  total_doubletons_micro_all <- sum(micro_all$new_freq ==2)</pre>
  total_doubletons_micro_all
[1] 202
```

```
# total samples
  sum(micro_all$new_freq)
[1] 21708
  coverage_micro_all <- 1-(total_singletons_micro_all/sum(micro_all$new_freq))</pre>
  coverage_micro_all
[1] 0.9812972
  CV_micro_all <- sd(micro_all$new_freq)/mean(micro_all$new_freq)</pre>
  CV_micro_all
[1] 2.990786
Sample Coverage For Core Malaise Microgastrinae.
  ## from Spade R
  micro_core_estimate <- ChaoSpecies(core$Frequency, "abundance", k=10, conf=0.95)</pre>
                                                       CV for entire ../Dataset",
  micro_core_estimate$Basic_data_information[c("
                                                       Coverage estimate for entire ../Dataset")
     Variable Value
NA
         <NA> <NA>
NA.1
         <NA> <NA>
  ## calculating from the spreadsheet
  total_bins <- nrow(core)</pre>
  total_bins
```

[1] 388

```
total_singletons_core <- sum(core$Frequency ==1)</pre>
  total_singletons_core
[1] 176
  total_doubletons_core <- sum(core$Frequency ==2)</pre>
  total_doubletons_core
[1] 54
  # total samples
  sum(core$Frequency)
[1] 3781
  coverage_core <- 1-(total_singletons_core/sum(core$Frequency))</pre>
  coverage_core
[1] 0.9534515
  CV_core <- sd(core$Frequency)/mean(core$Frequency)</pre>
  CV_core
[1] 3.322479
Sample Coverage For Core Insecta
  ## from spade R
  insc_acg_estimate$Basic_data_information[c("
                                                     CV for entire ../Dataset",
                                                       Coverage estimate for entire ../Dataset")
     Variable Value
NA
         <NA> <NA>
NA.1
         <NA> <NA>
```

```
insecta <- read.csv("../Data/Insecta ACG Core Malaise.csv")</pre>
  ## from the spreadsheet
  total_bins <- nrow(insecta)</pre>
  total_bins
[1] 53945
  total_singletons_insecta <- sum(insecta$Frequency ==1)</pre>
  total_singletons_insecta
[1] 19374
  total_doubletons_insecta <- sum(insecta$Frequency ==2)</pre>
  {\tt total\_doubletons\_insecta}
[1] 7402
  coverage_insecta <- 1-(total_singletons_insecta/sum(insecta$Frequency))</pre>
  coverage_insecta
[1] 0.9881422
  CV_insecta <- sd(insecta$Frequency)/mean(insecta$Frequency)</pre>
  CV_insecta
[1] 8.956866
```

Number of singletons and sample coverage for Core Malaise for each taxonomic level (Braconidae, Ichneumonoidea, and Hymenoptera).

Braconidae

```
braconidae <- read.csv("../Data/Braconidae ACG Core Malaise.csv")</pre>
  ## from the spreadsheet
  total_bins <- nrow(braconidae)</pre>
  total_bins
[1] 2160
  total_singletons_braconidae <- sum(braconidae$Frequency ==1)</pre>
  total_singletons_braconidae
[1] 1022
  total_doubletons_braconidae <- sum(braconidae$Frequency ==2)</pre>
  total_doubletons_braconidae
[1] 342
  ## total number of samples
  sum(braconidae$Frequency)
[1] 15108
  coverage_braconidae <- 1-(total_singletons_braconidae/sum(braconidae$Frequency))</pre>
  coverage_braconidae
[1] 0.9323537
  CV_braconidae <- sd(braconidae$Frequency)/mean(braconidae$Frequency)</pre>
  CV_braconidae
[1] 3.270035
```

Ichneumonoidea

```
ichneumonoidea <- read.csv("../Data/Ichneumonoidea ACG Core Malaise.csv")
  ## from the spreadsheet
  total_bins <- nrow(ichneumonoidea)</pre>
  total_bins
[1] 3402
  total_singletons_ichneumonoidea <- sum(ichneumonoidea$Frequency ==1)</pre>
  total_singletons_ichneumonoidea
[1] 1496
  total_doubletons_ichneumonoidea <- sum(ichneumonoidea$Frequency ==2)
  total_doubletons_ichneumonoidea
[1] 530
  ## total number of samples
  sum(ichneumonoidea$Frequency)
[1] 33207
  coverage_ichneumonoidea <- 1-(total_singletons_ichneumonoidea/sum(ichneumonoidea$Frequency
  coverage_ichneumonoidea
[1] 0.9549493
  CV_ichneumonoidea <- sd(ichneumonoidea$Frequency)/mean(ichneumonoidea$Frequency)</pre>
  CV_ichneumonoidea
[1] 3.862408
```

Hymenoptera

```
hymenoptera <- read.csv("../Data/Hymenoptera ACG Core Malaise.csv")</pre>
  ## from the spreadsheet
  total_bins <- nrow(hymenoptera)</pre>
  total_bins
[1] 13934
  total_singletons_hymenoptera <- sum(hymenoptera$Frequency ==1)</pre>
  total_singletons_hymenoptera
[1] 5689
  total_doubletons_hymenoptera <- sum(hymenoptera$Frequency ==2)</pre>
  total_doubletons_hymenoptera
[1] 2061
  ## total number of samples
  sum(hymenoptera$Frequency)
[1] 235248
  coverage_hymenoptera <- 1-(total_singletons_hymenoptera/sum(hymenoptera$Frequency))</pre>
  coverage_hymenoptera
[1] 0.975817
  CV_hymenoptera <- sd(hymenoptera$Frequency)/mean(hymenoptera$Frequency)</pre>
  CV_hymenoptera
[1] 7.55354
```