Statistical Analyses for Van Meter et al 2016

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intro

Statistical analysis and results presentation and discussion for total concentrations of parent active ingredients (atrazine, imidacloprid, fipronil, triadimenon, pendimethalin).

```
## [1] "R version 3.0.2 (2013-09-25)"
##
## Attaching package: 'dplyr'
##
## The following object is masked from 'package:MASS':
##
       select
##
##
## The following objects are masked from 'package:stats':
##
##
       filter, lag
##
##
  The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
```

data prep

```
## [1] "Day" "Row" "Column" "Pesticide" "SoilType" "## [6] "BodyBurden" "Soil" "Weight" "Total" "Formulation" ## [11] "Parent"
```

```
## [1] "integer"
  ##
 ## [246] 3 3 3 3 3 3 3 0 0 0 0 1 1 1 1 1 1 1 1
## Levels: 0 1 2 3
## [1] "integer"
##
  [1] \ 1 \ 1 \ 3 \ 5 \ 6 \ 7 \ 1 \ 2 \ 2 \ 4 \ 5 \ 7 \ 1 \ 1 \ 2 \ 5 \ 6 \ 6 \ 1 \ 2 \ 4 \ 5 \ 5 \ 7 \ 1 \ 1 \ 3 \ 5 \ 6 \ 7 \ 1 \ 2 \ 2 \ 4 \ 5
  [36] \ 7 \ 1 \ 1 \ 2 \ 5 \ 6 \ 6 \ 1 \ 2 \ 4 \ 5 \ 5 \ 7 \ 1 \ 1 \ 3 \ 5 \ 6 \ 7 \ 1 \ 2 \ 2 \ 4 \ 5 \ 7 \ 1 \ 1 \ 2 \ 5 \ 6 \ 6 \ 1 \ 2 \ 4 \ 5 
##
## [71] 5 7 1 1 3 5 6 7 1 2 2 4 5 7 1 1 2 5 6 6 1 2 4 5 5 7 1 2 5 6 6 7 2 2 4
## [106] 4 6 7 1 1 4 7 7 7 2 3 5 6 6 7 1 1 4 7 7 7 2 3 5 6 6 7 1 1 4 7 7 7 2 3
## [141] 5 6 6 7 1 1 2 4 5 7 2 2 2 5 6 7 1 3 4 4 6 6 1 3 5 6 6 7 1 1 2 4 5 7 2
## [176] 2 2 5 6 7 1 3 4 4 6 6 1 3 5 6 6 7 1 1 2 4 5 7 2 2 2 5 6 7 1 3 4 4 6 6
## [211] 1 3 5 6 6 7 1 1 2 4 5 7 2 2 2 5 6 7 1 3 4 4 6 6 1 3 5 6 6 7 2 3 3 4 5
## [246] 7 1 3 3 5 5 5 1 1 4 7 7 7 2 3 5 6 6 7
## Levels: 1 2 3 4 5 6 7
## [1] "factor"
## [1] "factor"
## [1] "factor"
## [1] "numeric"
## [1] "numeric"
## [1] "numeric"
## [1] "integer"
##
  ## Levels: 0 1
## [1] "integer"
```

```
## [141] 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 1 1 1 1 1 1 1 1 1 1 1 1 1 0 0 0 0 0 0
## [176] 0 0 0 0 0 1 1 1 1 1 1 1 1 1 1 1 1 1 0 0 0 0 0 0 0 0 0 0 0 0 1 1 1 1 1 1 1
## [211] 1 1 1 1 1 1 0 0 0 0 0 0 0 0 0 0 0 1 1 1 1 1 1 1 1 1 1 1 1 0 0 0 0 0
## [246] 0 0 0 0 0 0 0 1 1 1 1 1 1 1 1 1 1 1 1
## Levels: 0 1
## [1] "integer"
 ## Levels: 0 1
```

koc data

```
[1] ATZTOT
                 ATZDEA
                          STAUGDEA ATZDIA
                                            STAUGDIA ATZ
                                                               Imid
## [8] FipTOT
                          FipS
                                   TNDTOT
                                            TDLA
                                                      STRIKEA
                                                               TDLB
                 Fip
## [15] STRIKEB TDN
                          Pendi
## 17 Levels: ATZ ATZDEA ATZDIA ATZTOT Fip FipS FipTOT Imid ... TNDTOT
## [1] PLE OLS
## Levels: OLS PLE
```

summary stats for exposure data

Summary statistics for data set.

```
str(frog.soil)
## 'data.frame':
                    264 obs. of 16 variables:
  $ Pesticide
                            : Factor w/ 17 levels "ATZ", "ATZDEA", ...: 1 1 1 1 1 1 1 1 1 1 1 ...
                            : Factor w/ 2 levels "OLS", "PLE": 1 1 1 1 1 1 1 1 1 1 ...
   $ SoilType
                            : Factor w/ 4 levels "0", "1", "2", "3": 3 3 3 3 3 3 3 3 3 3 ...
##
   $ Day
                            : Factor w/ 7 levels "1", "2", "3", "4", ...: 2 4 5 7 1 2 4 5 5 7 ...
## $ Row
## $ Column
                            : Factor w/ 10 levels "","A","B","C",..: 10 3 9 6 6 8 10 2 8 5 ...
                            : num 0.728 0.27 0.237 1.9 0.566 ...
## $ BodyBurden
## $ Soil
                            : num 16.6 12.3 21.6 29.2 14.2 ...
## $ Weight
                            : num 11.1 12 17.4 11.8 11.1 ...
                            : Factor w/ 2 levels "0", "1": 1 1 1 1 1 1 1 1 1 1 ...
## $ Total
## $ Formulation
                            : Factor w/ 2 levels "0", "1": 1 1 1 1 2 2 2 2 2 2 ...
```

```
## $ Parent
                           : Factor w/ 2 levels "0", "1": 2 2 2 2 2 2 2 2 2 2 ...
## $ bowlbcf
                           : num 0.044 0.022 0.011 0.065 0.0398 ...
## $ surface area total
                          : num 4.57 4.76 5.91 4.71 4.55 ...
## $ surface_area_footprint: num 3.3 3.5 4.82 3.46 3.28 ...
## $ expKoc
                          : num NA NA NA NA NA NA NA NA NA ...
## $ litKoc
                            : num NA NA NA NA NA NA NA NA NA ...
head(frog.soil)
     Pesticide SoilType Day Row Column BodyBurden
                                                     Soil Weight Total
## 1
          ATZ
                   OLS
                         2
                             2
                                    I 0.7282998 16.55151 11.1447
## 2
                                    B 0.2703513 12.28110 11.9615
          ATZ
                   OLS
                         2
## 3
          ATZ
                   OLS
                         2
                             5
                                    H 0.2365494 21.60190 17.3882
                                                                      0
                   OLS
                         2
                             7
                                    E 1.8995641 29.24066 11.7687
## 4
          ATZ
                                                                      0
## 5
          ATZ
                   OLS
                         2
                             1
                                    E 0.5662302 14.23919 11.0822
                                                                      0
## 6
          ATZ
                   OLS
                         2
                             2
                                    G 1.9850391 19.48325 10.0690
   Formulation Parent
                         bowlbcf surface_area_total surface_area_footprint
## 1
              0
                     1 0.04400201
                                            4.567885
                                                                   3.299112
## 2
              0
                     1 0.02201361
                                            4.758833
                                                                   3.503537
## 3
              0
                     1 0.01095040
                                            5.909763
                                                                   4.815101
## 4
              0
                     1 0.06496310
                                                                   3.455478
                                            4.714269
## 5
              1
                     1 0.03976562
                                            4.553036
                                                                   3.283379
## 6
              1
                     1 0.10188442
                                            4.307167
                                                                   3.026407
## expKoc litKoc
## 1
        NA
               NA
## 2
        NA
## 3
               NA
        NA
## 4
        NA
               NA
## 5
        NA
               NA
## 6
        NA
               NA
#View(frog.soil.total.ai)
#using dplyr
frog.soil.group <- group_by(frog.soil, Pesticide, SoilType, Formulation, Parent)</pre>
str(frog.soil.group)
## Classes 'grouped_df', 'tbl_df', 'tbl' and 'data.frame': 264 obs. of 16 variables:
                           : Factor w/ 17 levels "ATZ", "ATZDEA", ...: 1 1 1 1 1 1 1 1 1 1 ...
## $ Pesticide
                           : Factor w/ 2 levels "OLS", "PLE": 1 1 1 1 1 1 1 1 1 1 ...
## $ SoilType
                           : Factor w/ 4 levels "0", "1", "2", "3": 3 3 3 3 3 3 3 3 3 3 ...
## $ Day
## $ Row
                           : Factor w/ 7 levels "1", "2", "3", "4", ...: 2 4 5 7 1 2 4 5 5 7 ...
                           : Factor w/ 10 levels "", "A", "B", "C", ...: 10 3 9 6 6 8 10 2 8 5 ...
## $ Column
## $ BodyBurden
                           : num 0.728 0.27 0.237 1.9 0.566 ...
## $ Soil
                           : num 16.6 12.3 21.6 29.2 14.2 ...
## $ Weight
                           : num 11.1 12 17.4 11.8 11.1 ...
## $ Total
                           : Factor w/ 2 levels "0", "1": 1 1 1 1 1 1 1 1 1 1 ...
## $ Formulation
                          : Factor w/ 2 levels "0", "1": 1 1 1 1 2 2 2 2 2 2 ...
## $ Parent
                          : Factor w/ 2 levels "0", "1": 2 2 2 2 2 2 2 2 2 2 ...
                           : num 0.044 0.022 0.011 0.065 0.0398 ...
## $ bowlbcf
## $ surface area total
                          : num 4.57 4.76 5.91 4.71 4.55 ...
## $ surface_area_footprint: num 3.3 3.5 4.82 3.46 3.28 ...
## $ expKoc
                          : num NA NA NA NA NA NA NA NA NA ...
                           : num NA NA NA NA NA NA NA NA NA ...
## $ litKoc
```

```
- attr(*, "vars")=List of 4
##
    ..$: symbol Pesticide
##
    ..$ : symbol SoilType
    ..$ : symbol Formulation
##
##
    ..$ : symbol Parent
##
   - attr(*, "drop")= logi TRUE
   - attr(*, "indices")=List of 44
    ..$: int 0 1 2 3 10 11
##
##
    ..$: int 456789
##
    ..$: int 18 19 20 21 22 23
    ..$: int 12 13 14 15 16 17
     ..$: int 24 25 26 27 28 29
##
    ..$: int 30 31 32 33 34 35
##
##
    ..$: int 36 37 38 39 40 41
##
    ..$: int 42 43 44 45 46 47
##
     ..$: int 48 49 56 57 58 59
##
    ..$: int 50 51 52 53 54 55
    ..$: int 60 61 62 63 64 65
##
##
     ..$: int 66 67 68 69 70 71
     ..$: int 72 73 74 75 76 77
##
##
    ..$: int 78 79 80 81 82 83
##
    ..$: int 84 85 86 87 88 89
    ..$ : int 90 91 92 93 94 95
##
##
    ..$: int 96 97 98 99 100 101
##
    ..$: int 102 103 104 105 106 107
    ..$: int 108 109 110 111 112 113
##
     ..$: int 114 115 116 117 118 119
##
     ..$: int 120 121 122 123 124 125
##
    ..$: int 126 127 128 129 130 131
    ..$: int 132 133 134 135 136 137
##
     ..$: int 138 139 140 141 142 143
##
    ..$: int 144 145 146 147 148 149
##
    ..$: int 150 151 152 153 154 155
##
     ..$: int 156 157 158 159 160 161
##
     ..$: int 162 163 164 165 166 167
##
    ..$: int 168 169 170 171 172 173
##
    ..$: int 174 175 176 177 178 179
##
    ..$: int 180 181 182 183 184 185
##
    ..$: int 186 187 188 189 190 191
    ..$: int 192 193 194 195 196 197
##
##
    ..$: int 198 199 200 201 202 203
##
     ..$: int 204 205 206 207 208 209
     ..$: int 210 211 212 213 214 215
##
    ..$: int 216 217 218 219 220 221
    ..$: int 222 223 224 225 226 227
##
    ..$: int 228 229 230 231 232 233
    ..$: int 234 235 236 237 238 239
##
##
    ..$: int 246 247 248 249 250 251
    ..$: int 240 241 242 243 244 245
    ..$: int 252 255 256 257 258 259
##
    ..$ : int 253 254 260 261 262 263
##
   - attr(*, "group_sizes")= int 6 6 6 6 6 6 6 6 6 ...
   - attr(*, "biggest_group_size")= int 6
## - attr(*, "labels")='data.frame': 44 obs. of 4 variables:
```

```
..$ Pesticide : Factor w/ 17 levels "ATZ", "ATZDEA", ..: 1 1 1 1 2 2 3 3 4 4 ...
##
##
     ..$ SoilType : Factor w/ 2 levels "OLS", "PLE": 1 1 2 2 1 2 1 2 1 1 ...
     ..$ Formulation: Factor w/ 2 levels "0","1": 1 2 1 2 1 1 1 1 1 2 ...
##
     ..$ Parent : Factor w/ 2 levels "0", "1": 2 2 2 2 1 1 1 1 2 2 ...
##
     ..- attr(*, "vars")=List of 4
##
##
     ....$ : symbol Pesticide
     ....$ : symbol SoilType
##
     ....$ : symbol Formulation
     ....$ : symbol Parent
frog.soil.group
## Source: local data frame [264 x 16]
## Groups: Pesticide, SoilType, Formulation, Parent
##
      Pesticide SoilType Day Row Column BodyBurden
                                                        Soil Weight Total
## 1
            ATZ
                     OLS
                           2
                               2
                                      I 0.7282998 16.551513 11.1447
## 2
            ATZ
                     OLS
                           2
                               4
                                      B 0.2703513 12.281098 11.9615
                                                                         0
## 3
            ATZ
                     OLS
                           2
                             5
                                      H 0.2365494 21.601898 17.3882
                                                                         0
                     OLS
## 4
            ATZ
                           2 7
                                      E 1.8995641 29.240663 11.7687
                                                                         0
## 5
           ATZ
                     OLS
                           2 1
                                      E 0.5662302 14.239191 11.0822
                                                                         0
## 6
           ATZ
                     OLS
                           2
                             2
                                      G 1.9850391 19.483245 10.0690
                                                                         0
## 7
           ATZ
                     OLS
                           2 4
                                      I 0.2670444 18.094682 11.0174
                                                                         0
## 8
           ATZ
                     OLS
                           2 5
                                      A 0.2356130 18.492963 12.3638
           ATZ
                                      G 0.3124082 7.940987 10.1878
## 9
                     OLS
                           2
                              5
                                                                         0
## 10
            ATZ
                     OLS
                           2
                              7
                                      D 0.2438387 16.933410 11.5272
                                                                         0
## ..
                     ## Variables not shown: Formulation (fctr), Parent (fctr), bowlbcf (dbl),
##
     surface_area_total (dbl), surface_area_footprint (dbl), expKoc (dbl),
##
     litKoc (dbl)
frog.soil.means <- summarise(frog.soil.group,</pre>
            count = n(),
            FrogMean = mean(BodyBurden),
            FrogSD = sd(BodyBurden),
            SoilMean = mean(Soil),
            SoilSD = sd(Soil)
  )
frog.soil.means
## Source: local data frame [44 x 9]
## Groups: Pesticide, SoilType, Formulation
##
##
      Pesticide SoilType Formulation Parent count
                                                    FrogMean
## 1
                     OLS
                                                6 0.81375385 0.654947835
            ATZ
                                   0
                                          1
## 2
            ATZ
                     OLS
                                   1
                                                6 0.60169561 0.688861900
## 3
            ATZ
                     PLE
                                   0
                                                6 0.43815022 0.230781640
                                          1
## 4
            ATZ
                     PLE
                                                6 0.52394830 0.336497915
                                   1
                                          1
        ATZDEA
                                                6 0.56841980 0.853934956
## 5
                     OLS
                                   0
                                          0
## 6
        ATZDEA
                     PLE
                                  0
                                          0
                                                6 0.11582458 0.098357479
                                  0
## 7
        ATZDIA
                     OLS
                                          Λ
                                                6 0.56823951 0.846310211
## 8
        ATZDIA
                     PLE
                                   0
                                                6 0.07990814 0.074451822
## 9
        ATZTOT
                     OLS
                                   0
                                          1
                                                6 1.95041316 2.301128614
```

```
## 10
         ATZTOT
                      OLS
                                     1
                                                    6 0.82672856 0.663118510
## 11
         ATZTOT
                      PLE
                                                    6 0.63388293 0.354753198
                                     0
## 12
         ATZTOT
                      PLE
                                     1
                                                    6 0.69718557 0.337418123
## 13
                      OLS
                                     0
                                                    6 0.09692212 0.050364156
             Fip
                                             1
## 14
            Fip
                      PLE
                                     0
                                             1
                                                    6 0.05474889 0.033710850
## 15
           FipS
                      OLS
                                             0
                                     0
                                                    6 0.06154416 0.031688542
## 16
           FipS
                      PLE
                                             0
                                                    6 0.03365841 0.025023420
                                     0
         FipTOT
## 17
                      OLS
                                     0
                                             1
                                                    6 0.15846628 0.078824431
                                                    6 0.08840730 0.055028527
## 18
         FipTOT
                      PLE
                                     0
                                             1
## 19
           Imid
                      OLS
                                     0
                                             1
                                                    6 0.03531090 0.021642805
## 20
           Imid
                      PLE
                                     0
                                             1
                                                    6 0.04027054 0.025656606
## 21
                      OLS
                                     0
                                                    6 3.69828962 2.012556828
          Pendi
                                             1
## 22
          Pendi
                      OLS
                                             1
                                                    6 1.73652917 1.007560748
                                     1
## 23
          Pendi
                                     0
                                                    6 2.94789191 1.421463716
                      PLE
                                             1
## 24
          Pendi
                      PLE
                                                    6 3.03225651 1.606078090
                                     1
                                             1
## 25
       STAUGDEA
                      OLS
                                      1
                                             0
                                                    6 0.09659701 0.065142138
## 26
       STAUGDEA
                      PLE
                                             0
                                                    6 0.09044778 0.036584069
                                     1
## 27
       STAUGDIA
                      OLS
                                     1
                                                    6 0.12843594 0.118047484
       STAUGDIA
## 28
                      PLE
                                                    6 0.08278948 0.026913238
                                             0
                                     1
## 29
        STRIKEA
                      OLS
                                     1
                                             0
                                                    6 0.04013783 0.057736717
## 30
        STRIKEA
                      PLE
                                     1
                                             0
                                                    6 0.01052381 0.021706468
## 31
        STRIKEB
                      OLS
                                                    6 0.08923070 0.102226784
                                     1
## 32
        STRIKEB
                      PLE
                                             0
                                                    6 0.03710196 0.041024425
                                     1
## 33
                      OLS
                                     0
                                             0
                                                    6 0.07845052 0.046822014
           TDLA
## 34
           TDLA
                      PLE
                                     0
                                             0
                                                    6 0.02754424 0.041536786
## 35
           TDLB
                      OLS
                                     0
                                             0
                                                    6 0.16031762 0.070661612
## 36
           TDLB
                      PLE
                                     0
                                             0
                                                    6 0.08023899 0.054961891
## 37
            TDN
                      OLS
                                     0
                                             1
                                                    6 0.08926025 0.042368742
## 38
             TDN
                      OLS
                                             1
                                                    6 0.05391972 0.007921897
                                     1
## 39
             TDN
                      PLE
                                     0
                                             1
                                                    6 0.07315779 0.031544457
## 40
             TDN
                      PLE
                                     1
                                             1
                                                    6 0.05642193 0.024150822
## 41
         TNDTOT
                      OLS
                                     0
                                             1
                                                    6 0.32802839 0.107117899
## 42
         TNDTOT
                      OLS
                                     1
                                                    6 0.18390695 0.153054256
## 43
         TNDTOT
                      PLE
                                     0
                                                    6 0.18201386 0.124224013
                                             1
         TNDTOT
                      PLE
                                     1
                                             1
                                                    6 0.11034839 0.063776177
## Variables not shown: SoilMean (dbl), SoilSD (dbl)
```

```
#View(frog.soil.means)

#Merge means and other statistics back into larger file.
frog.soil <- merge(frog.soil,frog.soil.means)

#treatment bcf
frog.soil$treatbcf <- frog.soil$BodyBurden/frog.soil$SoilMean</pre>
```

Setup of the main data set frog.soil:

```
dim(frog.soil)
```

[1] 264 22

```
264 obs. of 22 variables:
## 'data.frame':
    $ Pesticide
                             : Factor w/ 17 levels "ATZ", "ATZDEA", ...: 1 1 1 1 1 1 1 1 1 1 ...
   $ SoilType
                             : Factor w/ 2 levels "OLS", "PLE": 1 1 1 1 1 1 1 1 1 1 ...
                             : Factor w/ 2 levels "0", "1": 1 1 1 1 1 2 2 2 2 ...
##
    $ Formulation
    $ Parent
                             : Factor w/ 2 levels "0", "1": 2 2 2 2 2 2 2 2 2 2 ...
##
                             : Factor w/ 4 levels "0", "1", "2", "3": 3 3 3 3 3 3 3 3 3 3 ...
##
  $ Day
                             : Factor w/ 7 levels "1", "2", "3", "4", ...: 2 4 5 7 1 2 1 2 5 7 ...
  $ Row
                            : Factor w/ 10 levels "", "A", "B", "C", ...: 10 3 9 6 3 7 6 8 8 5 ...
## $ Column
```

\$ BodyBurden : num 0.728 0.27 0.237 1.9 0.472 ...
\$ Soil : num 16.6 12.3 21.6 29.2 29.7 ...
\$ Weight : num 11.14 11.96 17.39 11.77 9.56 ...
\$ Total

\$ Total : Factor w/ 2 levels "0","1": 1 1 1 1 1 1 1 1 1 1 1 ...

\$ bowlbcf : num 0.044 0.022 0.011 0.065 0.0159 ... ## \$ surface_area_total : num 4.57 4.76 5.91 4.71 4.18 ... ## \$ surface_area_footprint: num 3.3 3.5 4.82 3.46 2.9 ...

\$ FrogMean : num 0.814 0.814 0.814 0.814 0.814 ... ## \$ FrogSD : num 0.655 0.655 0.655 0.655 ... ## \$ SoilMean : num 21.2 21.2 21.2 21.2 21.2 ... ## \$ SoilSD : num 7.08 7.08 7.08 7.08 ...

\$ treatbcf : num 0.0344 0.0128 0.0112 0.0897 0.0223 ...

conditional data sets for subset analyses

Create additional subsets.

[1] "Pesticide"

[3] "Formulation"

str(frog.soil)

```
## [1] 96 22
    [1] "Pesticide"
                                   "SoilType"
##
    [3] "Formulation"
                                   "Parent"
   [5] "Day"
                                   "Row"
   [7] "Column"
                                   "BodyBurden"
##
   [9] "Soil"
                                   "Weight"
## [11] "Total"
                                   "bowlbcf"
## [13] "surface_area_total"
                                   "surface_area_footprint"
                                   "litKoc"
## [15] "expKoc"
## [17] "count"
                                   "FrogMean"
## [19] "FrogSD"
                                   "SoilMean"
## [21] "SoilSD"
                                   "treatbcf"
## [1] 60 22
```

"SoilType"
"Parent"

```
## [9] "Soil"
                                  "Weight"
## [11] "Total"
                                  "bowlbcf"
                                 "surface_area_footprint"
## [13] "surface_area_total"
## [15] "expKoc"
                                  "litKoc"
## [17] "count"
                                 "FrogMean"
## [19] "FrogSD"
                                 "SoilMean"
## [21] "SoilSD"
                                 "treatbcf"
## [1] 48 22
## [1] "Pesticide"
                                  "SoilType"
##
   [3] "Formulation"
                                 "Parent"
                                 "Row"
## [5] "Day"
                                 "BodyBurden"
## [7] "Column"
## [9] "Soil"
                                 "Weight"
## [11] "Total"
                                 "bowlbcf"
## [13] "surface area total"
                                 "surface_area_footprint"
## [15] "expKoc"
                                 "litKoc"
## [17] "count"
                                  "FrogMean"
## [19] "FrogSD"
                                 "SoilMean"
                                 "treatbcf"
## [21] "SoilSD"
```

statistical analyses (anova, etc.)

Analysis of total analyte concentrations data set.

Pesticide

```
###################
#analyses
##################
#randomized block design for bowlbcfs
bowlbcf.total.aov <- aov(bowlbcf ~ Pesticide + SoilType + Formulation +</pre>
                          surface_area_total + expKoc, data = frog.soil.total)
summary(bowlbcf.total.aov)
##
                     Df Sum Sq Mean Sq F value
                                                 Pr(>F)
## Pesticide
                      4 0.8852 0.22130 16.231 5.76e-10 ***
## SoilType
                     1 0.0262 0.02617 1.919 0.169
                    1 0.0300 0.03000 2.200
## Formulation
                                                  0.142
## surface_area_total 1 0.0062 0.00615 0.451
                                                  0.504
                     1 0.0005 0.00051 0.038
## expKoc
                                                  0.847
## Residuals
                   87 1.1862 0.01363
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
#randomized block design for bowlbcfs
treatbcf.total.aov <- aov(treatbcf ~ Pesticide + SoilType + Formulation +</pre>
                          surface_area_total + expKoc, data = frog.soil.total)
summary(treatbcf.total.aov)
                     Df Sum Sq Mean Sq F value
```

4 0.6790 0.16975 23.153 4.73e-13 ***

Pr(>F)

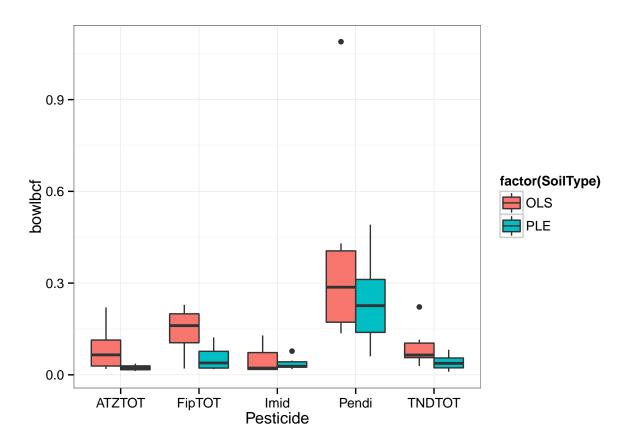
```
## SoilType
                      1 0.0131 0.01306
                                        1.781
                                                 0.186
## Formulation
                                                 0.163
                      1 0.0145 0.01451
                                        1.979
                                                 0.162
## surface_area_total 1 0.0146 0.01459
                                        1.990
## expKoc
                      1 0.0077 0.00772
                                        1.053
                                                 0.308
## Residuals
                     87 0.6379 0.00733
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

A paired comparison design is implemented to examine the impacts of soil type and surface area. The paired comparison design is essentially a randomized block design where the blocking variable (pesticides) has size 2 and is therefore treated as a nuisance variable. This accounts for the large variation in treatment application rates across the different pesticides tested. The paired comparison design on the bowl bcf finds soil type significant, but not amphibian surface area.

We evaluate 3 different ways: with bowlbcfs, where each frog tissue concentration is divided by its soil concentration, mean bcf, where each frog tissue concentration is divided by the mean of the soil concentrations for that treatment, and by body.burden where soil concentration is used as an additional covariate.

```
# is imidacloprid being factored in correctly for the aov
bowlbcf.total.ai.aov <- aov(bowlbcf ~ Pesticide + SoilType + surface_area_total + expKoc,
                             data = frog.soil.total.ai)
summary(bowlbcf.total.ai.aov)
##
                     Df Sum Sq Mean Sq F value
                                                 Pr(>F)
## Pesticide
                      4 0.6372 0.15929
                                         9.456 8.03e-06 ***
## SoilType
                      1 0.0821 0.08211
                                         4.875
                                                 0.0317 *
## surface_area_total 1 0.0015 0.00154
                                         0.091
                                                 0.7638
## expKoc
                      1 0.0304 0.03035
                                         1.802
                                                 0.1853
## Residuals
                     52 0.8759 0.01684
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# more significant if imidacloprid is dropped (but not necessary)
bowlbcf.total.noimid.aov <- aov(bowlbcf ~ Pesticide + SoilType + surface_area_total,
                                 data = frog.soil.total.noimid)
summary(bowlbcf.total.noimid.aov)
##
                     Df Sum Sq Mean Sq F value
                                                 Pr(>F)
## Pesticide
                      3 0.5563 0.18543 8.857 0.000115 ***
## SoilType
                      1 0.0961 0.09613
                                         4.592 0.037968 *
                                         0.006 0.936840
## surface_area_total 1 0.0001 0.00013
## Residuals
                     42 0.8793 0.02094
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

qplot(Pesticide, bowlbcf, fill=factor(SoilType), data=frog.soil.total.ai, geom="boxplot", position="dod



```
## Pesticide 4 0.4257 0.10642 18.180 1.87e-09 ***

## SoilType 1 0.0644 0.06438 10.999 0.00165 **

## expKoc 1 0.0201 0.02012 3.438 0.06928 .

## Residuals 53 0.3102 0.00585

## ---

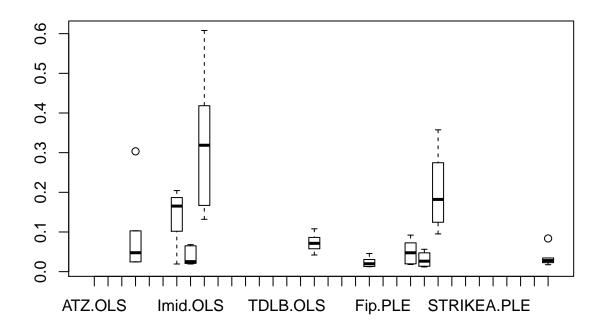
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

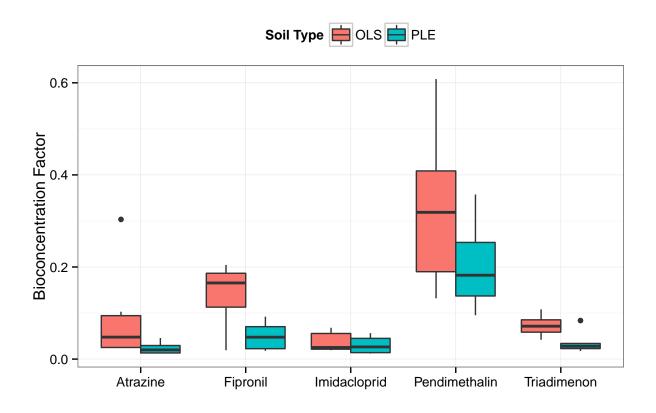
```
model.tables(treatbcf.total.ai.aov)
```

```
## Warning in replications(paste("~", xx), data = mf): non-factors ignored:
## expKoc

## Tables of effects
##
## Pesticide
## Pesticide
```

```
ATZTOT FipTOT
                       Imid
                              Pendi
## -0.04343 -0.00611 -0.06732 0.16376 -0.04691
##
##
  SoilType
## SoilType
##
       OLS
               PI.F.
   0.03276 -0.03276
##
##
   expKoc
## expKoc
     1.733
             2.303
                      2.556
                              2.634
                                       2.864
                                                3.01
                                                       3.025
                                                                3.645
  0.03371 0.01133 0.01813 -0.01133 0.00399 -0.00823 0.00823 -0.01813
##
     4.242
             6.425
## -0.00399 -0.03371
#for reporting - http://www.bodowinter.com/tutorial/bw_anova_general.pdf
#soiltype
\# p = 0.00165, F = 10.999, df1 = 1, df2 = 53
#tukey as anova post-hoc proxy
TukeyHSD(treatbcf.total.ai.aov)
## Warning in replications(paste("~", xx), data = mf): non-factors ignored:
## expKoc
## Warning in TukeyHSD.aov(treatbcf.total.ai.aov): 'which' specified some
## non-factors which will be dropped
##
    Tukey multiple comparisons of means
      95% family-wise confidence level
##
##
## Fit: aov(formula = treatbcf ~ Pesticide + SoilType + expKoc, data = frog.soil.total.ai)
##
## $Pesticide
                       diff
                                   lwr
                                              upr
                                                     p adj
## FipTOT-ATZTOT 0.037321911 -0.05088198 0.12552581 0.7542455
## Imid-ATZTOT
               -0.023891382 -0.11209528 0.06431251 0.9394943
## Pendi-ATZTOT
                ## TNDTOT-ATZTOT -0.003481293 -0.09168519 0.08472260 0.9999639
## Imid-FipTOT
               -0.061213293 -0.14941719 0.02699060 0.2996226
## Pendi-FipTOT
                ## TNDTOT-FipTOT -0.040803204 -0.12900710 0.04740069 0.6884923
## Pendi-Imid
                ## TNDTOT-Imid
                0.020410089 -0.06779381 0.10861398 0.9652483
## TNDTOT-Pendi -0.210671229 -0.29887512 -0.12246733 0.0000001
##
## $SoilType
                diff
                           lwr
                                       upr
                                              p adj
## PLE-OLS -0.06551572 -0.1051385 -0.02589299 0.0016508
#figure 1 of Van Meter et al. manuscript
#pdf(paste(frogsoildir, "rvm2016_fig1.pdf", sep=""))
```





some additional stuff we did not use

```
#Bartlett test to test the null hypothesis of equal group variances
bartlett.test(treatbcf ~ Pesticide, data =frog.soil.total.ai)
##
##
   Bartlett test of homogeneity of variances
##
## data: treatbcf by Pesticide
## Bartlett's K-squared = 44.5486, df = 4, p-value = 4.935e-09
#no sale! for pesticides
bartlett.test(treatbcf ~ SoilType, data = frog.soil.total.ai)
##
    Bartlett test of homogeneity of variances
##
##
## data: treatbcf by SoilType
## Bartlett's K-squared = 7.5497, df = 1, p-value = 0.006002
#also rejected for soil type, but not grouped by pesticide
```

```
#the oneway.test() applies a Welch correction for nonhomogeneity
oneway.test(treatbcf ~ Pesticide + SoilType, data =frog.soil.total.ai)
##
##
   One-way analysis of means (not assuming equal variances)
##
## data: treatbcf and Pesticide + SoilType
## F = 6.0442, num df = 9.000, denom df = 20.078, p-value = 0.0003999
#nonparameteric kruskal test
kruskal.test(treatbcf ~ Pesticide, data =frog.soil.total.ai)
##
   Kruskal-Wallis rank sum test
##
##
## data: treatbcf by Pesticide
## Kruskal-Wallis chi-squared = 27.9798, df = 4, p-value = 1.259e-05
kruskal.test(treatbcf ~ SoilType, data =frog.soil.total.ai)
##
## Kruskal-Wallis rank sum test
##
## data: treatbcf by SoilType
## Kruskal-Wallis chi-squared = 7.0035, df = 1, p-value = 0.008135
treatbcf.total.noimid.aov <- aov(treatbcf ~ Pesticide + SoilType + surface_area_total,</pre>
                                  data = frog.soil.total.noimid)
summary(treatbcf.total.noimid.aov)
##
                     Df Sum Sq Mean Sq F value
## Pesticide
                      3 0.3577 0.11924 16.072 4.18e-07 ***
                      1 0.0771 0.07711 10.394 0.00245 **
## SoilType
## surface_area_total 1 0.0014 0.00142 0.192 0.66354
## Residuals
                     42 0.3116 0.00742
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

We can also consider the pairwise t-test. For this we need the means of the pesticide treatements by soil for the test. Doesn't make any sense.