Persistence Experiments

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Analysis of Persistence Experiments

Dataset A

```
# Read in A data
my.dat = read_xlsx("dat/Counts_data.xlsx", sheet = "A")
# only use the persistence experiments for Groups 1 & 2. Groups 3-6 do not
# have enough replicates to be meaningful
persist.dat = my.dat %>% filter(
      Substrate != 'Cott01' &
      Experiment %in% c(1,2) &
      ObservationType != 'Ndata') %>%
 select(c("Substrate", "ObservationType", "Count", "Mass (g)", "TransferTime (s)",
           "PersistenceTime (min)", "Experiment", "Replicate")) %>%
 dplyr::rename(Mass = `Mass (g)`,
        TransferTime = `TransferTime (s)`,
         PersistenceTime = `PersistenceTime (min)`)
# fix column types
persist.dat$Count = as.numeric(persist.dat$Count)
persist.dat$PersistenceTime = as.numeric(persist.dat$PersistenceTime)
persist.dat$Experiment = as.character(persist.dat$Experiment)
persist.dat$Replicate = as.character(persist.dat$Replicate)
# some errors in the data, fix
persist.dat[persist.dat$Substrate == 'wool01', 'Substrate'] <- 'Wool'</pre>
persist.dat[persist.dat$Substrate == 'Wool01', 'Substrate'] <- 'Wool'</pre>
persist.dat[persist.dat$Substrate == 'Nylo01', 'Substrate'] <- 'Nylon'</pre>
persist.dat[persist.dat$Substrate == 'Wool' & persist.dat$Experiment == '2', 'Substrate'] <- 'Nylon'
# summarise the count data
summ.dat = summarySE(persist.dat, measurevar = "Count", groupvars = c("Substrate", "PersistenceTime",
                                                                        "Experiment"))
knitr::kable(head(summ.dat), caption = "Summary of A Persistence Data")
```

Table 1: Summary of A Persistence Data

Substrate	PersistenceTime	Experiment	N	Count	sd	se	ci
Nylon	0	2	6	49.83333	24.449267	9.981371	25.657932
Nylon	30	2	6	30.33333	22.033308	8.995060	23.122539
Nylon	60	2	6	22.00000	14.615061	5.966574	15.337566
Nylon	120	2	6	15.00000	14.669697	5.988879	15.394903
Nylon	180	2	6	11.83333	9.907909	4.044887	10.397713
Nylon	360	2	6	3.50000	3.507136	1.431782	3.680513

```
p1 = ggplot(summ.dat, aes(x=PersistenceTime, y = Count, group = Substrate, colour =
                            Substrate, shape=Substrate)) +
  geom_point(position = position_dodge(0.3)) +
  geom_errorbar(aes(ymin = Count-se, ymax = Count+se), width = 0.08) +
  xlim(c(-5,1500)) +
  scale_y_continuous(breaks = seq(0,60,10)) +
  scale_color_brewer(palette = 'Paired') +
  labs(x = "Persistence Time (min)",
       y = "Particle Count",
       caption = "Error bars: std error") +
  mytheme +
  theme_pubr()
p2 = ggplot(summ.dat, aes(x=PersistenceTime, y = Count, group = Substrate, colour =
                            Substrate, shape=Substrate)) +
  geom_point(position = position_dodge(0.3)) +
  geom_errorbar(aes(ymin = Count-se, ymax = Count+se), width = 0.08) +
  scale_color_brewer(palette = 'Paired') +
  labs(x = "Persistence Time (min)",
       y = "Particle Count") +
  theme_pubr() +
  theme(axis.title = element_text(size = 8),
        axis.text = element_text(size = 8),
        legend.title = element_blank(),
        legend.position = 'NA')
p1 + annotation_custom(ggplotGrob(p2), xmin = 700, xmax = 1600,
                       ymin = 20, ymax = 65)
                                     Substrate - Nylon - Wool
                                                       60
    60
                                                     Particle Count
                                                       40
    50
Particle Count
                                                       20
    40
    30
                                                                    2500
                                                                              5000
                                                                                       7500
                                                                                                10000
                                                                       Persistence Time (min)
    20
    10
     0
            0
                                      500
                                                                  1000
                                                                                              1500
                                         Persistence Time (min)
```

Figure S1: Particle count for Nylon and Wool as receiver materials

Error bars: std error

```
# ideas taken from http://douglas-watson.github.io/post/2018-09_exponential_curve_fitting/
# and https://dataconomy.com/2017/08/nonlinear-least-square-nonlinear-regression-r/
set.seed(12345)
ny.fit = nls(Count ~ SSasymp(PersistenceTime, Countf, Count0, log_alpha),
             data = summ.dat,
             subset = Substrate == 'Nylon')
ny.fit.err = summ.dat$Count-predict(ny.fit)
ny.nlm_error <- sqrt(mean(ny.fit.err^2))</pre>
ny.fit
## Nonlinear regression model
##
    model: Count ~ SSasymp(PersistenceTime, Countf, Count0, log_alpha)
##
      data: summ.dat
      Countf CountO log_alpha
##
##
       2.060
                47.063
                        -4.458
## residual sum-of-squares: 52.85
##
## Number of iterations to convergence: 0
## Achieved convergence tolerance: 5.673e-06
The residual error is: 6.42217
pts = seq(0,max(summ.dat$PersistenceTime),length=200)
gg.fit = data.frame(y=predict(ny.fit, data.frame(PersistenceTime = pts)), x= pts)
p1 = ggplot(summ.dat[summ.dat$Substrate == 'Nylon',], aes(x = PersistenceTime, y = Count)) +
  labs(
       x = "Persistence Time (min)",
       y = "Particle Count") +
  geom_point(colour = '#a6cee3') +
  geom_errorbar(aes(ymin = Count-se, ymax = Count+se), width = 0.08, data =
                  summ.dat[summ.dat$Substrate == 'Nylon',], colour = '#a6cee3') +
  geom_line(aes(x = x, y = y), data = gg.fit, colour = '#a6cee3') +
  xlim(c(-5,1500)) +
  mytheme +
  theme_pubr()
p2 = ggplot(summ.dat[summ.dat$Substrate == 'Nylon',], aes(x = PersistenceTime, y = Count)) +
  labs(x = "Persistence Time (min)",
       y = "Particle Count") +
  geom_point(colour = '#a6cee3') +
  geom_errorbar(aes(ymin = Count-se, ymax = Count+se), width = 0.08, data =
                  summ.dat[summ.dat$Substrate == 'Nylon',], colour = '#a6cee3') +
  geom_line(aes(x = x, y = y), data = gg.fit, colour = '#a6cee3') +
  theme_pubr() +
  theme(axis.title = element_text(size = 8),
        axis.text = element_text(size = 8),
        legend.title = element_blank(),
        legend.position = 'NA')
nplt <- p1 + annotation_custom(ggplotGrob(p2), xmin = 700, xmax = 1600,</pre>
                       ymin = 20, ymax = 65)
nplt
```

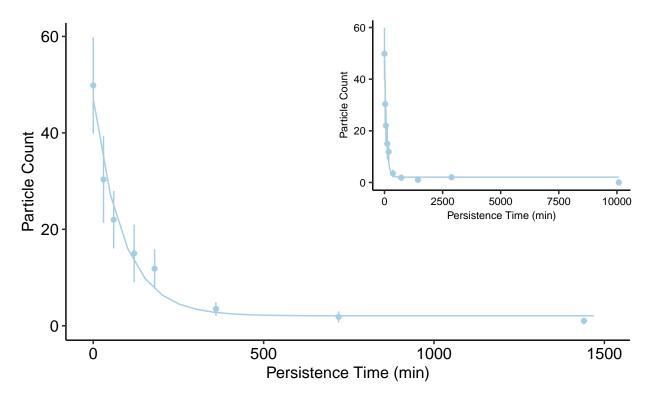


Figure S2: Curve fitting for Nylon as receiver material.

```
wl.fit = nls(Count ~ SSasymp(PersistenceTime, Countf, Count0, log_alpha),
             data = summ.dat,
             subset = Substrate == 'Wool')
wl.fit.err = summ.dat$Count-predict(wl.fit)
wl.nlm_error <- sqrt(mean(wl.fit.err^2))</pre>
wl.fit
## Nonlinear regression model
     model: Count ~ SSasymp(PersistenceTime, Countf, Count0, log_alpha)
##
##
      data: summ.dat
      Countf
                CountO log_alpha
       1.908
                27.132
##
                          -4.449
   residual sum-of-squares: 38.19
##
##
## Number of iterations to convergence: 0
## Achieved convergence tolerance: 4.898e-06
Residual error: 6.42218
# generate more points for smooth regression line
pts = seq(0,max(summ.dat$PersistenceTime),length=200)
gg.fit = data.frame(y=predict(wl.fit, data.frame(PersistenceTime = pts)), x= pts)
p1 = ggplot(summ.dat[summ.dat$Substrate == 'Wool',], aes(x = PersistenceTime, y = Count)) +
 labs(
       x = "Persistence Time (min)",
       y = "Particle Count",
       caption = "Error bars: std error") +
```

```
geom_point(colour = '#1f78b4') +
      geom_errorbar(aes(ymin = Count-se, ymax = Count+se), width = 0.08,
                                               data = summ.dat[summ.dat$Substrate == 'Wool',], colour = '#1f78b4') +
      geom_line(aes(x = x, y = y), data = gg.fit, colour = '#1f78b4') +
      xlim(c(-5,1500)) +
     mytheme +
      theme_pubr()
p2 = ggplot(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ.dat(summ
     labs(
                    x = "Persistence Time (min)",
                    y = "Particle Count") +
      geom_point(colour = '#1f78b4') +
      geom_errorbar(aes(ymin = Count-se, ymax = Count+se), width = 0.08,
                                               data = summ.dat[summ.dat$Substrate == 'Wool',], colour = '#1f78b4') +
      geom\_line(aes(x = x, y = y), data = gg.fit, colour = '#1f78b4') +
      theme_pubr()
      theme(axis.title = element_text(size = 8),
                        axis.text = element_text(size = 8),
                       legend.title = element_blank(),
                       legend.position = 'NA')
wplt = p1 + annotation_custom(ggplotGrob(p2), xmin = 700, xmax = 1600,
                                                                    ymin = 10, ymax = 40)
wplt
                                                                                                                                                                 30
                                                                                                                                                         Particle Count
            30
                                                                                                                                                                20
  Particle Count
             20
                                                                                                                                                                                                                                  5000
                                                                                                                                                                                                                                                             7500
                                                                                                                                                                                                                                                                                       10000
                                                                                                                                                                                                     2500
                                                                                                                                                                                                              Persistence Time (min)
             10
                0
                                                                                                                500
                                                                                                                                                                                               1000
                                   0
                                                                                                                                                                                                                                                                                 1500
                                                                                                                        Persistence Time (min)
```

Figure S3: Curve fitting for Wool as receiver material.

```
arrplot = ggarrange(nplt + rremove('x.title'), wplt, labels = c('A', 'B'), nrow = 2)
#ggsave("persistence.png", arrplot, height = 4.5, units = 'in')
arrplot
```

Error bars: std error

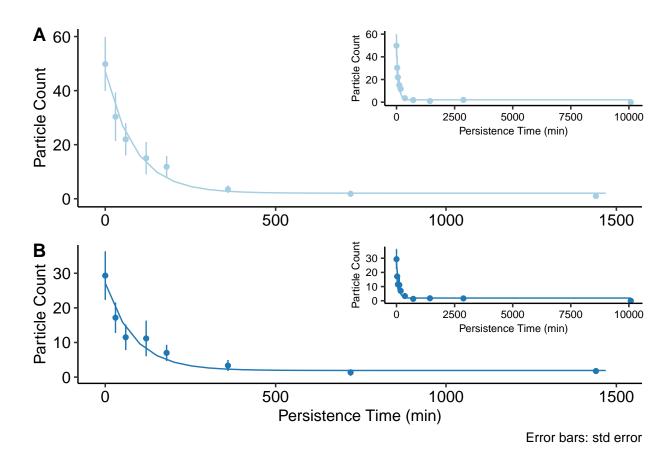


Figure S4: Comparison between (A) Nylon and (B) Wool as receiver materials

```
summ.dat$Experiment <- as.numeric(summ.dat$PersistenceTime)
cmp.fit.dat = summ.dat %>%
    group_by(Substrate) %>%
    do(fit = nls(Count ~ SSasymp(PersistenceTime, Countf, Count0, log_alpha), data = .)) %>%
    ungroup %>%
    mutate(fitCoef = map(fit,tidy)) %>%
    select(Substrate, fitCoef) %>%
    unnest(fitCoef) %>%
    select(Substrate, term, estimate) %>%
    spread(term, estimate) %>%
    mutate(alpha = exp(log_alpha))
knitr::kable(cmp.fit.dat)
```

Substrate	Count0	Countf	log_alpha	alpha
Nylon	47.06339	2.060017	-4.457615	0.0115900
Wool	27.13156	1.908363	-4.449466	0.0116848

Datasets B, C & D

No persistence data available. Data acquisition focussed on the transfer study only.

Dataset E

```
# Read in Em's data
my.dat = read_xlsx("dat/Counts_data.xlsx", sheet = "E", trim_ws = TRUE, col_types = "text")
# only use expts 7 & 8 as they're the only ones
# with persistence data. Plus for some reason
# the persistence replicates are numbered from 8
persist.dat = my.dat %>% filter(
     Substrate != 'Cott01' &
     Experiment %in% c(7,8) &
     Replicate > 7 &
     ObservationType != 'Ndata') %>%
  select(c("Substrate", "ObservationType", "Count", "Mass (g)",
           "PersistenceTime (min)", "Experiment", "Replicate", "Note")) %>%
 dplyr::rename(Mass = `Mass (g)`,
        PersistenceTime = `PersistenceTime (min)`)
# fix column types
persist.dat$Count = as.numeric(persist.dat$Count)
persist.dat$PersistenceTime = as.numeric(persist.dat$PersistenceTime)
persist.dat$Experiment = as.character(persist.dat$Experiment)
persist.dat$Replicate = as.character(persist.dat$Replicate)
# summarise the count data
summ.dat = summarySE(persist.dat, measurevar = "Count",
                     groupvars = c("Substrate", "PersistenceTime", "Experiment", "Note"))
knitr::kable(summ.dat, caption = "Summary of E Persistence Data")
```

Table 3: Summary of E Persistence Data

Substrate	PersistenceTime	Experiment	Note	N	Count	sd	se	ci
Nylo01	0	7	C1	2	48.5	4.949747	3.5	44.47172
Nylo01	0	8	C2	2	84.0	16.970563	12.0	152.47446
Nylo01	30	7	C1	2	37.5	4.949747	3.5	44.47172
Nylo01	30	8	C2	2	76.0	7.071068	5.0	63.53102
Nylo01	60	7	C1	2	46.5	21.920310	15.5	196.94617
Nylo01	60	8	C2	2	81.5	2.121320	1.5	19.05931
Nylo01	120	7	C1	1	30.0	NA	NA	NaN
Nylo01	120	8	C2	1	78.0	NA	NA	NaN
Nylo01	180	7	C1	1	14.0	NA	NA	NaN
Nylo01	180	8	C2	1	52.0	NA	NA	NaN
Nylo01	360	7	C1	1	3.0	NA	NA	NaN
Nylo01	360	8	C2	1	8.0	NA	NA	NaN
Nylo01	720	7	C1	1	1.0	NA	NA	NaN
Nylo01	720	8	C2	1	8.0	NA	NA	NaN
Nylo01	1440	7	C1	2	5.5	6.363961	4.5	57.17792
Nylo01	1440	8	C2	2	8.0	11.313709	8.0	101.64964
Nylo01	2880	7	C1	1	2.0	NA	NA	NaN
Nylo01	2880	8	C2	1	3.0	NA	NA	NaN
Nylo01	10080	7	C1	1	0.0	NA	NA	NaN
Nylo01	10080	8	C2	1	0.0	NA	NA	NaN

Insufficient number of replicates for comprehensive analysis: only 2 replicates for 0, 30, 60 and 1440 minutes, all the other results are single-point.

```
summ.dat = persist.dat %>%
  group_by(Substrate, PersistenceTime, Note) %>%
  summarise(N = n(), Mean = mean(Count), Max = max(Count), Min = min(Count))

ggplot(summ.dat, aes(x=PersistenceTime, y = Mean, colour = Note)) +
  geom_point() +
  geom_linerange(aes(ymin = Min, ymax = Max)) +
  scale_color_brewer(palette = 'Paired') +
  xlim(c(-10, 1500)) +
  labs(title = "Nylon Persistence",
      subtitle = "By different camera settings",
      x = "Persistence Time (min)",
      y = "Particle Count",
      caption = "Error bars: min-max") +
  mytheme +
  theme_pubr()
```

Nylon Persistence By different camera settings

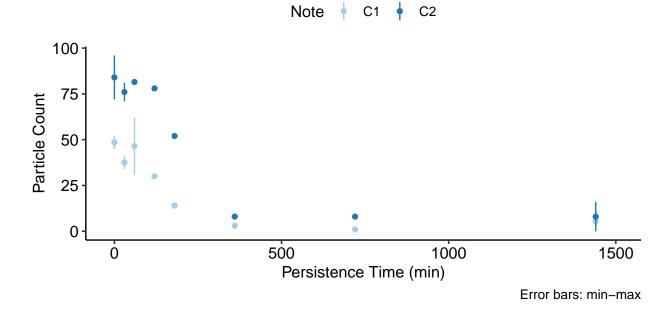


Figure S5: Nylon as receiver material, comparison between camera settings.