# **Standardizing Data**

Here are a few different ways we can scale the data, the first is using a loop, which are incredibly versatile BUT kinda tricky to wrap your head around. (Here is more info)[https://intro2r.com/prog r.html] on loops that is a good reference

## Loop

First, lets read in the data:

```
dat<- read.csv(
  here("Data", "Yellowtail", "2024Env-annual-yellowtail_GLORYS_UNSTANDARDIZED.csv")
)%>%
  filter(year>=1998&year<=2021) # lets filter the data so we dont have any missing values</pre>
```

Now, lets create a dataframe. We will "fill" this dataframe using a loop

```
stand_dat <-dat #using the same shape as dat will also let us retain the column names
```

Now we can create the actual loop:

```
#i is what we want the loop to iterate over, in this case i is columns. If we want the
# loop to loop over every column, we can start it at 1 and go to the total number
# of columns. ncol() is a function that counts the number of columns in a dataframe
# so in this case we will loop from column 1 to the last column

for(i in 1:ncol(dat)){
    stand_dat[,i]<- (dat[,i]-mean(dat[,i]))/sd(dat[,i])
}</pre>
```

Our stand\_dat dataframe now contains each column with a mean of 0 and standard deviation of 1. Lets check it...

#### colMeans(stand\_dat)

```
year
                     DDpre
                                                               DDpjuv
                                    DDegg
                                                 DDlarv
-9.251859e-18
              8.367150e-16 -2.151057e-16
                                           2.035409e-16 9.390636e-16
       DDben
                       Tcop
                                    Tpart
                                                MLDpart
                                                              MLDlarv
-1.292947e-15
              1.327642e-15 8.835525e-16 3.238150e-16 -3.469447e-16
                    CSTlarv
                                  CSTpjuv
                                                              LSTpjuv
     MLDpjuv
                                                LSTlarv
8.974303e-16
                            1.850372e-17 8.789266e-17 -2.220446e-16
              3.700743e-17
   hci1_larv
                 hci1_pjuv
                               hci2_larv
                                              hci2_pjuv
                                                              oni_pre
0.000000e+00 -1.249001e-16
                            0.000000e+00 -1.249001e-16 -1.850372e-17
     oni_larv
                  oni_pjuv
                                pdo_larv
                                               pdo_pjuv
                                                          lusi_annual
-1.850372e-17 2.312965e-17
                            7.401487e-17 -2.775558e-17 -3.654484e-16
     Z00pjuvN
                    Z00benN
                                 Z00pjuvS
                                                Z00benS
                                                                    Х
0.000000e+00 -6.013708e-17 3.238150e-17 -6.245005e-17 -9.251859e-18
 CutiSTIpjuv CutiTUMIpjuv
                                     Year BeutiTUMIpjuv
                                                               Year.1
2.312965e-17 2.914335e-16 -9.251859e-18 -7.401487e-17 -9.251859e-18
BeutiSTIpjuv
                    CHLpjuv
                                   PPpjuv
                                              bakun sti
-1.989150e-16 6.476301e-17 8.396062e-16 -1.850372e-17
```

## apply(stand\_dat, 2, sd)

year	DDpre	DDegg	DDlarv	DDpjuv
1	1	1	1	1
DDben	Tcop	Tpart	${ t MLDpart}$	${ t MLDlarv}$
1	1	1	1	1
MLDpjuv	CSTlarv	CSTpjuv	LSTlarv	LSTpjuv
1	1	1	1	1
hci1_larv	hci1_pjuv	hci2_larv	hci2_pjuv	oni_pre
1	1	1	1	1
oni_larv	oni_pjuv	pdo_larv	pdo_pjuv	lusi_annual
1	1	1	1	1
Z00pjuvN	Z00benN	Z00pjuvS	Z00benS	Х
1	1	1	1	1
CutiSTIpjuv	CutiTUMIpjuv	Year	${\tt BeutiTUMIpjuv}$	Year.1
1	1	1	1	1
BeutiSTIpjuv	$\mathtt{CHLpjuv}$	PPpjuv	bakun_sti	

The means of each column is pretty close to 0! And the sd is as well!

## **Apply**

Now you may have noticed that when calculating the sd of each function I used apply. Rather than writing a loop we could have just used this! Lets use it here to standardize the data...

```
stand_data_apply <- apply(dat, 2, scale)
head(stand_data_apply )</pre>
```

```
DDlarv
                                                                   DDben
                      DDpre
                                 DDegg
                                                       DDpjuv
           year
[1,] -1.6263456
                 2.79432823
                             2.0652425
                                        2.2468318
                                                   1.97182592
                                                               0.3776698
[2,] -1.4849242
                 0.03494097
                             0.2375537 -0.7622902 -0.91217826 -0.4744541
[3,] -1.3435029 -0.31874437 -0.1290300 0.1215045 -0.03340699 -0.9624530
[4,] -1.2020815 -0.67892077 -0.9378641 -0.4239759 -0.73198157 -0.6951369
[5,] -1.0606602 -0.79438257 -0.4608233 -0.9887974 -1.35184416 -0.6292660
[6,] -0.9192388 -0.23015000
                             MLDpart
           Tcop
                      Tpart
                                            MLDlarv
                                                       MLDpjuv
                                                                   CSTlarv
[1,]
     2.6666699
                 2.19889421
                             3.82323623
                                         3.39269147
                                                     0.1485115 -0.57884030
[2,]
     0.4379791 -0.85057733
                             1.06985511
                                                     1.0200999
                                         2.11898054
                                                                0.90561290
[3,] -0.5602335 -0.05980499 -0.51832950 -0.18220965 -1.0067481
                                                                0.15083688
[4,] -0.5305484 -0.42450685 -0.23769989 -0.53042904
                                                     0.2297167 -0.44020836
[5,] -0.6697892 -0.85819721 -0.38622627 -0.80924151
                                                     0.1426017
                                                                0.07036301
[6,] -1.9395112 0.97069017 -0.01705528 -0.04951702 -0.3553550
                                                                0.60915913
         CSTpjuv
                    LSTlarv
                               LSTpjuv
                                         hci1_larv
                                                     hci1_pjuv
                                                                 hci2_larv
[1,] -0.03802977
                  1.7264370
                            0.4889551 -1.56798699 -1.27115913 -1.56798699
[2,]
     0.94350146
                  1.4760473 -1.2856393
                                        1.25559625
                                                    1.19972209
                                                                1.25559625
                  0.2180359 -0.7130612
[3,]
     1.19176038
                                        0.09881201
                                                    0.06562815
                                                                0.09881201
[4,]
     0.38474393 -0.6262714 -0.5019289
                                        0.39967244
                                                    1.13446472
                                                                0.39967244
     0.53120956 -0.9255748 -1.3013491
                                        1.07861953
                                                    1.10480228
                                                                1.07861953
[6,] -0.10811819 -0.6993861 -0.1147803 -1.38296587 -0.50883443 -1.38296587
      hci2_pjuv
                    oni_pre
                              oni_larv
                                          oni_pjuv
                                                     pdo_larv
                                                                pdo_pjuv
[1,] -1.27115913
                  2.1429247
                             2.0090279 -0.05089855
                                                    1.9366648
                                                               0.3970298
[2,]
     1.19972209 -1.2653885 -1.2340431 -1.98712104 -0.5796399 -1.4867611
[3,]
     0.06562815 - 1.3052852 - 1.2961926 - 1.14365931 - 0.5104292 - 0.5346554
[4,]
      1.13446472 -0.5632076 -0.4374003 -0.18801302
                                                    0.2904379 -0.8282001
      1.10480228 -0.1083859
                             0.1727943
                                       1.41165577 -0.5697527 -0.2309005
[6,] -0.50883443
                  0.9893417
                             0.6756398 0.12361077
                                                    1.5461185
                                                               0.9994344
     lusi_annual
                     Z00pjuvN
                                 Z00benN
                                           Z00pjuvS
                                                       Z00benS
                                                                        X
[1,]
       1.0055400 -1.952427025 -0.3585604
                                         1.7126823
                                                     0.7954300 -1.6263456
[2,]
       1.5213590 -0.169297841
                               0.7000897 -0.7176185 -1.6095081 -1.4849242
[3,]
     -0.4682286 -0.004760062
                               1.2082420 -0.9834969 -0.9465854 -1.3435029
[4,]
       0.3791884
                  0.235604522
                               1.3160679 -0.9022688 -1.0887306 -1.2020815
[5,]
                 0.556019342
                               1.3121875 -0.8130939 -0.5867960 -1.0606602
       1.2266053
```

```
[6,] -0.3945401 -0.067985973 -0.4133460 0.5036207 -0.3517562 -0.9192388
    CutiSTIpjuv CutiTUMIpjuv
                                  Year BeutiTUMIpjuv Year.1 BeutiSTIpjuv
[1,]
    -0.1918014
                -0.4939859 -1.6263456 -1.568685313 -1.6263456
                                                                 -0.1790974
[2,]
      0.3504340
                   0.1430873 -1.4849242
                                        0.001992683 -1.4849242
                                                                  0.4387064
[3,]
    -0.7109629 -0.6343623 -1.3435029 -1.099932577 -1.3435029
                                                                 -0.7706116
[4,]
     -1.2993460
                  0.9778535 -1.2020815
                                         0.712209704 -1.2020815
                                                                 -1.4409943
[5,]
     -0.9878491 1.5685664 -1.0606602 1.339731782 -1.0606602
                                                                 -0.6785982
[6,]
      0.9157433
                   0.3323588 -0.9192388 -1.220105642 -0.9192388
                                                                  1.0827996
       CHLpjuv
                  PPpjuv bakun_sti
[1,] -1.9364182 -2.0454212 -1.5268571
[2,] -1.4005172 -1.0273683 -1.2167479
[3,] -0.7564655 -0.6926709 1.1090711
[4,] -0.8155079 -0.6337877 0.3854830
[5,] 2.2314761 2.3045496 -0.3381052
[6,] 0.6224340 0.9496238 0.2304284
```

Let's check, does the data from apply look the same as the data from the loop? You can use apply to also run a function across rows.

```
diff<-stand_data_apply - stand_dat
head(diff)</pre>
```

	year	DDpre	DDegg	DDlarv	DDpjuv	DDben	Тсор	Tpart
1	0	0	1.332268e-15	-1.332268e-15	0	2.609024e-15	-2.664535e-15	0
2	0	0	1.498801e-15	-6.661338e-16	0	2.498002e-15	-2.664535e-15	0
3	0	0	1.498801e-15	-8.465451e-16	0	2.331468e-15	-2.664535e-15	0
4	0	0	1.554312e-15	-7.216450e-16	0	2.442491e-15	-2.664535e-15	0
5	0	0	1.498801e-15	-6.661338e-16	0	2.442491e-15	-2.664535e-15	0
6	0	0	1.498801e-15	-9.992007e-16	0	2.525757e-15	-2.664535e-15	0
		MLDpar	rt MLDla:	rv MLDpjuv	I	CSTlarv	CSTpjuv	
1	1.776	3357e−1	15 2.220446e-	15 7.133183e-1	5 -5.55	1115e-16 -1.3	18390e-16	
2	1.110	)223e-1	15 2.220446e-	15 7.105427e-1	5 -4.440	0892e-16 -1.1	10223e-16	
3	7.77	1561e-1	16 2.775558e-	15 7.105427e-1	5 -5.273	3559e-16 -2.2	20446e-16	
4	8.049	9117e-1	16 2.886580e-	15 7.105427e-1	5 -5.55	1115e-16 -1.1	10223e-16	
5	7.216	3450e-1	16 2.886580e-	15 7.105427e-1	5 -5.134	4781e-16 -1.1	10223e-16	
6	8.326	3673e−1	16 2.754741e-	15 7.160939e-1	5 -5.55	1115e-16 -1.3	87779e-16	
		LSTla	arv LSTp	juv hci1_larv h	nci1_pji	uv hci2_larv	hci2_pjuv	
1	-4.4	40892e-	-16 7.216450e	-16 0		0 0	0	
2	-4.4	40892e-	-16 4.440892e	-16 0		0 0	0	
3	-2.49	98002e-	-16 5.551115e	-16 0		0 0	0	
4	-2.2	20446e-	-16 5.551115e	-16 0		0 0	0	
5	-1.1	10223e-	-16 4.440892e	-16 0		0 0	0	

```
6 -2.220446e-16 6.245005e-16
                                      0
                                                                     0
        oni_pre
                    oni_larv
                                   oni_pjuv
                                                 pdo_larv
                                                              pdo_pjuv
                              9.714451e-17
  0.000000e+00 0.000000e+00
                                             2.220446e-16 5.551115e-17
1
2
  0.000000e+00 0.000000e+00
                              2.220446e-16 -3.330669e-16 2.220446e-16
  0.000000e+00 0.000000e+00
3
                              0.000000e+00 -2.220446e-16 0.000000e+00
  0.000000e+00 5.551115e-17
                               1.110223e-16 -5.551115e-17 0.000000e+00
5 -1.387779e-17 8.326673e-17 -2.220446e-16 -2.220446e-16 8.326673e-17
  0.000000e+00 0.000000e+00
                              6.938894e-17 2.220446e-16 0.000000e+00
                  Z00pjuvN Z00benN Z00pjuvS
  lusi annual
                                                  ZOObenS X CutiSTIpjuv
1
            0 0.00000e+00
                                  0
                                           0 1.110223e-16 0 4.718448e-16
2
            0 2.775558e-17
                                  0
                                           0 2.220446e-16 0 4.996004e-16
3
                                  0
                                           0 1.110223e-16 0 3.330669e-16
            0 1.734723e-17
                                  0
4
            0 5.551115e-17
                                           0 0.000000e+00 0 4.440892e-16
5
            0 0.00000e+00
                                  0
                                           0 1.110223e-16 0 3.330669e-16
                                  0
            0 2.775558e-17
                                           0 5.551115e-17 0 5.551115e-16
 CutiTUMIpjuv Year BeutiTUMIpjuv Year.1 BeutiSTIpjuv
                                                              CHLpjuv PPpjuv
1 6.106227e-16
                  0 -1.110223e-15
                                        0 5.273559e-16 -1.332268e-15
                                                                           0
2 6.106227e-16
                  0 -1.004839e-15
                                        0 6.661338e-16 -1.110223e-15
                                                                           0
3 6.661338e-16
                  0 -8.881784e-16
                                        0 4.440892e-16 -1.110223e-15
                                                                           0
4 5.551115e-16
                  0 -9.992007e-16
                                        0 2.220446e-16 -1.221245e-15
                                                                           0
5 6.661338e-16
                  0 -8.881784e-16
                                        0 4.440892e-16 -1.332268e-15
                                                                           0
                  0 -8.881784e-16
                                        0 6.661338e-16 -1.221245e-15
6 5.551115e-16
                                                                           0
      bakun_sti
  0.000000e+00
1
2
  0.00000e+00
3
  0.000000e+00
  5.551115e-17
5 -5.551115e-17
  8.326673e-17
```

It sure does! The values are identical, so we know both work

#### Scale

Now a useful thing about scale is that you actually don't need to loop or apply because that functionality is built into it! We can scale columns using the function directly

```
scale_dat_scale <- scale(dat)
head(scale_dat_scale)</pre>
```

year DDpre DDegg DDlarv DDpjuv DDben

```
[1,] -1.6263456 2.79432823 2.0652425 2.2468318 1.97182592 0.3776698
[2,] -1.4849242   0.03494097   0.2375537   -0.7622902   -0.91217826   -0.4744541
[3,] -1.3435029 -0.31874437 -0.1290300 0.1215045 -0.03340699 -0.9624530
[4,] -1.2020815 -0.67892077 -0.9378641 -0.4239759 -0.73198157 -0.6951369
[5,] -1.0606602 -0.79438257 -0.4608233 -0.9887974 -1.35184416 -0.6292660
[6,] -0.9192388 -0.23015000 0.2453647 0.8054927 0.23617465 -0.2484564
                              MLDpart
                                          MLDlarv
                                                     MLDpjuv
          Tcop
                     Tpart
[1,] 2.6666699 2.19889421 3.82323623 3.39269147 0.1485115 -0.57884030
[2,] 0.4379791 -0.85057733 1.06985511 2.11898054 1.0200999 0.90561290
[3,] -0.5602335 -0.05980499 -0.51832950 -0.18220965 -1.0067481 0.15083688
[4,] -0.5305484 -0.42450685 -0.23769989 -0.53042904 0.2297167 -0.44020836
[5,] -0.6697892 -0.85819721 -0.38622627 -0.80924151 0.1426017 0.07036301
[6,] -1.9395112  0.97069017 -0.01705528 -0.04951702 -0.3553550  0.60915913
        CSTpjuv
                   LSTlarv
                             LSTpjuv
                                      hci1_larv hci1_pjuv
                                                             hci2 larv
[1,] -0.03802977 1.7264370 0.4889551 -1.56798699 -1.27115913 -1.56798699
[2,] 0.94350146 1.4760473 -1.2856393 1.25559625 1.19972209 1.25559625
[3,] 1.19176038 0.2180359 -0.7130612 0.09881201 0.06562815 0.09881201
[4,] 0.38474393 -0.6262714 -0.5019289 0.39967244 1.13446472 0.39967244
[5,] 0.53120956 -0.9255748 -1.3013491 1.07861953 1.10480228 1.07861953
[6,] -0.10811819 -0.6993861 -0.1147803 -1.38296587 -0.50883443 -1.38296587
      hci2 pjuv
                   oni_pre
                           oni_larv
                                        oni_pjuv
                                                 pdo_larv
                                                              pdo_pjuv
[1,] -1.27115913 2.1429247 2.0090279 -0.05089855 1.9366648 0.3970298
[2,] 1.19972209 -1.2653885 -1.2340431 -1.98712104 -0.5796399 -1.4867611
[3,] 0.06562815 -1.3052852 -1.2961926 -1.14365931 -0.5104292 -0.5346554
[4,] 1.13446472 -0.5632076 -0.4374003 -0.18801302 0.2904379 -0.8282001
[5,] 1.10480228 -0.1083859 0.1727943 1.41165577 -0.5697527 -0.2309005
[6,] -0.50883443  0.9893417  0.6756398  0.12361077  1.5461185  0.9994344
    lusi_annual
                    Z00pjuvN
                                Z00benN
                                         Z00pjuvS
                                                     Z00benS
                                                                      Х
[1,]
      1.0055400 -1.952427025 -0.3585604 1.7126823 0.7954300 -1.6263456
[2,]
     1.5213590 -0.169297841 0.7000897 -0.7176185 -1.6095081 -1.4849242
[3,]
    -0.4682286 -0.004760062 1.2082420 -0.9834969 -0.9465854 -1.3435029
[4,]
     0.3791884 0.235604522 1.3160679 -0.9022688 -1.0887306 -1.2020815
[5,]
      1.2266053 0.556019342 1.3121875 -0.8130939 -0.5867960 -1.0606602
[6,]
    -0.3945401 -0.067985973 -0.4133460 0.5036207 -0.3517562 -0.9192388
    CutiSTIpjuv CutiTUMIpjuv
                                  Year BeutiTUMIpjuv
                                                         Year.1 BeutiSTIpjuv
[1,]
    -0.1918014
                 -0.4939859 -1.6263456 -1.568685313 -1.6263456
                                                                  -0.1790974
[2,]
                 0.1430873 -1.4849242 0.001992683 -1.4849242
     0.3504340
                                                                  0.4387064
[3,]
    -0.7109629 -0.6343623 -1.3435029 -1.099932577 -1.3435029
                                                                 -0.7706116
[4,]
    -1.2993460 0.9778535 -1.2020815 0.712209704 -1.2020815
                                                                -1.4409943
[5,]
    -0.9878491 1.5685664 -1.0606602 1.339731782 -1.0606602
                                                                  -0.6785982
[6,]
                 0.3323588 -0.9192388 -1.220105642 -0.9192388
     0.9157433
                                                                1.0827996
       CHLpjuv
                   PPpjuv bakun_sti
[1,] -1.9364182 -2.0454212 -1.5268571
```

```
[2,] -1.4005172 -1.0273683 -1.2167479

[3,] -0.7564655 -0.6926709 1.1090711

[4,] -0.8155079 -0.6337877 0.3854830

[5,] 2.2314761 2.3045496 -0.3381052

[6,] 0.6224340 0.9496238 0.2304284
```

Is it right???

#### apply(scale\_dat\_scale, 2, mean)

```
DDpre
                                    DDegg
                                                 DDlarv
                                                                DDpjuv
         year
-1.850372e-17
              7.968163e-16 1.292947e-15 -6.059967e-16 9.529414e-16
        DDben
                       Tcop
                                    Tpart
                                                MLDpart
                                                               MLDlarv
1.309138e-15 -1.327642e-15 8.789266e-16 1.119475e-15 2.377728e-15
     MLDpjuv
                    CSTlarv
                                  CSTpjuv
                                                LSTlarv
                                                               LSTpjuv
8.049117e-15 -4.440892e-16 -1.110223e-16 -2.220446e-16
                                                         4.255855e-16
    hci1 larv
                  hci1_pjuv
                                hci2_larv
                                              hci2_pjuv
                                                               oni pre
0.000000e+00 -5.088522e-17 \quad 0.000000e+00 -5.088522e-17 -3.700743e-17 \\
     oni larv
                   oni_pjuv
                                 pdo larv
                                               pdo_pjuv
                                                          lusi annual
4.163336e-17 8.789266e-17 -7.401487e-17
                                           1.110223e-16 -3.469447e-16
     Z00pjuvN
                    Z00benN
                                 Z00pjuvS
                                                Z00benS
                                                                     Х
0.000000e+00 -3.700743e-17 \\ 6.476301e-17 \\ 1.225871e-16 -1.850372e-17
 CutiSTIpjuv CutiTUMIpjuv
                                     Year BeutiTUMIpjuv
5.458597e-16 8.974303e-16 -1.850372e-17 -1.110223e-15 -1.850372e-17
BeutiSTIpjuv
                    CHLpjuv
                                   PPpjuv
                                              bakun sti
3.590878e-16 -1.110223e-15 8.141636e-16 5.551115e-17
```

### apply(scale\_dat\_scale, 2, sd)

year	DDpre	DDegg	DDlarv	DDpjuv
1	1	1	1	1
DDben	Tcop	Tpart	${ t MLDpart}$	${ t MLDlarv}$
1	1	1	1	1
MLDpjuv	CSTlarv	CSTpjuv	LSTlarv	LSTpjuv
1	1	1	1	1
hci1_larv	hci1_pjuv	hci2_larv	hci2_pjuv	oni_pre
1	1	1	1	1
oni_larv	oni_pjuv	pdo_larv	pdo_pjuv	lusi_annual
1	1	1	1	1
Z00pjuvN	Z00benN	Z00pjuvS	Z00benS	X
1	1	1	1	1

Year.1	BeutiTUMIpjuv	Year	CutiTUMIpjuv	CutiSTIpjuv
1	1	1	1	1
	bakun_sti	PPpjuv	CHLpjuv	BeutiSTIpjuv
	1	1	1	1

There are a few things I did not execute flawlessly in this...you will notice I did not remove all variables. I also left year in the dataframe so it standardized that as well!! Which we don't want...I will leave it up to you to troubleshoot that:)

One thing to note is that if we want to use your long table, the easiest way to create standardized data in that format is looping over your variable name column. Alternatively, you could use the methods here and then merge or join the datasets together after you create a table of the standardized values.

Hope this helps! Happy standardizing!