

BSB Oceanography

Ricky Tabandera

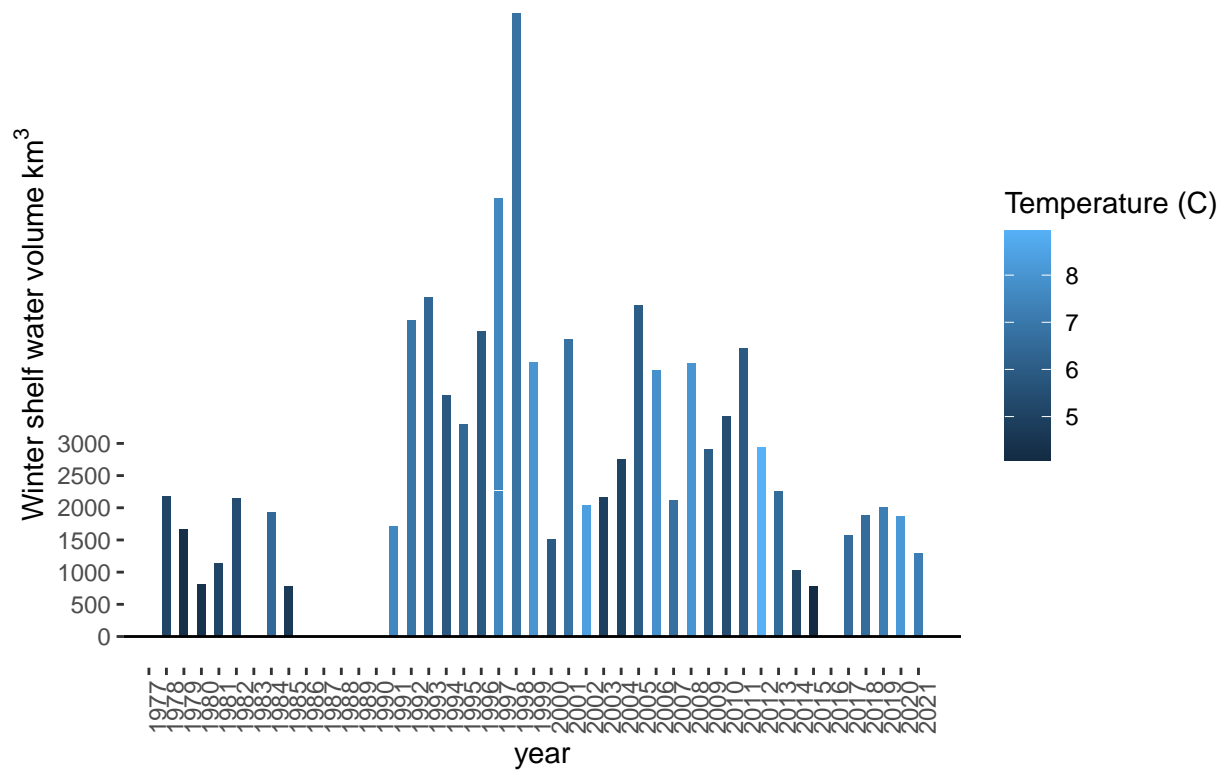
15 November, 2022

Shelf water volume

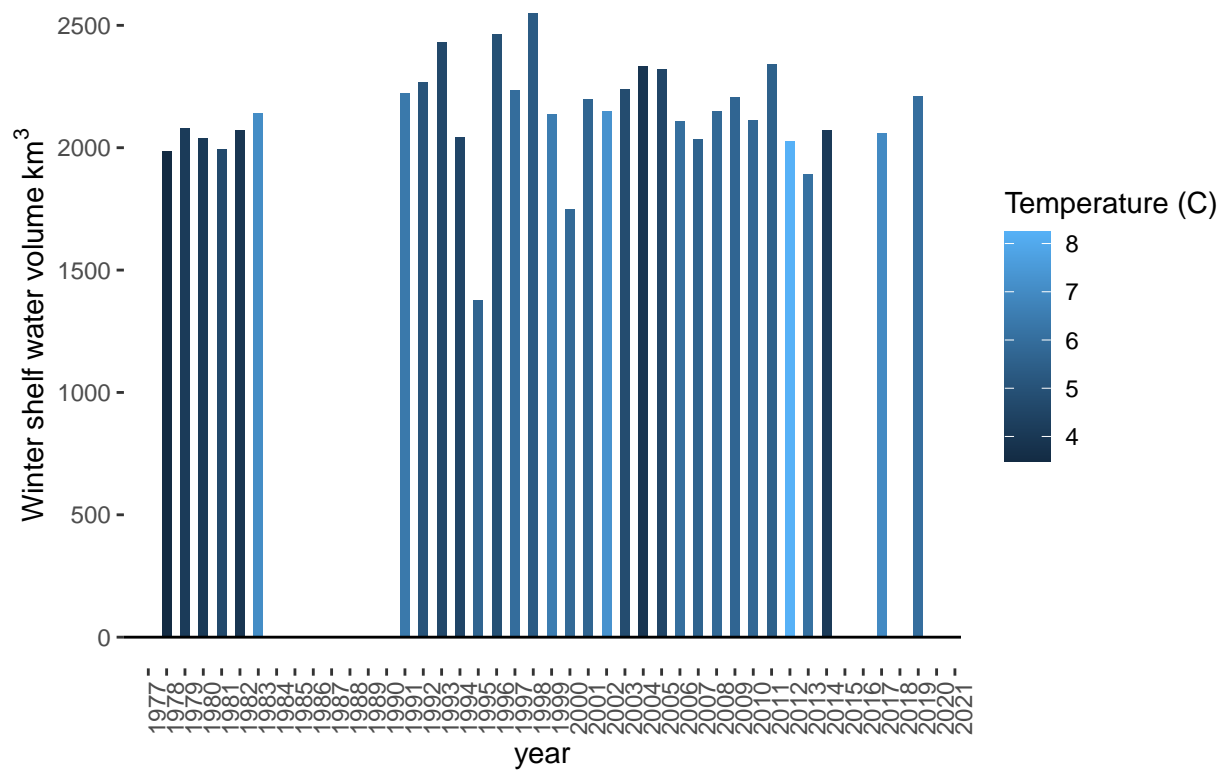
Shelf water volume which is a measure of the volume of water bounded inshore of a hydrodynamic feature called the shelf-slope front. In this analysis the shelf water is defined as all water having salinity <34 . It is hypothesized that fish are migrating from the shelf edge and using the shelf slope front as a way-point. The position of this front will vary inter-annually with the higher values indicating the front being pushed further towards the shelf break. As this front moves closer or further from the coast, the available susceptible habitat can expand or contract as black sea bass are known to concentrate slope ward of the front. Miller et al. 2016 Identified a negative impact on catches of both juveniles and adult black sea bass when shelf water volume exceeded 4000 km^3

winter shelf water volume

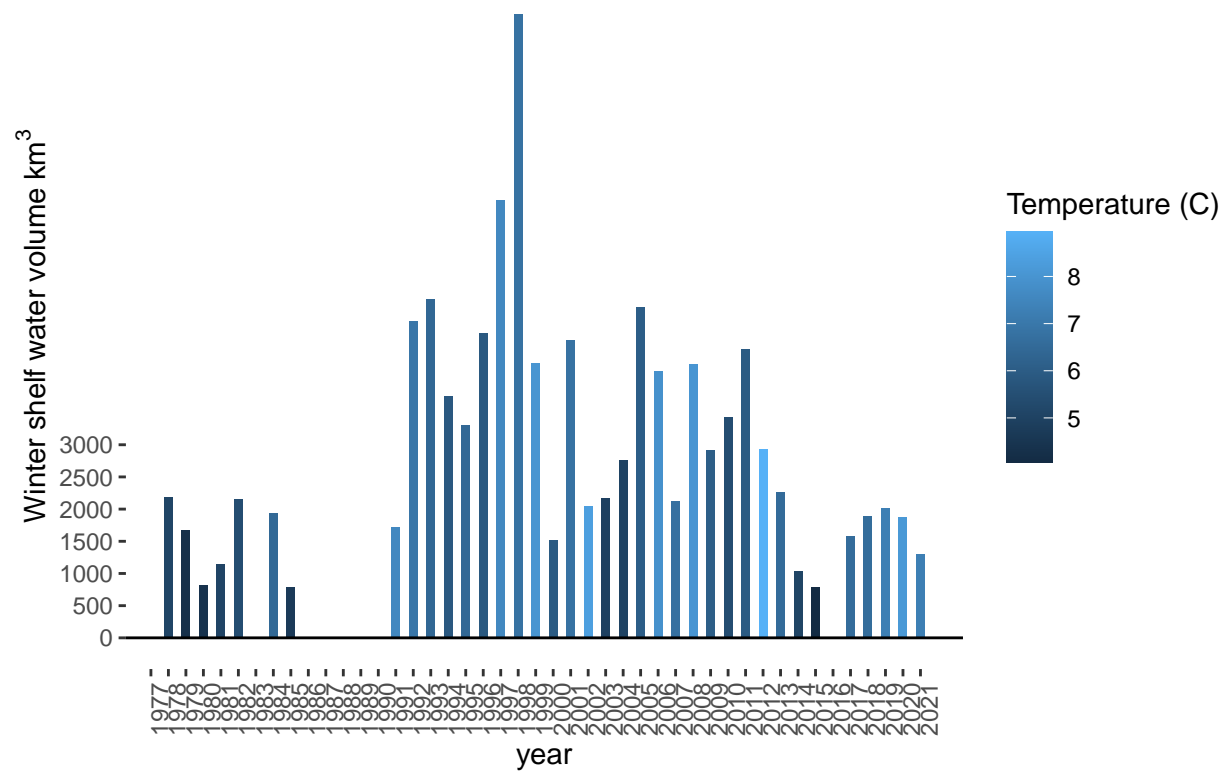
Southern Mid Atlantic Bight



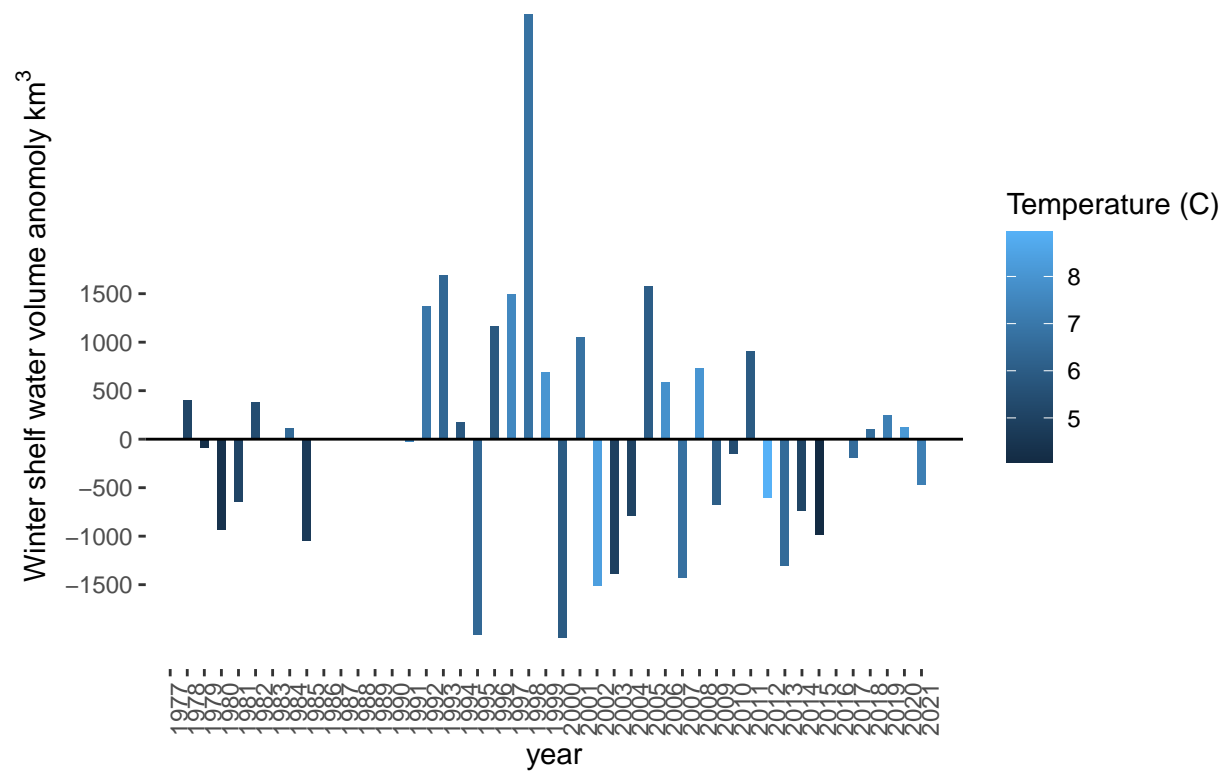
Northern Mid Atlantic Bight

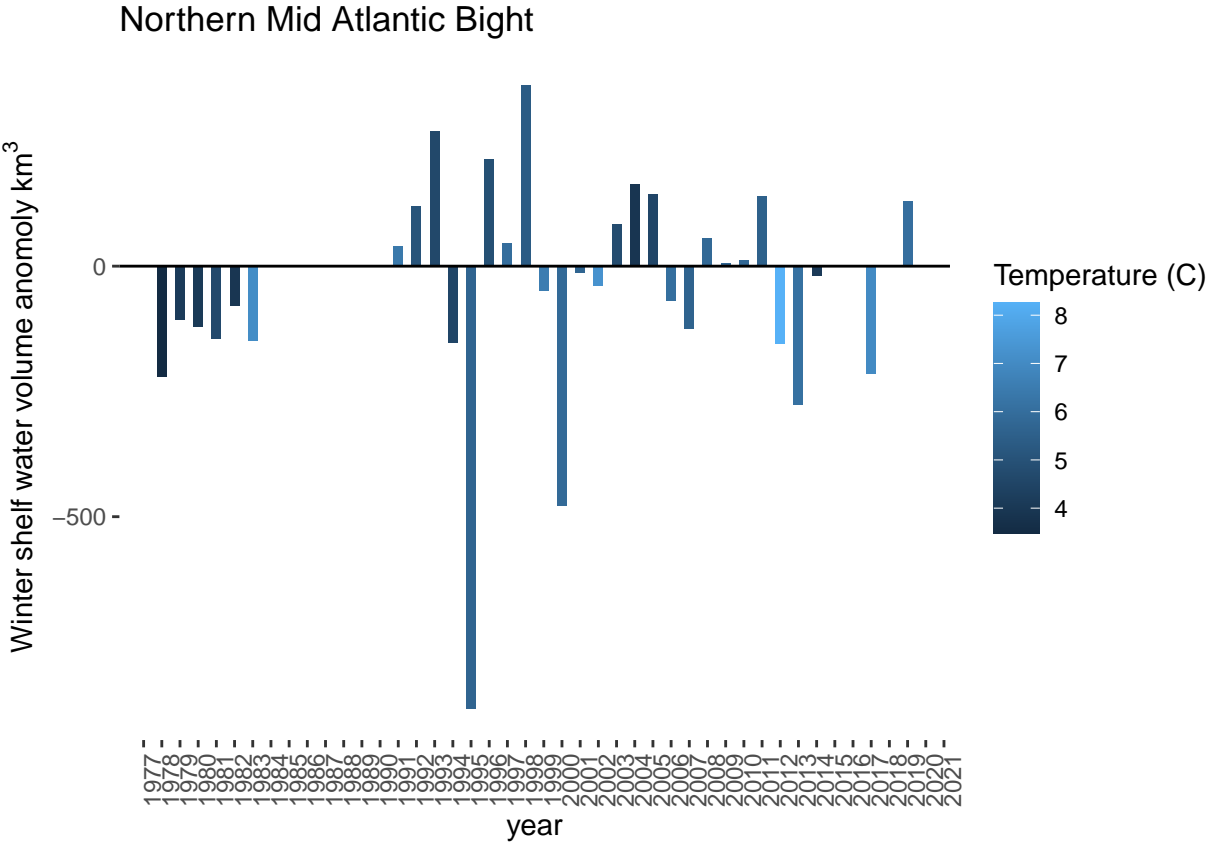


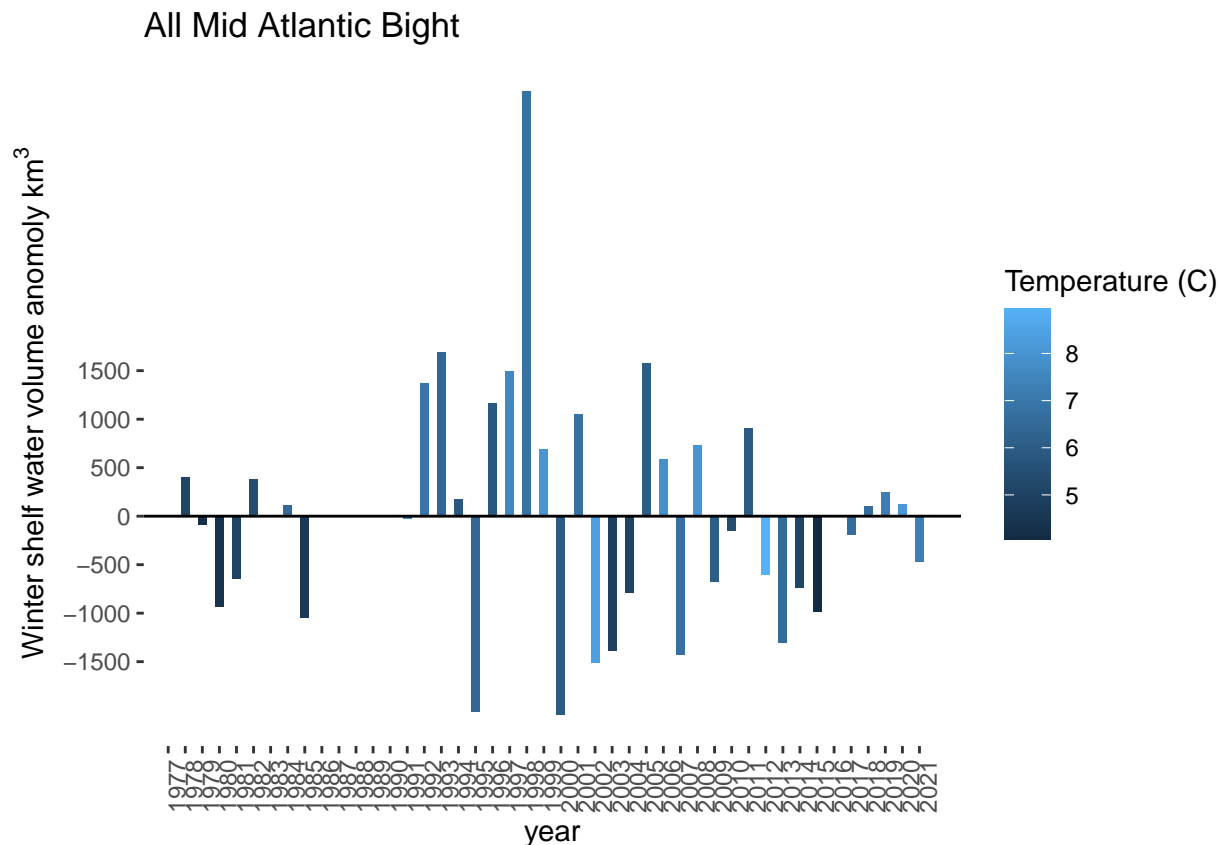
All Mid Atlantic Bight



Southern Mid Atlantic Bight





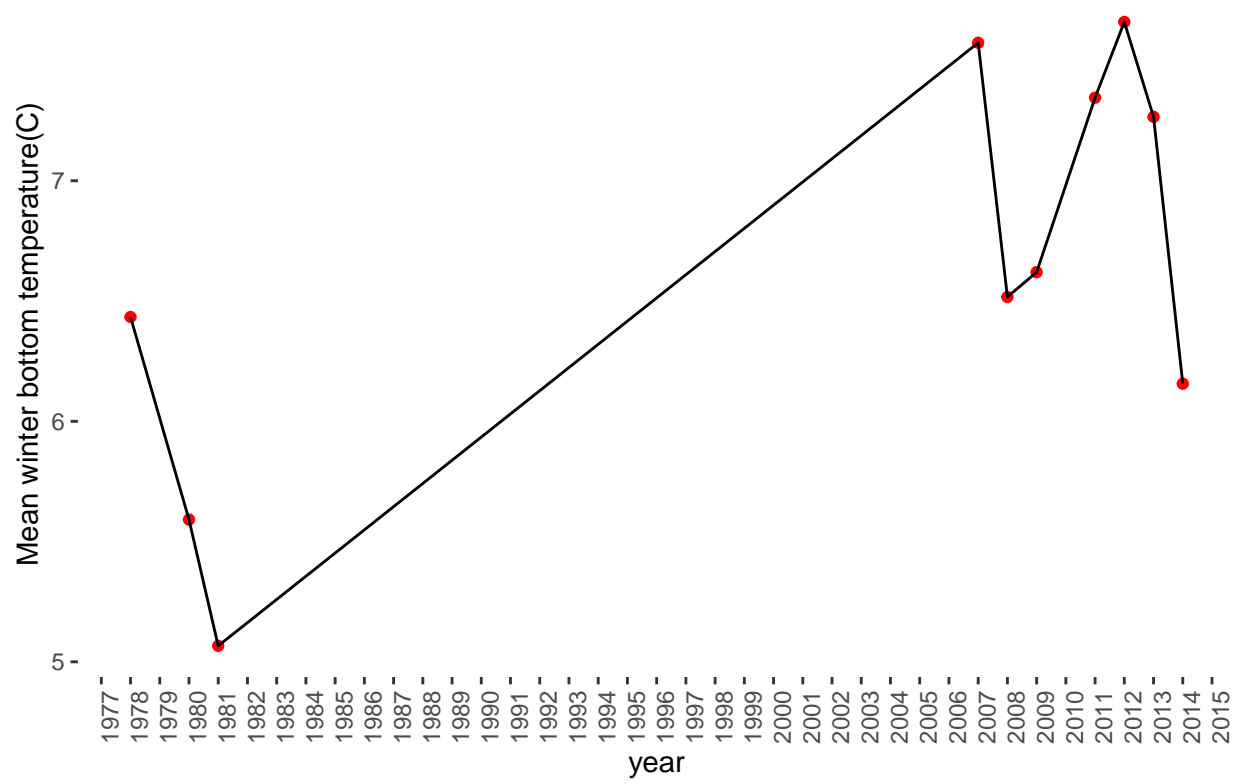


Regional in-situ winter bottom temperature and salinity with anomaly

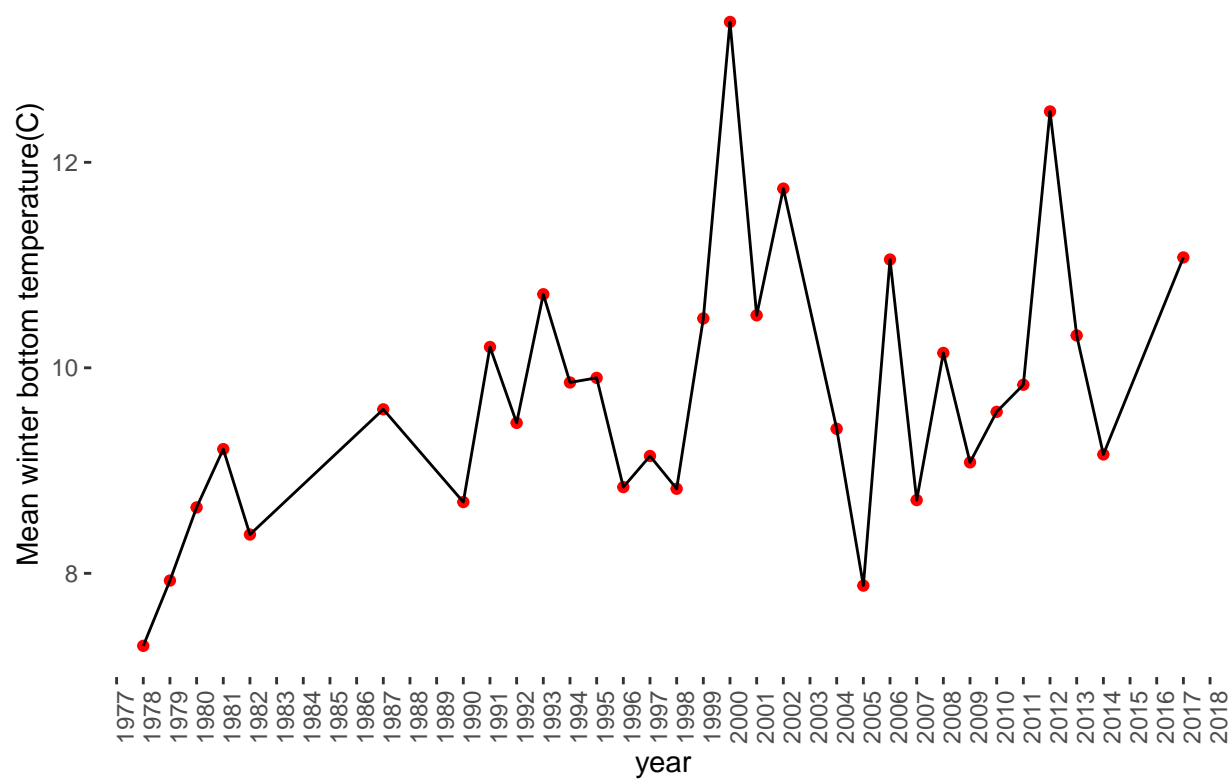
All available CTD data within 10m of the bottom between the northern and southern MAB region and as a whole. Regional time series were computed as follows: area-weighted regional mean values were computed for each survey in the OCDBS and a reference annual cycle was removed (fit to observations from 1981-2010) to get seasonal anomalies.

note: winter coverage is very sparse due to the winter ECOMON surveys ending. A better approach may be to use a two month span at the end of winter where coverage is better i.e. FEB-MAR rather than a whole winter.

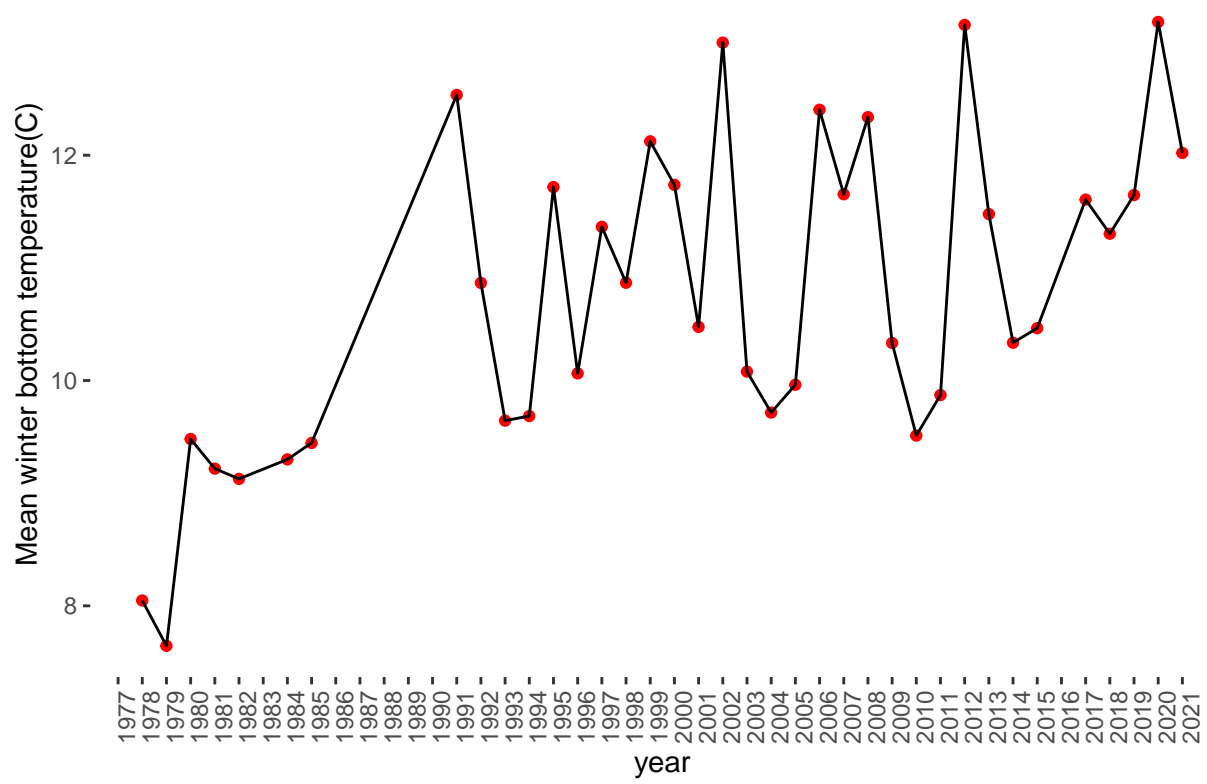
Western Gulf Of Maine



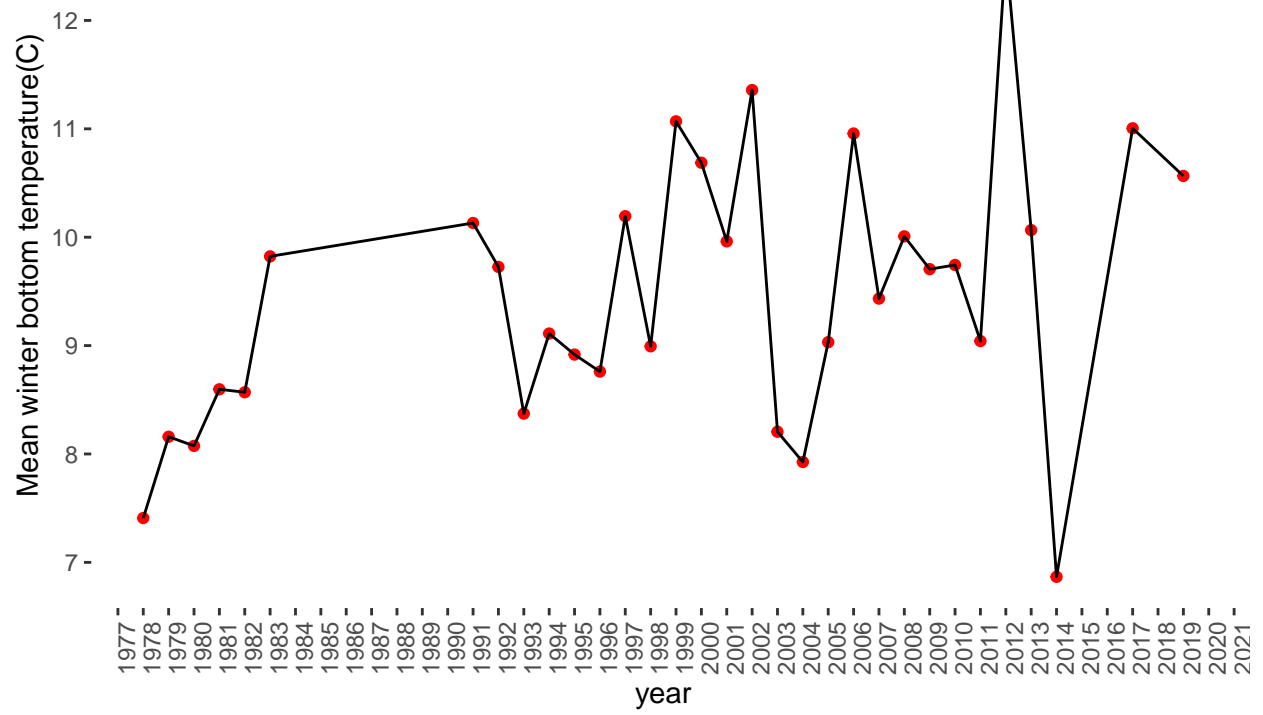
Western Georges bank

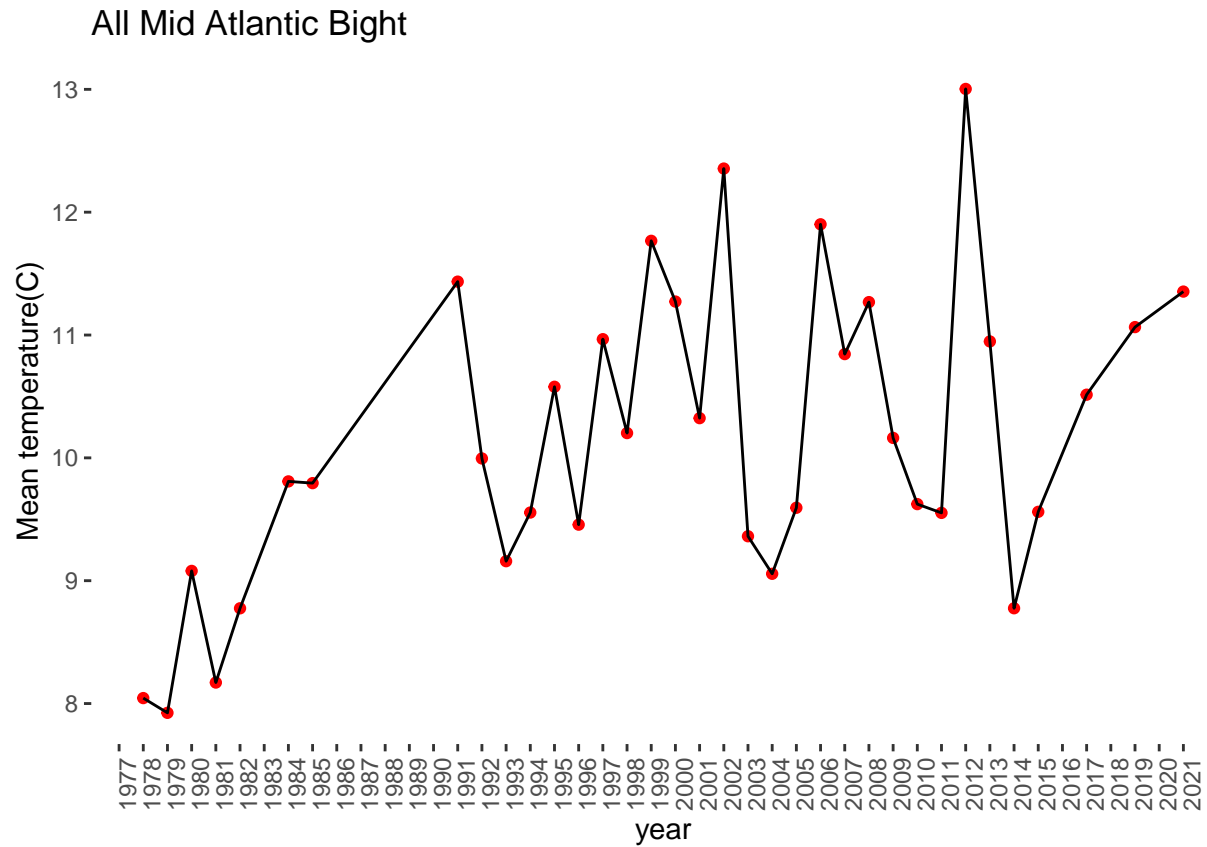


Southern Mid Atlantic Bight



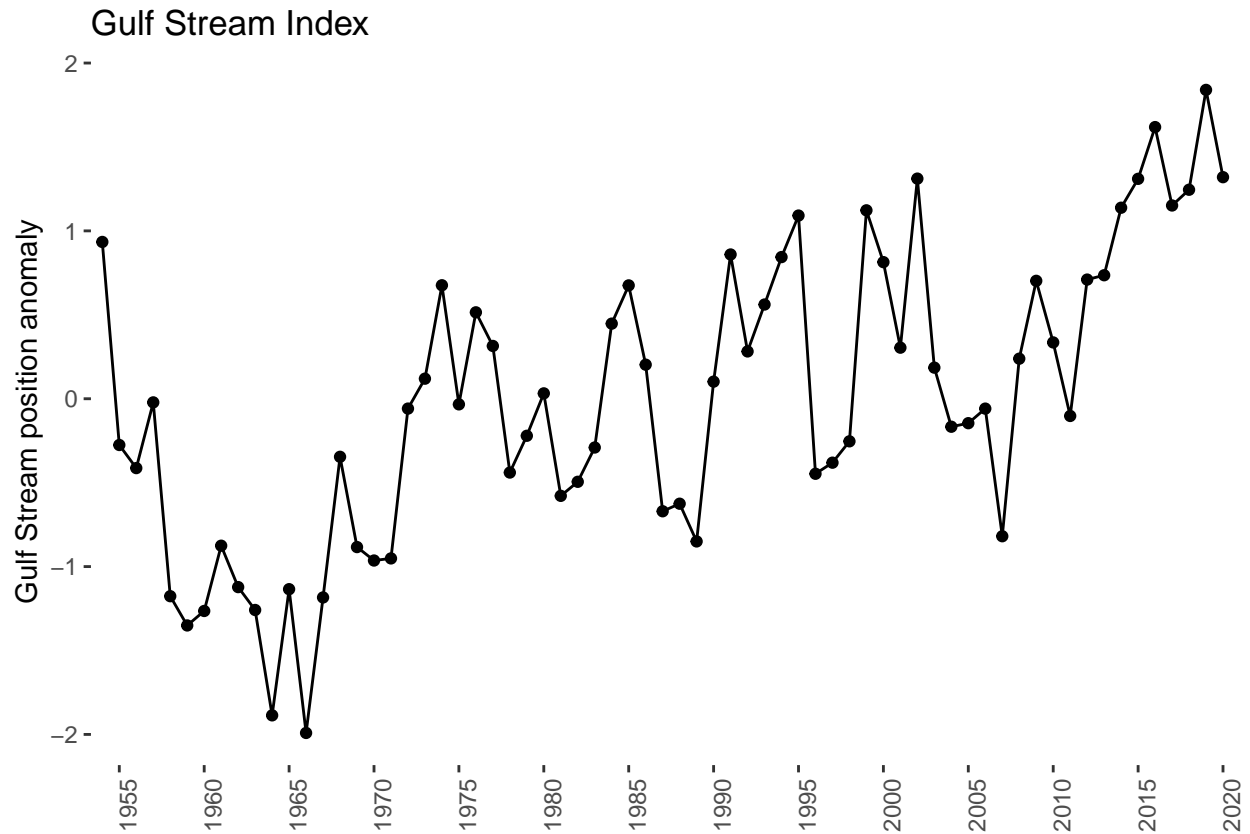
Northern Mid Atlantic Bight





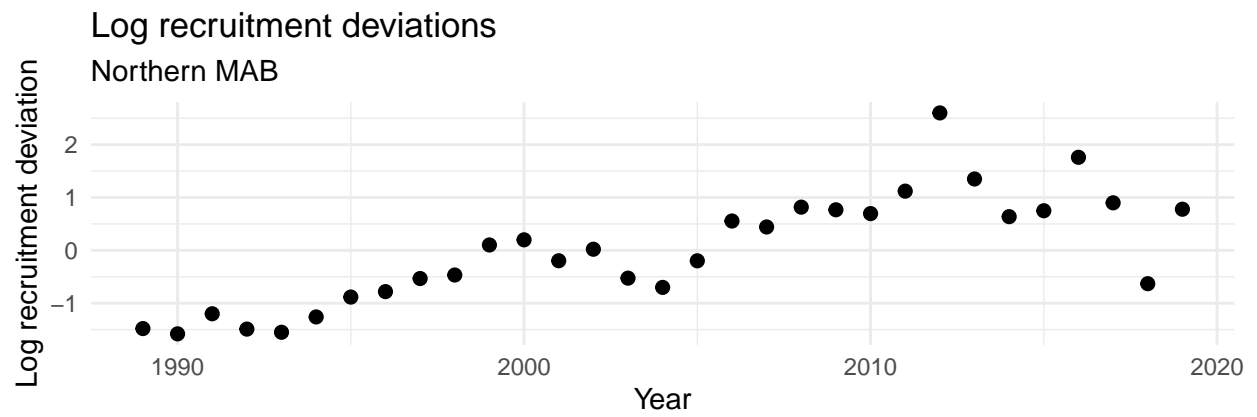
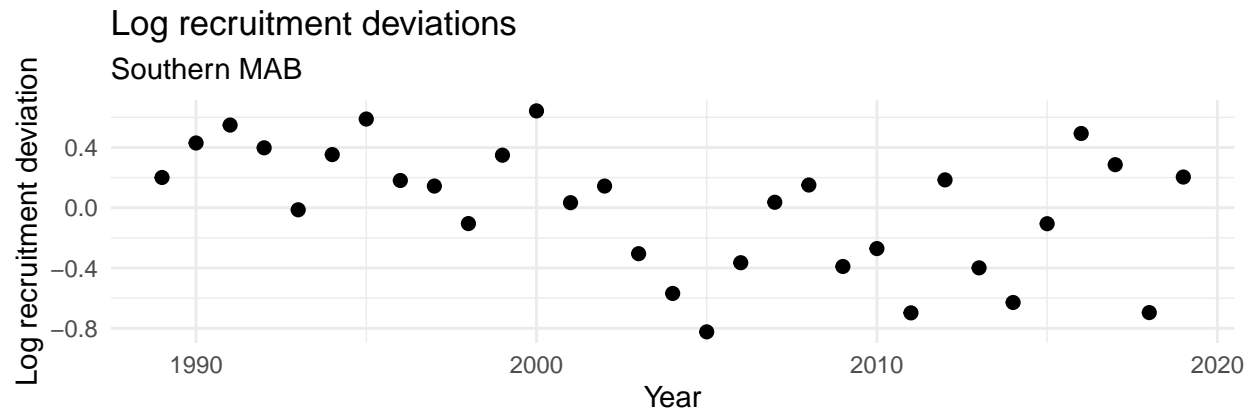
Gulf Stream Index

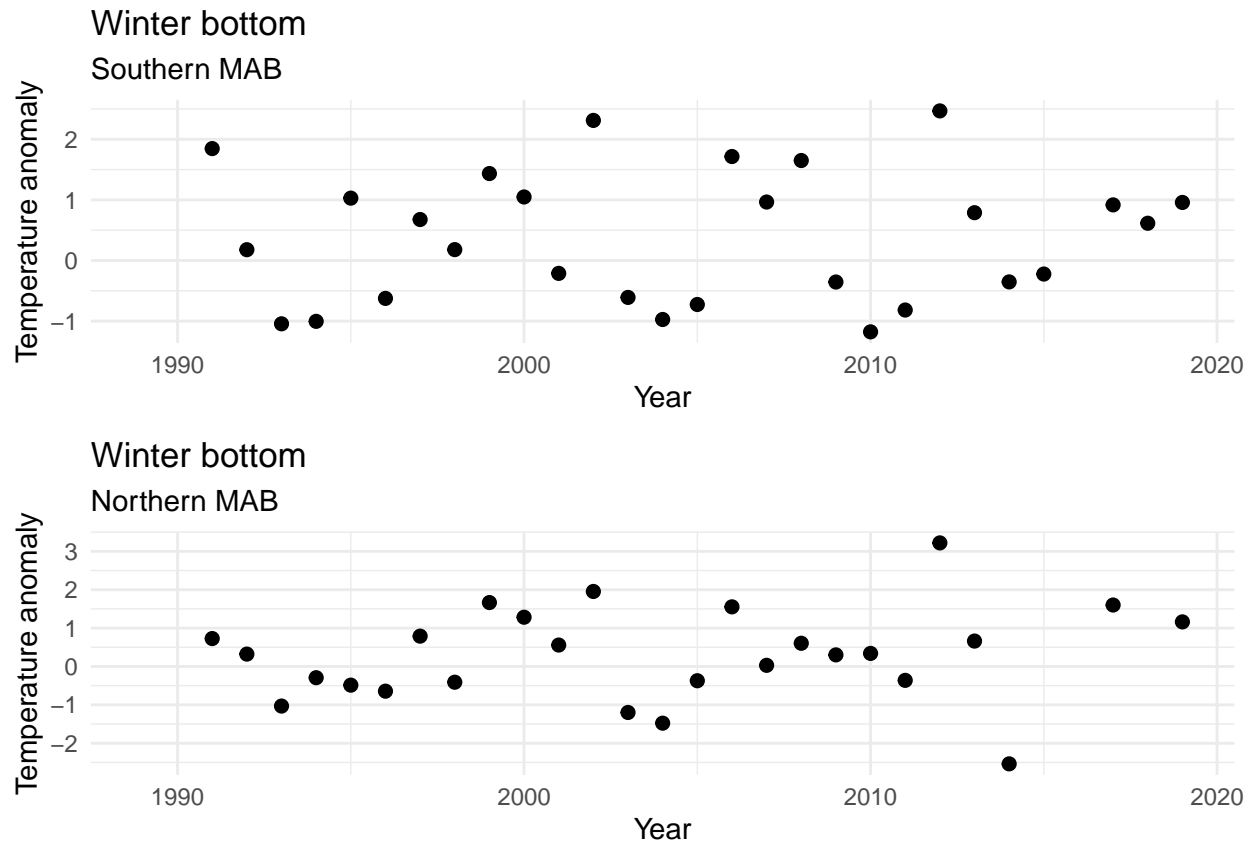
The GSI is calculated based on the method presented by Pérez-Hernández and Joyce (2014). This gulf stream index is a position anomaly meaning the larger the value of the index the further north the northern wall of the Gulf Stream is for that year.



Cross correlation testing

Explorations into the association between bottom conditions and Black sea bass recruitment deviations. recruitment deviations from the 2021 operational assessment. This model output lacks 2020 data and thus 2019 is the terminal year. Bottom conditions are also limited to this time span. Temperature anomaly are used to avoid seasonal and annual patterns. The association is likely to occur with a time lag as current conditions would likely manifest in following years. Horizontal line indicates significant cross correlation





Pearsons correlations

Bottom temperature

Associations between model estimates of recruitment and environmental indicators is tested using Pearsons correlations. Mean winter bottom temperature is significantly correlated within year estimates of recruitment in both regions (South. P-value = 0.012, $t = 2.69$, $r=0.467$; North, P-value = 0.013, $t = 2.68$, $r= 0.480$). No significant associations were found for lags of one or two years in mean bottom temperatures across regions. Temperature anomalys display a similar significance level and mangitude of associaiton to in-situ temperature values.

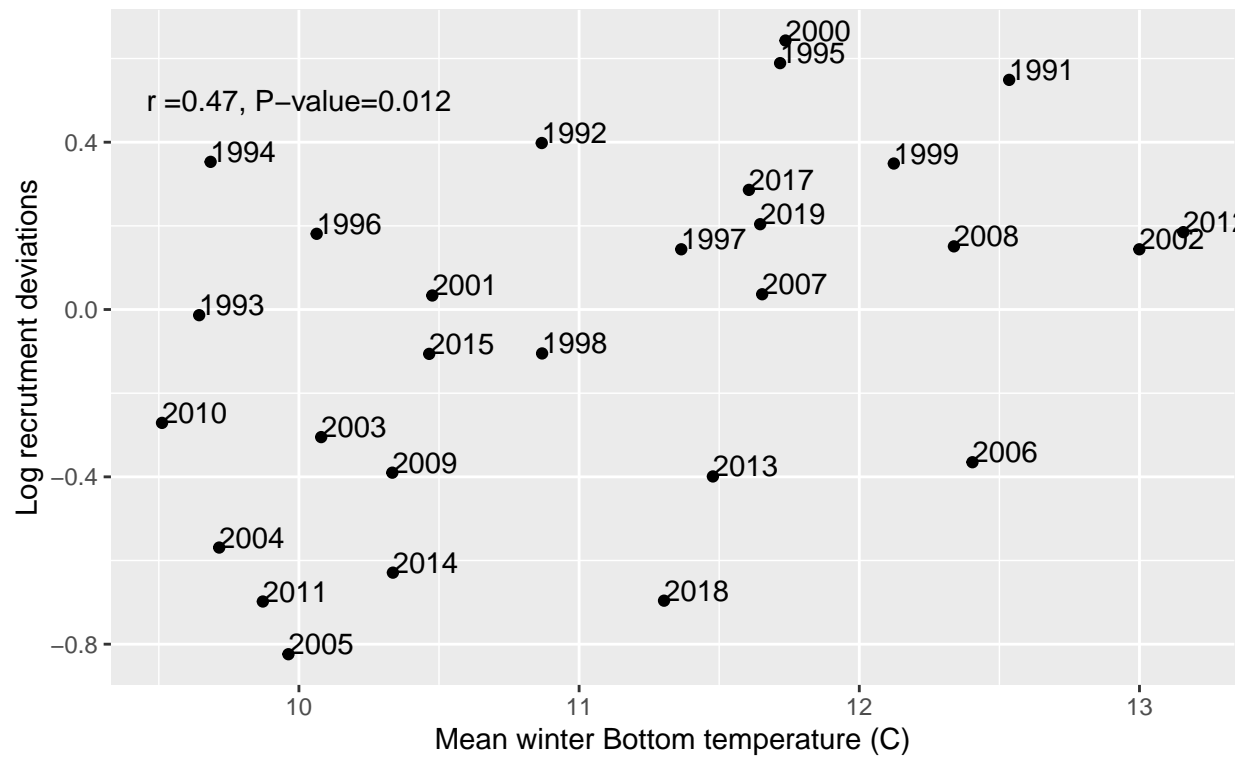
Bottom Salinity

No significant associations found in either region (South. P-value = 0.880, $t = 0.151$, $r=0.029$; North, P-value = 0.080, $t = 2.68$, $r= 0.353$). Simiarly nither one or two year lags were found to be associated with recruitment deviation.

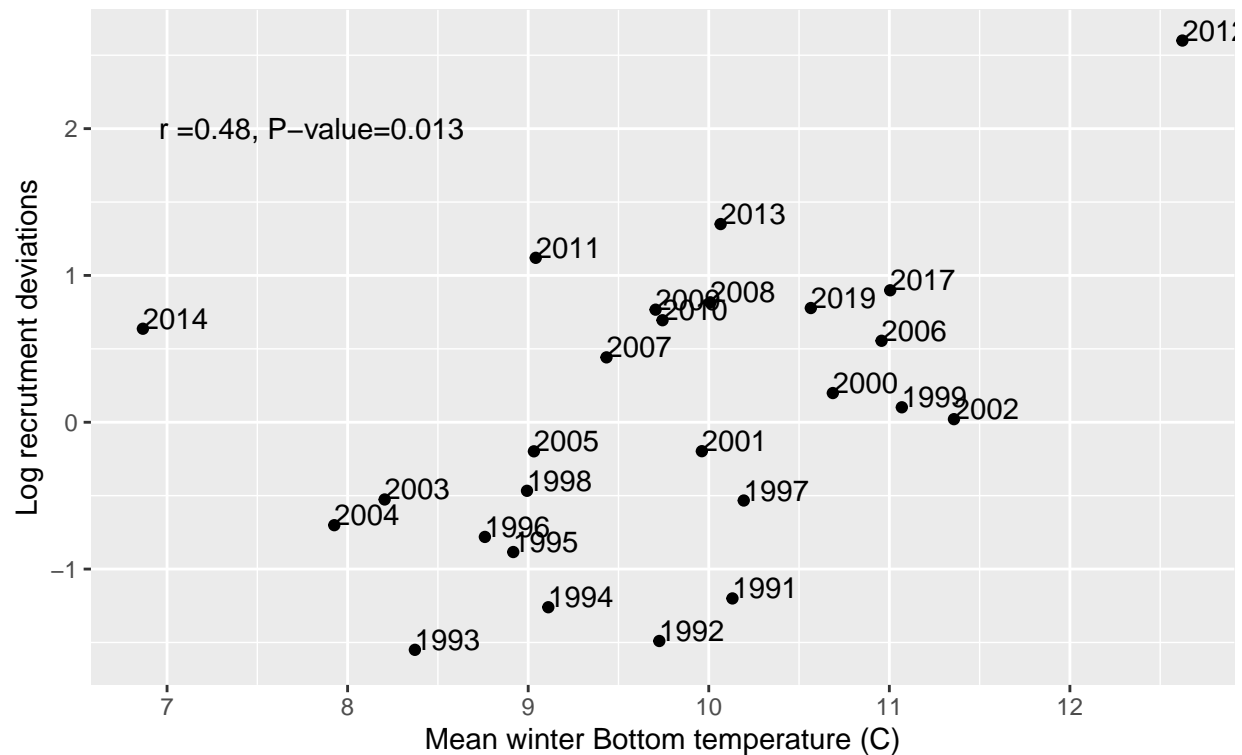
Winter Shelf water volume

No significant associations found in either region (South, $t = -1.00$, p-value = 0.321, $r= -0.13$; North $t = -1.098$, p-value = 0.283, $r= -0.210$). Additionally no lags had significant associations for either of one or two years of winter shelf water volume.

Black sea bass Recrutment and bottom temperature southern MAB



Black sea bass Recrutment and bottom temperature Northern MAB



Within indicator correlations

indicators are evaluated for their auto correlation within years to detect if meaningful confounding occurs. Bottom salinity and Shelf water volume is significantly negatively correlated with shelf water volume in both regions (South , $t = -12.78$, $P\text{-value}= 0.001$, $r = -0.8551866$ (North, $t = -3.46$, $P\text{-value}= 0.001$, $r = -0.534$). This strong association requires the selection of one of these indicators at the exclusion of the other to avoid overfitting.Shelf water volume was not associated with bottom temperature. Salinity and temperature were not significantly associated with one another in either region

Reanalysis product

A high-resolution bottom temperature ocean reanalysis and model output over the period 1989 - 2021 is compared to observed ocean temperature data using methods described in Miller et. al. 2016. The in situ dataset is subject to missing data coverage due to the timing and quality of data collection platforms resulting in Southern MAB missing 3 years, while Northern MAB is missing 7 years in coverage. The reanalysis data uses numerical simulation to interpolate for areas and times where data is limited.

```
## # A tibble: 792 x 6
## # Groups:   "Region", year [33]
##       X Region year month bt_temp "Region"
##   <int> <chr> <int> <int>   <dbl> <chr>
## 1     1   1 North  1989     1    7.90 Region
## 2     2   2 North  1989     2    6.96 Region
## 3     3   3 North  1989     3    5.96 Region
## 4     4   4 North  1989     4    7.06 Region
```



```

## 5      5 North  1989      5      8.32 Region
## 6      6 North  1989      6      8.94 Region
## 7      7 North  1989      7      9.34 Region
## 8      8 North  1989      8      9.80 Region
## 9      9 North  1989      9     11.8  Region
## 10     10 North  1989     10     12.4  Region
## # ... with 782 more rows
## # i Use 'print(n = ...)' to see more rows

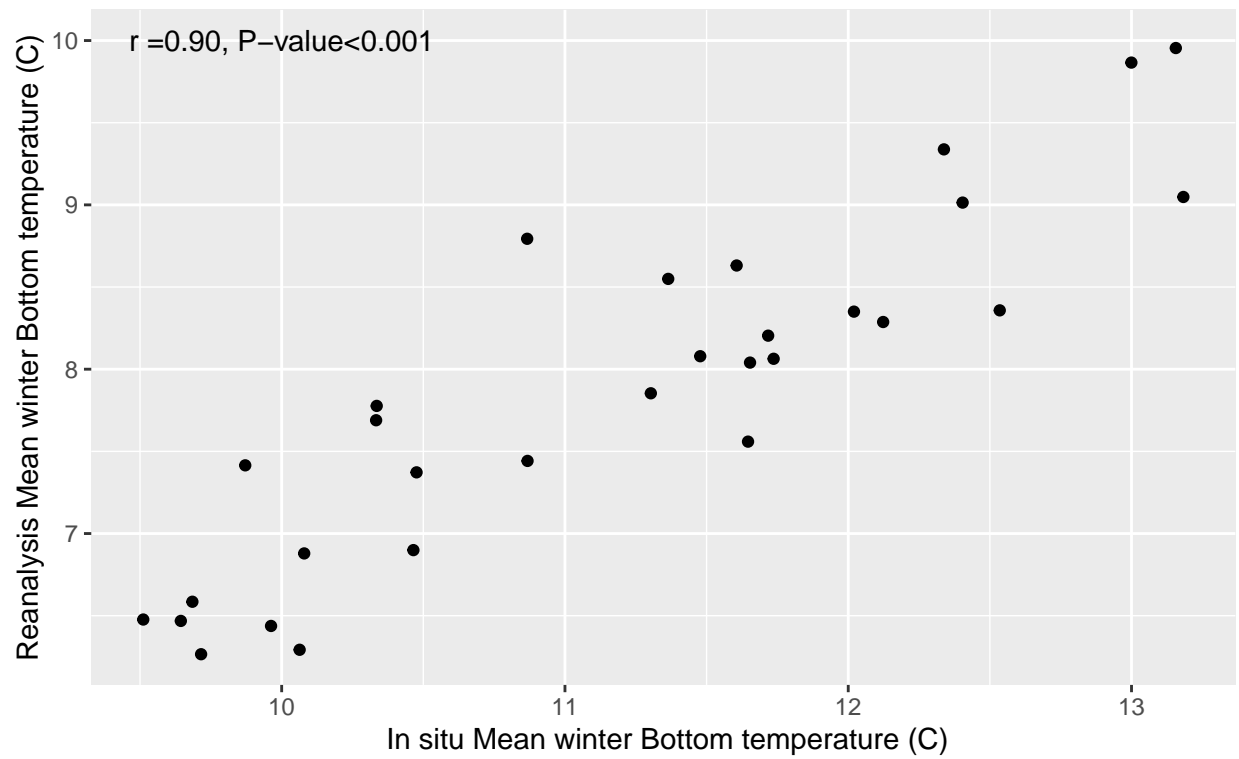
##
## Pearson's product-moment correlation
##
## data:  w_bt_temp and mean_bot_T
## t = 6.6492, df = 24, p-value = 7.064e-07
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.6070278 0.9089696
## sample estimates:
##          cor
## 0.8050788

##
## Pearson's product-moment correlation
##
## data:  w_bt_temp and mean_bot_T
## t = 10.865, df = 28, p-value = 1.495e-11
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.7968877 0.9512173
## sample estimates:
##          cor
## 0.8990461

## Warning: Removed 3 rows containing missing values (geom_point).

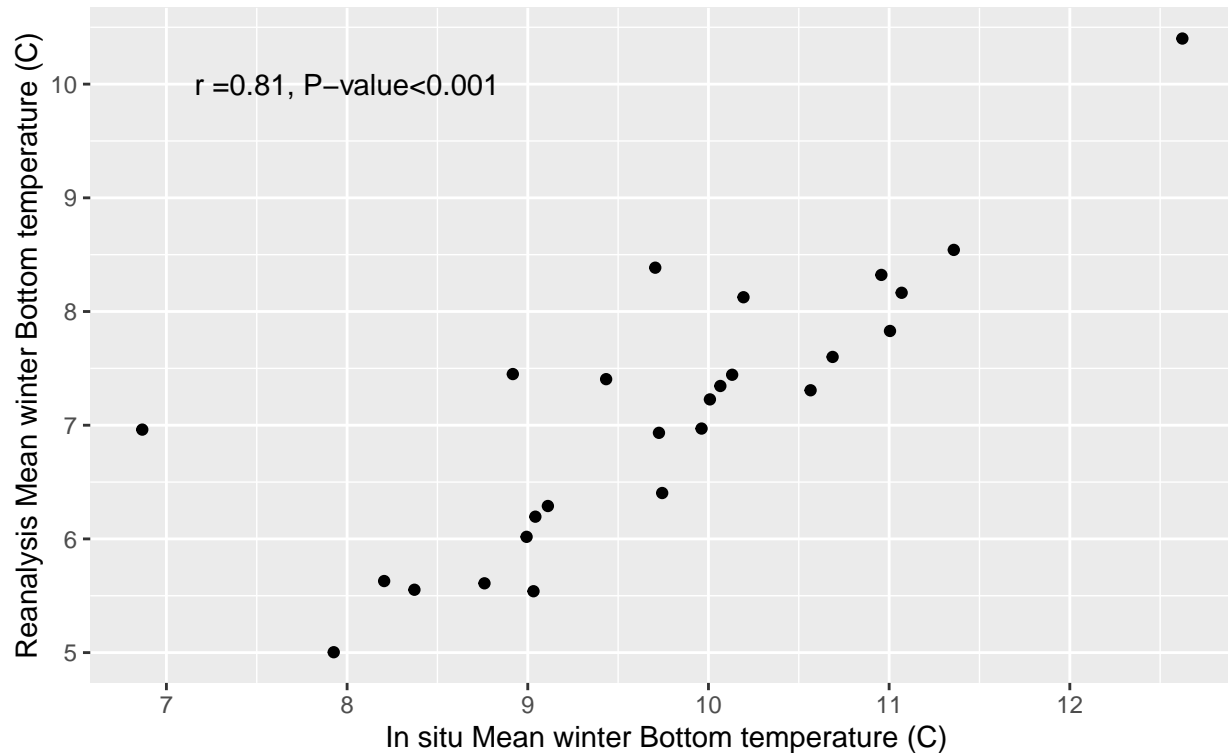
```

Association between bottom temperature methods: insitu vs Reanalysis
Southern MAB



Warning: Removed 7 rows containing missing values (geom_point).

Association between bottom temperature methods: insitu vs Reanalysis Northern MAB



linear models

The association in mean winter bottom temperature is further investigated using linear models. Significant relationships were found between bottom temperature and recruitment deviation. Model residuals do not display any concerning patterns and positive relationships observed in both regions.

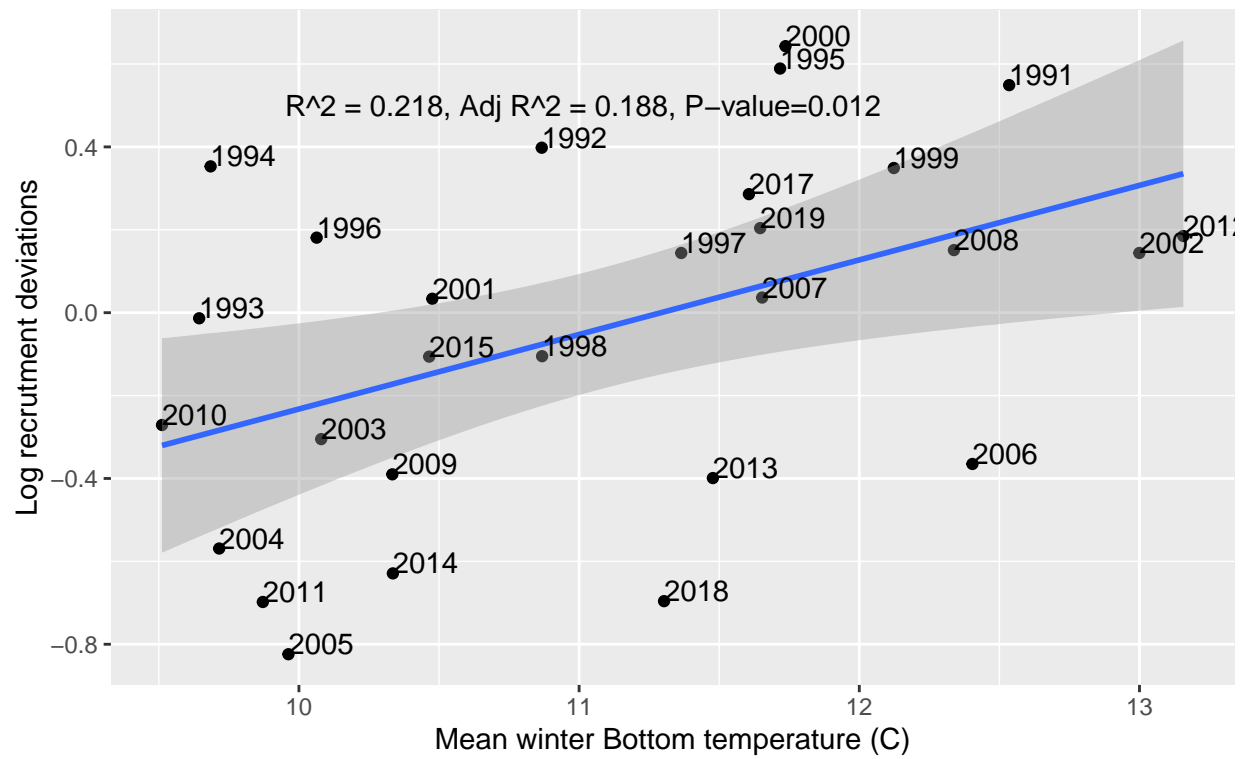
```
## Warning: Removed 3 rows containing non-finite values (stat_smooth).
```

```
## Warning: Removed 3 rows containing missing values (geom_point).
```

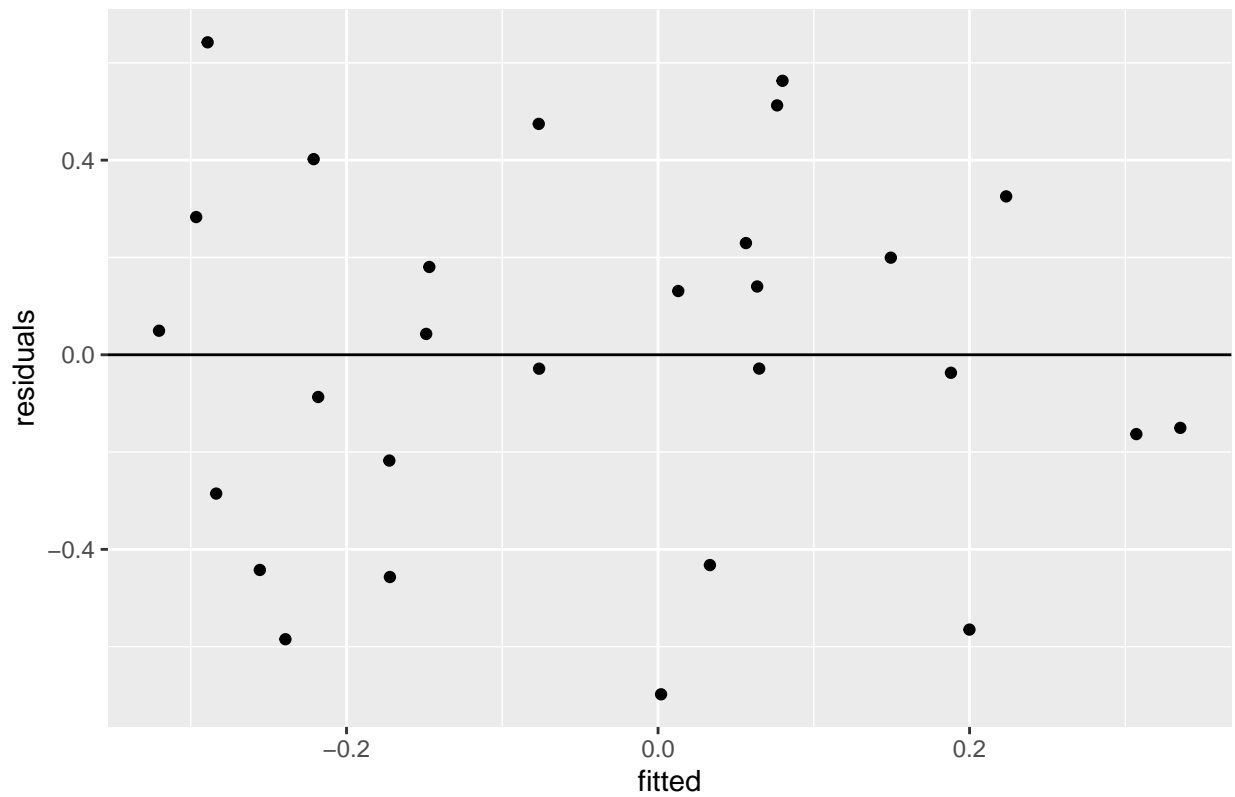
```
## Warning: Removed 3 rows containing missing values (geom_text).
```

```
## Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x$label), x$x, x$y, :  
## font width unknown for character 0x9
```

Black sea bass Recrutment and bottom temperature southern MAB



Model residuals vs fitted Southern MAB



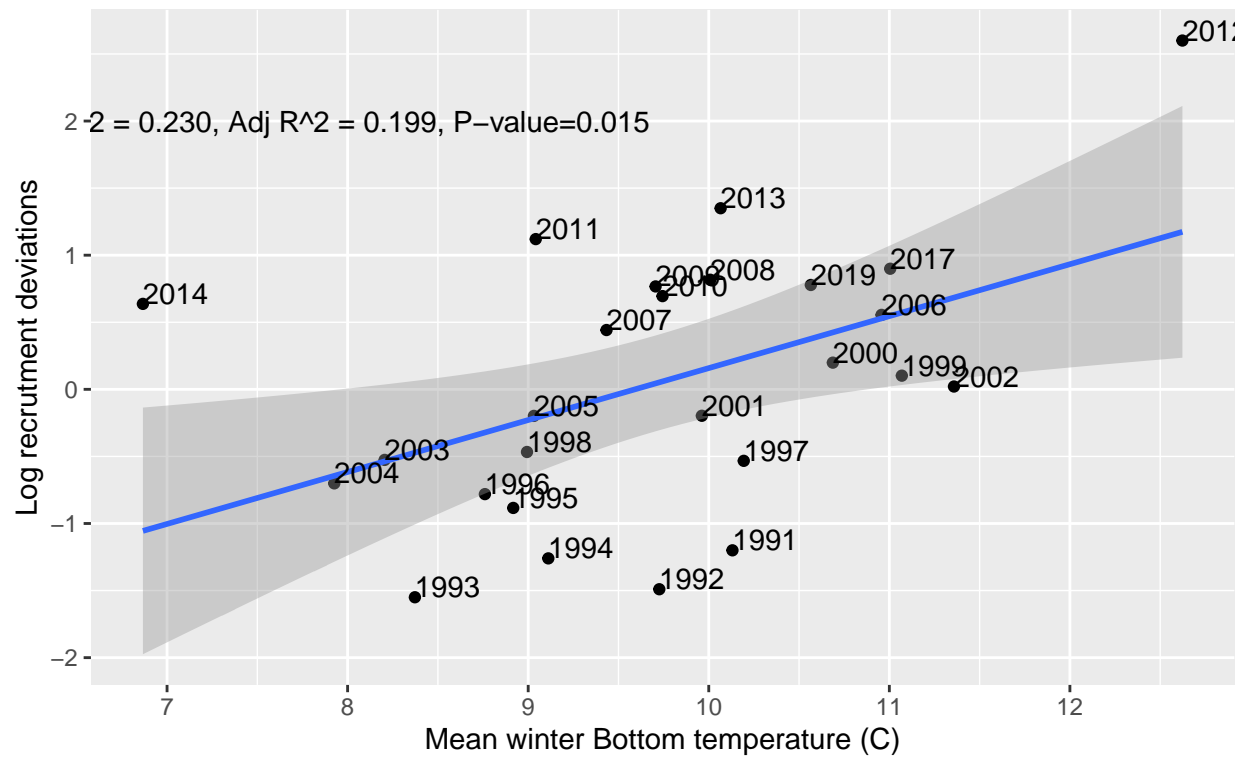
```
## Warning: Removed 5 rows containing non-finite values (stat_smooth).
```

```
## Warning: Removed 5 rows containing missing values (geom_point).
```

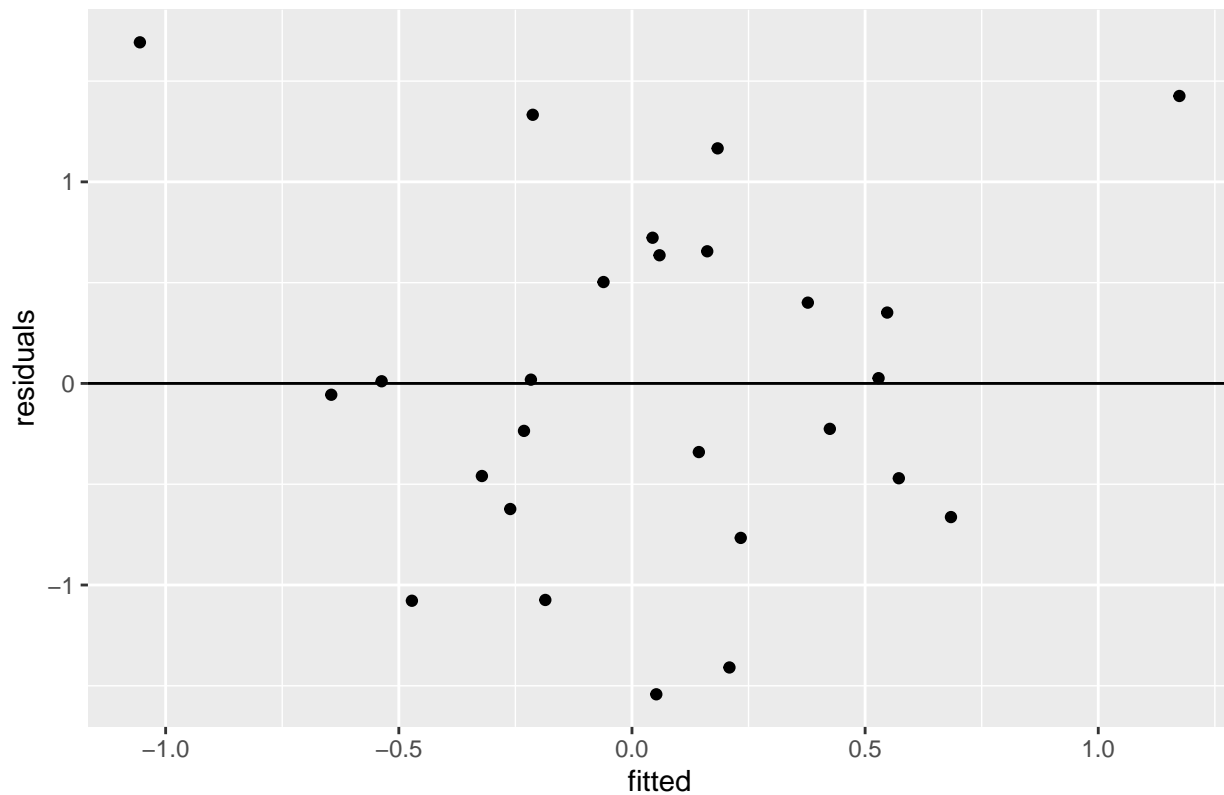
```
## Warning: Removed 5 rows containing missing values (geom_text).
```

```
## Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x$label), x$x, x$y, :  
## font width unknown for character 0x9
```

Black sea bass Recruitment and bottom temperature Northern MAB



Model residuals vs fitted Northern MAB



```
ra_S_rec<-left_join(ra_S,South_rec_dev, by= "year")
ra_N_rec<-left_join(ra_N,North_rec_dev, by= "year")
```

```
ra_S_rec %>% with(cor.test(w_bt_temp,log_recruit_devs, method=c("pearson")))
```

```
##
## Pearson's product-moment correlation
##
## data: w_bt_temp and log_recruit_devs
## t = 2.4632, df = 29, p-value = 0.01994
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.07227617 0.67135130
## sample estimates:
##      cor
## 0.4159633
```

```
ra_N_rec %>% with(cor.test(w_bt_temp,log_recruit_devs, method=c("pearson")))
```

```
##
## Pearson's product-moment correlation
##
## data: w_bt_temp and log_recruit_devs
```

```

## t = 3.3434, df = 29, p-value = 0.002294
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.2129207 0.7429472
## sample estimates:
## cor
## 0.5274655

re_rec_lm_N<-lm(log_recruit_devs~w_bt_temp,data =ra_N_rec)
summary(re_rec_lm_N)

##
## Call:
## lm(formula = log_recruit_devs ~ w_bt_temp, data = ra_N_rec)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -2.00560 -0.70274  0.09095  0.65256  1.59244
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  -3.4599      1.0477  -3.302  0.00255 **
## w_bt_temp      0.4822      0.1442   3.343  0.00229 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.9074 on 29 degrees of freedom
## (2 observations deleted due to missingness)
## Multiple R-squared:  0.2782, Adjusted R-squared:  0.2533
## F-statistic: 11.18 on 1 and 29 DF, p-value: 0.002294

re_rec_lm_S<-lm(log_recruit_devs~w_bt_temp,data =ra_S_rec)
summary(re_rec_lm_S)

##
## Call:
## lm(formula = log_recruit_devs ~ w_bt_temp, data = ra_S_rec)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.6921 -0.2436  0.0330  0.2657  0.6122
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  -1.3000      0.5323  -2.442  0.0209 *
## w_bt_temp      0.1650      0.0670   2.463  0.0199 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.3849 on 29 degrees of freedom
## (2 observations deleted due to missingness)
## Multiple R-squared:  0.173, Adjusted R-squared:  0.1445
## F-statistic: 6.068 on 1 and 29 DF, p-value: 0.01994

```



```
#0.173, Adjusted R-squared: 0.1445
```

```
re_rec_lm<-lm(log_recruit_devs~w_bt_temp,data =ra_N_rec)
summary(re_rec_lm)
```

```
##
## Call:
## lm(formula = log_recruit_devs ~ w_bt_temp, data = ra_N_rec)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -2.00560 -0.70274  0.09095  0.65256  1.59244
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  -3.4599     1.0477  -3.302  0.00255 **
## w_bt_temp      0.4822     0.1442   3.343  0.00229 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.9074 on 29 degrees of freedom
## (2 observations deleted due to missingness)
## Multiple R-squared:  0.2782, Adjusted R-squared:  0.2533
## F-statistic: 11.18 on 1 and 29 DF,  p-value: 0.002294
```

```
#0.2782, Adjusted R-squared: 0.2533 P-value= 0.002
```

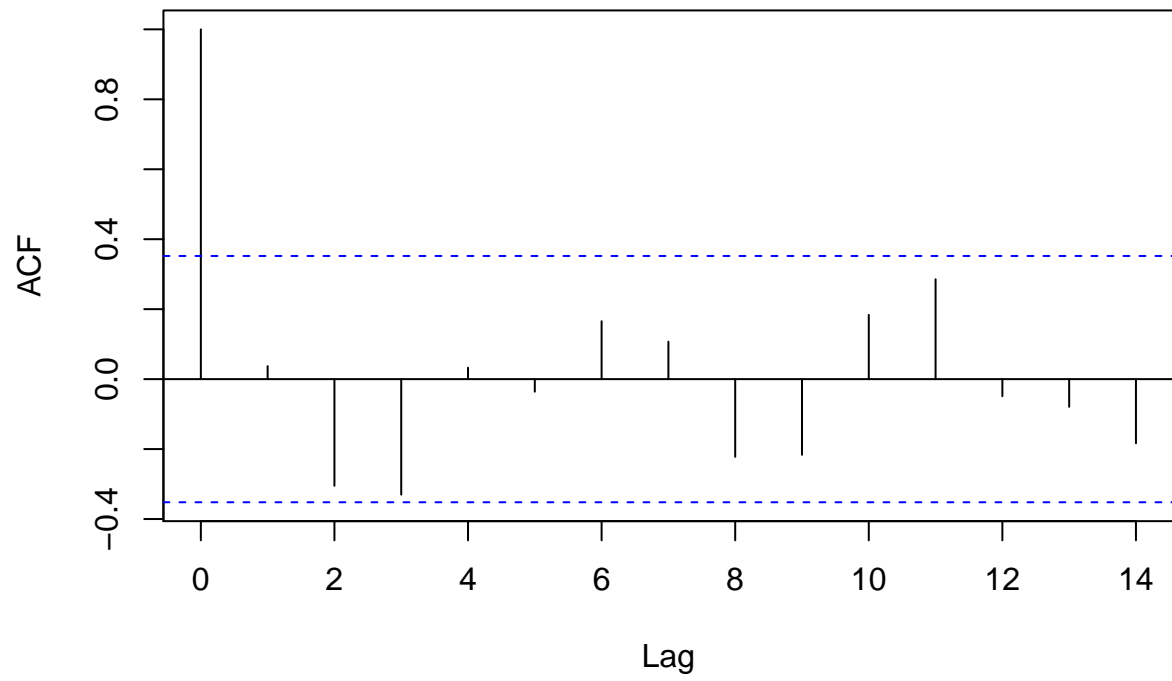
Autocorrelation function

Searching for Autocorrelation within each variable is useful for identifying the types of structure the data may contain. Each time series is correlated with itself at differing time lags.

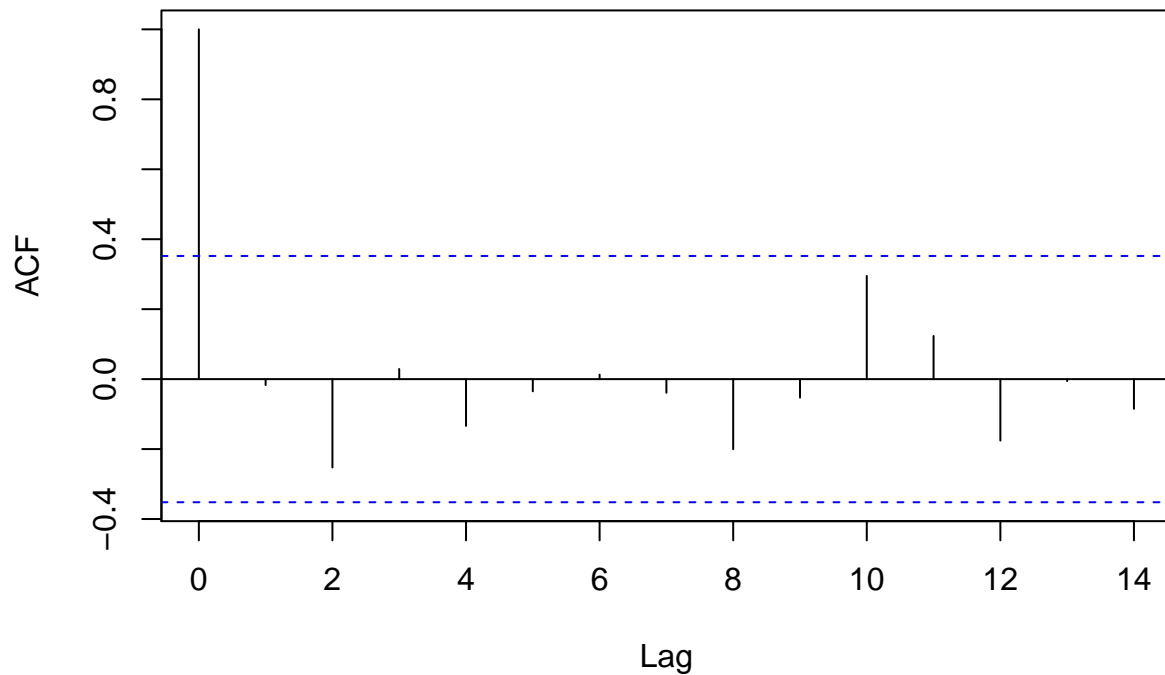
Bottom temp anomaly ACF

Appears to display minimal issues with autocorrelations, and appears to be similar to white noise for both Northern and southern regions

Southern MAB bottom temp anomaly



Northern MAB bottom temp anomaly



Stationarity

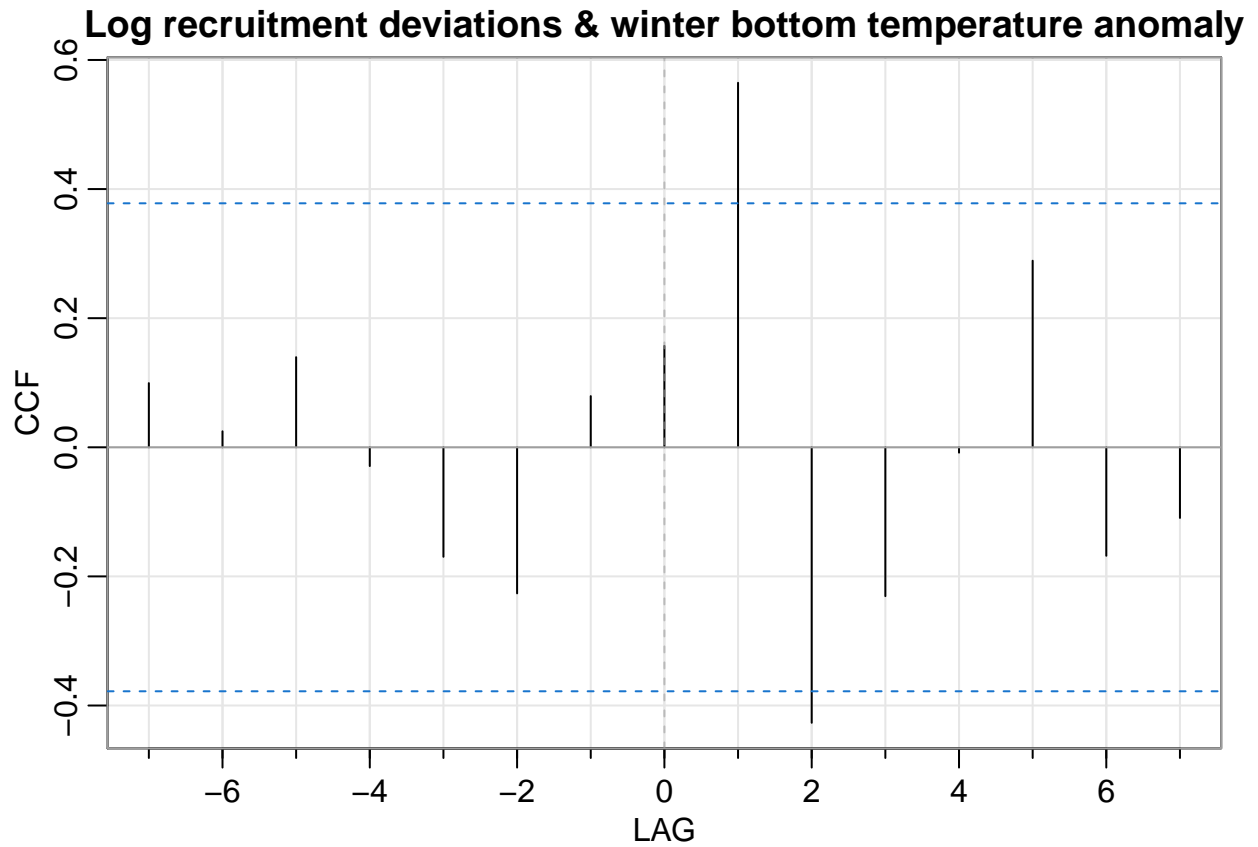
Augmented Dickey-Fuller Test indicates that recruitment time series are not stationary. Recruitment deviations are however corrected into stationarity when differenced, converting the data from original values to sequential rate changes in time. IE, each value is the difference of preceding years

$$Y_t - Y_{t-1}$$

southern MAB ccf

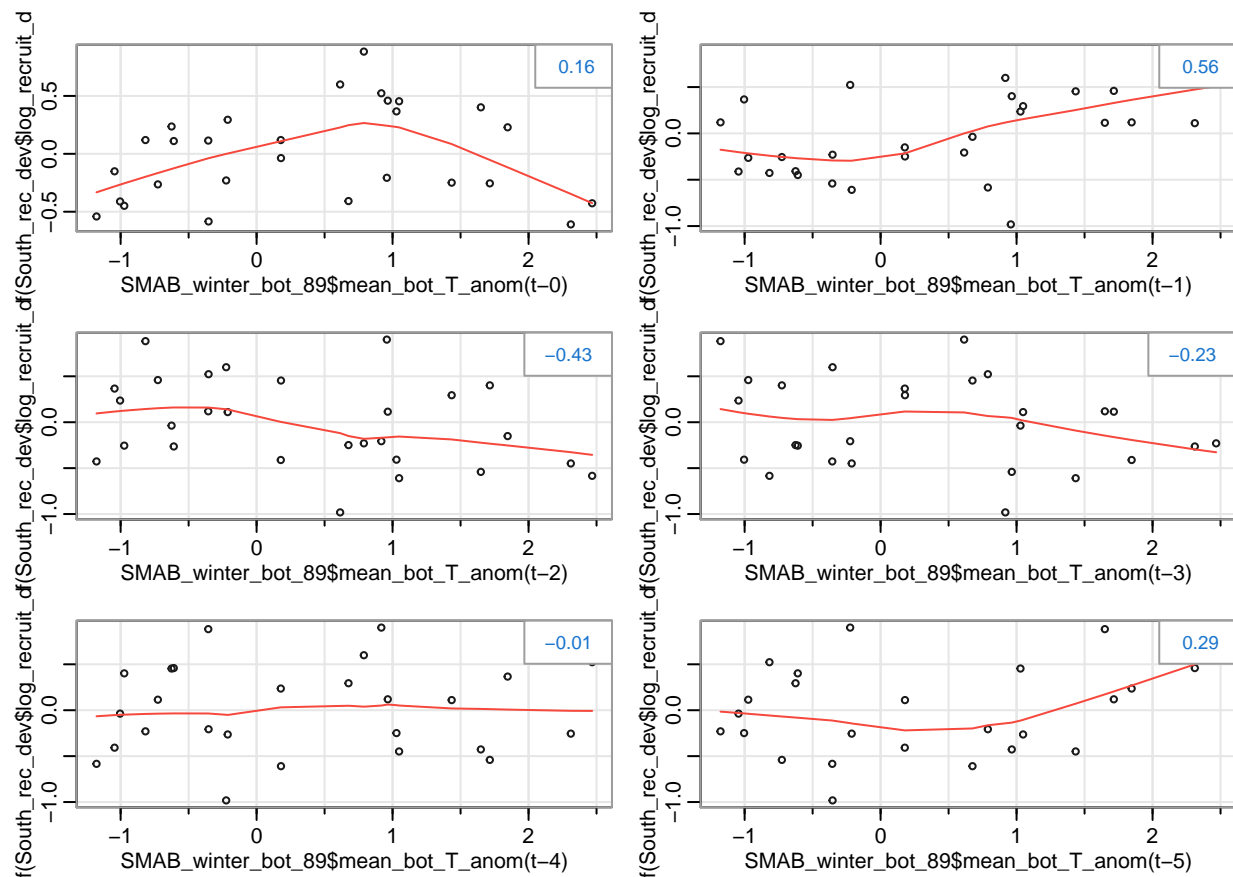
Cross Correlation Functions are useful in identifying lags in a time series that may be predictors of another series. This test indicates that there is a significant positive correlation between the rate of change in recruitment deviations and bottom temperature anomaly. There is more positive deviation from model predictions when the previous years anomaly is higher.

IE, the positive bottom temperature anomaly in 1999 is associated with increasing rate of recruitment deviations in 2000



southern MAB ccf visualizations

Range of lagged winter bottom temperature scatterplots with a lowess fit smoother displayed. Lag of 1 year has a positive correlations to rate of recruitment deviation.



Shelf water volume and recruitment CCF

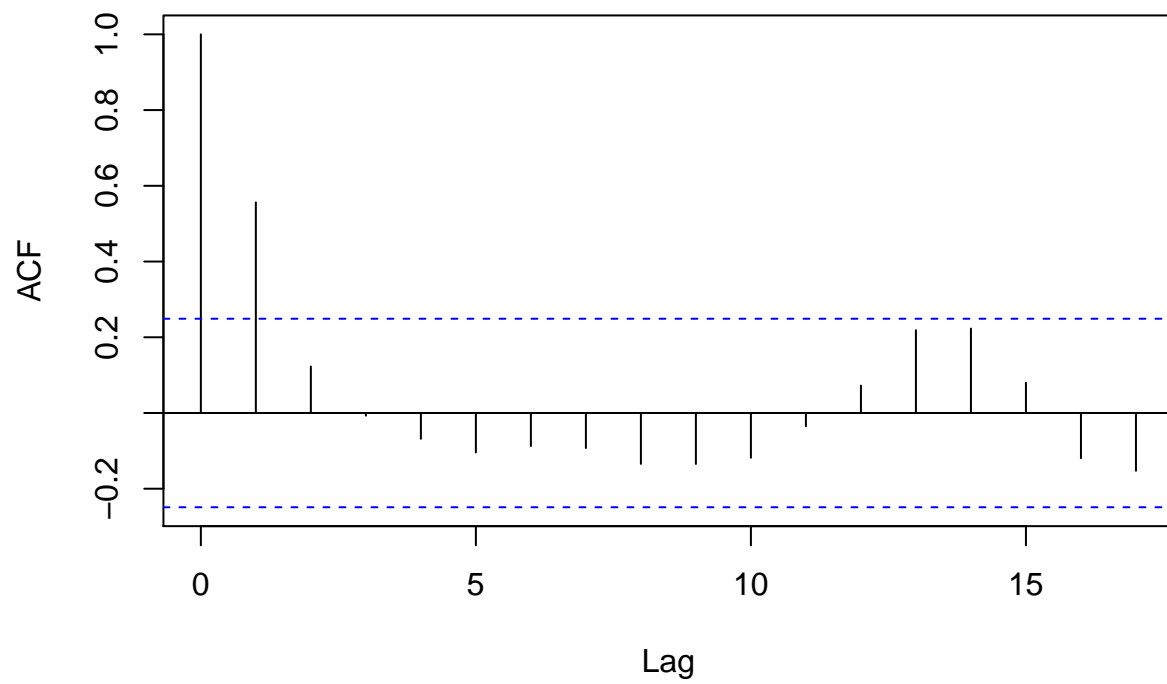
No significant correlations between Shelf water volume anomaly and the rate of recruitment deviations in either region

```
## [1] -219.79400 -106.27200 -120.36750 -145.20500 -78.32000 -148.24400
## [7] 39.38550 120.31400 268.37050 -153.11100 -883.50900 213.09000
## [13] 45.69000 361.65200 -48.97300 -478.33200 -12.31067 -38.00850
## [19] 83.64850 163.01400 143.74200 -67.99600 -125.30750 54.94150
## [25] 4.92950 12.23700 139.48300 -154.55400 -275.65850 -18.46200
## [31] -214.66400 129.36400
```

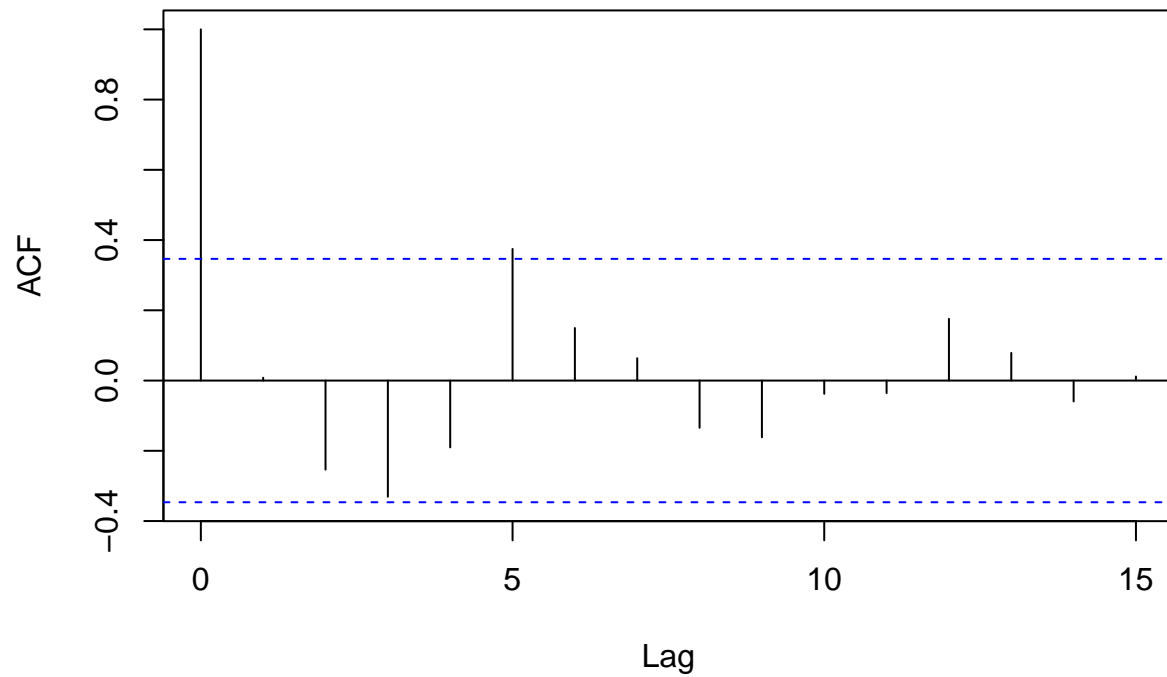
```
## [1] 0
```

```
## [1] 0
```

Series SHW_SMAB_winter\$mean_SHW_anom

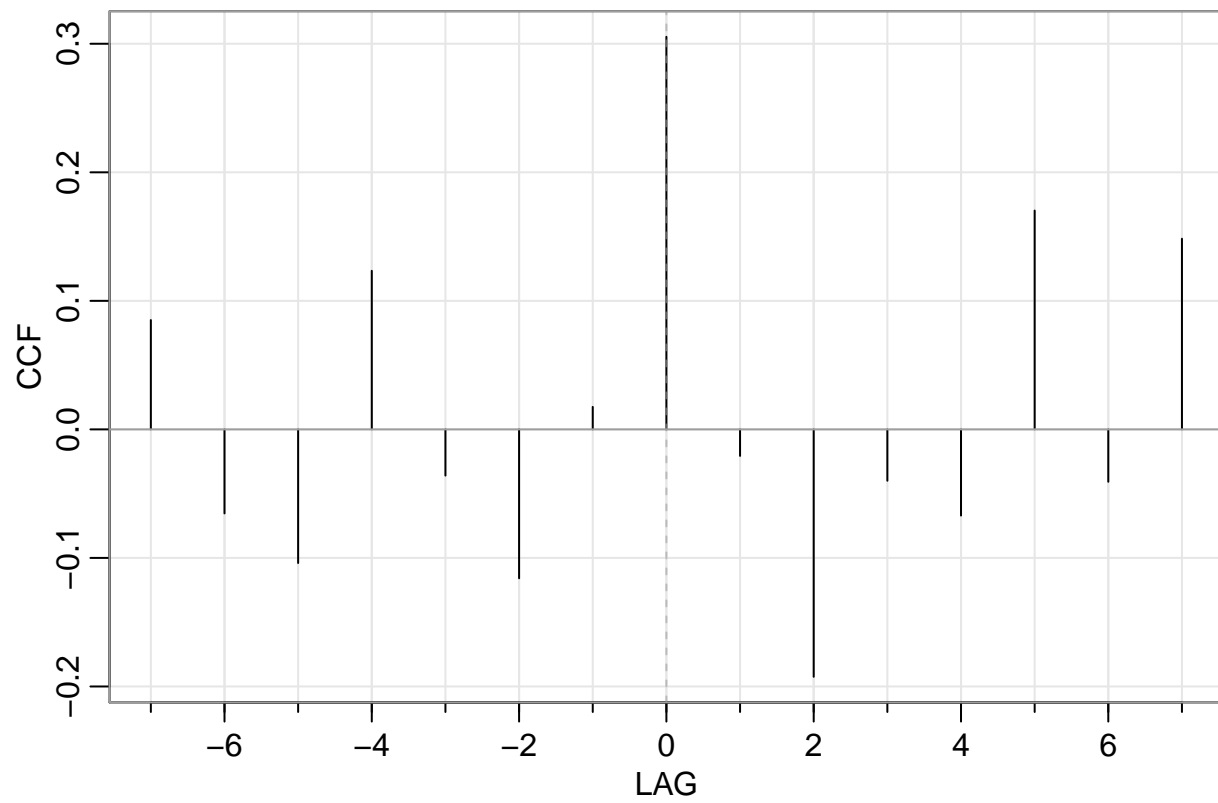


Series SHW_NMAB_winter\$mean_SHW_anom

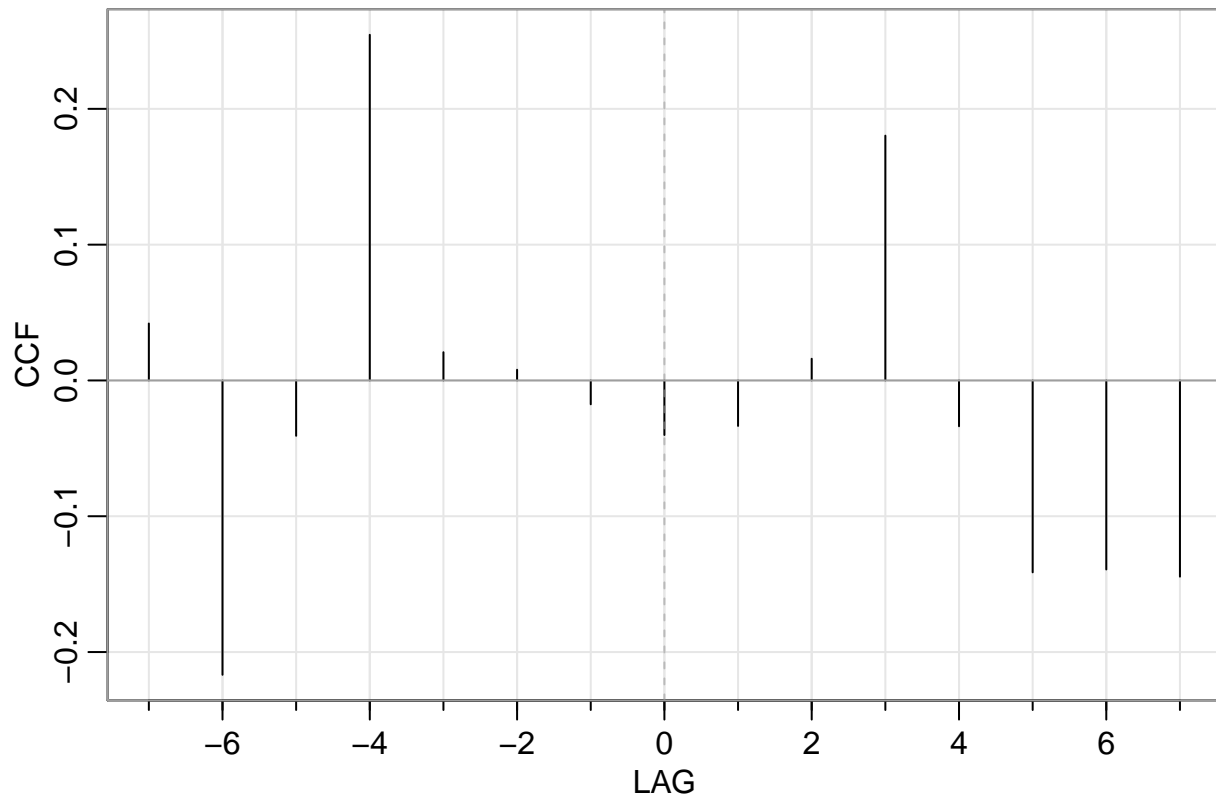


```
##  
## Augmented Dickey-Fuller Test  
##  
## data: diff(SHW_NMAB_ts)  
## Dickey-Fuller = -7.6407, Lag order = 3, p-value = 0.01  
## alternative hypothesis: stationary
```

.og recruitment deviations & winter Shelf water volume anomaly South



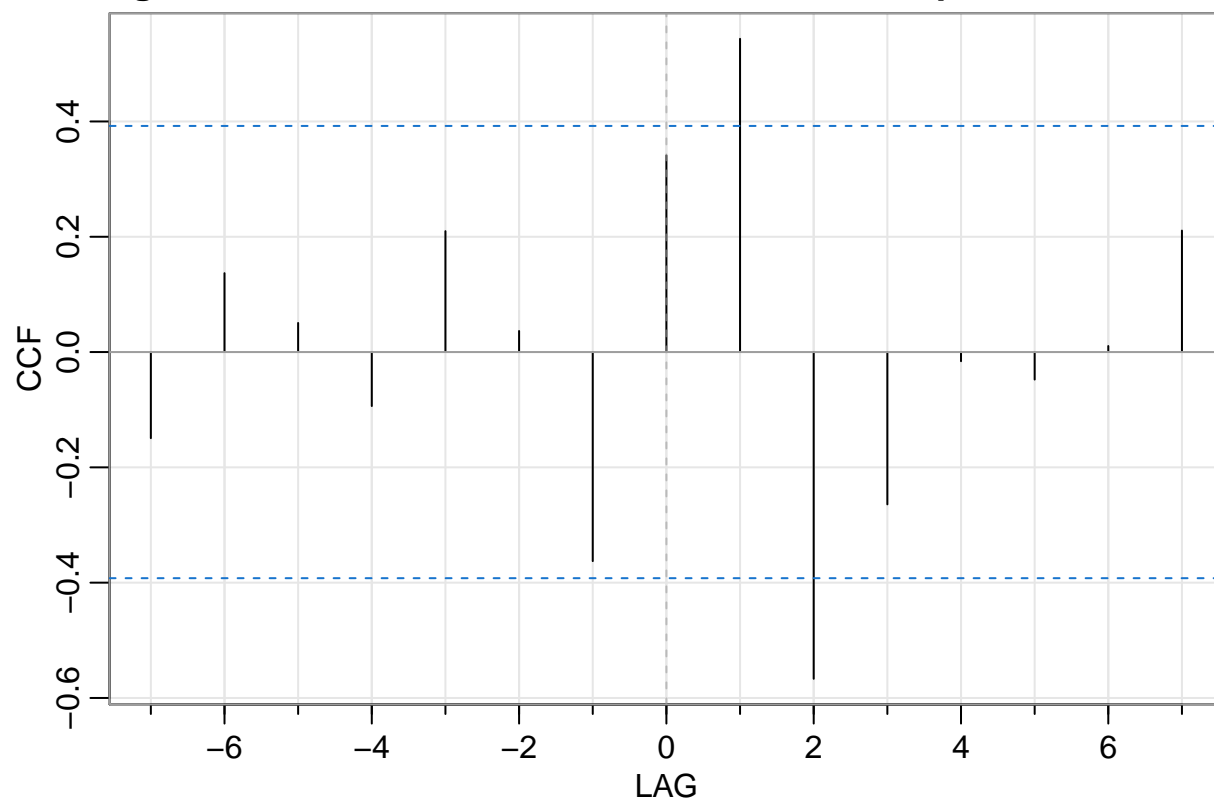
.og recruitment deviations & winter Shelf water volume anomaly North

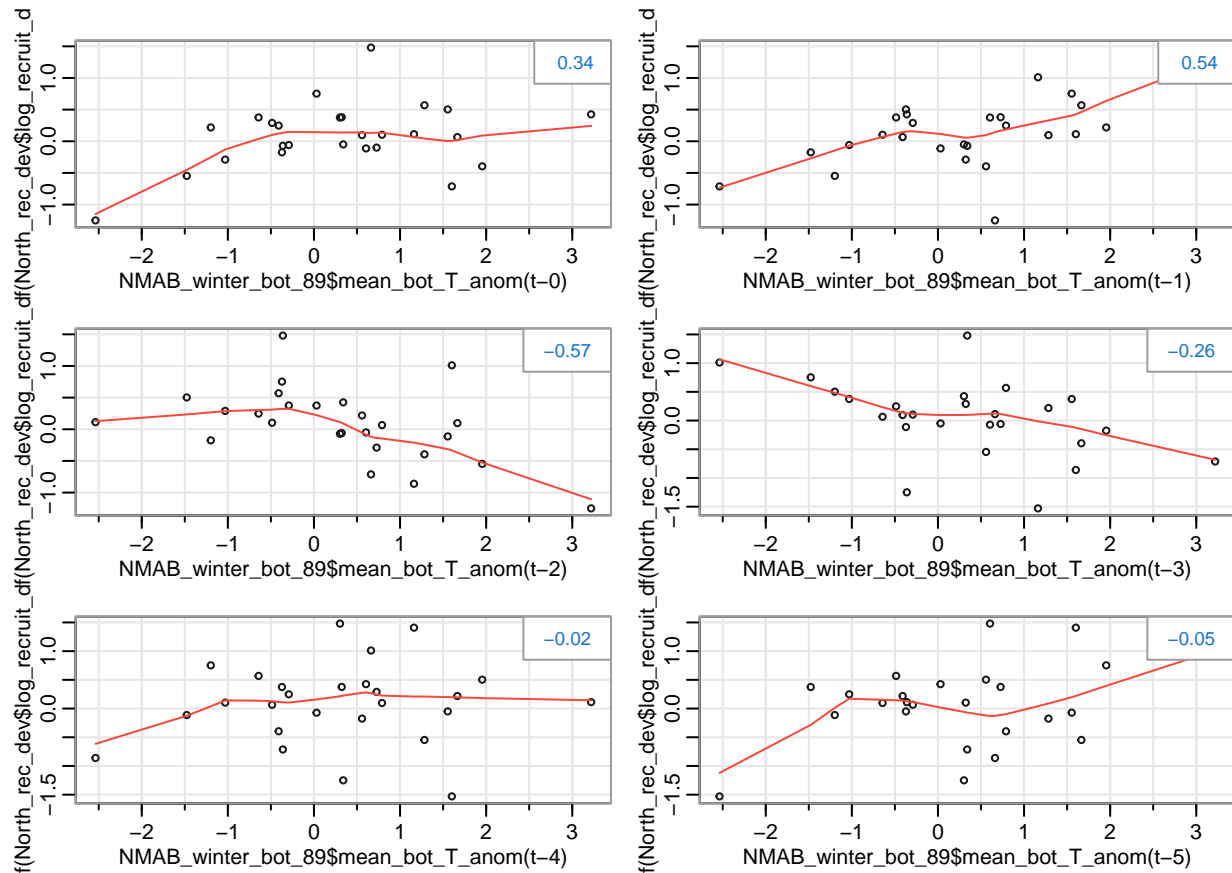


Northern MAB CCF

Peak correlation occurs with a 1 year lag.

Log recruitment deviations & winter bottom temperature anomaly





Gulf stream wall index CCF

Differing patterns in association is observed across the north vs south. Northern MAB has -3 and -7 lags, while Southern MAB has no significant time lags that correlate with recruitment deviations.

Indicator cross correlations

All indicators are reverted to their respective anomaly values and tested for correlations across differing lags. indicators for each region are tested for potential differences.

Winter bottom temperature vs Shelf water volume

No meaningful correlations detected across time lags across either region between winter bottom temperature and Shelf water volume

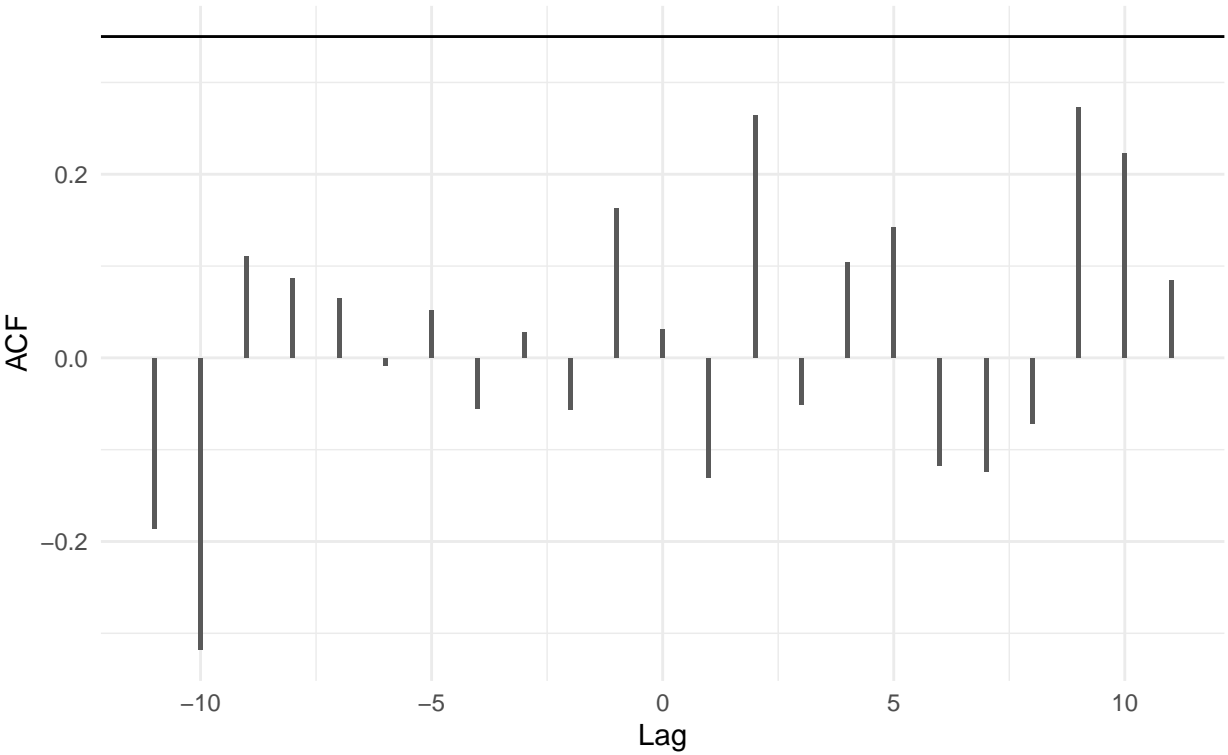
```
## function (series1, series2, max.lag = 0, corr = TRUE, smooth = TRUE,
##   col = gray(0.1), lw1 = 1, bgl = "white", box.col = 8, ...)
## {
##   as.ts = stats::as.ts
##   par = graphics::par
##   plot = graphics::plot
##   lines = graphics::lines
##   ts.intersect = stats::ts.intersect
```

```

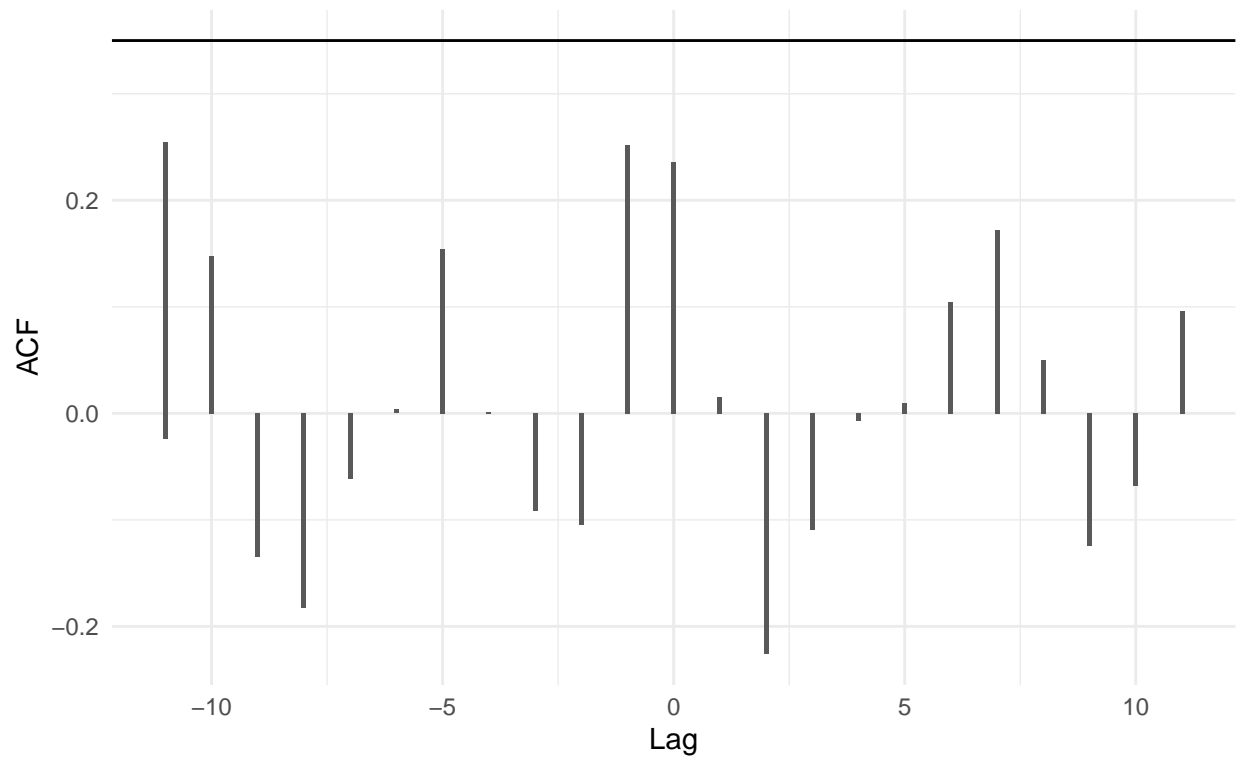
##      legend = graphics::legend
##      name1 = paste(deparse(substitute(series1)), "(t-", sep = "")
##      name2 = paste(deparse(substitute(series2)), "(t)", sep = "")
##      series1 = as.ts(series1)
##      series2 = as.ts(series2)
##      max.lag = as.integer(max.lag)
##      m1 = max.lag + 1
##      prow = ceiling(sqrt(m1))
##      pcol = ceiling(m1/prow)
##      a = stats::ccf(series1, series2, max.lag, plot = FALSE)$acf
##      old.par <- par(no.readonly = TRUE)
##      par(mfrow = c(prow, pcol))
##      for (h in 0:max.lag) {
##          tsplot(stats::lag(series1, -h), series2, xy.labels = FALSE,
##                type = "p", xlab = paste(name1, h, ""), sep = ""),
##                ylab = name2, col = col, ...)
##          if (smooth == TRUE)
##              lines(stats::lowess(ts.intersect(stats::lag(series1,
##                -h), series2)[, 1], ts.intersect(stats::lag(series1,
##                -h), series2)[, 2]), col = 2, lwd = lwl)
##          if (corr == TRUE)
##              legend("topright", legend = round(a[m1 - h], digits = 2),
##                    text.col = 4, bg = bgl, adj = 0.25, cex = 0.85,
##                    box.col = box.col)
##          on.exit(par(old.par))
##      }
## }
## <bytecode: 0x000000002d59c8b0>
## <environment: namespace:astsa>

```

Winter bottom temperature & winter shelf water volume anomaly
Northern MAB



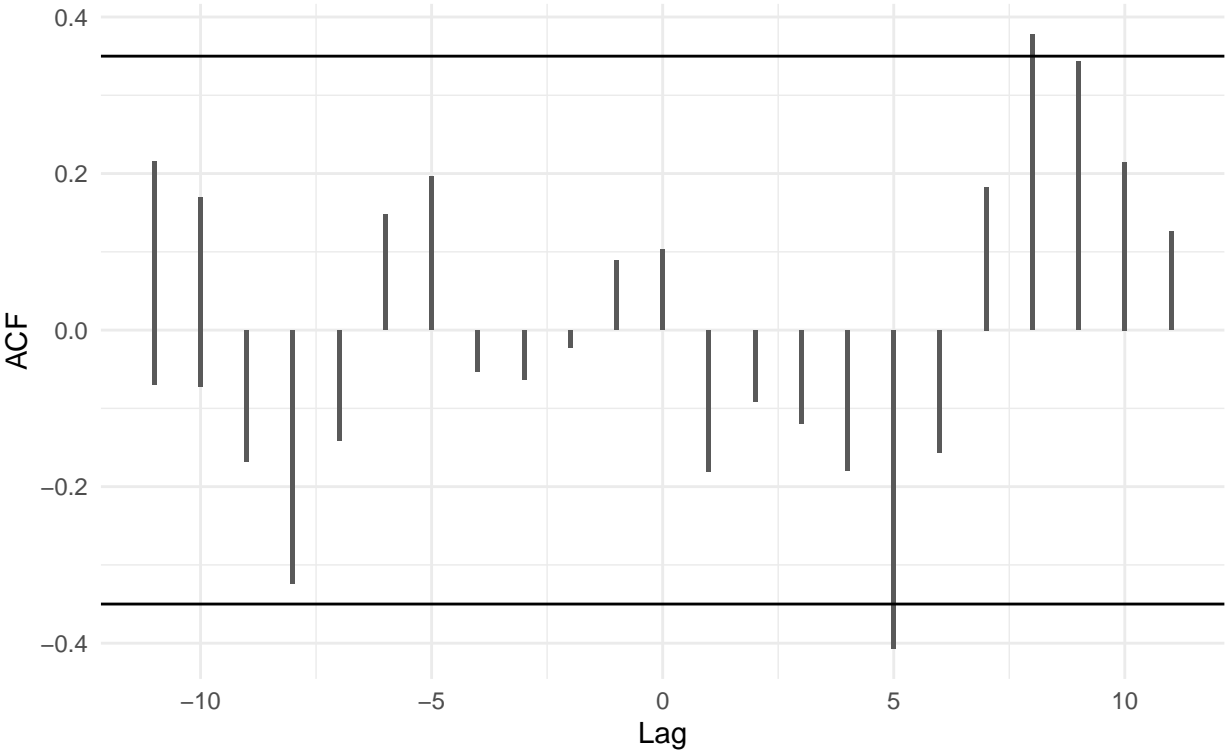
Winter bottom temperature & winter shelf water volume anomaly Southern MAB



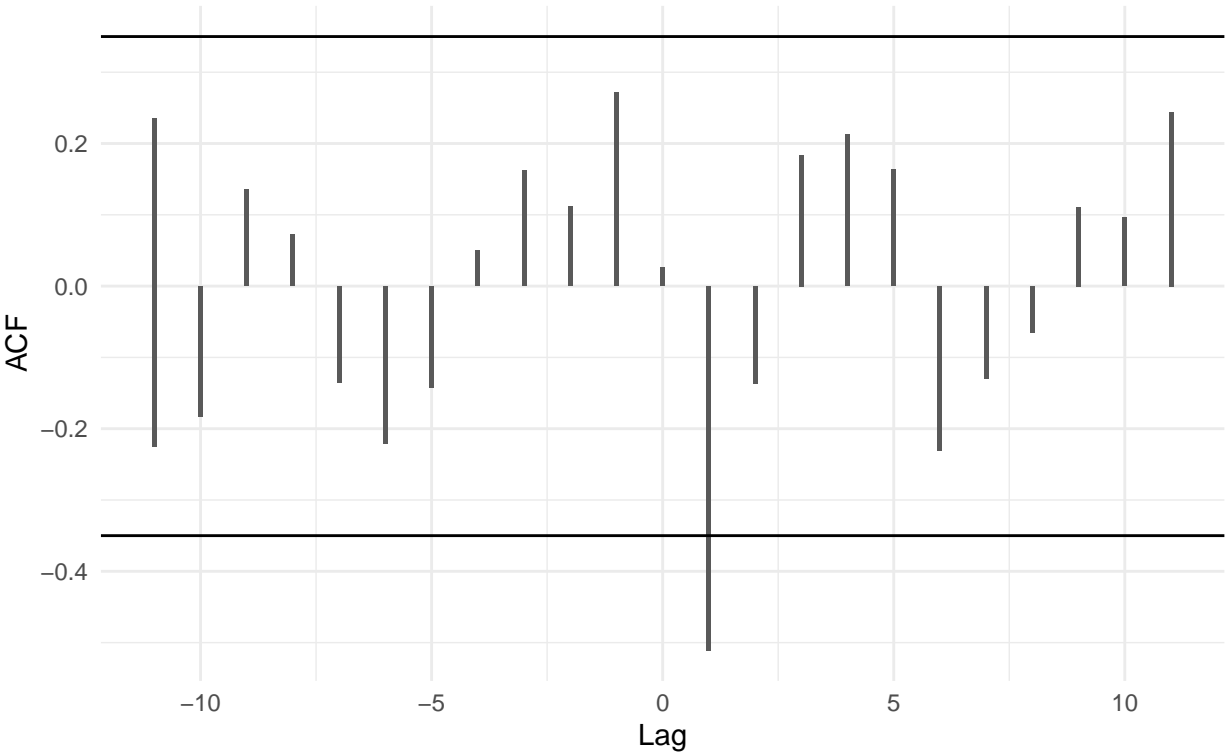
Winter bottom salinity vs Shelf water volume

Southern MAB displays some correlations between variables at the 5 and 8 year lag, while northern MAB has a negative correlation at a one year lag.

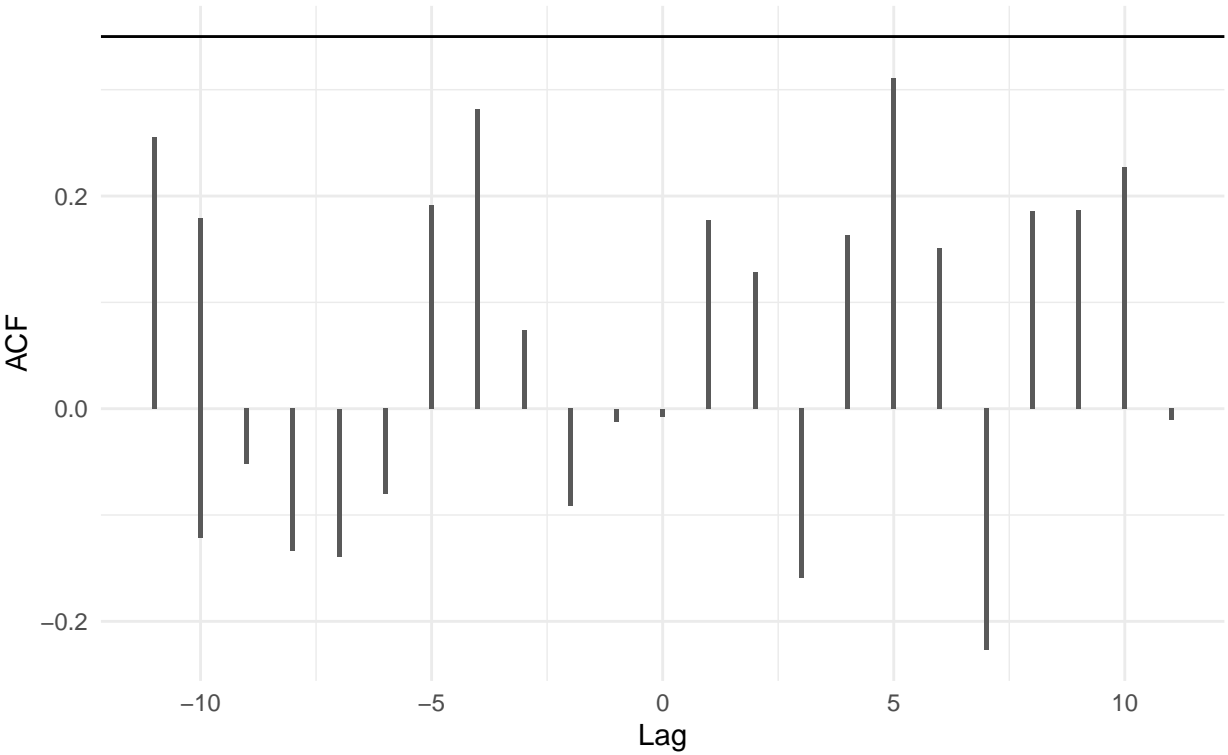
Winter bottom salinity anomaly & winter shelf water volume anomaly
Southern MAB



Winter bottom salinity anomaly & winter shelf water volume anomaly
Northern MAB



Winter bottom salinity anomaly & winter bottom temp anomaly
Southern MAB



Winter bottom salinity anomaly & winter bottom temp anomaly
Northern MAB

