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R version 4.4.0 (2024-04-24) -- "Puppy Cup"
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Platform: aarch64-apple-darwin20
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'help.start()' for an HTML browser interface to help.
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[R.app GUI 1.80 (8376) aarch64-apple-darwin20]
[History restored from /Users/alperkaragol/.Rapp.history]
> rm(list = ls())
> library(ggplot2)
> library(ggrepel)
> # Original data
> X <-
c(-1149.5, -680.6, -131.9, -1075, -760.6, -156.2, -226.7, -150, -144.7, -3455.6, -482, -515.6, -456.4, -1290.2, -168, -177.5, -1111, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -120.2, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4, -168.4,
-226.3,-1114.4,-324.3,-232.2,-164.4,-1089.4,-991)
> y <- c(718.71, 518.35, 97.27, 1013.12, 643.41, 160.33, 206.26, 72.09, 99.32, 3325.04, 294.18, 328.73, 264.82,
1360.25, 155.36, 153.54, 1025.21, 137.52, 615.36, 246.17, 173.78, 121.97, 641.70, 947.04)
> # Labels for outliers
> # Create a data frame
> df \leftarrow data.frame(x = x, y = y, label = labels)
> # Calculate Pearson correlation
> cor_result <- cor.test(x, y, alternative = "two.sided", method = "pearson", exact=FALSE)
> print(cor_result)
        Pearson's product-moment correlation
data: x and y
t = -22.857, df = 22, p-value < 2.2e-16
alternative hypothesis: true correlation is not equal to 0
95 percent confidence interval:
 -0.9912713 -0.9526378
sample estimates:
            cor
-0.9795878
> # Function to identify pair outliers using Tukey's fence method
> identify_outliers <- function(x, y, k = 1.5) {</pre>
     # Calculate Mahalanobis distances
       center <- c(mean(x), mean(y))</pre>
       cov_matrix <- cov(cbind(x, y))</pre>
      mahalanobis_dist <- mahalanobis(cbind(x, y), center, cov_matrix)</pre>
       # Calculate Tukey's fences
       q1 <- quantile(mahalanobis_dist, 0.25)
       q3 <- quantile(mahalanobis_dist, 0.75)
       iqr <- q3 - q1
       lower_fence <- q1 - k * iqr</pre>
       upper_fence <- q3 + k * iqr
       # Identify outliers
       outliers <- mahalanobis_dist > upper_fence | mahalanobis_dist < lower_fence
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return(outliers)
+ }
> # Identify outliers
> df$outlier <- identify_outliers(df$x, df$y)</pre>
> # Print number of outliers
> num_outliers <- sum(df$outlier)</pre>
> cat("Number of pair outliers detected:", num_outliers, "\n")
Number of pair outliers detected: 5
> # Fit linear rearession model
> lm_model <- lm(y \sim x, data = df)
> # Create applot
> p \leftarrow ggplot(df, aes(x = x, y = y)) +
     geom_point(aes(color = outlier, shape = outlier), size = 2.5) + # Smaller data points
geom_smooth(method = "lm", se = FALSE, color = "darkgreen", linetype = "solid", size = 0.5) + # Continuous line
     name = "Data Points") +
     name = "Data Points") +
     labs(title = " ",
           x = " RNA structure MFE (kcal/mol)", y = "Ensemble Diversity") +
     theme_minimal(base_size = 13) +
     theme(
        legend.position = c(1, 1), # Move legend to upper right corner
        legend.justification = c(1, 1), # Align legend to top-right
        legend.box.just = "right"
        legend.margin = margin(2, 2, 5, 5)
       legend.background = element_rect(fill = "white", color = "black", size = 0.5),
panel.grid.major = element_line(color = "gray80", size = 0.2),
panel.grid.minor = element_line(color = "gray90", size = 0.05)
Warnina messages:
1: Using `size` aesthetic for lines was deprecated in ggplot2 3.4.0.
i Please use `linewidth` instead.
This warning is displayed once every 8 hours.
Call `lifecycle::last_lifecycle_warnings()` to see where this warning was generated.
2: The `size` argument of `element_rect()` is deprecated as of ggplot2 3.4.0.
i Please use the `linewidth` argument instead.
This warning is displayed once every 8 hours.
Call `lifecycle::last_lifecycle_warnings()` to see where this warning was generated. 
3: The `size` argument of `element_line()` is deprecated as of ggplot2 3.4.0.
i Please use the `linewidth` argument instead.
This warning is displayed once every 8 hours.
Call `lifecycle::last_lifecycle_warnings()` to see where this warning was generated. 4: A numeric `legend.position` argument in `theme()` was deprecated in ggplot2 3.5.0.
i Please use the `legend.position.inside` argument of `theme()` instead.
This warning is displayed once every 8 hours.
Call `lifecycle::last_lifecycle_warnings()` to see where this warning was generated.
> # Add labels to outliers using ggrepel
> p <- p + geom_text_repel(
+ data = subset(df, outlier),</pre>
     aes(label = label),
    box.padding = 0.5,
     point.padding = 0.5,
    force = 2.
    max.overlaps = Inf,
    size = 3.5
> # Add regression equation
> eq <- paste0("y = ", round(coef(lm_model)[2], 4), "x + ", round(coef(lm_model)[1], 4))
> p <- p + annotate("text", x = -Inf, y = Inf, label = eq, hjust = -1.1, vjust = 16, size = 4)</pre>
> # Extend the plot limits (less than before)
> x_range <- max(df$x) - min(df$x)</pre>
> y_range <- max(df$y) - min(df$y)
> p <- p + coord_cartesian(</pre>
    \begin{array}{lll} & \text{xlim} = c(\min(df\$x) - 0.01* \ x\_range, \ max(df\$x) + 0.01* \ x\_range), \\ & \text{ylim} = c(\min(df\$y) - 0.01* \ y\_range, \ max(df\$y) + 0.01* \ y\_range) \end{array}
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> # Add Pearson correlation to the plot
> cor_text <- paste("Pearson correlation:", round(cor_result$estimate, 4))
> p <- p + annotate("text", x = -Inf, y = Inf, label = cor_text, hjust = -0.8, vjust = 12.5, size = 4.5)
> # Display the plot
> print(p)
`geom_smooth()` using formula = 'y ~ x'
>
```