

# Residual-fitted value plots

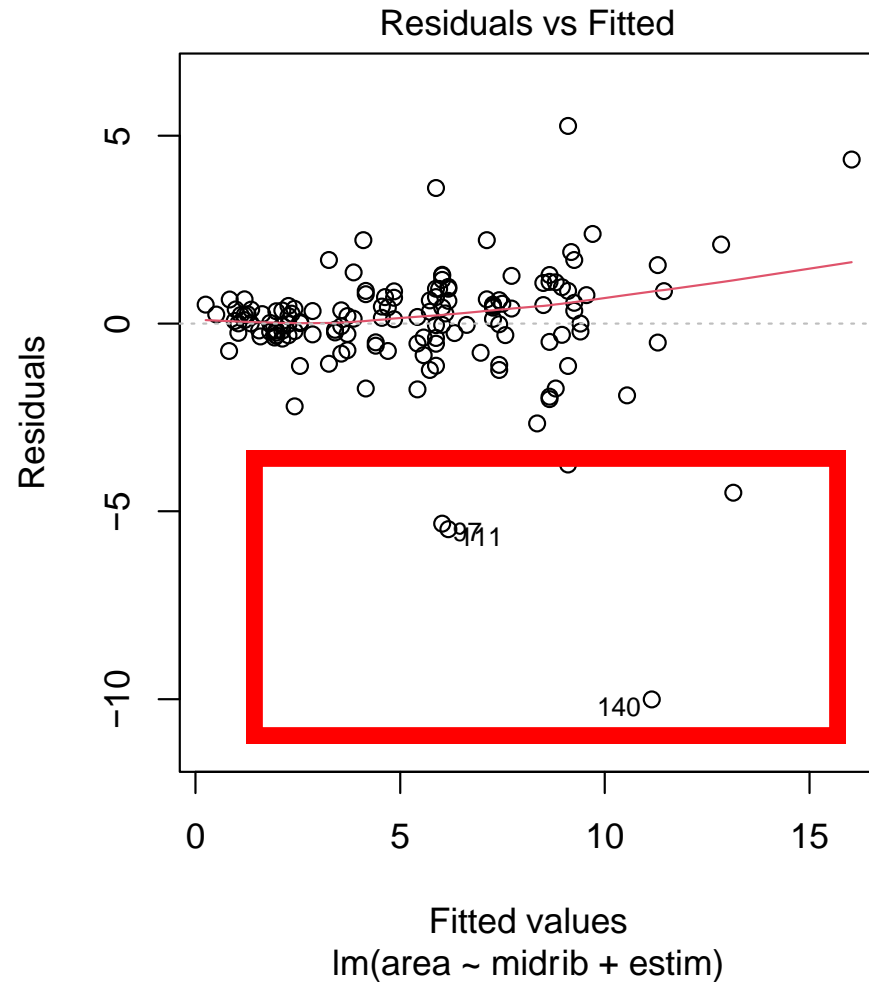
```
plot(model, which=1)
```

- What it tells us:
  - Points with large residual
    - Problem: Potential outlier (need to verify with Cook's distance)
  - A non-horizontal trend in residuals (red trend line isn't horizontal near residual=0)
    - Problem: missing intercept or Y not linearly related to X (violation of assumption I).
  - A pattern in the residuals
    - Problem: Correlated random error. Violation of assumption (IV).

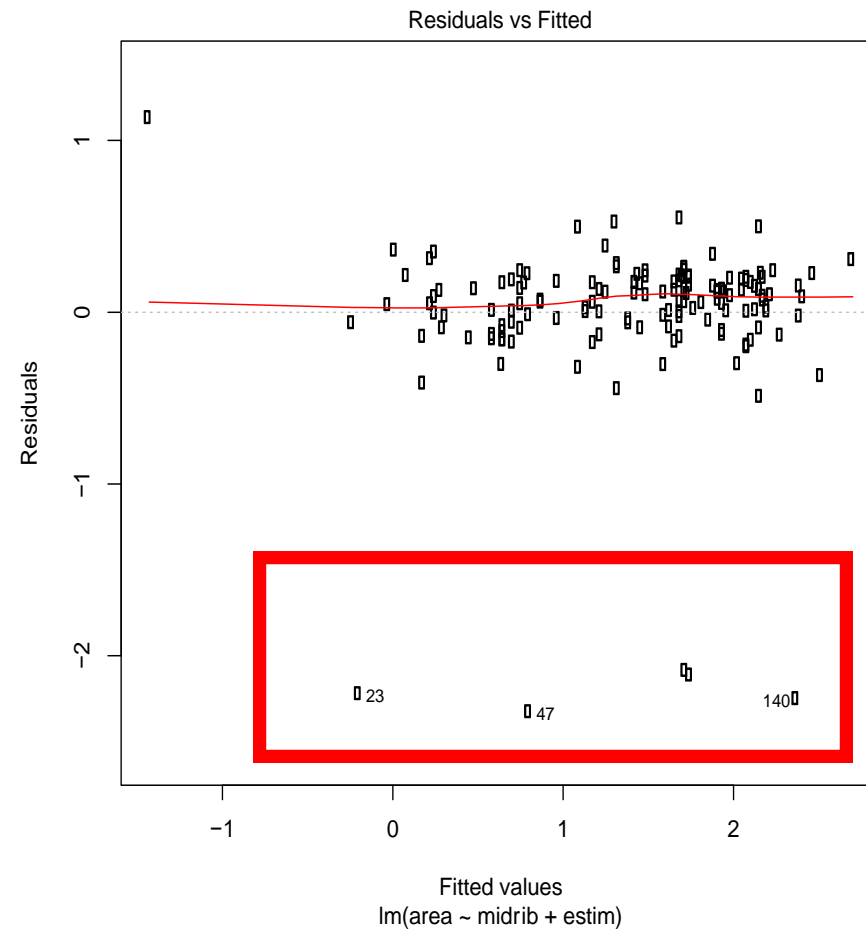
# Comparing residual-fitted value plots

`plot(model, which=1)`

**Before log-transform**



**After log-transform**

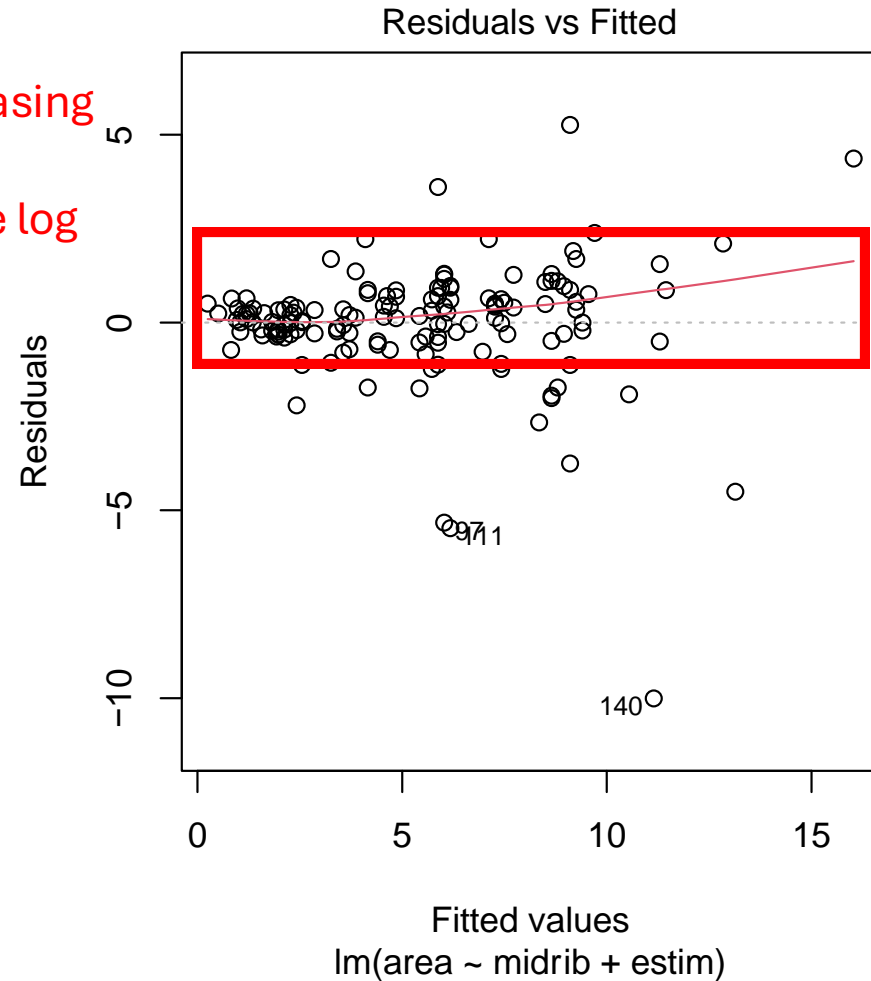


Large residuals  
occur before  
and after log-  
transform!

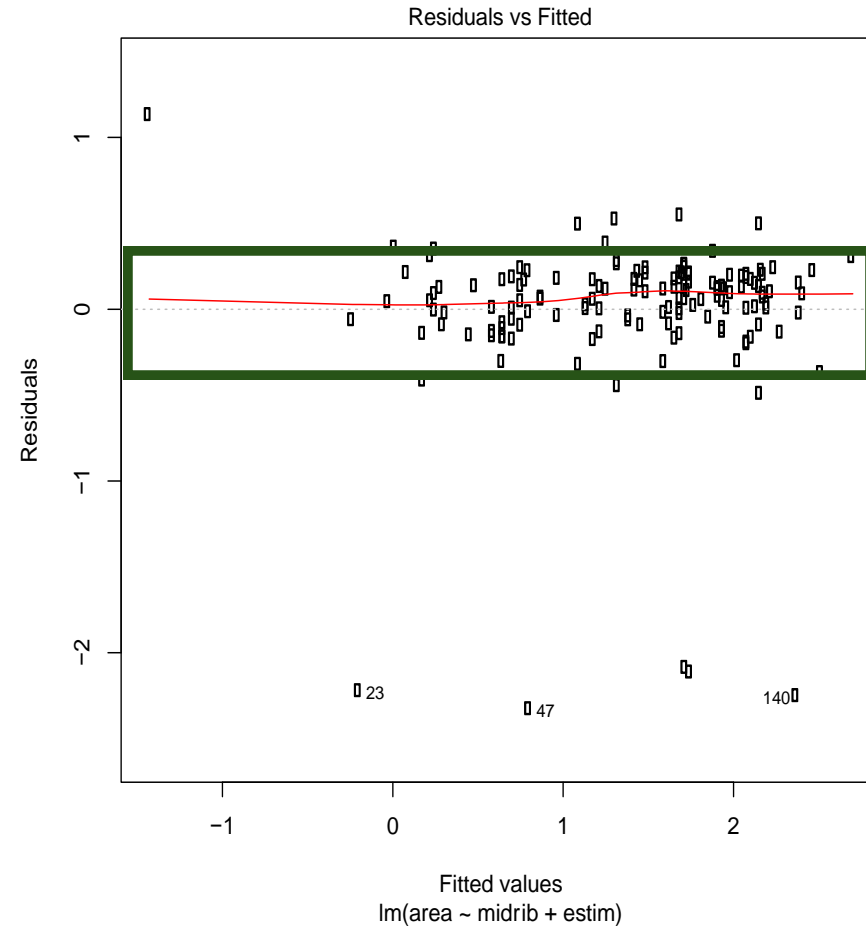
# Comparing residual-fitted value plots

`plot(model, which=1)`

**Before log-transform**



**After log-transform**



Trendline is almost horizontal around residual = 0 after log-transform

Slight increasing exponential trend before log transform

# QQ-normal plot for standardised residuals

```
plot(model, which=2)
```

- What it tells us:

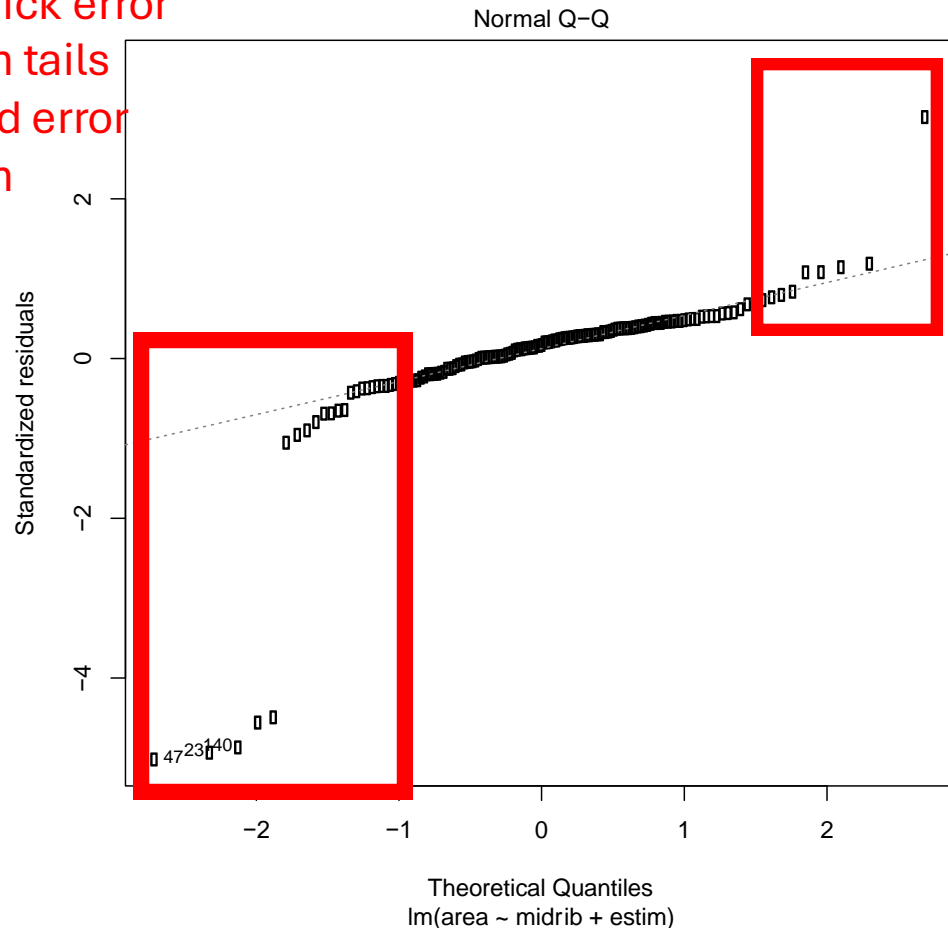
- A single extreme quantile is far from the dotted line
  - Problem: Potential outlier (need to verify with Cook's distance)
- Highest and lowest empirical quantiles are far from dotted line
  - Problem: Over- or under- estimation of error distribution tails.
- Points below the dotted line are further away from line than points above dotted line.
  - Random error follows a skewed distribution.

# QQ-normal plot for standardised residuals

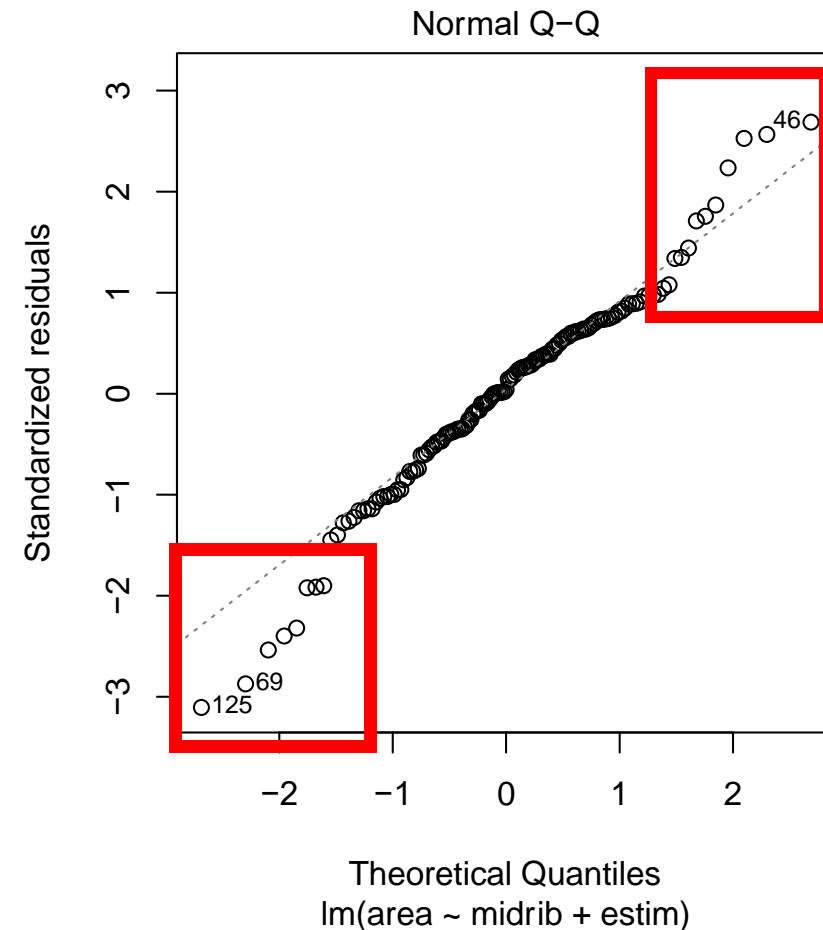
```
plot(model, which=2)
```

Before removing outliers, we observe two issues: unusually thick error distribution tails and skewed error distribution

**Before removing outlier**



**After removing outliers**



After deleting outliers, there is still some evidence of unusually thick error distribution tails!

But evidence of skewness is no longer present.

# Scale-location

```
plot(model, which=3)
```

- What it tells us:

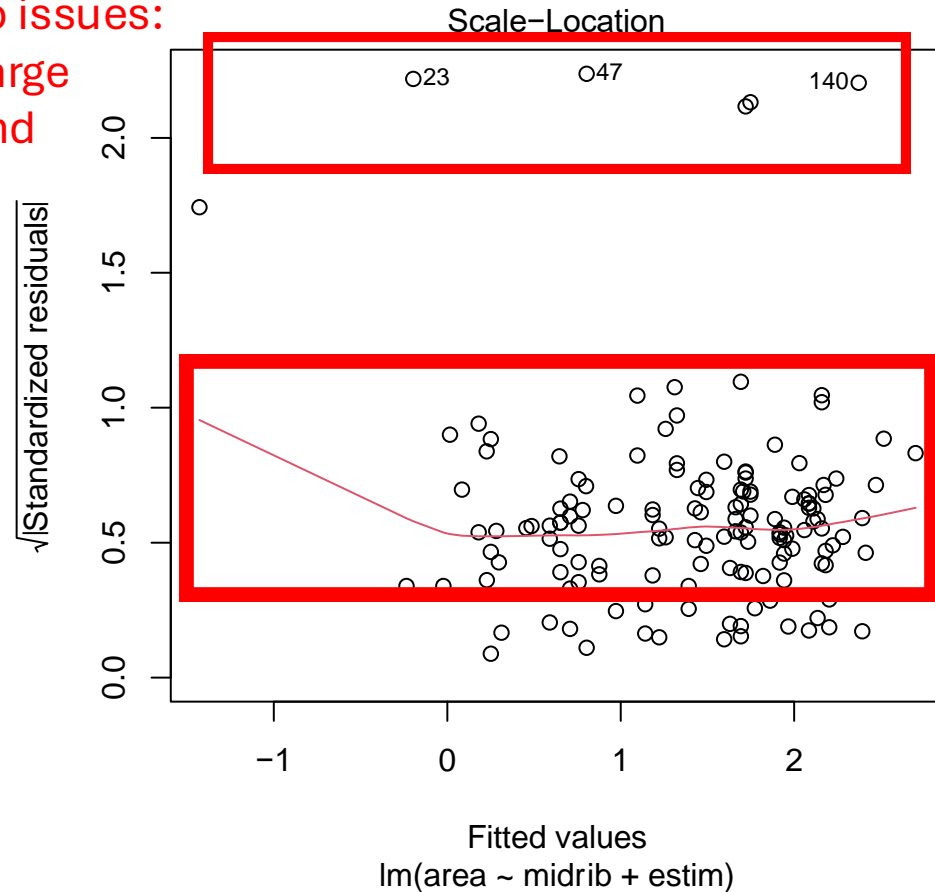
- A single unusually high sqrt-standardised residual
  - Problem: Potential outlier (need to verify with Cook's distance)
- Non-horizontal trendline (trendline isn't horizontal)
  - Problem: non-constant error variance. Violation of assumption (IV).

# Scale-location

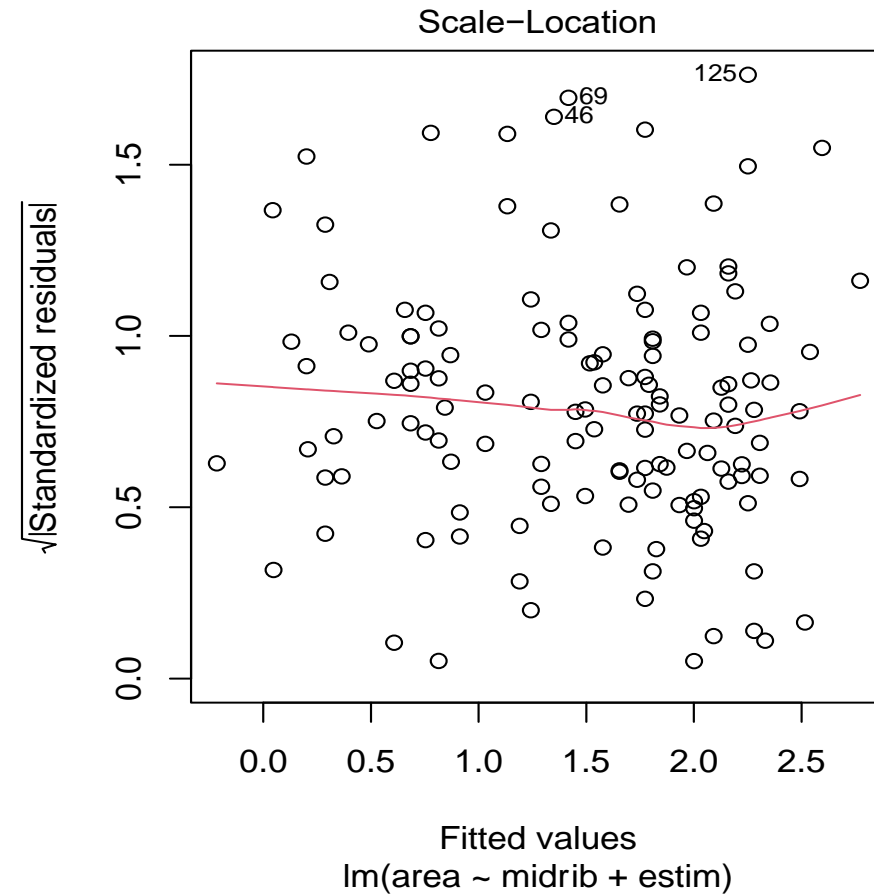
```
plot(model, which=3)
```

Before removing outliers, we observe two issues: unusually large residuals and

Before removing outlier



After removing outliers



After removing outliers, both issues are resolved

# Cook's distance plot

```
plot(model, which=4)
```

- Horizontal axis = leverage
- Vertical axis = standardised residual
- Contour = Cook's distance
- What it tells us:
  - Points lie beyond high Cook's distance contours
    - Problem: Strong evidence for an outlier

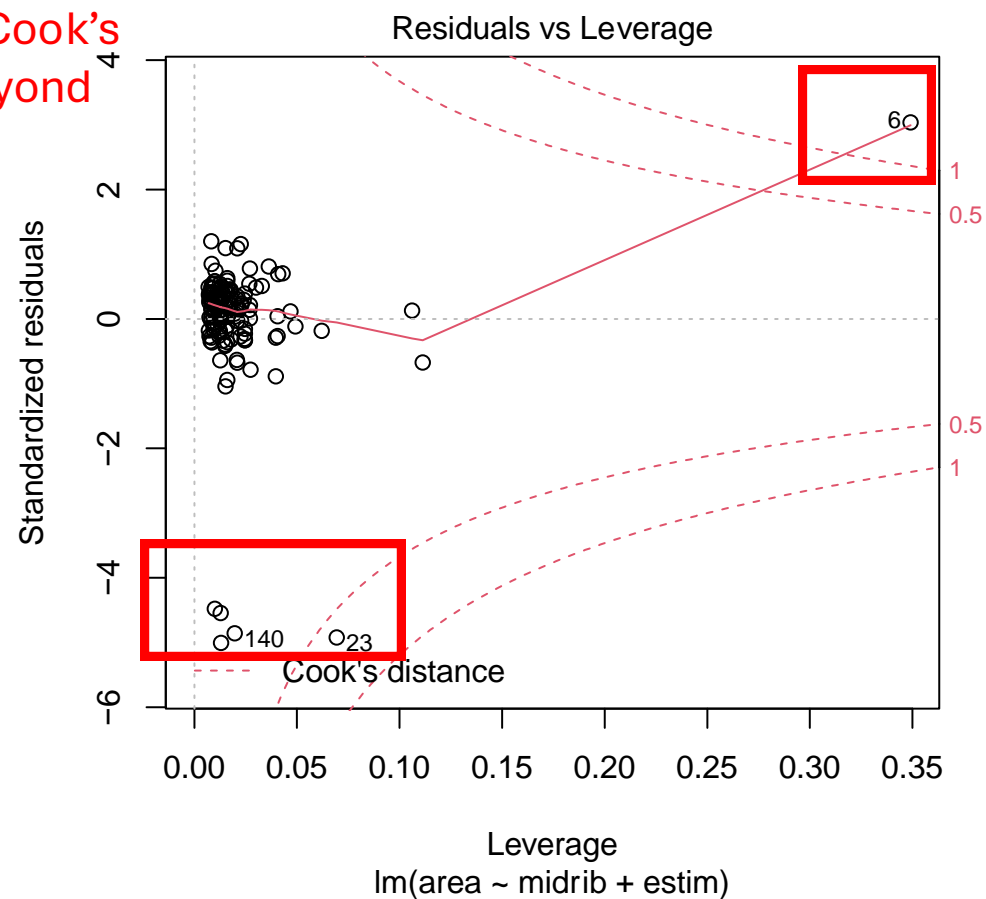


# Cook's distance

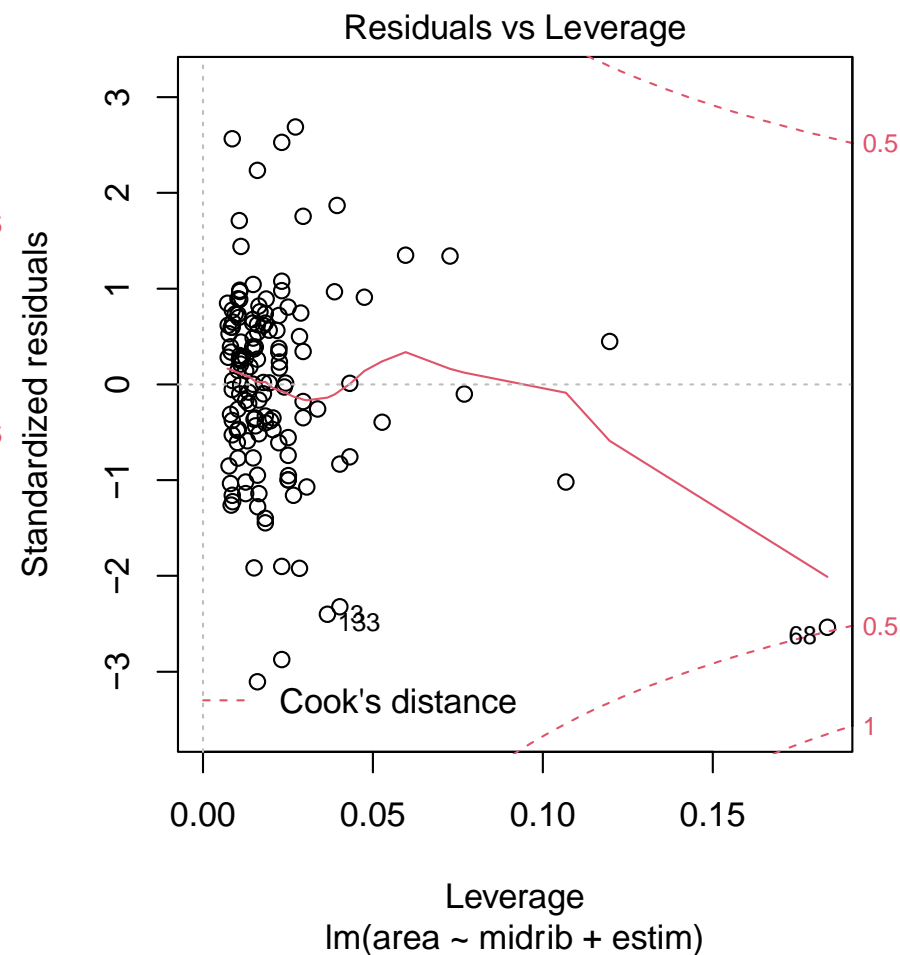
```
plot(model, which=4)
```

Before removing outliers, several points with Cook's D near or beyond 0.5-contour

**Before removing outlier**



**After removing outliers**



After removing outliers, only one point with Cook's D near 0.5-contour