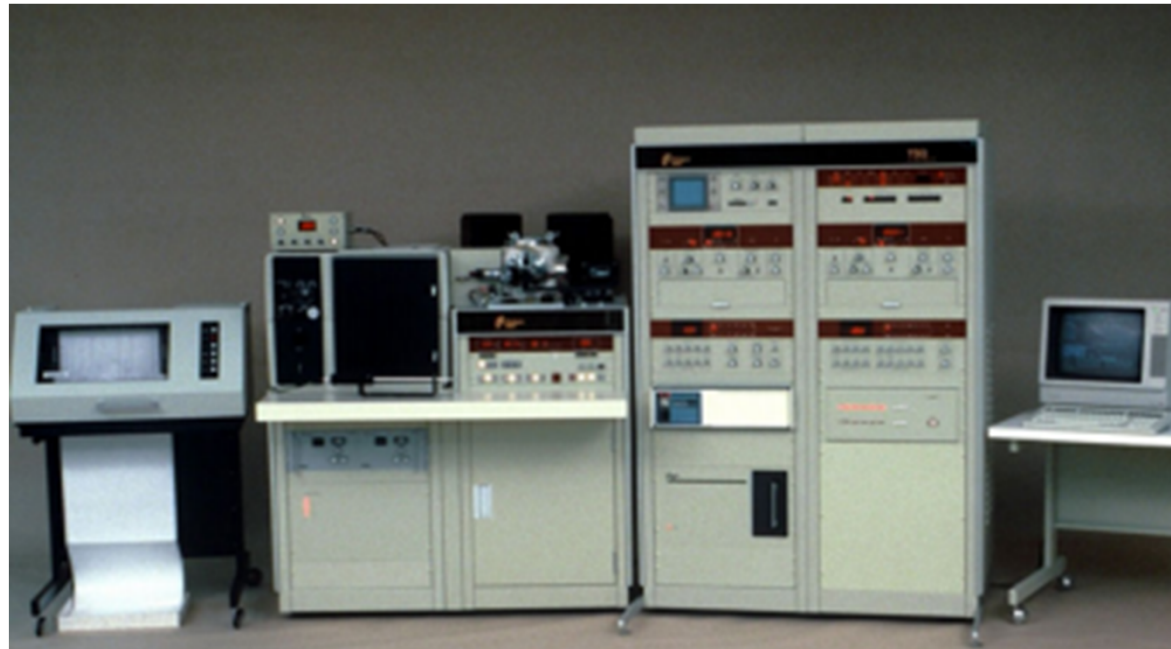


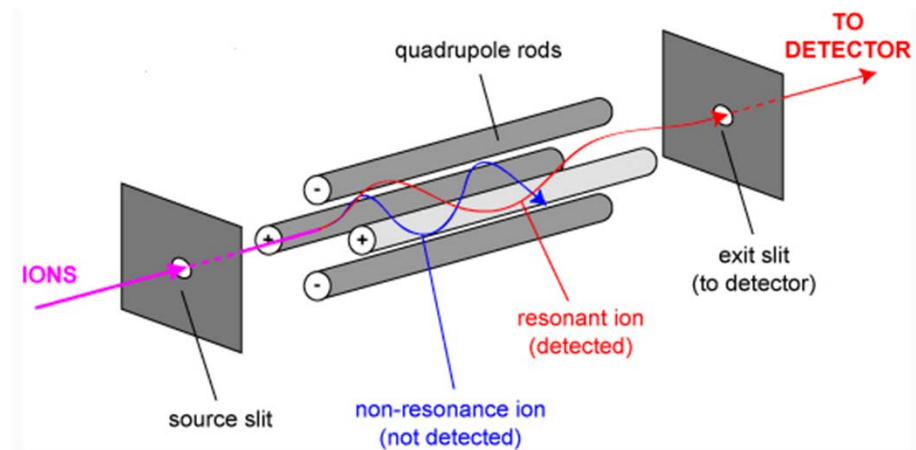


# Modern Mass Spectrometers and the Correlation Coefficient – Are they compatible?

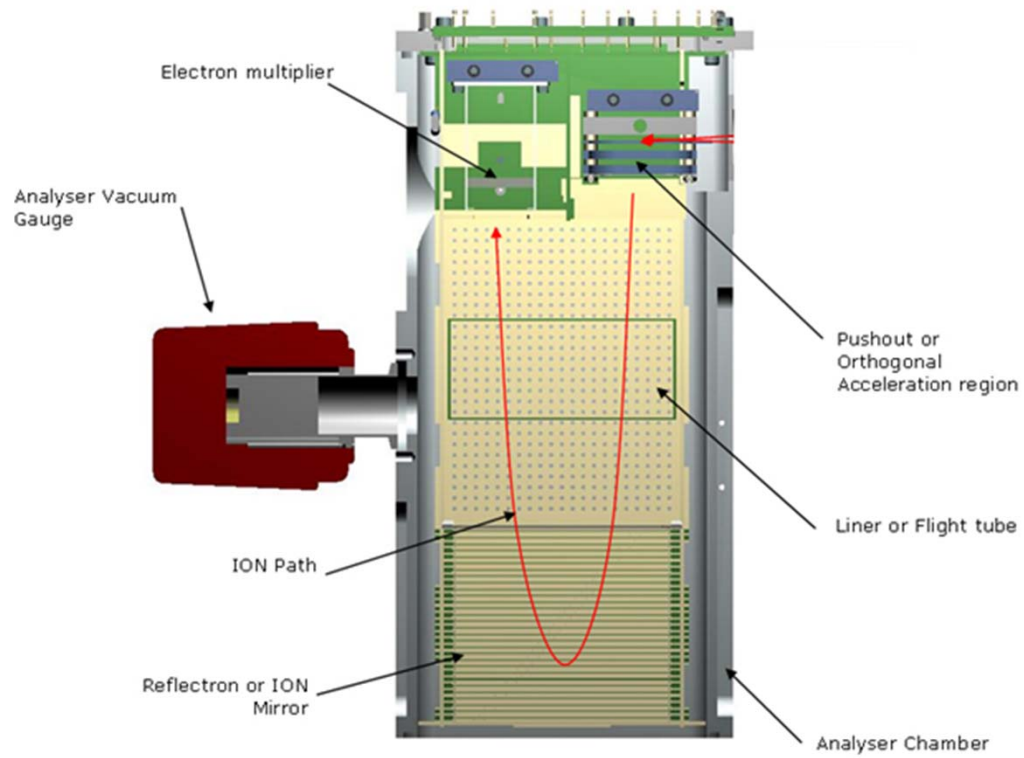
**Richard Burrows**

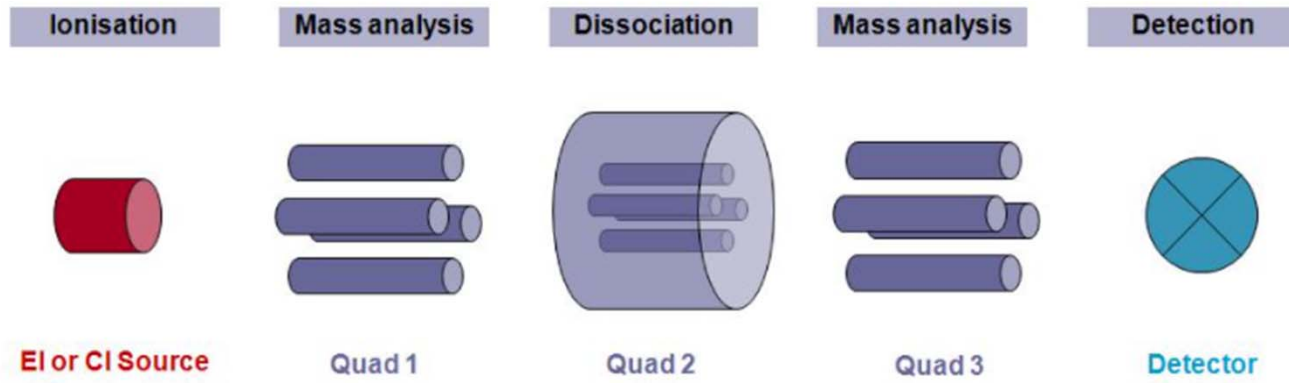






# Time of Flight





## Why use advanced mass spectrometers?

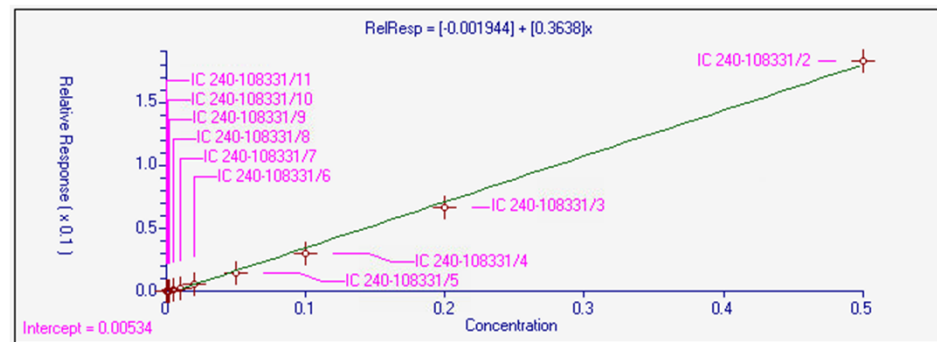


- **More sensitive**
- **Greater working range**
- **Better selectivity**

**Faster   Cheaper   Better**  
**Choose all three!**



## Hexadecane, 0.5-500 ng/mL



### Linear Unweighted

Coefficient of determination: **0.998**

Low point error **1109%**

Bottom 5 points all have error > 30% (RSE **213%**)

### Quadratic unweighted

Coefficient of determination **1.000**

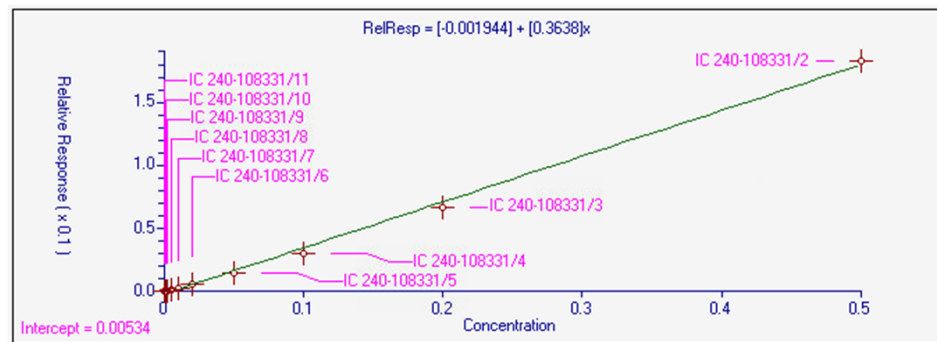
Low point error **326%**

Bottom 3 points all have error > 50% (RSE **134%**)





## Hexadecane, 0.5-500 ng/mL



### Linear Weighted

Coefficient of determination: **0.963**

All points error < 30% (RSE **18.5%**)

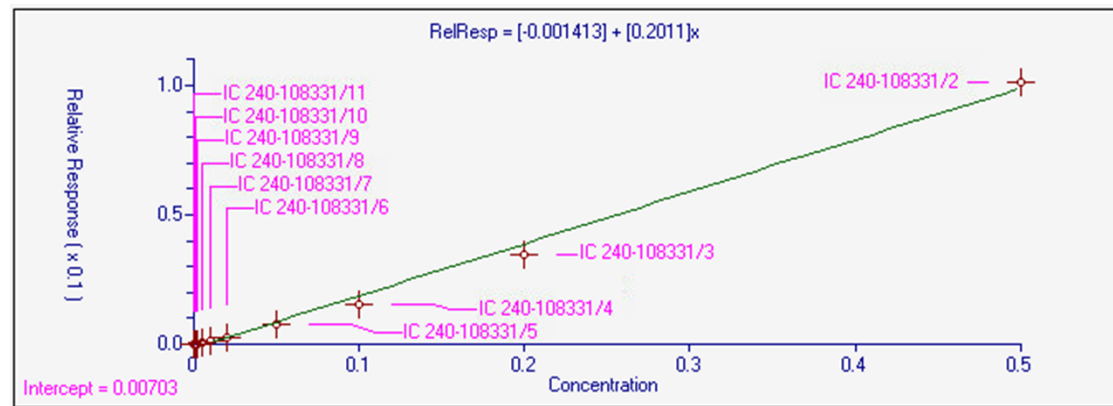
### Quadratic weighted

Coefficient of determination **0.986**

All points error < 25% (RSE **13.2%**)



## 2,4,5 Trichlorophenol, 0.5-500 ng/mL



Linear Unweighted

Coefficient of determination: **0.996**

Low point error **1335%**, bottom 4 points all > 85% error (RSE **535%**)

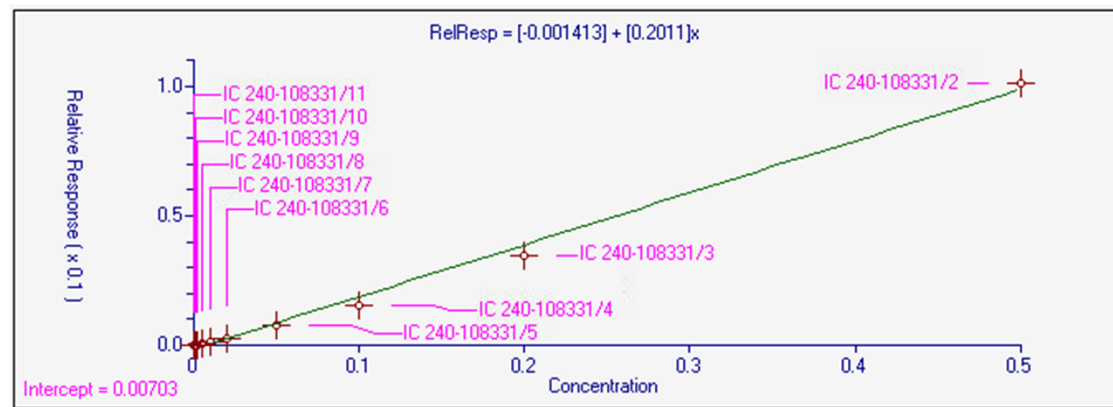
Quadratic unweighted

Coefficient of determination **1.000**

Low point error **220%**, bottom 3 points > 50% error (RSE **90.4%**)



## 2,4,5 Trichlorophenol, 0.5-500 ng/mL



Linear weighted

Coefficient of determination: **0.958**

All points < 30% error (RSE **19.8%**)

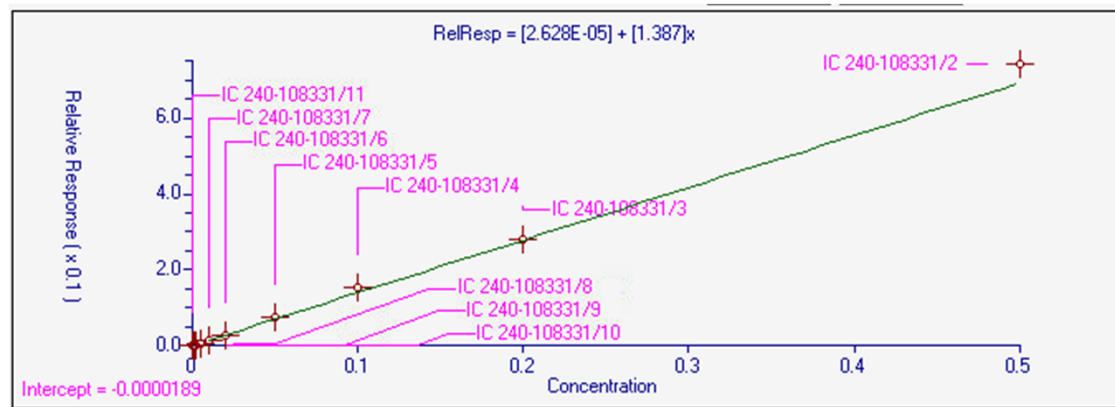
Quadratic weighted

Coefficient of determination **0.985**

All points < 22% error (RSE **13.8%**)



## Chrysene, 0.5-500 ng/mL



Linear unweighted

Coefficient of determination: **0.999**

Low point **166%** error (RSE **62.4%**)

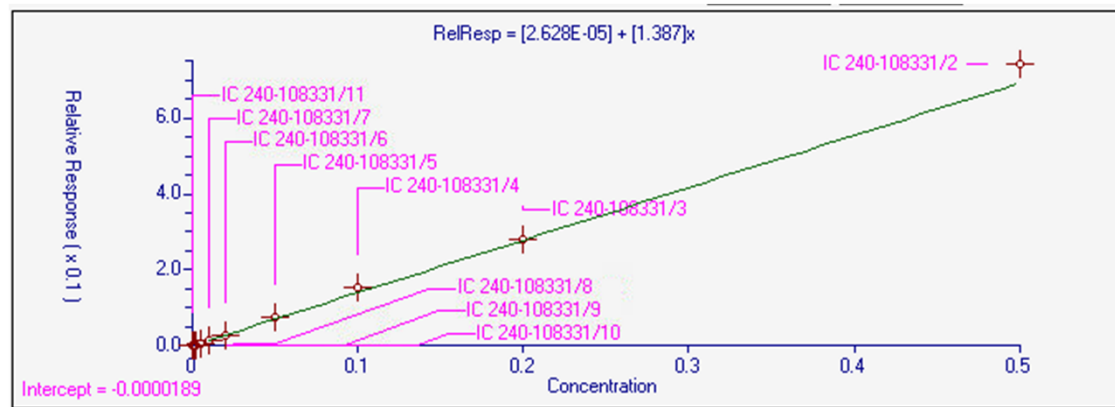
Quadratic unweighted

Coefficient of determination **1.000**

Low point error **142%** (RSE **68.7%**)



## Chrysene, 0.5-500 ng/mL



Linear weighted

Coefficient of determination: **0.985**

All points < 20% error (RSE **11.7%**)

Quadratic weighted

Coefficient of determination **0.987**

All points < 20% error(RSE **12%**)

# What kind of weighting is best for Environmental Analysis



What kind of weighting is best for environmental analysis?

No weighting?

1/Concentration weighting?

1/(Concentration)<sup>2</sup> weighting?

**What are we trying to achieve?**

## What do we want from a calibration?



Accurate translation of response into concentration

What do we mean by “accurate”?

Minimize the relative error at all points in the working range

Assumption – we are equally interested in accuracy at all points in the working range

## What weighting assigns equal weight to each calibration point?



$1/(\text{Concentration})^2$

Why?

The regression minimizes the sum of the squares of the absolute residuals

$$S_{min} = \sum_{i=1}^n r_i^2$$



## What about Average RF?



Average RF =  $1/(\text{Concentration})^2$  weighted regression forced through zero

Good choice, unless

Best line does not go through zero

Or

Response is curvilinear

## Best calibration weighting



### Average

Unless does not go through zero, in which case

**$1/(\text{Concentration})^2$  weighted linear regression**

Unless curvilinear response, in which case

**$1/(\text{Concentration})^2$  weighted quadratic regression**

## What do our calibration measures offer?



- Correlation coefficient and coefficient of determination
  - Unweighted almost always has a “better” number than  $1/(\text{Concentration})$  weighted
  - $1/(\text{Concentration})$  weighted almost always has a “better” number than  $1/(\text{Concentration})^2$  weighted

**For almost any calibration, the correlation coefficient and coefficient of determination almost always lead us in the direction of choosing the wrong calibration**

Applies to quadratic as well as linear regressions

## What do our calibration measures offer?



- **Relative Standard Error (RSE)**
  - Unweighted almost always has a worse number than  $1/\text{Concentration}$  weighted
  - $1/\text{Concentration}$  weighted usually has a worse number than  $1/(\text{Concentration})^2$  weighted

**For almost any calibration, the RSE almost always leads us in the direction of choosing the correct calibration**

## Calibration measures



What if we were routinely using a measure for calibration quality that:

- Guided us towards using the worst possible type of calibration fit (one that creates large errors in the amount of analyte)
- For the same data set, told us that curve fits with very large errors were good, and curve fits with much smaller errors were bad

That would not be a good thing, right?

## Measures



**Unfortunately, that is exactly what we do.**

**For most of our methods!!**

**The measures are the correlation coefficient and the coefficient of determination**

**$r$  = Correlation coefficient**

**$r^2$  = Coefficient of determination**

Not just environmental analysis –  
pervasive problem in analytical chemistry  
in general

## Progress so far...



- RSE added to Method 8000 and 600 series
- RSE added to TNI standards
- Relative error added to 8000 series
- Relative Error added to TNI standards



## DOD data validation guidelines



**Each analyte should meet one of the options below:**

**Option 1:** RSD for each analyte  $\leq 20\%$ ;

**Option 2:** linear least squares regression for each analyte:  $r^2 \geq 0.990$  or  $r \geq 0.995$ ;

**Option 3:** non-linear least squares regression (quadratic) for each analyte:  $r^2 \geq 0.99$  or  $r \geq 0.995$ ;

**Option 4:** Relative Standard Error (RSE)  $\leq 20\%$ .

**DOD Data Validation Guidelines do not require assessment of correlation coefficient or coefficient of determination**



## RSE Status



- **RSE adoption should be relatively straightforward because:**
  - For the average RF calibration  $RSE = RSD$
  - RSE essentially just allows RSD to be applied to all types of curves, instead of just Average RF
- **However:**
- **Virtually unused**
  - May increase after 2016 standards are adopted
  - Needs to be incorporated into major manufacturer instrument software
  - Needs removal of correlation coefficient option??
  - Needs champions

## Correlation coefficient



**IUPAC, 1998**  
**Guidelines for Calibration in Analytical Chemistry**

The correlation coefficient, which is a measure of two random variables, has no meaning in calibration because the values  $x$  are not random quantities

## Correlation Coefficient



For most applications, and calibration curves in particular, the correlation coefficient must be regarded as a relic of the past

- Meier and Zund, *Statistical Methods in Analytical Chemistry*, 2000

## So what is important?



# • Measuring relative error

- Do we already have measures of relative error in EPA methods?

relative error

$$\delta x = \frac{x_0 - x}{x}$$

measured value

actual value

wikiHow

wikiHow to Calculate Absolute Error

## Method 524.4



- Linear or quadratic regression may be used
- Calibration points  $\leq$  MRL must calculate within 50% of true value (Relative Error)
- Calibration points above the MRL must calculate within 30% of true value (Relative Error)
- **No correlation coefficient or coefficient of determination!**

Alternative to RSE is measuring relative error at each point, or at key points (for example at the mid point and the low point)

## Relative error (Method 524)



Using relative error of each point is less desirable than RSE, but it is good:

- Measures what is important, relative error
- Consistent with TNI standards
- Consistent for different curve fits

## 8270E Relative Error



### Average curve fit – RSD (Relative Error)

#### Linear or quadratic regression

- Has RSE option (Relative Error)
- Recalc at low point 50%, other points 30% (Should) (Relative Error)
- Consistent with method 524
- Unfortunately includes correlation coefficient and coefficient of determination

**Just drop r and r<sup>2</sup>!!**

## SW846 guidance



The intent of Section 11.5.4 of Method 8000D is consistent with the title, 'Acceptance criteria independent of calibration model'. This section provides Relative Standard Error (RSE) or % Error across a range of individual calibration standards as stand-alone alternatives to other measures of calibration fit.

**In other words, SW-846 does not  
require use of correlation coefficient  
or coefficient of determination**



## 624.1 Relative Error



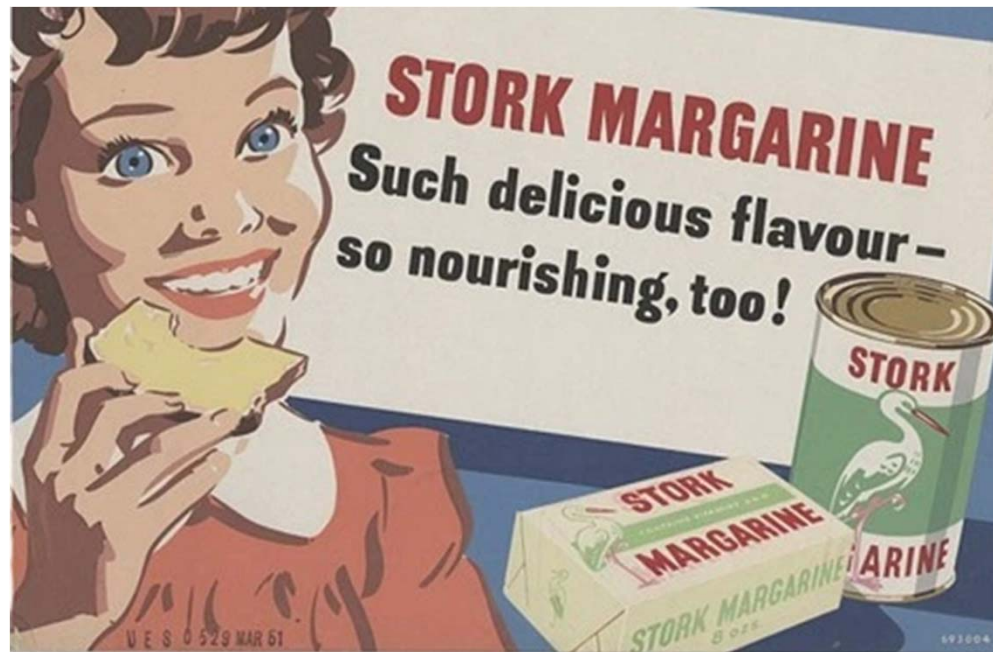
Average curve fit – RSD

Linear or quadratic regression

- Has RSE option (Relative Error)
- No recalc
- Unfortunately includes coefficient of determination

**Just drop  $r^2$  and add Recalc!**

# Margarine



# Radioactive face cream



## Arsenic based face cream



## What Next?



- Calibration is the most critical part of an analytical method
- We must have good measures of calibration quality

**Therefore, we have to get rid of  
the correlation coefficient and  
coefficient of determination**