Data Processing Worflow

By Euchie

Summary of Steps from Raw Signals to Analyzable Concentrations:

TRACE METALS:

- Raw data processing BEFORE using R (slides 4 8)
- Raw data processing using R
 - Step 1: Calculating standard concentration. (slides 10 14)
 - Step 2: Concentration calculation and dataset manipulation. *(slides 15 18)*
 - Step 3: Adding environmental and biological data to concentration dataset (slide 19)

ORGANIC COMPOUNDS:

- Raw data processing BEFORE using R (slides 22 26)
- Raw data processing using R
 - Step 1: Cleaning and Modifying Datasets. (slides 29)
 - Step 2: Calculating Concentrations in MG/KG. (slides 30)
 - Step 3: Creating final concentration dataset. (slides 31)

FOR TRACE METALS PROCESSING RAW DATA BEFORE USING R

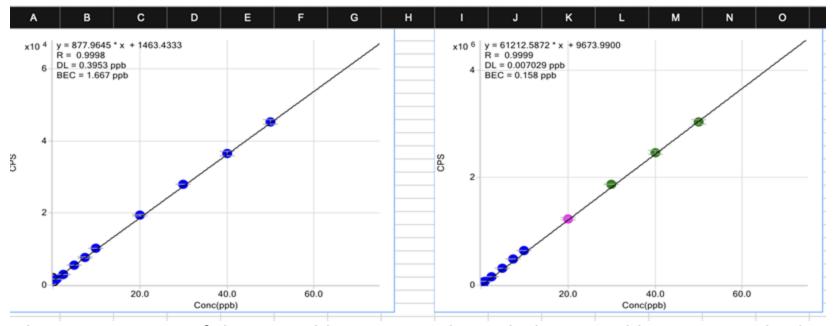
PROCESS INTRODUCTION

- About 30-40 samples (one batch) were analyzed per week.
- Inksac and muscle samples were analyzed first, for their respective batches, due to the presumed reduced sediments in the digested samples to avoid crosscontamination during chemical analysis.
- Calibration curves were constructed for every batch analyzed each week.
 - Calibration curves are used to quantify the instrumental response of an analyte (Trace metals, e.g Fe), and to predict the concentration of the analyte in a sample.
 - Inductively Coupled Plasma Mass Spectrometry (ICP-MS).

PROCESSING THE RAW DATA BEFORE R

- After instrumental analysis the raw data is received in an excel file.
- · The file has two sheets
 - o Sheet 1 has the plotted calibration curves for all ten trace metals





Snippet showing two out of the ten calibration graphs with the ten calibration standards in each graph.

PROCESSING THE RAW DATA BEFORE R (see excel snippet showing one trace metal (Fe) on next slide)

O Sheet 2 has:

datas Cali

- The first ten rows are the calibration standards used to make the calibration curve.
- The rows below these ten rows are the instrument wash cycles labelled as wash/blk.
- After the rows with the wash cycles comes the blank control. That is used to check for the background noise in the solution after trace metal extraction from the samples.
 - The solution used to wash the instrument is 2% nitric acid which is also used as the internal standard.
 - The solution used for blank control has 2% nitric acid and a diluted version of the strong acid used to extract the trace metals from the sample.
- After the blank control are the 30-40 analyzed samples.
 - the samples are named using Area_ID number_Tissue (e.g. 65_01_muscle)
- The columns are arranged in this manner.
 - · there are 10 trace metals.
 - each trace metal are further sub-divided into 3 columns namely:
 - Concentration (ppb) of the sample
 - o Count per seconds (CPS). how many ions of the specific trace metal that hit the detection plate in the instrument per second.
 - Counts per seconds relative standard deviation (CPS RSD). The rate percentage at which the hit the detection plate.

SNIPPPET OF RAW DATA EXCEL FILE AFTER INSTRUMENT ANALYSIS

A	В	С	D	E	F	G	н	- 1
						57	Fe [He]	
Rjct	Data File	Acq. Date-Time	Туре	Level	Sample Name	Conc. [ppb]	CPS	CPS RSD
*****	u.a	2023-04-18 9:32 AM	CalStd	1	U	0.00	1463.43	7.90
*****	1.d	2023-04-18 9:35 AM	CalStd	2	1	0.27	1697.90	8.94
*###	2.5.d	2023-04-18 9:39 AM	CalStd	3	2.5	1.79	3033.67	1.08
*###	5.d	2023-04-18 9:42 AM	CalStd	4	5	4.67	5564.34	1.91
****	10.d	2023-04-18 9:46 AM	CalStd	5	7.5	7.08	7677.41	3.85
****	15.d	2023-04-18 9:50 AM	CalStd	6	10	10.05	10283.27	0.63
****	20.d	2023-04-18 9:53 AM	CalStd	7	20	20.38	19352.27	2.17
*###	30.d	2023-04-18 9:57 AM	CalStd	8	30	30.21	27988.44	0.74
****	40.d	2023-04-18 10:00 AM	CalStd	9	40	39.93	36517.59	3.87
****	50.d	2023-04-18 10:04 AM	CalStd	10	50	49.92	45290.31	3.07
*****	blk1.d	2023-04-18 10:07 AM	Sample		blk1	<0.000	812.26	1.25
****	blk2.d	2023-04-18 10:11 AM	Sample		blk2	<0.000	1067.25	29.87
alibration ours	blk3.d	2023-04-18 10:14 AM	Sample		blk3	<0.000	786.71	6.58
alibration curve / ####	sample1.d	2023-04-18 10:17 AM	Sample		batch2 bc	2.98	4076.45	9.87
<i>####</i>	sample2.d	2023-04-18 10:21 AM	Sample		03_04_muscle	4.27	5209.78	2.11
****	sample3.d	2023-04-18 10:25 AM	Sample		03_04_liver	23.33	21942.02	0.12
****	sample4.d	2023-04-18 10:28 AM	Sample		03_04_stomach	15.21	14819.93	2.32
####	sample5.d	2023-04-18 10:32 AM	Sample		03_05_inksac	6.19	6897.06	1.50
\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\	sample6.d	2023-04-18 10:35 AM	Sample		03_05_muscle	3.93	4917.46	5.35
Wash cycles	sample7.d	2023-04-18 10:39 AM	Sample		03_05_liver	14.18	13911.37	1.15
****	sample8.d	2023-04-18 10:42 AM	Sample		03_05_stomach	25.71	24033.65	2.53
####	sample9.d	2023-04-18 10:46 AM	Sample		21_05_muscle	5.05	5893.36	2.12
####	sample10.d	2023-04-18 10:50 AM	Sample		21_05_liver	51.68	46834.41	0.43
****	sample11.d	2023-04-18 10:53 AM	Sample		21_05_stomach	11.52	11579.62	2.74
		2022 04 10 11:00 444			24 07 intrace	7.04	0160 00	2.40

Trace metal

- Concentration (ppb)
- CPS
- CPS RSD

Squid samples

Blank control

PROCESSING RAW DATA BEFORE R

Preliminary checks were made:

- To check if squid IDs were entered correctly.
- To check or make changes for efficient processing in R.
- To check if any comments were added in terms of processing.

FOR TRACE METALS PROCESSING RAW DATA USING R

(See: 1-Data_Preprocessing/Rscripts/Raw_trace_metals_data_to_preprocessed_data.R)

Step 1: Calculating the Standard concentration for each batch:

- Sheet 2 is saved as a CSV file, which is then used to calculate the standard concentrations.
- The standard concentrations represent the concentrations of the calibration standards which will be used later to compute the, slope, intercept, limit of detection (LOD) and limit of quantification (LOQ) using average intensity. This is calculated using the first ten rows of the CSV file (typically from row 3-12).
- First the **slope** and **intercept** are obtained which will later be used in Step 4, to calculate the actual concentration ppb for each sample.

Step 1: Calculating the Standard concentration for each batch (Continued):

- The **slope** was calculated using linear regression and the **intercept** is actually represented by the **average intensity** of the Oppb calibration standard.
- For the trace metals that have concentrations between 0 and 1 ppb. The first 5 calibration standards were used to do the regression. This is because the more points you include, the less accurate the concentrations will be, especially at low concentrations. For the trace metals that have high concentrations all the calibration standards were used to run the linear regression.

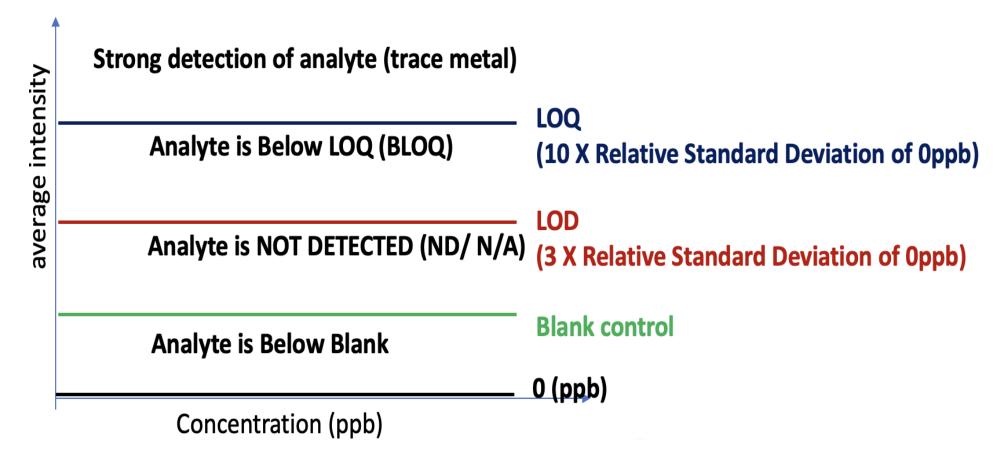
Step 1: Calculating the Standard concentration for each batch (Continued):

LOD and LOQ are calculated.

- LOD = Average intensity of the trace metal (CPS) in the 0ppb calibration standard + 3 X (The relative standard deviation of the trace metal in the 0ppb calibration standard (CPS RSD) X 0.01 X Average intensity of the trace metal in the 0ppb calibration standard (CPS))
- LOQ = Average intensity of the trace metal (CPS) in the 0ppb calibration standard + 10 X (The relative standard deviation of the trace metal in the 0ppb calibration standard (CPS RSD) X 0.01 X Average intensity of the trace metal in the 0ppb calibration standard (CPS))
- The LOD and LOQ will later be used to quantify the concentration (ppb) for each sample in Step 2.

Step 1: Calculating the Standard concentration for each batch:

• After the LOD and LOQ are calculated sampleconcentrations are classified using below schema:

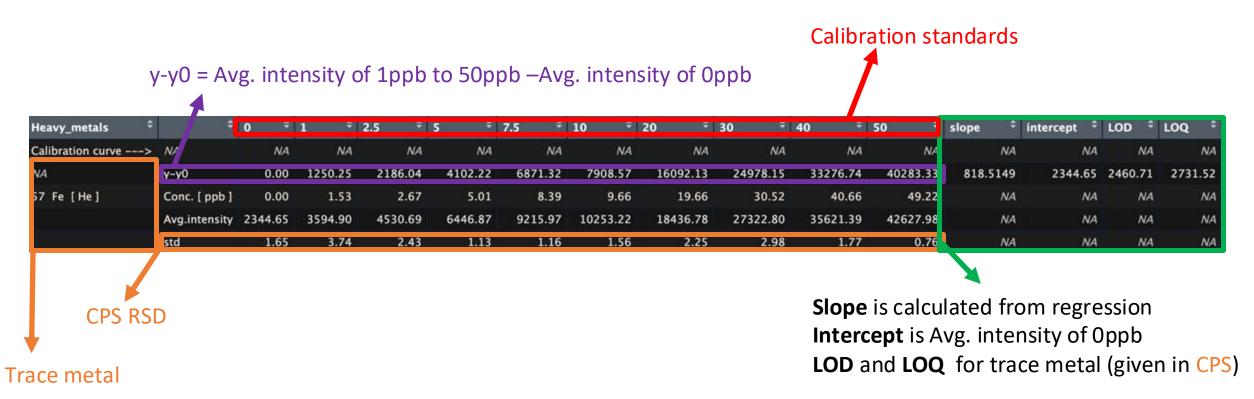


Step 1: Calculating the Standard concentration for each batch (Continued):

Final product from Step 1: (Year)Std_concentration_ppb.csv

Check point 1: Chose one metal in output (std_conc dataset) to check if calculations are correct.

Snippet showing first 5 rows from std_conc dataset in R

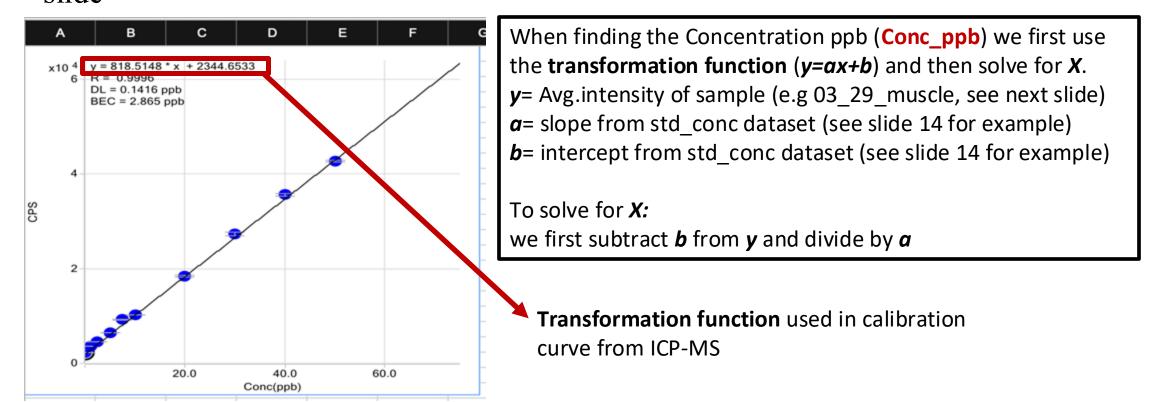


Step 2: Concentration calculation and dataset manipulation

- Getting the dataset into the format needed for statistical analysis.
- The dry weight dataset is first formatted to be able to be added to the concentration dataset.
 - The dry weight for each sample is added to dataset to help calculate the final concentration mg/kg.

Step 2: Concentration calculation and dataset manipulation (Continued)

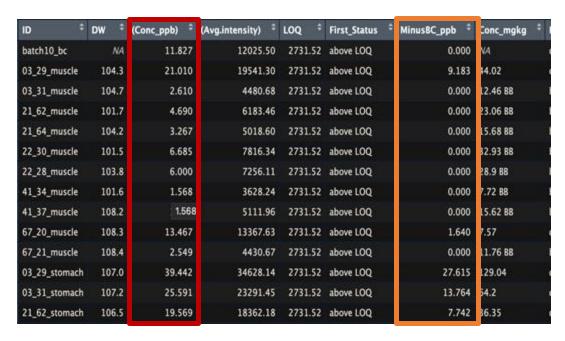
• Calculation of concentration ppb (**Conc_ppb**) see red-outlined column in next slide



Snippet of Fe calibration curve from ICP-MS

Step 2: Concentration calculation and dataset manipulation (Continued)

Calculating MinusBC_ppb:



When finding the MinusBC_ppb:

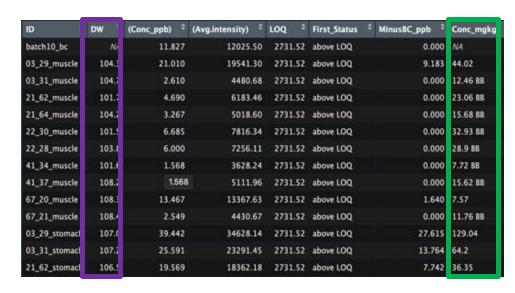
We first compare **sample Conc_ppb** (e.g 03_29_muscle) with **Conc_ppb of blank control** (e.g batch10_bc = 11.87):

- If sample Conc_ppb > Conc_ppb of blank control then sample Conc_ppb Conc_ppb of blank control (e.g 21.010-11.827 = 9.183) and results placed in MinusBC_ppb.
- If sample Conc_ppb < Conc_ppb of blank control then "0" is placed in MinusBC_ppb.

Snippet showing first 14 rows from in R output

Step 2: Concentration calculation and dataset manipulation (Continued)

- Calculating Conc_mg/kg:
- # Check point 2: choose at least 3 rows (top, middle and bottom) to check calculations.



Snippet showing first 14 rows from R output

When finding the Conc_mg/kg:

- We first multiply the Concentration (ppb) in MinusBC_ppb by 100 and 5 then divide by the dry weight (DW/1000) and divide again by 1000. (e.g 9.183*100*5)/(104.3/1000)/1000= 44.02
- If MinusBC_ppb = 0, it means that only noise was detected. In that case the above formula was used to calculate Conc_mg/kg directly from the Conc_ppb without subtracting it from blank control. Letters like 'BB' (below blank) or 'BLOQ' were added to identify these concentrations (subject to change).

NB. 100= how many times the sample was diluted and 5 is the volume of the extraction solvent used in each sample.

Step 3: Adding environmental and biological data to concentration dataset.

- The squid information from the fishing vessel and lab were added to the concentration dataset.
- The current batch is appended to the previous batches
- # Check point 3: choose at least 3 rows (top, middle and bottom) to check calculations.

Snippet showing first 6 rows from R output.

ID ‡	DW ‡	Year ‡	ID_num	Area	† Tissue ‡	Gender	† Longitude †	Latitude	* Month_of_Capture *	Mantle_Length_mm	Wet_Weight_g	* Maturity_level *	dta_km	dtfl_km	Fe
03_01_stomach	109.7	2021	01	03	stomach	1	49*33'5	59°59W	4	288.00	646.2	5	544	181	67.2
03_01_liver	100.8	2021	01	03	liver	1	49*33'S	59°59'W	4	288.00	646.2	5	544	181	63.06
03_01_muscle	102.1	2021	01	03	muscle	1	49°33'S	59°59'W	4	288.00	646.2	5	544	181	9.27
03_02_inksac	48.8	2021	02	03	inksac	1	49*33'\$	59°59'W	4	254.00	444.5	5	544	181	174.02
03_02_stomach	104.8	2021	02	03	stomach	1	49*33'5	59°59W	4	254.00	444.5	5	544	181	218.51
03_02_liver	103.2	2021	02	03	liver	1	49*33'S	59°59W	4	254.00	444.5	5	544	181	79.23

NB. The total number of rows after combining all the batches **DO NOT** include the samples that were not measured due to insufficient tissue amount, specifically those squids with small inksacs.

- For 2019 trace metals analysis no ink sacs were measured
- For 2020 and 2021 trace metals analysis not all ink sacs were analyzed due to this issue.

FOR ORGANIC COMPOUNDS PROCESSING RAW DATA BEFORE USING R

PROCESS INTRODUCTION

- About 40-90 samples (one batch) were analyzed per month.
- Calibration curves were constructed for every organic compound (4) analyzed.
 - Calibration curves were used to quantify the instrumental response of an analyte (organic compound, e.g Metolachor), and to predict the concentration of analyte in a sample by using the Area ratio and the concentration ppb.
 - LC-MS coupled with Electrospray Ionization Mass Spectrometry (ESI-MS) were used

PROCESSING THE RAW DATA BEFORE R

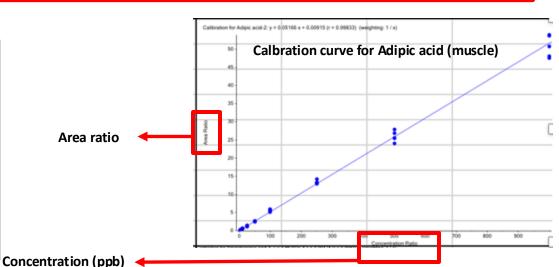
- After instrumental analysis the raw data is received in an excel file.
- The file has 7 sheets.
 - The beginning 2 or 3 sheets such as Calibration Curve, LC-MS condition and IS-ratio are mainly for reference.
 - The 4 sheets that come after, are each an organic compound with all the samples that were measured for that organic compound.
 - Each sheet has four tables (one for each tissue) with the samples listed under. Snippet on next slide explaining table structure for organic compound (Adipic acid)
 - O At the top of each table reads the (batch information): name of the organic compound, the internal standard(IS name) used, the LOQ and upper LOQ for that organic compound within that specific tissue, the R2 score and the file name.
 - The calculated concentration was already given in ppb as compared to trace metals and is in the "Calc. Conc" column.

SNIPPPET OF RAW DATA EXCEL FILE FOR organic compounds AFTER INSTRUMENT ANALYSIS

Batch information for muscle

A	В	С	D	E	F	G	H	I	1	K	L	M	N	0	P	Q	R	S	T	U	V	W	Х
	Compound Name	Adipic ac	id-2				Compound Name	Adipic aci	d-2				Compound Name	Adipic aci	d-2				Compound Name	Adipic ac	id-2		
	IS Name	d4 cholic	acid-2				IS Name	d4 cholic a	cid-2				IS Name	d4 cholic a	cid-2				IS Name	d4 cholic	acid-2		
	LOQ(ppb)	2.5					LOQ(ppb)	25					LOQ(ppb)	25					LOQ(ppb)	5			
	ULOQ(ppb)	1000					ULOQ(ppb)	500					ULOQ(ppb)	1250					ULOQ(ppb)	500			
	r =	0.99833					r =	0.99518					r =	0.99952					r =	0.99907			
	File Name	20230605	Squid 20	20_Muse	cle.qsession		File Name	20230609	Squid 2020	_Stoma	ch.qsession		File Name	20230615	Squid 202	Liver.	qsession		File Name	20230612	Squid 202	0_Ink.c	session
		Muscie			Unit: ppo			Stomacn			Unit: ppo			Liver			Unit: ppo			Ink sac			Onit: ppo
	Sample		10.4	Area	Cal.		Sample		10.4	Area	Cal.		Sample		10.4	Area	Cal.		Sample		10.4	Area	Cal.
	Name	Area	IS Area	Ratio	Conc.		Name	Area	IS Area	Ratio	Conc.		Name	Area	IS Area	Ratio	Conc.		Name	Area	IS Area	Ratio	Conc.
	Muscle_60-4	45742	670226	0.07	BLOQ		Stomach_60-4	19180	63410	0.30	BLOQ		Liver_60-4	1813749	17852	101.60	1757.72		Ink_60-4	16556	55869	0.30	BLOQ
	Muscle_60-11	19664	634258	0.03	BLOQ		Stomach_60-11	28540	57460	0.50	BLOQ		Liver_60-11	3431612	9297	369.11	6390.32		Ink_60-11	15874	54258	0.29	BLOQ
	Muscle_60-18	84355	624639	0.14	BLOQ		Stomach_60-18	70040	55460	1.26	21.72		Liver_60-18	3065061	7601	403.25	6981.51		Ink_60-18	22358	49360	0.45	7.74
	Muscle_60-20	58158	530748	0.11	BLOQ		Stomach_60-20	26510	44610	0.59	BLOQ		Liver_60-20	757495	16521	45.85	792.33		Ink_60-20	28554	45390	0.63	10.87
	Muscle_60-26	26367	564152	0.05	BLOQ		Stomach_60-26	33270	42870	0.78	BLOQ		Liver_60-26	1992315	9945	200.33	3467.56		Ink_60-26	11823	46100	0.26	BLOQ
	Muscle_60-27	23232	575906	0.04	BLOQ		Stomach_60-27	36140	49050	0.74	BLOQ		Liver_60-27	2442013	8925	273.60	4736.41		Ink_60-27	37869	43798	0.86	15.05
	Muscle_60-29	39193	543150	0.07	BLOQ		Stomach_60-29	27630	42210	0.65	BLOQ		Liver_60-29	333107	23765	14.02	241.07		Ink_60-29	25262	48344	0.52	8.97
	Muscle_60-33	30886	520669	0.06	BLOQ		Stomach_60-33	32780	49820	0.66	BLOQ		Liver_60-33	3282213	9413	348.69	6036.77		Ink_60-33	25969	46483	0.56	9.62
	Muscle_60-36	88670	551878	0.16	2.93		Stomach_60-36	14310	41830	0.34	BLOQ		Liver_60-36	2319929	9463	245.15	4243.73		Ink_60-36	24329	41826	0.58	10.02
	Muscle_60-39	36109	549392	0.07	BLOQ		Stomach_60-39	39030	41390	0.94	BLOQ		Liver_60-39	1946766	7384	263.65	4563.99		Ink_60-39	11315	40516	0.28	BLOQ
								****							2022	200.00	1000						

- 1. Samples arranged by tissue.
- 2. Area Ratio = Area/IS Area
- 3. Concentration (ppb)/ Cal. Conc. = Area ratio plotted on the calibration curve then compared with LOQ(ppb) above.
 - If Cal. Conc < LOQ(ppb) then Cal. Conc = BLOQ.
 - If Cal. Conc > LOQ(ppb) then Cal. Conc = Concentration.
 - If NO AREA was detected then Cal. Conc = NA.

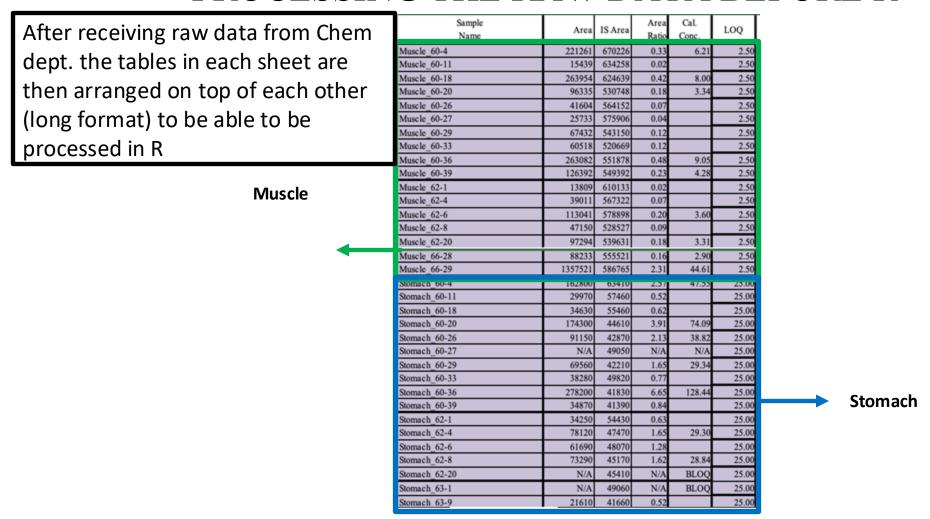


PROCESSING RAW DATA BEFORE R

Preliminary checks were changes made:

- To check if squid IDs were entered correctly.
- To check or make changes for efficient processing in R.
- To check if any comments were added in terms of processing.
- To add numerical LOQ column.

PROCESSING THE RAW DATA BEFORE R



Snippet of Adipic acid table arranged in long format for processing in R

FOR ORGANIC COMPOUND PROCESSING RAW DATA USING R

(See: 1-Data_Preprocessing/Rscripts/Raw_organic_compounds_data_to_preprocessed_data.R)

The sheets in the raw data excel file are first converted to CSV using a chunk of code in the R script (*lines 372-384*) and saved as a folder in the current working directory.

- The folder, immediately after processing in R, is saved as the current year_month_day_time of its processing.
- That folder is then loaded into R from the working directory and the sheets within the folder are saved into a list
- Sample separation data (dry weight dataset) was loaded as 'dry weight'.

Step 1: CLEANING AND MODIFYING DATASETS:

- Each concentration dataset in the list were cleaned and modified:
 - Remove extra letters added to the sample names.
 - Remove columns that are not needed (e.g. 'Dilu_Factor' etc..)
 - Remove rows that are not needed for statistical analysis (e.g calibration standards)
 - Replace "-" with "_".
 - Replace concentrations that are 'BLOQ' with numerical values.
 - Add extra columns.
 - Rearrange samples name so sample IDs can resemble that of trace metals.
 - Rename columns.
 - Formatted sample IDs in each CSV file need to resemble those in trace metals dataset (60_04_muscle).
- Check point 1: data_manipulation1 function output was printed (top, middle and bottom rows checked)
- <u>Check point 2: Data_manipulation2 function output was printed (top, middle and bottom rows checked)</u>

Step 2: CALCULATING CONCETRATION MG/KG:

- The sample ID column for dry weight dataset was formatted to resemble that of the concentration dataset (e.g. 60 04)
- The dry weight for each sample (row) in each concentration dataset within the list was added.
- The **concentration** for each sample (row) in each concentration dataset within the list was simultaneously calculated.
 - The concentrations with the exception of samples that show BLOQ were processed as concentration mg/kg.(formula= (sample Calculated concentration (ppb)/sample dry weight)*1000/1000
 - Those concentrations that were BLOQ were processed as the LOQ (ppb) for that tissue + "BLOQ" (e.g 250 BLOQ) (subject to change)
 - Those concentrations that were N/A were processed as "0" since no concentration was detected.
- Check point 3: add_dry_weight function output was printed (top, middle and bottom rows checked)

Step 3: CREATING FINAL CONCENTRATIONS DATASET:

 More manipulation was done on this dataset later to have it resemble the trace metals dataset. A few more columns were added and some columns were renamed.

Sample_Name 🗘	dry_weight ‡	Year ‡	Site ÷	ID_num ‡	Tissue ‡	Adipic_acid ‡
60_04_muscle	110.9	2020	60	04	Muscle	0.056
60_11_muscle	103.8	2020	60	11	Muscle	2.5 BLOQ
60_18_muscle	113.2	2020	60	18	Muscle	0.071
60_20_muscle	108.9	2020	60	20	Muscle	0.031
60_26_muscle	106.8	2020	60	26	Muscle	2.5 BLOQ
60_27_muscle	101.4	2020	60	27	Muscle	2.5 BLOQ
60_29_muscle	106.7	2020	60	29	Muscle	2.5 BLOQ

Snippet of final processed organic compounds dataset in R

Check point 4: organic_compound_concentration_dataset was printed (top, middle and bottom rows checked)