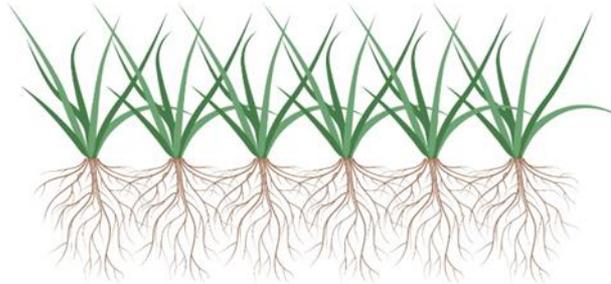
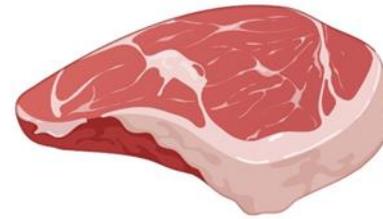
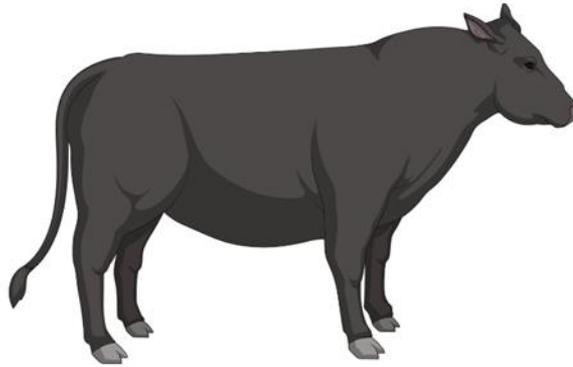


# Project Report

## Grass-Fed vs. Grain-Fed Beef Metabolomics



# Study Overview

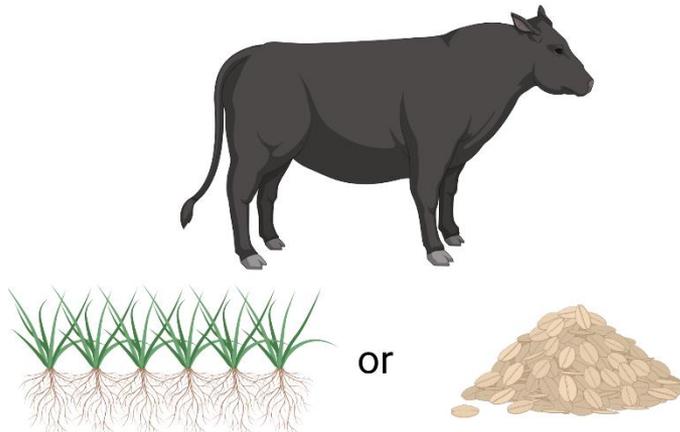
## Study Objective

The goal of this study was to determine the differences in metabolomes (nutrient profiles and animal health markers) of grass-fed vs grain fed beef.

## Study Design

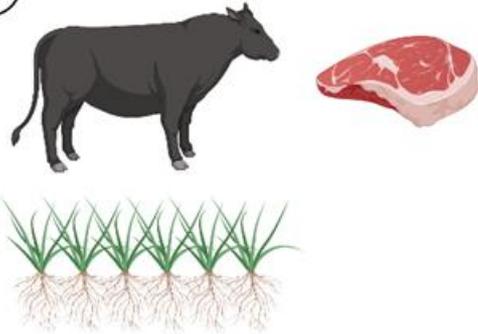
**Grain-finished beef** was obtained from a Midwest feedlot (South Dakota, USA). **Grass-finished beef** was obtained from Southern Idaho, USA where cattle are herded on mountain pastures during the grazing season.

Group ID	Treatment	Description	N
Bf_Grass	Grass	Grass fed bovine meat; ground and cooked	18
Bf_Grain	Grain	Grain fed bovine meat; ground and cooked (Control)	18

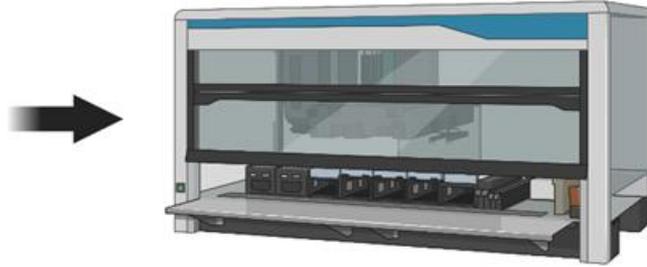


# Study Workflow

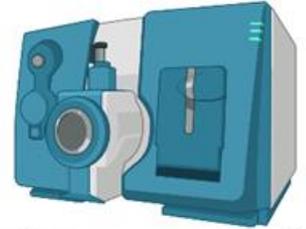
## a Sample acquisition



## b Sample processing

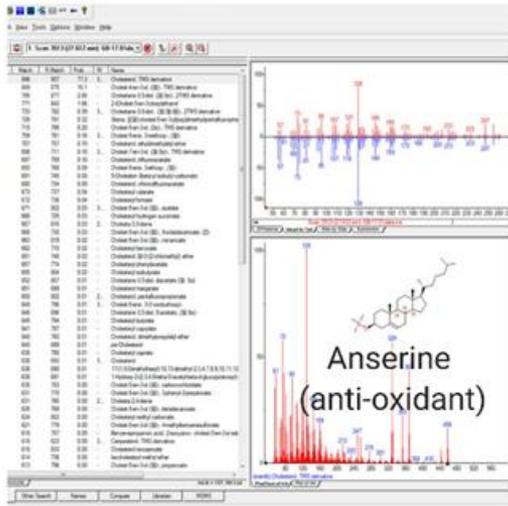


## c Mass-spec analysis

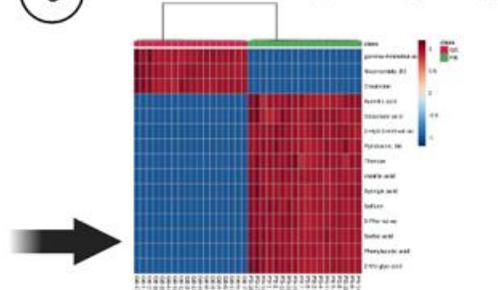


Liquid Chromatography with tandem mass spectrometry (LC/MS/MS)

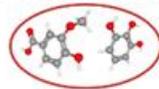
## d Metabolite identification



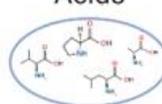
## e Bioactivities and pathway analysis



Polyphenols



Amino Acids



Clustering of metabolites into nutrient classes

## f Data Interpretation

### Amino Acid Metabolism

- Bioactive intermediates, glutathione (anti-oxidant) metabolism, inflammatory mediators, urea metabolism.

### Phytochemicals

- Flavonoids, phenolic compounds, anti-oxidants.

### Fatty acid metabolism

- Omega 3/6 fatty acids, cholesterol metabolism, bile acid metabolism, bioactive lipids.

### Vitamin & Nucleotide Metabolism

- DNA damage, FAD metabolism, ascorbate (Vitamin C) metabolism, folate metabolism, tocopherols (Vitamin E), B12, biotin etc.

### Microbiome Metabolism

- Choline/carnitine, short-chain & medium chain fatty acids, secondary bile acids.



# Statistical Summary

## Untargeted Metabolomics

### Statistical Comparisons

Total Biochemicals Identified	578
Total Biochemicals $p < 0.05$	377 (65%)
↑Grass	286
↑Grain	91
Total Biochemicals $0.05 < p < 0.10$	26 (4%)
↑Grass	18
↑Grain	8

## Complex Lipid Analysis

### Statistical Comparisons

Total Biochemicals Identified	998
Total Biochemicals $p < 0.05$	530 (53%)
↑Grass	307
↑Grain	223
Total Biochemicals $0.05 < p < 0.10$	86 (9%)
↑Grass	47
↑Grain	36

**\*Higher does not per se mean better, it depends on the biochemical.**

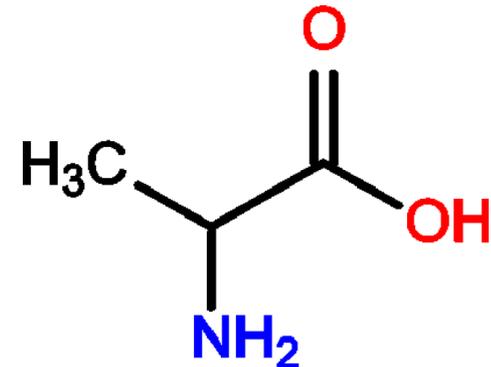
# Data Explanation

Pathway	Compound Name	Fold of Change
		$\frac{\text{Bi\_Grass}}{\text{Bi\_Grain}}$
Alanine and Aspartate Metabolism	alanine	1.08
	N-acetylalanine	0.88
	N-methylalanine	0.83
	aspartate	1.11
	N-acetylaspartate (NAA)	0.88
	asparagine	0.97
	N-acetylasparagine	1.26
	hydroxyasparagine**	0.48

**Green = ↑ Grass Fed**

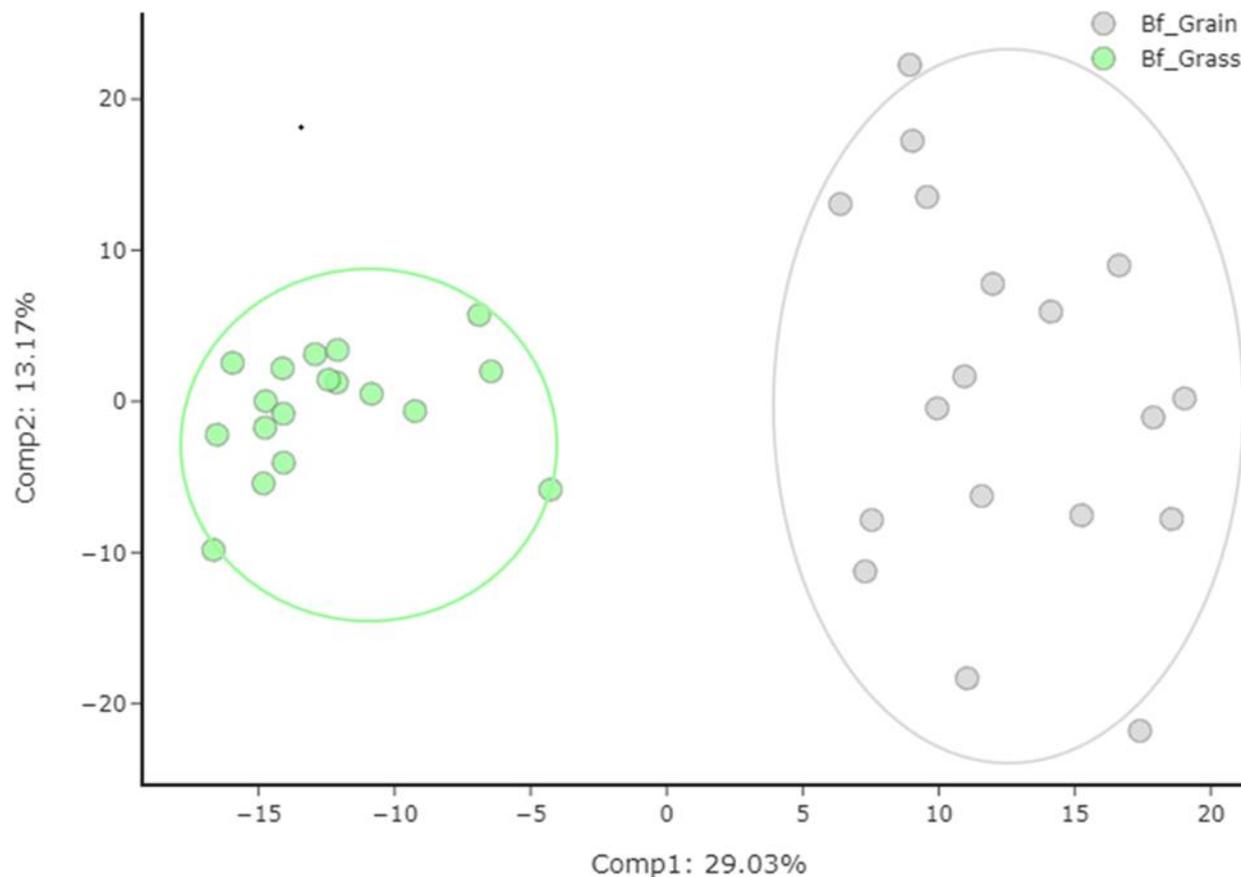
**Red = ↑ Grain Fed**

The number indicates how much higher (e.g., alanine is 1.08 higher in grass-fed bison vs grain-fed bison).



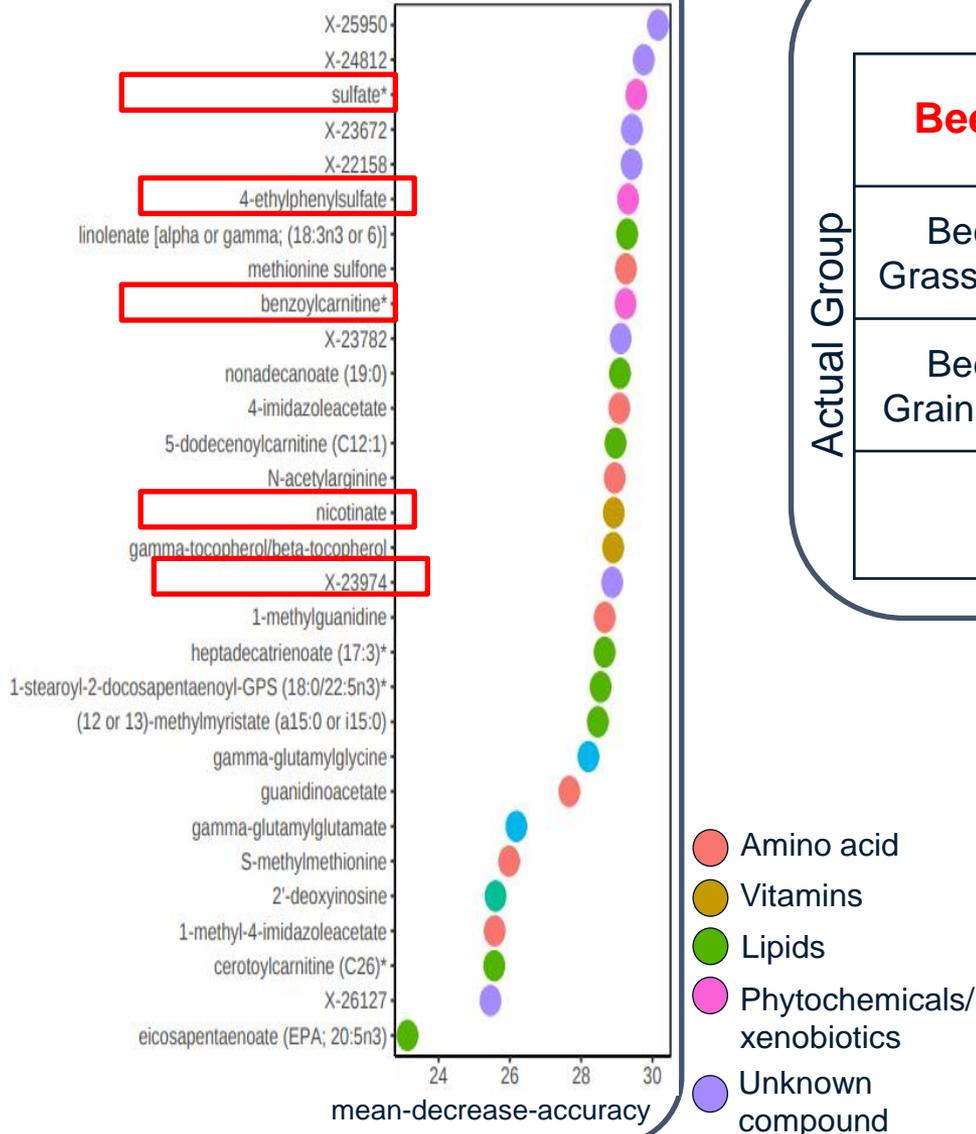
# Overview of the Dataset: Principal Component Analysis

## Untargeted Metabolomics



# Overview of the Dataset: Random Forest

## Biochemical Importance Plot



## Random Forest Confusion Matrix

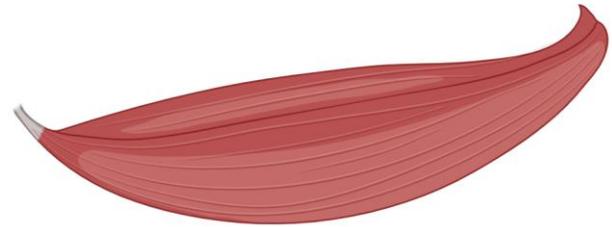
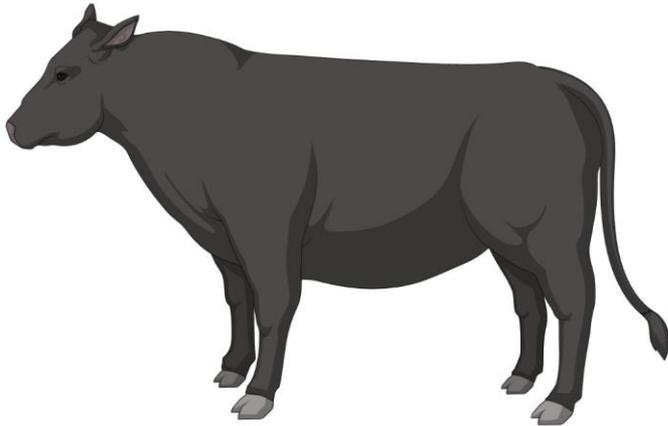
		Predicted Group		Class Error
		Beef Grass Fed	Beef Grain Fed	
Actual Group	Beef Grass Fed	18	0	0%
	Beef Grain Fed	0	18	0%

**Predictive accuracy = 100%**

The 30 top ranking biochemicals in the importance plot suggest key differences in

- vitamin metabolism
- phytochemical metabolism
- lipid metabolism

# Animal Health Markers



Not unlike human muscle, the muscle of animals provide many clues regarding the metabolic health of the animal.

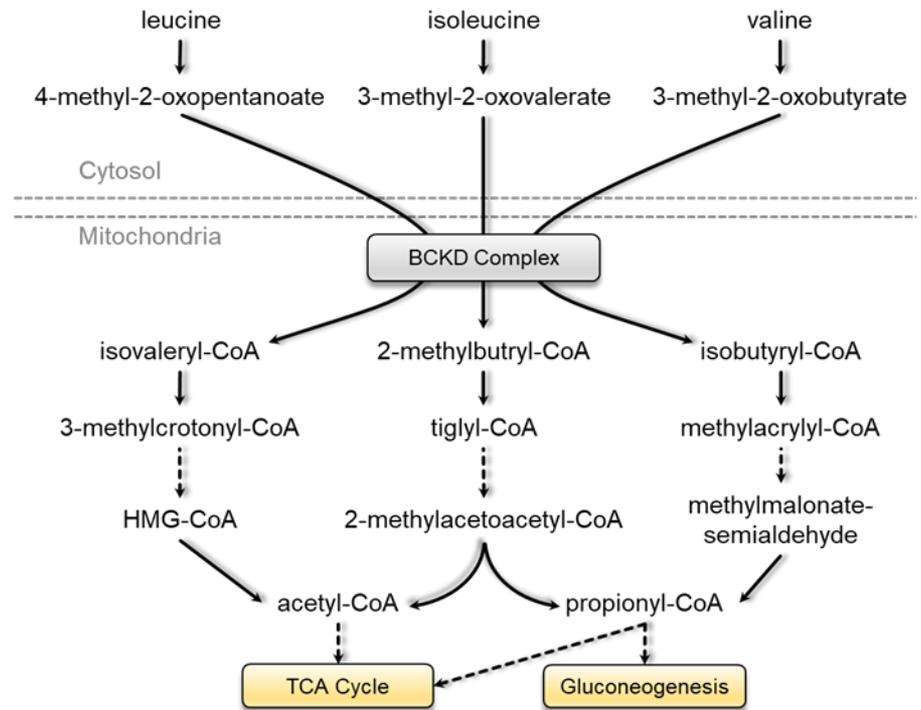
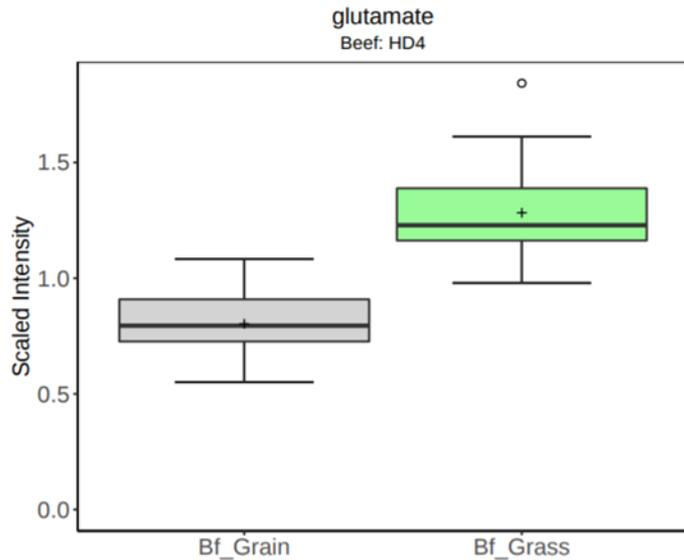
# Energy Metabolism

Sub Pathway	Biochemical Name	Fold difference
		$\frac{\text{Bf\_Grass}}{\text{Bf\_Grain}}$
Fructose, Mannose and Galactose Metabolism	fructose	1.38
	mannitol/sorbitol	1.45
TCA Cycle	citrate	1.65
	aconitate [cis or trans]	2.42
	succinylcarnitine (C4-DC)	1.23
	succinate	1.34
	fumarate	0.50
	malate	1.38



**Mitochondria of pastured beef shows energetic phenotypes not unlike those found in athletic humans (that other mammal)**



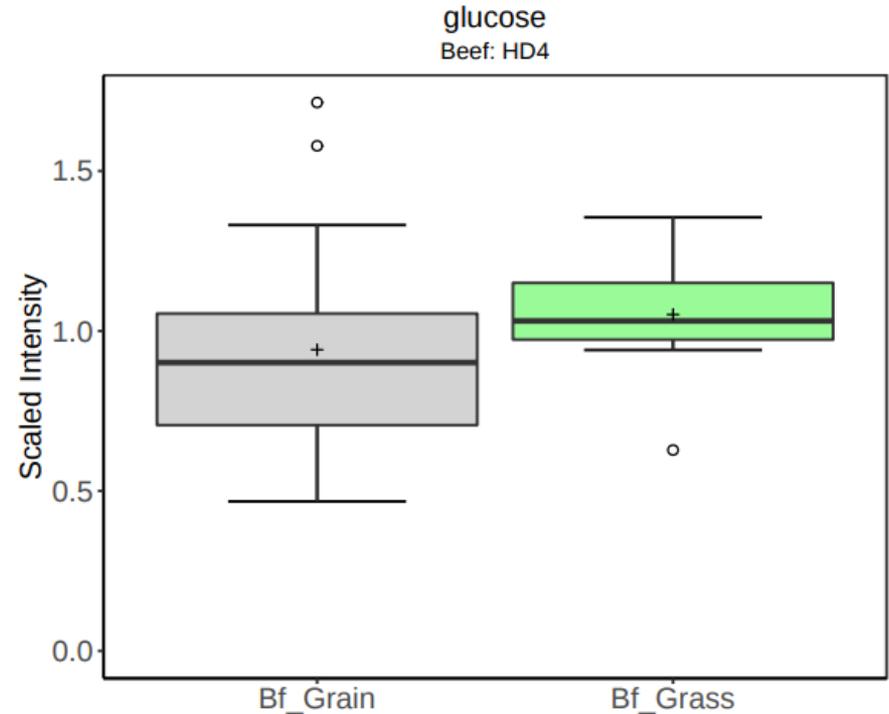
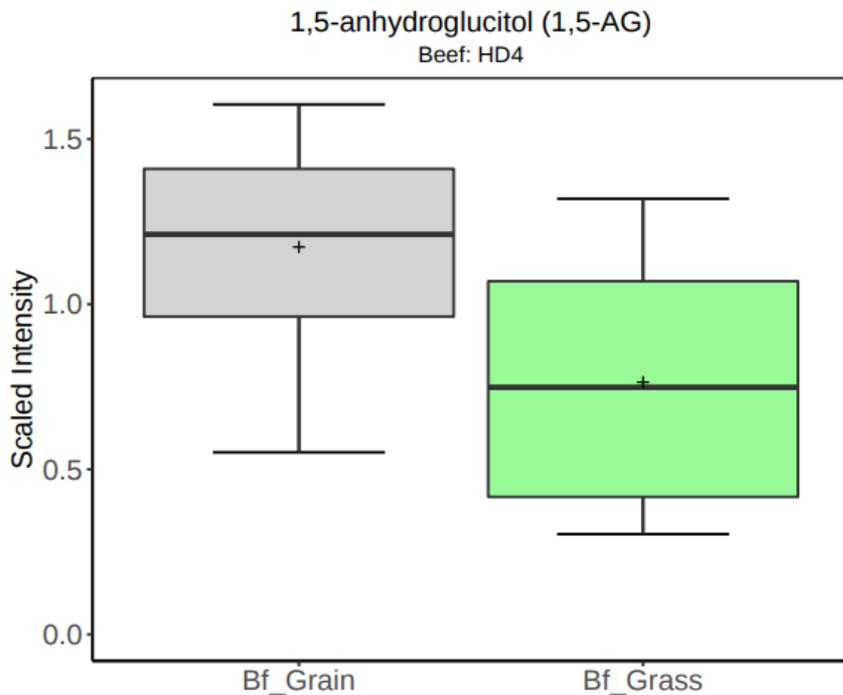


Sub Pathway	Biochemical Name	Fold difference
		$\frac{\text{Bf\_Grass}}{\text{Bf\_Grain}}$
Urea Cycle	urea	1.28
	ornithine	2.02
	citrulline	2.91
	homoarginine	2.61
Branched Chain Amino Acid Metabolites	isovalerylglycine	1.79
	beta-hydroxyisovaleroylcarnitine	1.87
	2-methylbutyrylcarnitine (C5)	1.66
	tiglylcarnitine (C5:1-DC)	1.51
	isobutyrylcarnitine (C4)	1.26
	3-hydroxyisobutyrate	1.26

**Higher carnitine metabolites may be indicative of increased muscle protein content of grass-fed animals.**

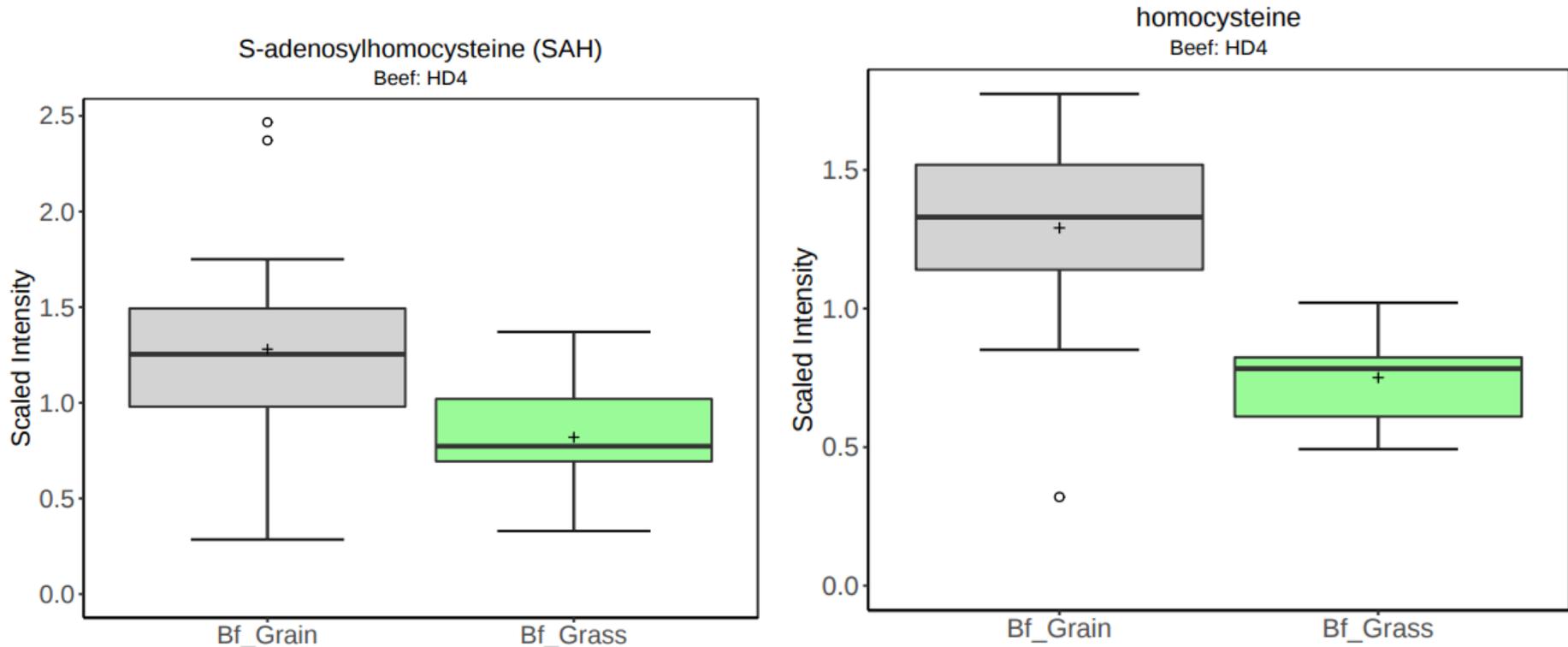
**The higher content of these amino acids is likely the result of increased physical activity of the grass-fed animals, which is in line with the energy (TCA) metabolites.**

# Glucose control



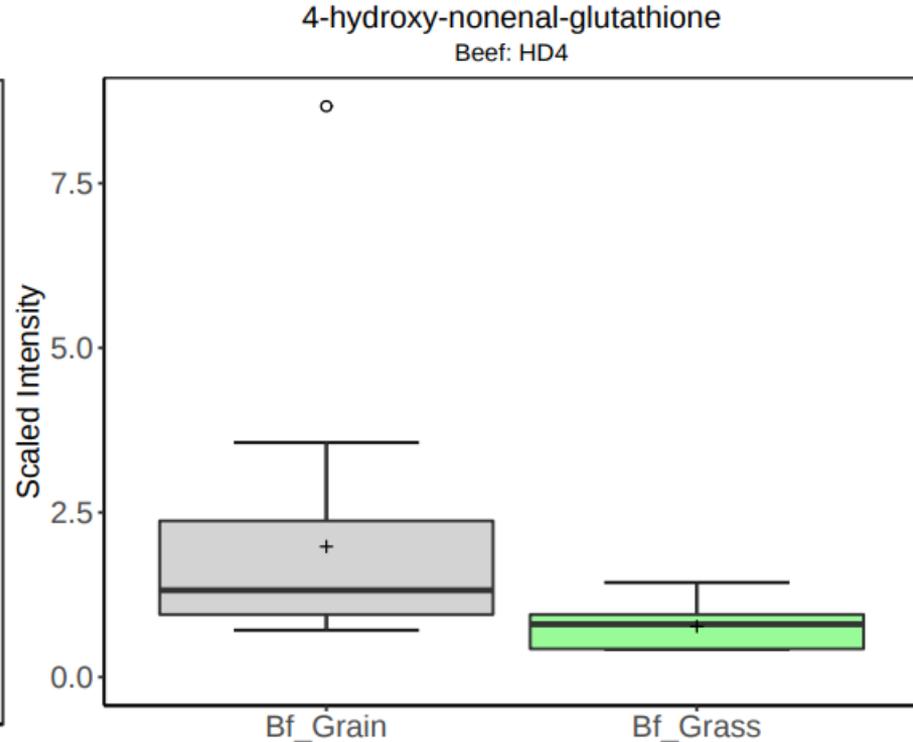
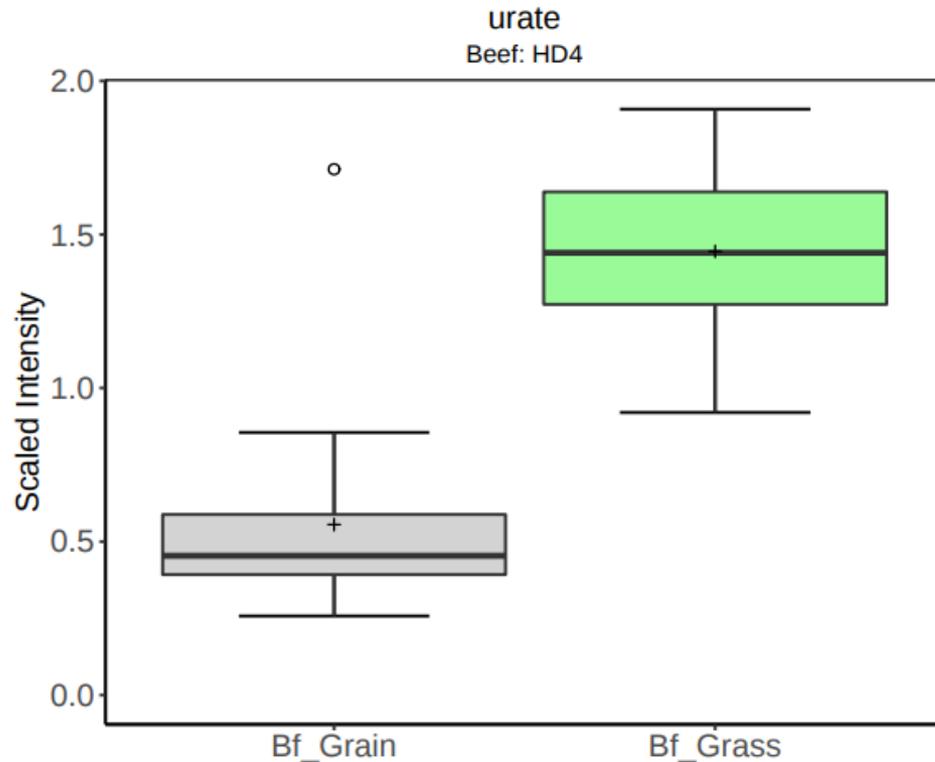
**1,5-AG is an indicator of longer-term glucose levels like Hb1AC in humans and higher levels are associated with decreased glucose metabolic health. Lower amounts are therefore considered beneficial for animal health. Glucose levels and its intermediates in glycolysis were higher in grass-fed beef, this could indicate higher sugar/carbohydrate levels in the forage. That is somewhat surprising given that grain-based rations are typically higher in sugars.**

# Homocysteine



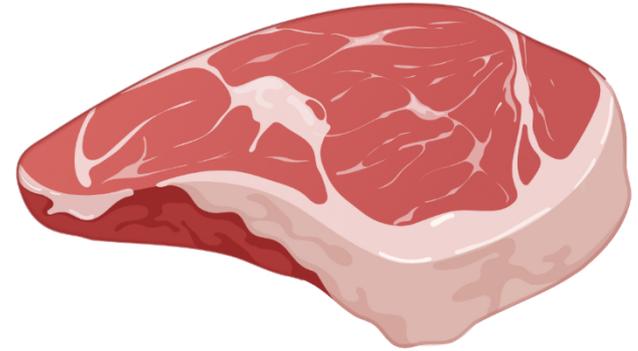
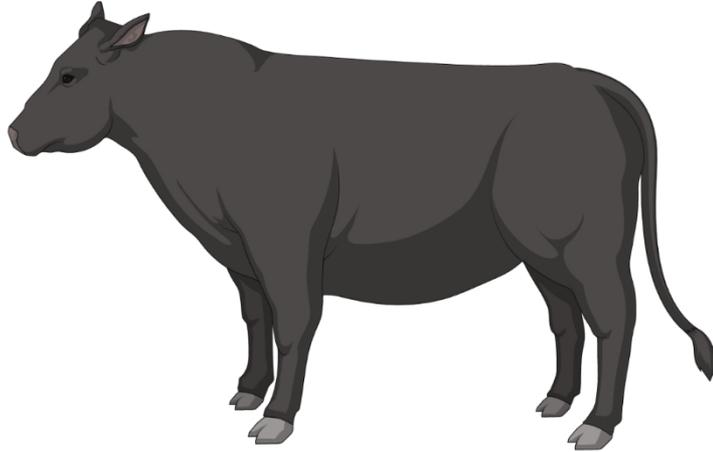
**Homocysteine and S-adenosylhomocysteine were higher in grain fed patties, which could have implication for cardiovascular disease (Prasad, 1999). This can be viewed as a further indication that the grass-fed animals were metabolically healthier than the grain-fed animals. Higher homocysteine levels in humans have been associated with increased risk of heart disease in humans (Bostom et al., 1999)**

# Oxidative Stress Markers



**Urate is a major intracellular anti-oxidant and higher levels indicate improved anti-oxidant status in the animal. Higher levels of 4-hydroxy-nonenal-glutathione indicate higher oxidative stress. Taken together these two metabolites indicate less oxidative stress and is in line with other indicators of diminished metabolic health.**

# Nutrient density

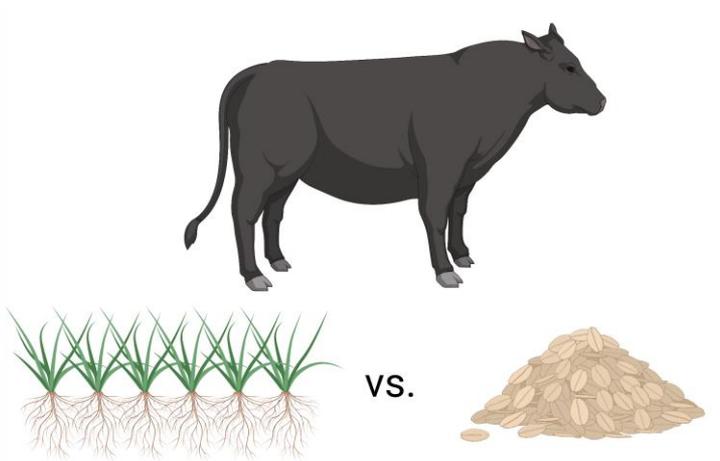
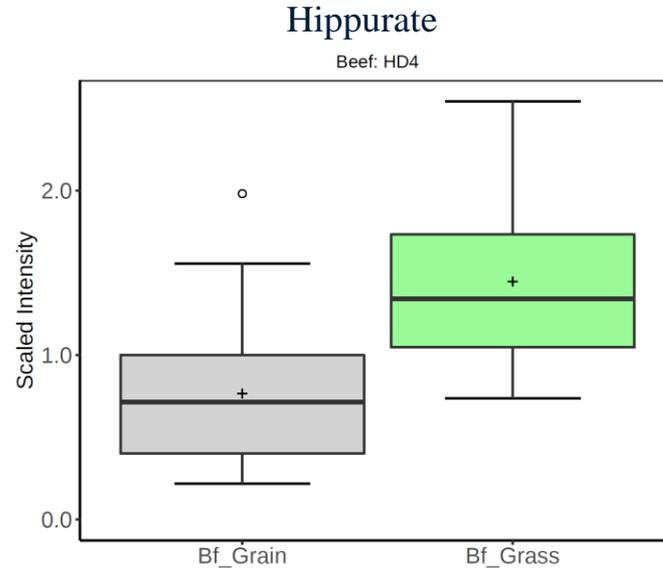
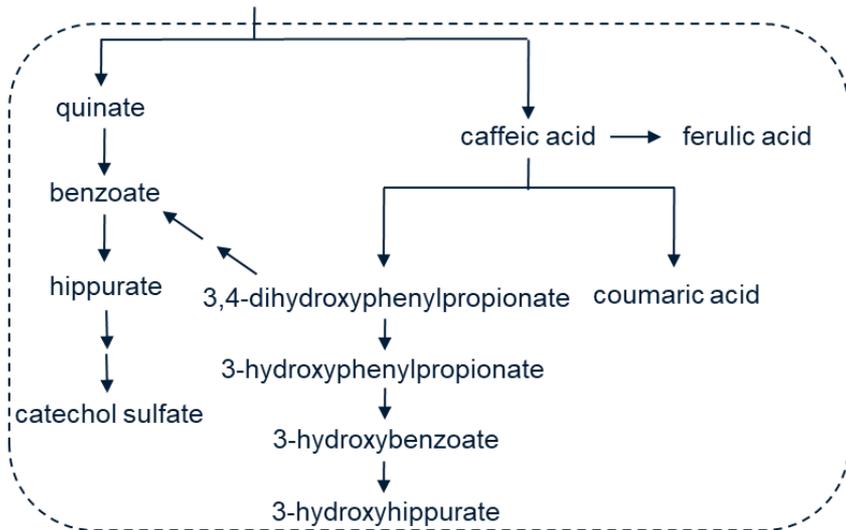


**Phytochemicals, vitamins & minerals, omega-3  
fats, triaglycerols, amino acids**



# Phytochemicals

## Plant phenolic compounds

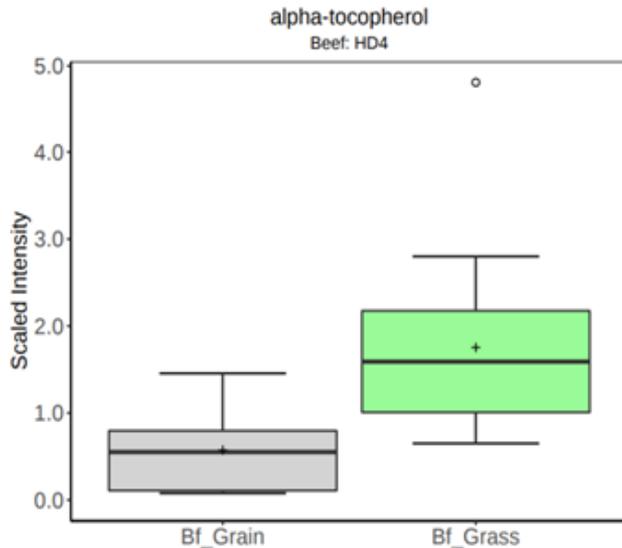


**On average 2.5-fold higher in pastured animals**

Fold difference
<u>Bi_Grass</u> <u>Bi_Grain</u>

Sub Pathway	Biochemical Name	Fold difference
Phytochemical Metabolism	hippurate	1.89
	catechol sulfate	2.65
	p-cresol sulfate	2.17
	4-ethylphenylsulfate	7.07
	cinnamoylglycine	1.38
	2,8-quinolinediol	0.36
	homostachydrine	4.30
	stachydrine	2.20

# Vitamin metabolites



**Tocopherols are vitamin E precursors best known for their anti-oxidative effects. Alpha-tocopherol is most abundant in forage and its abundance was 3-fold higher in beef. The higher level of gamma/beta tocopherol in grain-fed beef is the result of the vitamin/mineral additives to total mixed rations.**

Sub Pathway	Biochemical Name	Fold difference
		Bf_Grass / Bf_Grain
Vitamin B3 metabolism	niacin	9.41
	nicotinamide	0.63
	nicotinamide ribonucleotide (NMN)	0.85
	nicotinamide adenine dinucleotide (NADH)	1.20
Pantothenate and CoA Metabolism	pantothenate	0.76
Ascorbate and Aldarate Metabolism	dehydroascorbate	1.63
Tocopherol Metabolism	alpha-tocopherol	3.05
	gamma-tocopherol/beta-tocopherol	0.07
Choline Metabolism	choline	1.24
	glycerophosphorylcholine (GPC)	1.23
	glycerophosphoserine*	1.27

**Niacin (the main form of Vitamin B3 in foods) was 9-fold higher in the grass-fed beef. Niacin is known to help promote a healthy nervous system, digestive system, and skin. Nicotinamide (higher in grain-fed beef) is a common supplemental form of B3 and only present in small amounts in nature.**

**Choline was 1.2 fold higher in grass-fed beef. Choline is an essential nutrient that is important for brain function, muscle function, and liver function (Zeisel & da Costa, 2009).**

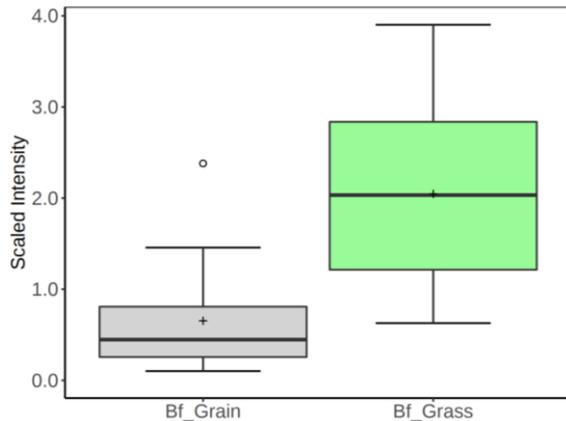
# Omega-3s

Beef

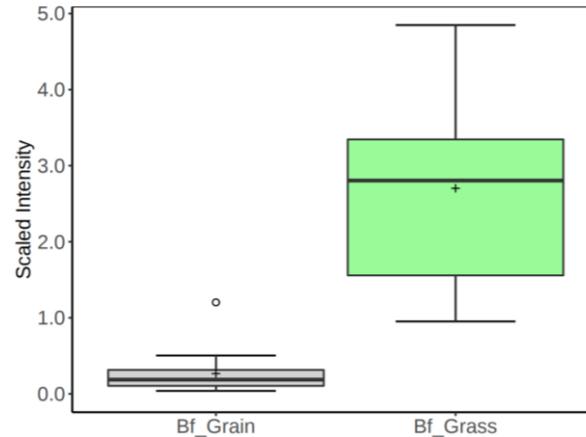
EXOGENOUS



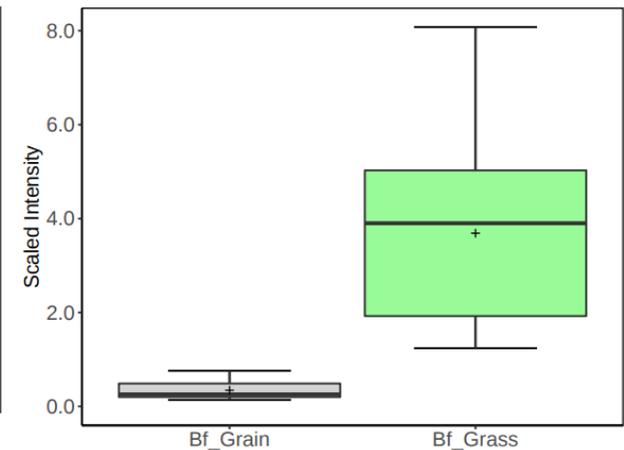
docosahexaenoate (DHA; 22:6n3)  
Beef: HD4



eicosapentaenoate (EPA; 20:5n3)  
Beef: HD4



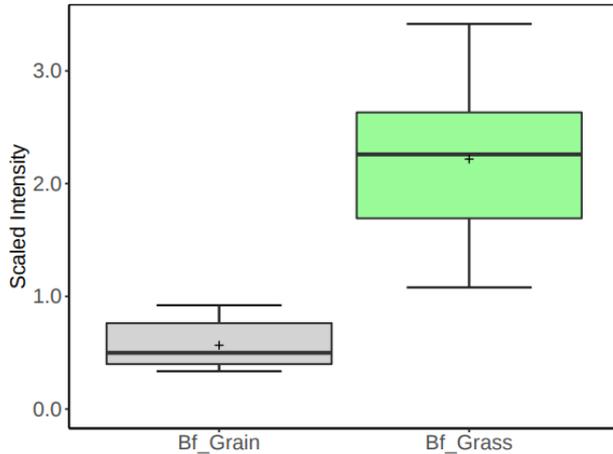
linolenate (18:3n3 or 3n6)  
Beef: HD4



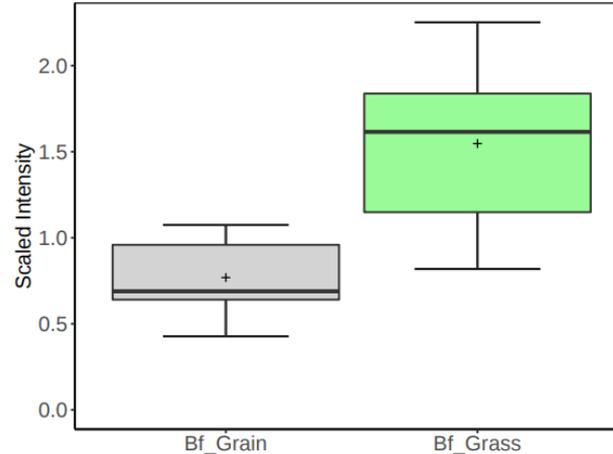
**Docosahexanoic acid (DHA), Eicosapentaenoic acid (EPA) and Linolenic acid (ALA) are omega-3 fatty acids. They have well-known health benefits including being anti-inflammatory and anti-oxidants. They may help lower the risk of getting heart disease, cancer, and liver diseases and could help improve brain function (Swanson et al., 2012). DHA, EPA, and ALA were 3-, 10-, and 10-fold higher in grass-fed beef.**

# Very long-chain saturated fatty acids

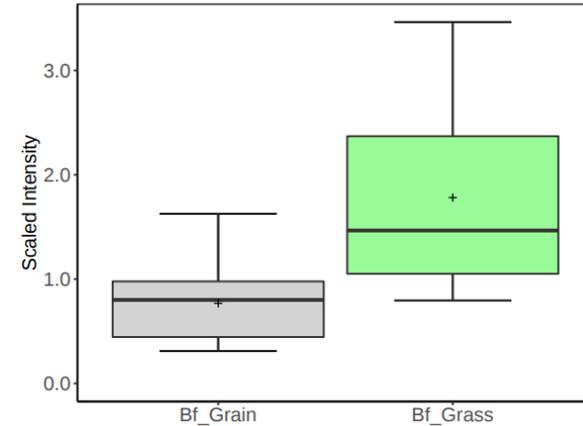
nonadecanoate (19:0)  
Beef: HD4



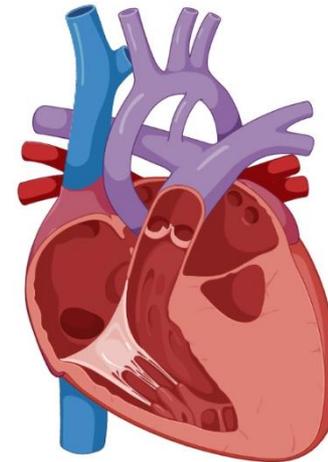
arachidate (20:0)  
Beef: HD4



behenate (22:0)\*  
Beef: HD4



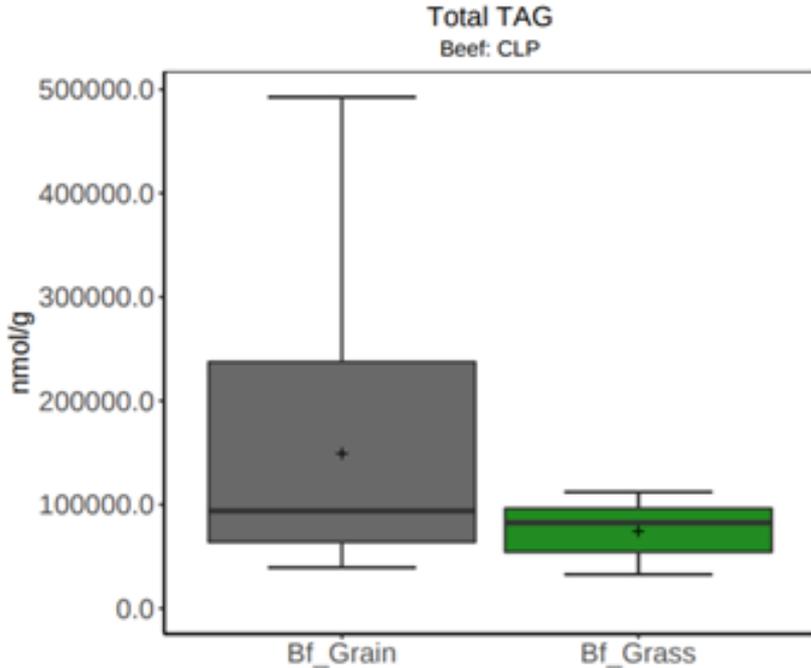
**Similar to the long-chain polyunsaturated (omega-3) fatty acids, very long-chain saturated fatty acids also became enriched in grass-fed beef. In contrast to other saturated fats, these long-chain saturated fats are actually associated with a decreased risk of cardiovascular disease. That these fatty acids also become enriched is less recognized by consumers and the scientific community.**



# Glycerides

Fold of Change

$\frac{\text{Bi\_Grass}}{\text{Bi\_Grain}}$



Within beef samples, TAG metabolites were significantly reduced in grass- compared to grain-fed samples and long-chain acyl carnitines were elevated.

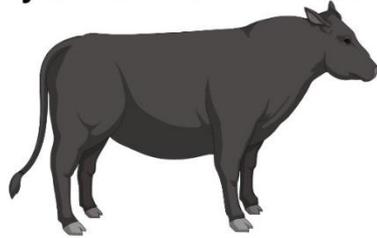
In humans, lower TAGs (Nordestgaard & Varbo, 2014) and higher long-chain acyl carnitines (Bhupathiraju et al., 2018) are associated with improved cardiovascular health.

Based on data in non-human mammals (Nordestgaard, 2016), we consider these findings further reflect that the grass-fed cattle were metabolically healthier.

Sub Pathway	Biochemical Name	Fold of Change
Cholesteryl Esters	Total CE	0.86
Diacylglycerols	Total DAG	1.24
Triacylglycerols	Total TAG	0.50
Monoacylglycerols	Total MAG	1.63
Fatty Acid Metabolism (Acyl Carnitine, Long Chain Saturated)	myristoylcarnitine (C14)	1.10
	pentadecanoylcarnitine (C15)*	0.84
	palmitoylcarnitine (C16)	1.48
	margaroylcarnitine (C17)*	1.05
	stearoylcarnitine (C18)	0.76
	Arachidoylcarnitine (C20)*	0.51
	behenoylcarnitine (C22)*	1.62
	cerotoylcarnitine (C26)*	9.07

# Summary

Improved phytochemical richness of feed + enhanced ability to engage in activity



- ↑ Metabolic Health of Animal
  - ↑ Improved mitochondrial/energetic health
  - ↑ Glucose metabolic health
  - ↓ Homocysteine  
improved cardiovascular health
  - ↓ Oxidative stress  
better muscle health/potential meat quality
- ↑ Omega-3 fatty acids
  - improved brain and cardiovascular health
- ↑ Long-chain saturated fatty acids
  - improved cardiovascular health

- ↑ Phytochemical/anti-oxidants
  - ↑ Polyphenols (anti-oxidants)
  - ↑ Carotenoids (vitamin A)
  - ↑ Tocopherols (vitamin E)  
(all have anti-inflammatory effects)
- ↓ Triaglycerols
  - improved cardiovascular health
- ↑ Niacin and choline
  - improved cardiovascular health
- ↑ Carnitine metabolites
  - important for heart and brain function

**Healthier, soil = healthier animal = healthier meat?**

**We observed casual relationships with better soil health (SOM, TEC, and minerals) in the grazing systems.**

**Does not per se indicate that grain-fed beef is therefore unhealthy, but comparatively, pasture-raised beef certainly looks healthier “on paper”.**