

***DATA  
SCIENCE***

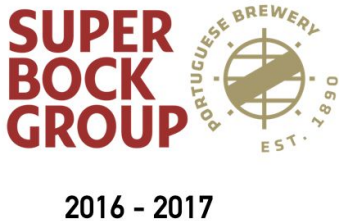
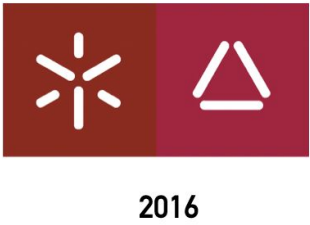
IN (ASTRO)PARTICLE  
PHYSICS and COSMOLOGY:  
the BRIDGE to INDUSTRY



# Helping Very Low Birth Weight Infants thrive using Near Infrared Spectroscopy and Machine Learning

Diogo Barros

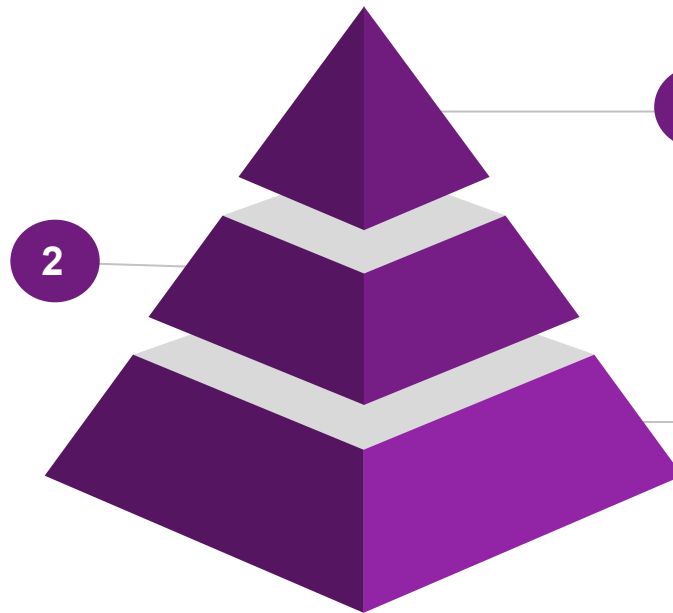
# Diogo Barros Gonçalves



# Agenda

## State of the Art

Medical community approaches to address preterm infants undernourishment and limitations.



## The Preemie System

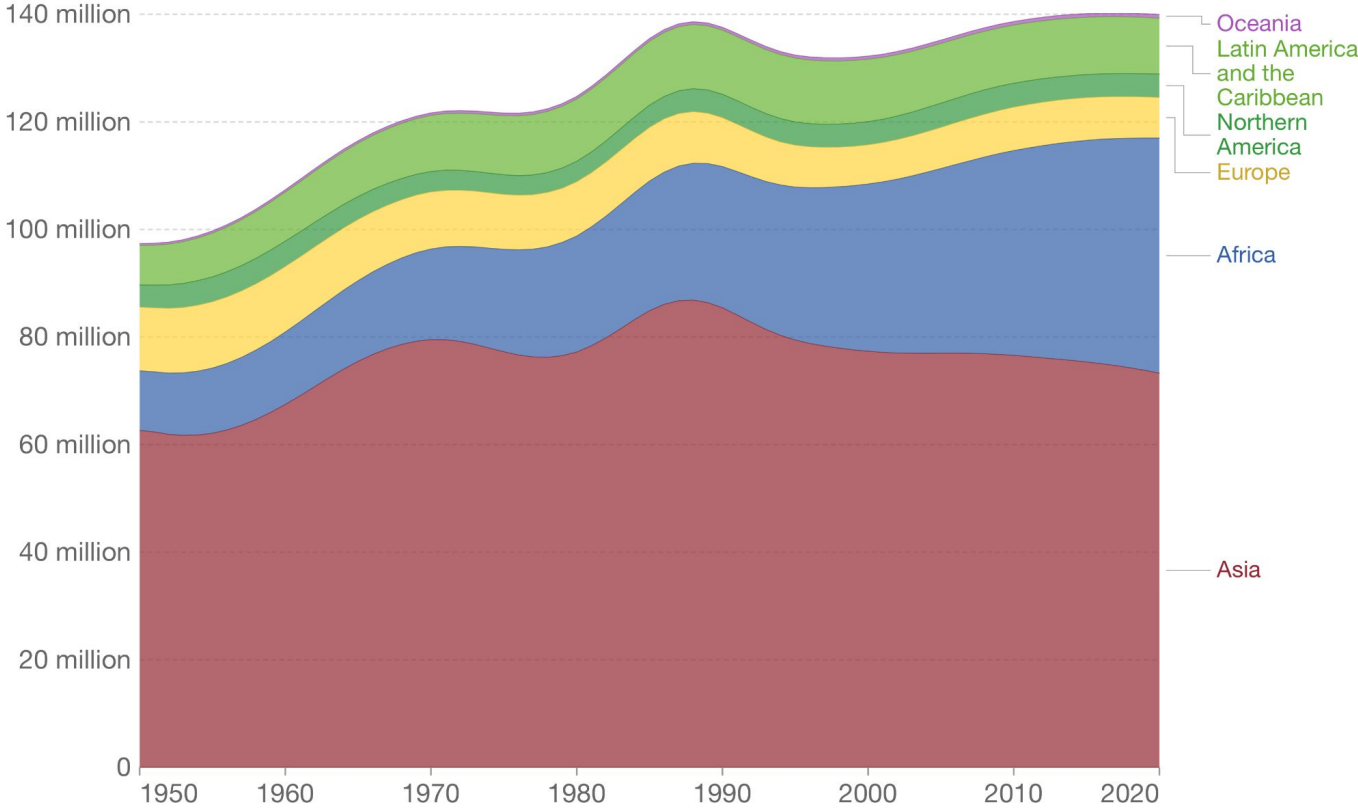
How NIR Spectroscopy and ML help preterm infants thrive, ML methodology for macronutrient quantification.

## Background

Preterm birth rates worldwide, in the EU and US and its economic cost.

# How many infants are born each year?

Annual number of births by world region



Our World  
in Data

Source: United Nations – Population Division (2019 Revision)

OurWorldInData.org/fertility-rate • CC BY

# What's the correlation between #children and GDP per capita?

## Children per woman vs. GDP per capita, 2017

Fertility rate, measured as the average number of births per woman versus gross domestic product (GDP) per capita, measured in 2011 international-\$.

Our World  
in Data



# Number of preterm births and preterm birth rates by UN geographical region

Region/subregion <sup>a</sup>	Preterm births		Preterm birth rate	
	No. in 1000s	95% CI <sup>b</sup>	%	95% CI <sup>b</sup>
<b>World total</b>	<b>12 870</b>	<b>12 228–13 511</b>	<b>9.6</b>	<b>9.1–10.1</b>
More developed countries	1 014	982–1 046	7.5	7.3–7.8
Less developed countries	7 685	7 109–8 261	8.8	8.1–9.4
Least developed countries	4 171	3 891–4 452	12.5	11.7–13.3
<b>Africa</b>	<b>4 047</b>	<b>3 783–4 311</b>	<b>11.9</b>	<b>11.1–12.6</b>
Eastern	1 686	1 481–1 891	14.3	12.5–16.0
Middle	602	535–669	11.6	10.3–12.9
Northern	407	290–523	8.7	6.2–11.2
Southern	228	191–265	17.5	14.6–20.3
Western	1 125	1 036–1 215	10.1	9.3–10.9
<b>Asia</b>	<b>6 907</b>	<b>6 328–7 486</b>	<b>9.1</b>	<b>8.3–9.8</b>
Eastern	724	650–798	3.8	3.4–4.1
South-central	4 467	3 944–4 991	11.4	10.0–12.7
South-eastern	1 271	1 062–1 480	11.1	9.3–13.0
Western	396	290–501	7.9	5.8–9.9
Central	49	21–77	3.8	1.6–5.9
<b>Europe</b>	<b>466</b>	<b>434–498</b>	<b>6.2</b>	<b>5.8–6.7</b>
<b>LA and the Caribbean</b>	<b>933</b>	<b>858–1 009</b>	<b>8.1</b>	<b>7.5–8.8</b>
Caribbean	48	33–63	6.7	4.7–8.8
Central America	295	263–326	9.1	8.2–10.1
South America	591	524–658	7.9	7.0–8.8
<b>North America<sup>d</sup></b>	<b>480</b>	<b>479–482</b>	<b>10.6</b>	<b>10.5–10.6</b>
<b>Oceania</b>				
Australia/New Zealand	20	20–20	6.4	6.3–6.6
Rest of Oceania	16	11–20	6.4	4.6–8.2

Source: S. Becky et al. *Bull World Health Organ* 2010; 88:31–38

# Rates of preterm birth from 1996 to 2008 in 19 European countries

Country: region/ area	All live births					Singleton live births					Multiple live births				
	<i>n</i>	1996	2000	2004	2008	<i>n</i>	1996	2000	2004	2008	<i>n</i>	1996	2000	2004	2008
	(2008)	%	%	%	%	(2008)	%	%	%	%	(2008)	%	%	%	%
Austria	77 720	9.1	10.0	11.4	11.1	75 066	7.9	8.4	9.4	8.7	2654	58.2	67.5	74.6	77.8
Belgium: Flanders	69 187	7.0	7.8	8.1	8.0	66 672	5.2	6.0	6.3	6.2	2515	51.7	55.9	60.4	57.3
Czech Republic	119 455		5.4	7.7	8.3	114 722		4.2	6.0	6.3	4733		42.3	52.7	57.5
Estonia	16 031	5.5	5.9	5.9	6.2	15 506	4.9	5.1	4.9	4.6	525	38.5	46.2	47.6	51.0
Finland	59 486	5.8	6.1	5.6	5.5	57 767	4.5	4.7	4.4	4.3	1719	46.5	49.4	44.5	47.5
France*	14 696	5.4	6.2	6.3	6.6	14 261	4.5	4.7	5.0	5.5	435	40.5	48.2	44.3	42.1
Germany: 3 Länder	215 634		8.8	9.2	9.0	208 383		7.0	7.2	7.0	7251		61.7	61.8	64.2
Ireland	75 246		5.4	5.5	5.9	72 589		4.5	4.4	4.3	2657		41.8	42.3	49.9
Lithuania	31 287	5.3	5.3	5.3	5.9	30 510	4.5	4.6	4.5	4.7	777	41.3	42.6	42.7	49.4
Malta**	4152		6.0	7.2	6.7	4020		5.0	5.8	5.3	132		39.5	51.7	50.0
the Netherlands	175 160	7.8	7.7	7.4	7.4	168 829	6.2	6.0	5.7	5.7	6331	51.1	47.5	48.2	50.6
Norway	60 744	6.4	6.8	7.1	6.7	58 674	5.3	5.4	5.5	5.3	2070	43.4	43.9	49.2	48.3
Poland	414 480	6.8	6.3	6.8	6.6	404 452	6.1	5.5	5.8	5.5	10 028	43.1	44.0	50.2	51.2
Portugal	103 597	7.0	5.9	6.8	9.0	100 705	6.1	4.9	5.4	7.4	2892	45.9	49.6	54.9	63.5
Slovakia	53 624	5.1	5.4	6.3	6.8	52 227	4.4	4.5	5.2	5.6	1397	40.3	46.3	49.8	52.2
Slovenia	21 816	6.0	6.8	7.0	7.4	21 050	4.8	5.1	5.2	5.4	766	54.1	57.4	55.4	62.3
Spain	417 094	7.1	7.7	8.0	8.2	400 474	6.2	6.3	6.4	6.3	16 620	42.2	50.4	53.0	53.9
Sweden**	108 865	6.1	6.4	6.3	5.9	105 799	5.0	5.2	5.2	4.8	3066	44.1	43.4	45.2	43.3
UK: Scotland	58 275	7.0	7.4	7.6	7.7	56 423	5.8	6.1	6.3	6.1	1852	53.1	51.6	55.5	55.0

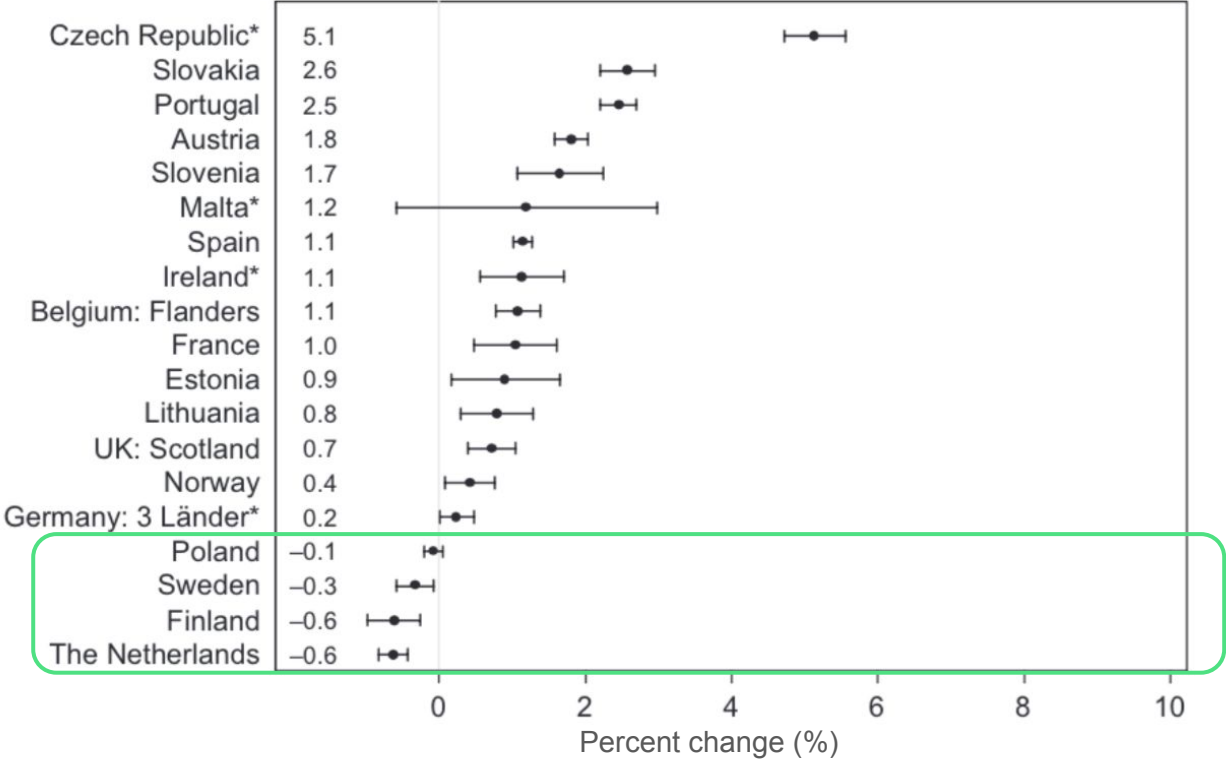
\*Data from France come from a nationally representative sample of births, and the years are 1995, 1998, 2003, and 2010.

\*\*2009, instead of 2008 data.

Source: J. Zeitlin et al. *BJOG* 2013; 120:1356–1365

# Average annual percentage change for preterm birth rate by country

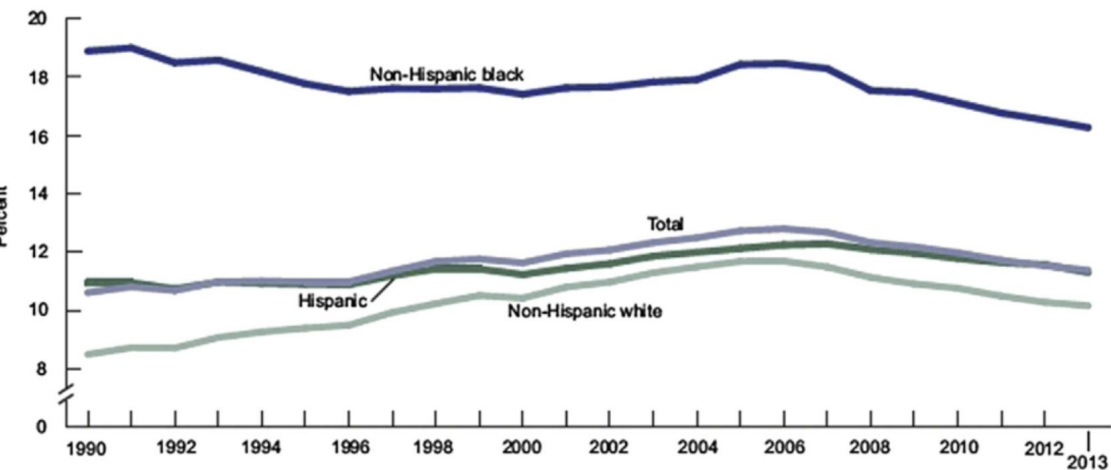
All live births



Source: J. Zeitlin et al. *BJOG* 2013; 120:1356–1365

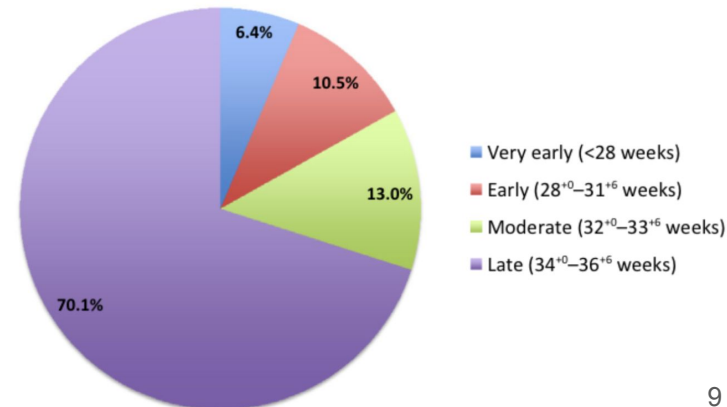


# How does preterm birth rate and distribution look like in the USA?



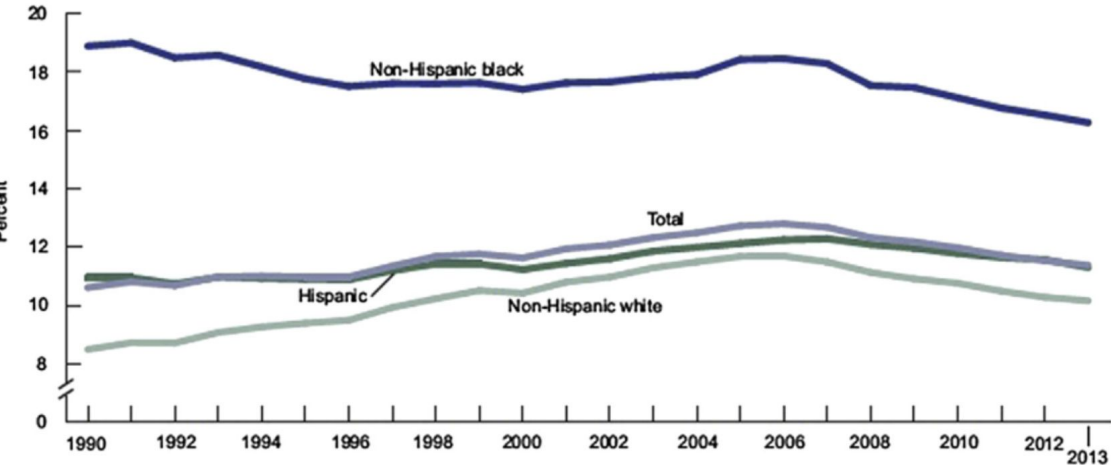
Preterm birth rates, by maternal race in the USA, 1990-2013

Source: J. A. Martin et al. *National Center for Health Statistics* 2015; 64:1-65



Distribution of preterm births in the USA in 2013  
Source: H.A. Frey et al. *Seminars in Fetal & Neonatal Medicine* 2016; 21:68-73

# How does preterm birth rate and distribution look like in the USA?

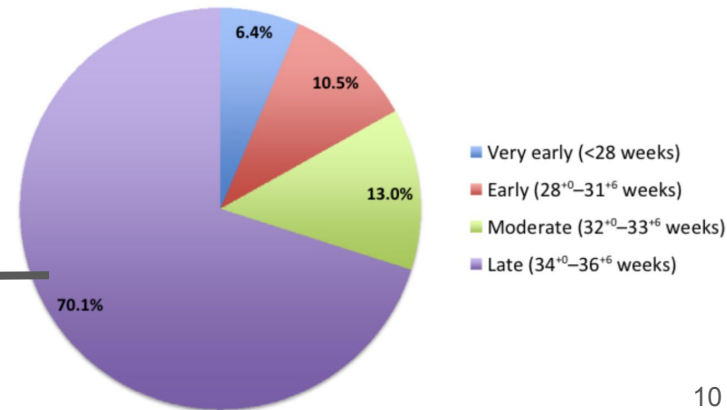


Preterm birth rates, by maternal race in the USA, 1990-2013

Source: J. A. Martin et al. *National Center for Health Statistics* 2015; 64:1-65

**US\$26 000 000 000 /yr**

Source: S. Becky et al. *Bull World Health Organ* 2010; 88:31-38



Distribution of preterm births in the USA in 2013

Source: H.A. Frey et al. *Seminars in Fetal & Neonatal Medicine* 2016; 21:68-73

# Addressing preemie's extra nourishment needs - Human Milk Fortification

**BORN TOO SOON: Preterm infants typically need extra nourishment to support their growth needs**



**BRAIN**  
is still developing

Milk may need higher  
content of **FAT**



**LUNGS**  
are still maturing

Milk may need higher  
content of **ENERGY**



**TEMPERATURE**  
regulation is still developing

Milk may need higher  
content of **ENERGY**



**HEARING**  
is still developing

Milk may need higher  
content of **PROTEIN**



**LIVER**  
is still maturing

Milk may need higher  
content of **PROTEIN**



**GROWTH**  
is restricted

Milk may need higher  
content of **PROTEIN**



**IMMUNE SYSTEM**  
Baby is born with a mostly  
sterile microbiome.

Milk may need higher  
content of **HMOs**



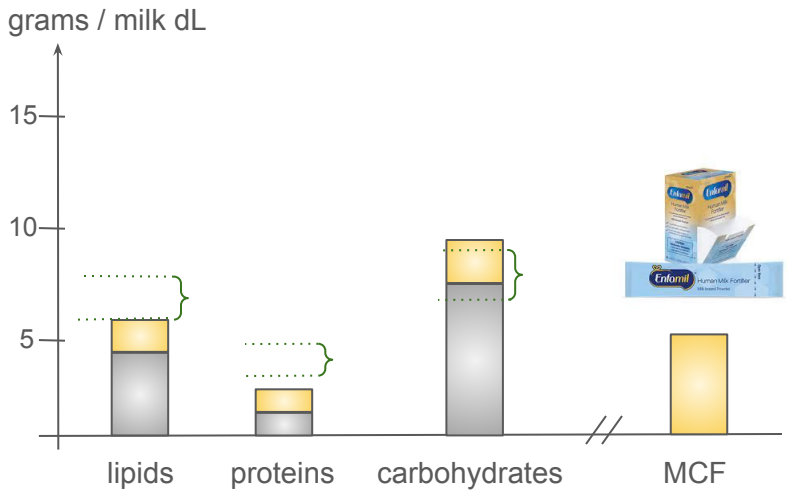
**Standard Fortification** - “The standard practice [of] **adding a fixed amount of [multicomponent] fortifier** per 100 ml of HM to achieve the recommended nutrient intakes.”

**Targeted Fortification** - “The concept of targeted fortification is to **analyze macronutrient composition of HM** and to fortify it in such a way that **each infant always receives the amount of nutrient that is suggested** in population-based recommendations.”

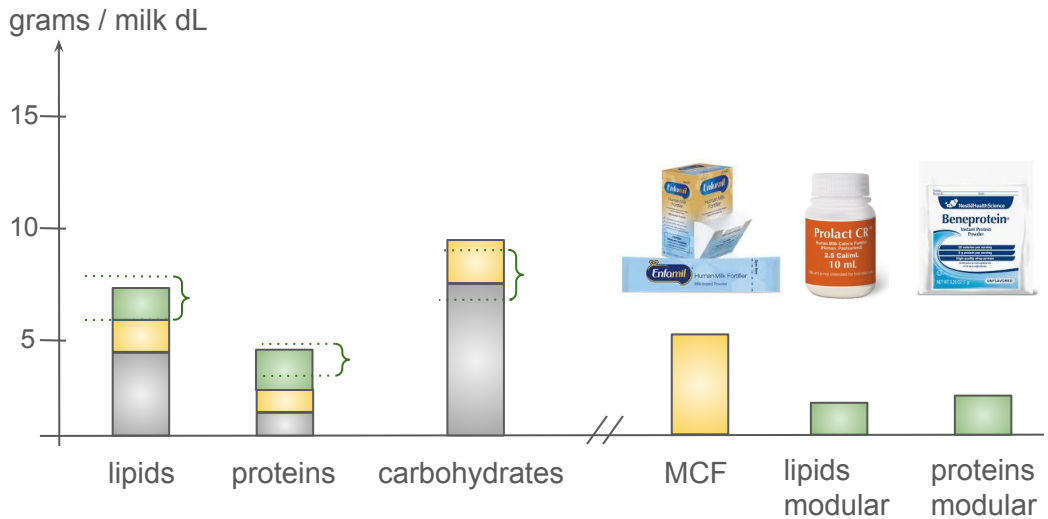


# Standard Fortification vs. Targeted Fortification: quantitatively speaking

STANDARD FORTIFICATION



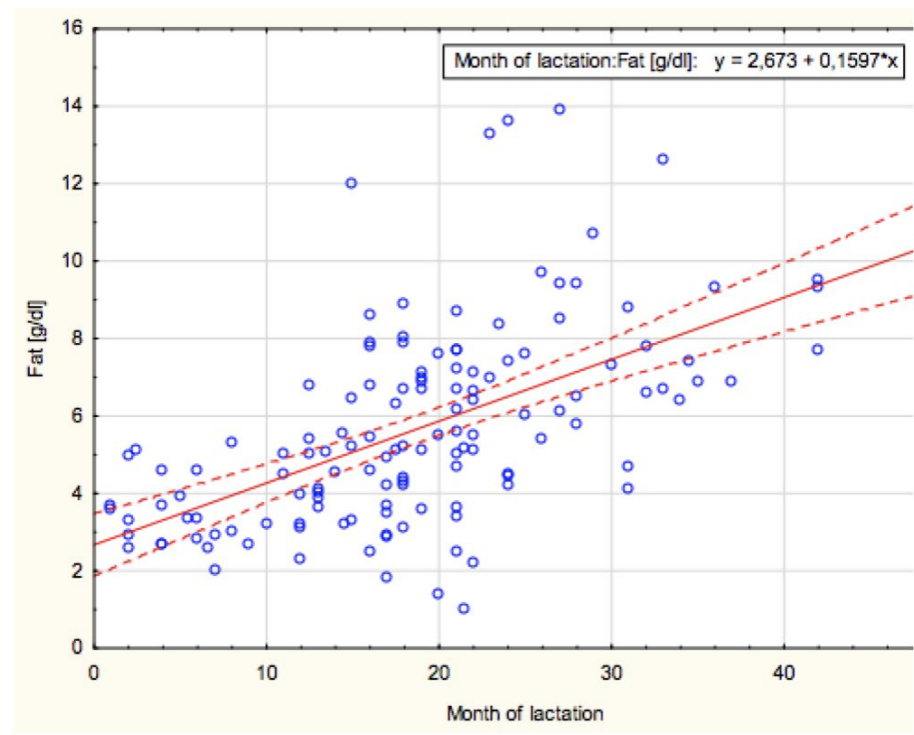
TARGETED FORTIFICATION



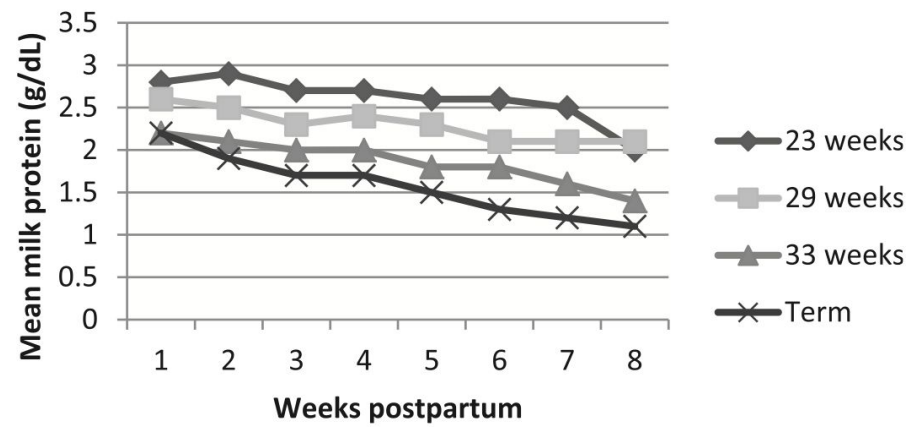
Legend

- Initial milk
- MultiComponent Fortifier (MCF)
- optimal nutrition range according to guideline
- Modular fortifier (lipids, proteins or carbs)

# Standard Fortification Limitations: Human milk is a complex, ever-changing food...

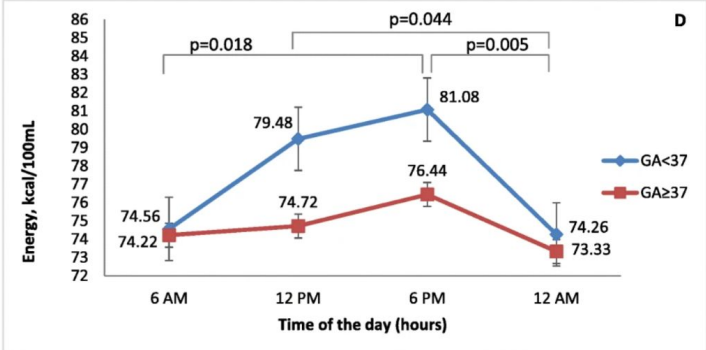
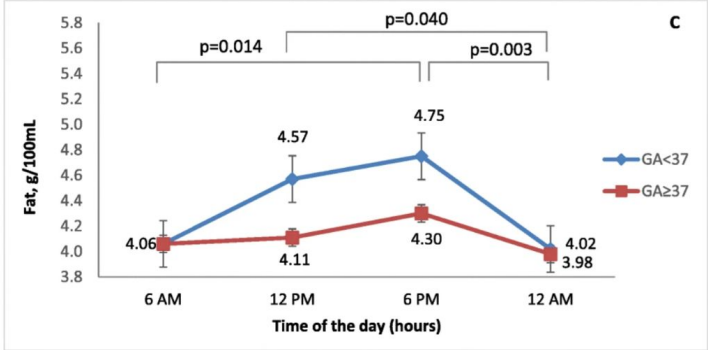
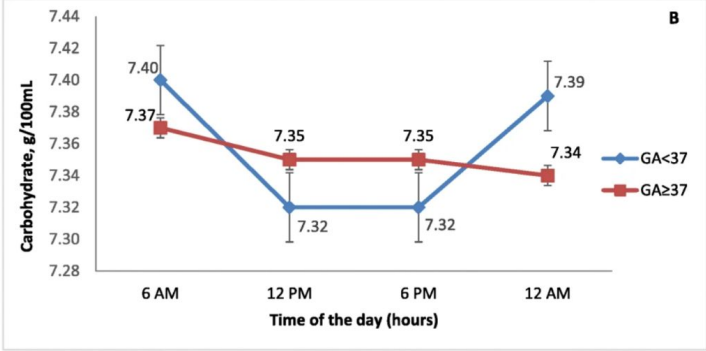
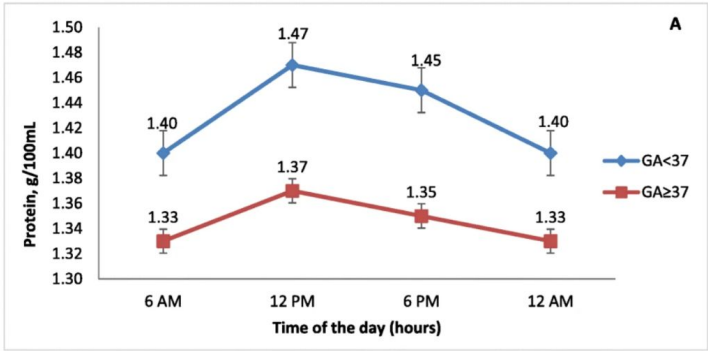


Source: M. Czosnykowska-Lukacka et al. *Nutrients* 2018; 10:1893



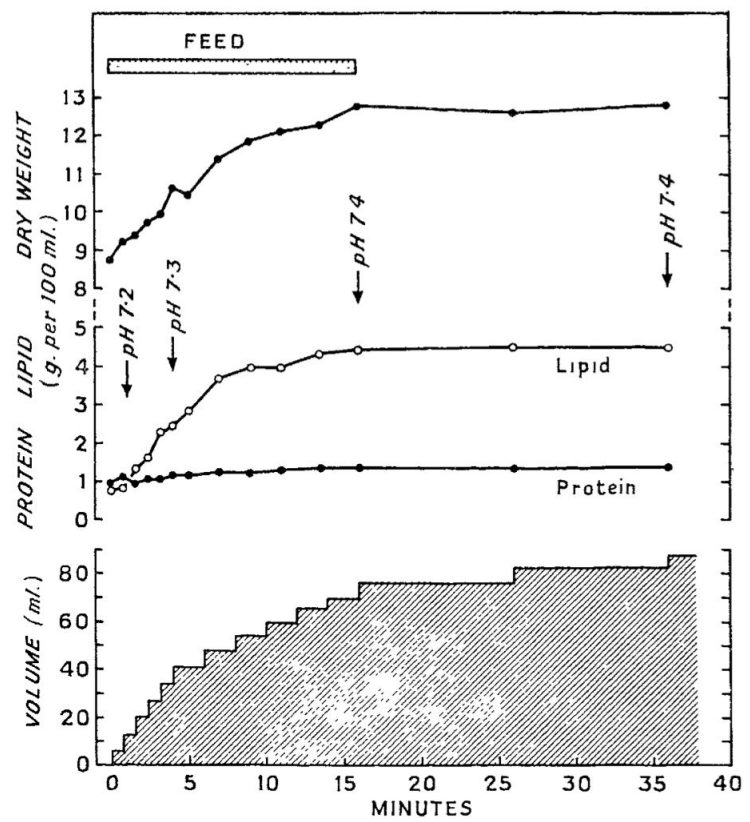
Source: O. Ballard et al. *Pediatr Clin N Am* 2013; 60:49–74

# Standard Fortification Limitations: Human milk is a complex, ever-changing food...



Source: I. Paulaviciene et al. *International Breastfeeding Journal* 2020; 15:49

# Standard Fortification Limitations: Human milk is a complex, ever-changing food...

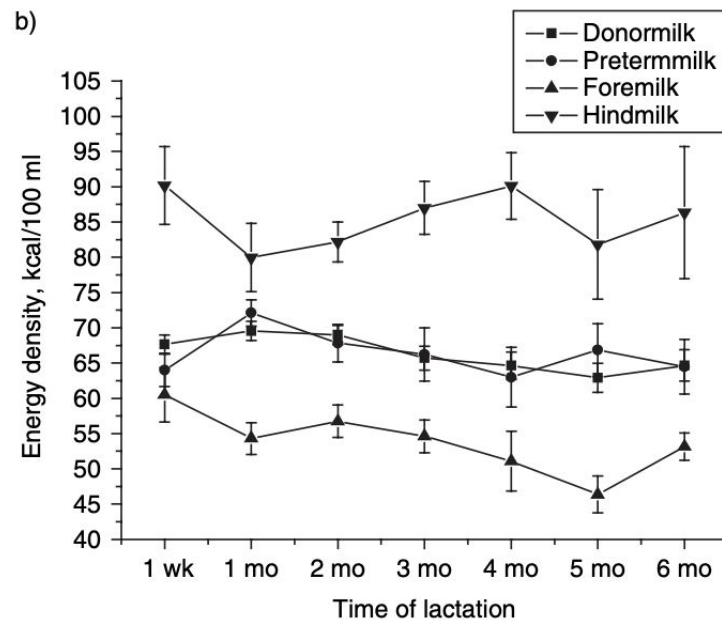
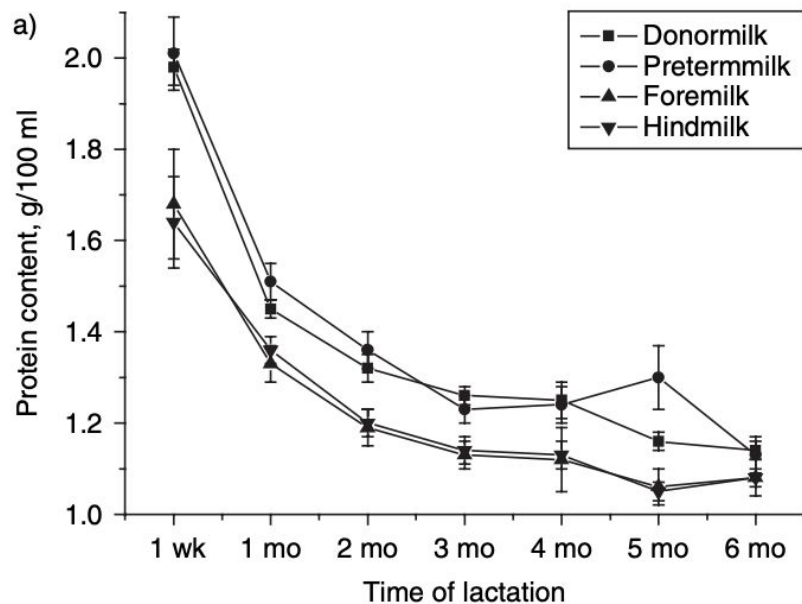


Changes in milk composition during the feed: continuous analysis of milk of one woman.

Source: B. Hall. *The Lancet* 1975; 305:779-781



# Standard Fortification Limitations: Human milk is a complex, ever-changing food...



Source: T. Saarela et al. *Acta Pædiatrica* 2005; 94: 1176–1181

# Standard Fortification Limitations: Human milk is a complex, ever-changing food...

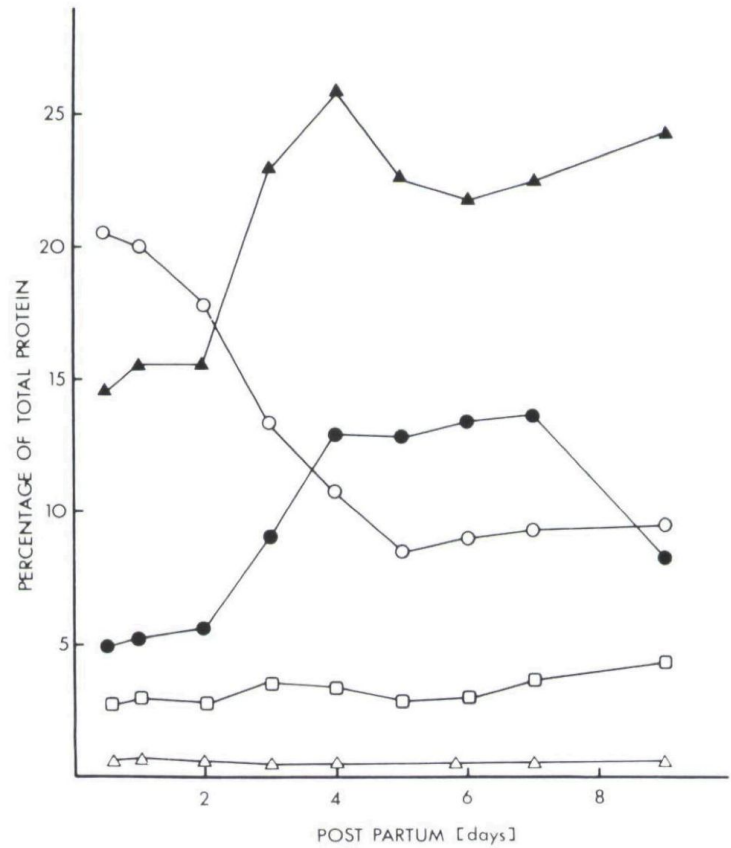
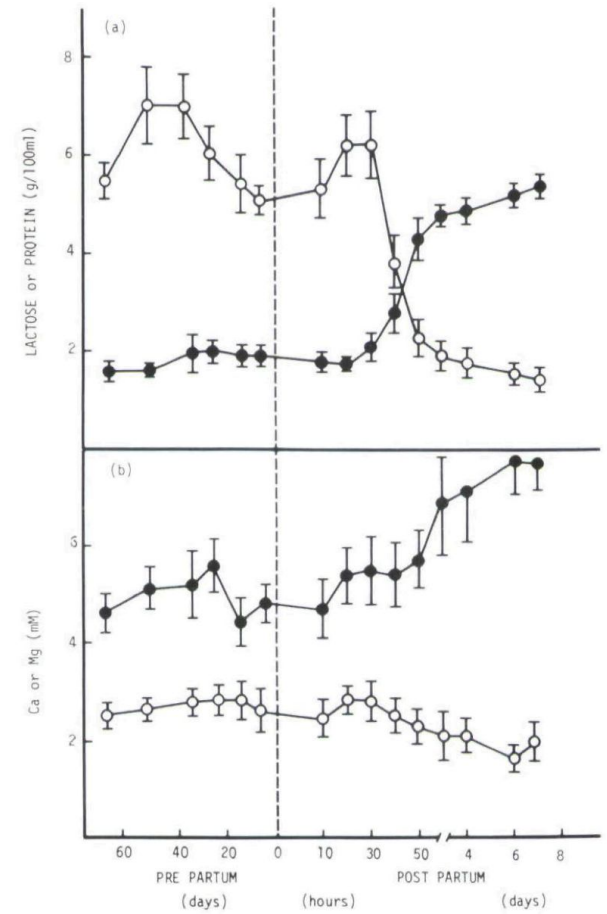
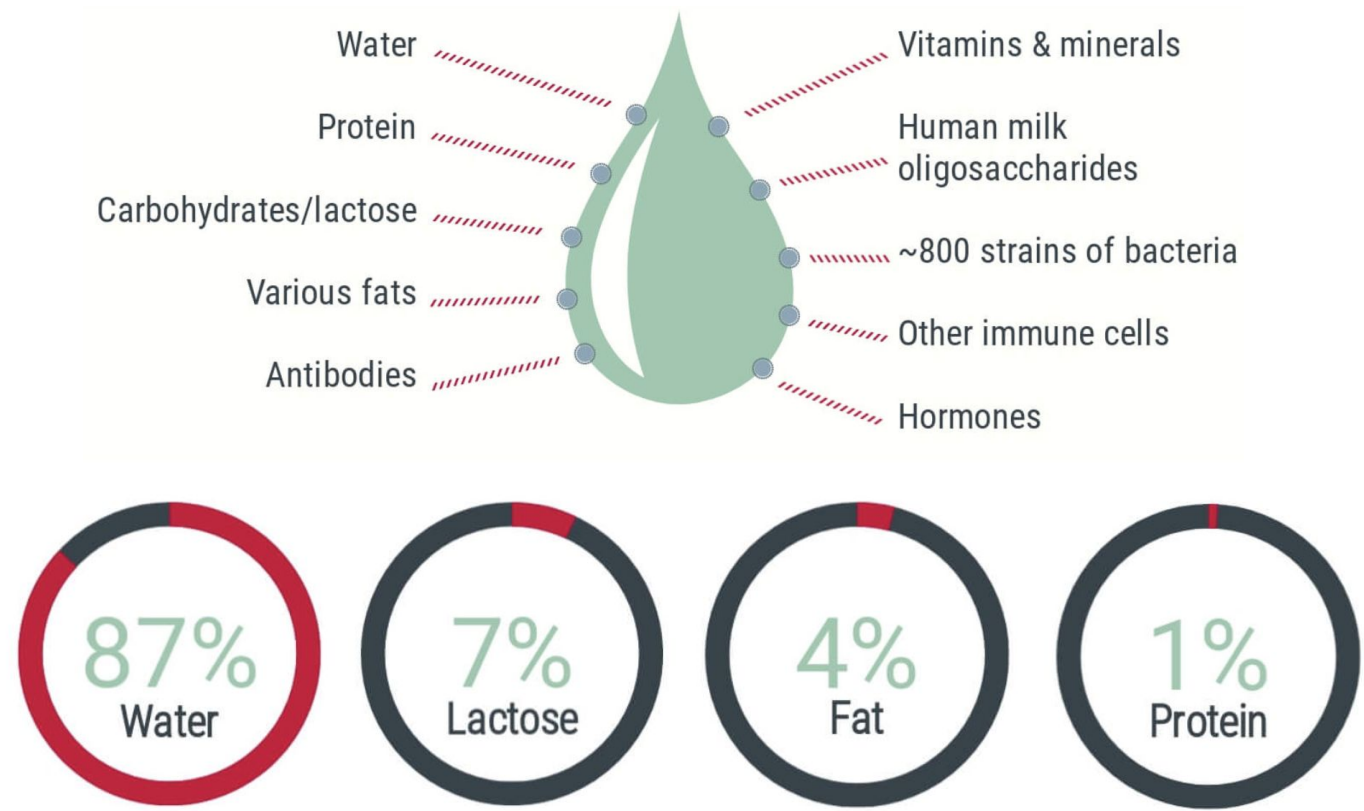


Fig. 5. Changes in lactoferrin, ▲, α-lactalbumin, ●, albumin, ○, IgA, □ and IgG, △, as a percentage of total protein in the mammary secretion during the first 9 days post-partum of 4 non-breast feeding women (N1-N4).



Source: J. Kulski et al. *Australian Journal of Experimental Biology and Medical Science* 1981; 59:101-114

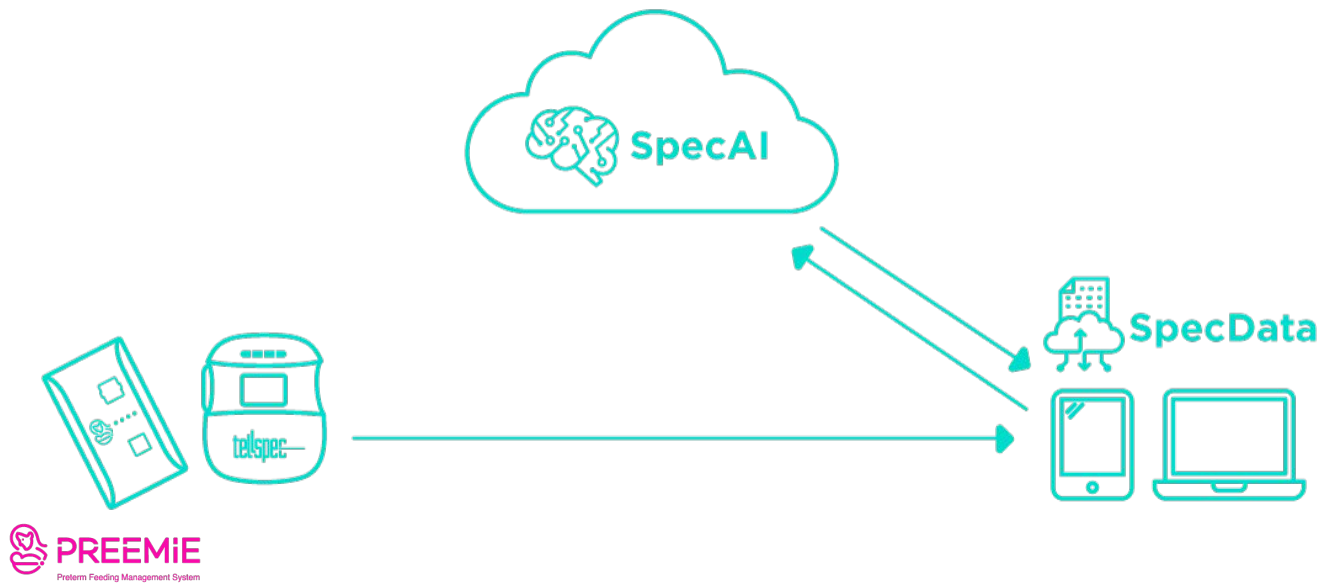
# Standard Fortification Limitations: Human milk is a complex, ever-changing food...



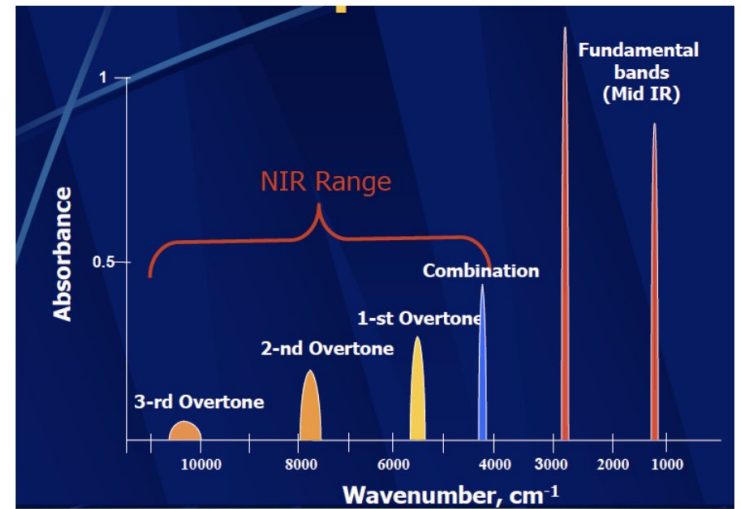
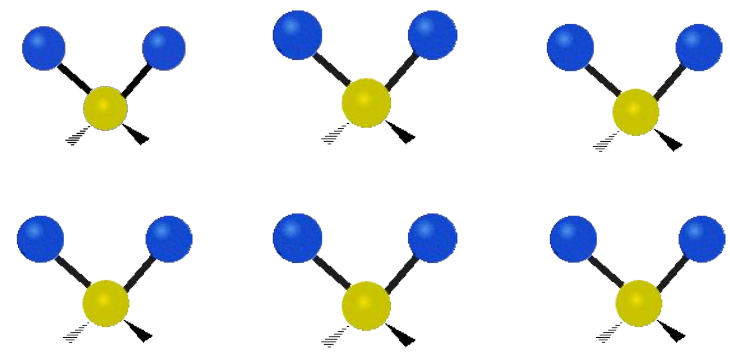
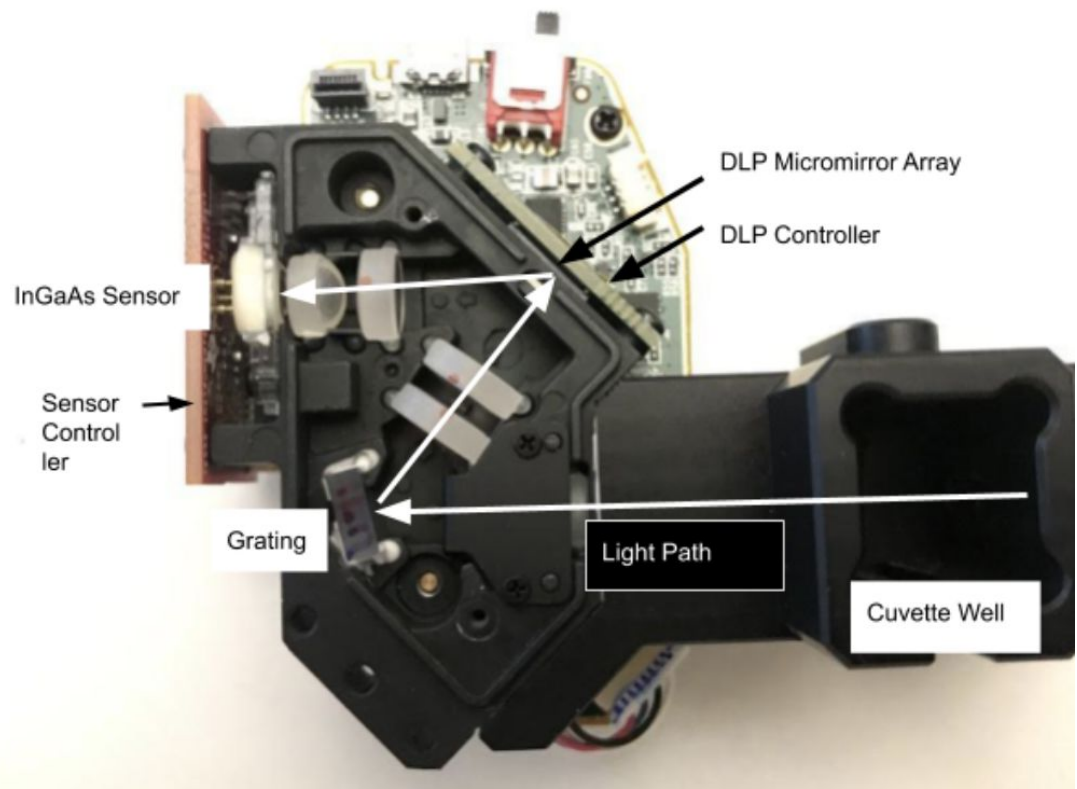
Source: <https://familyandnutrition.com/breastmilk/> (adapted)

# The Premie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive

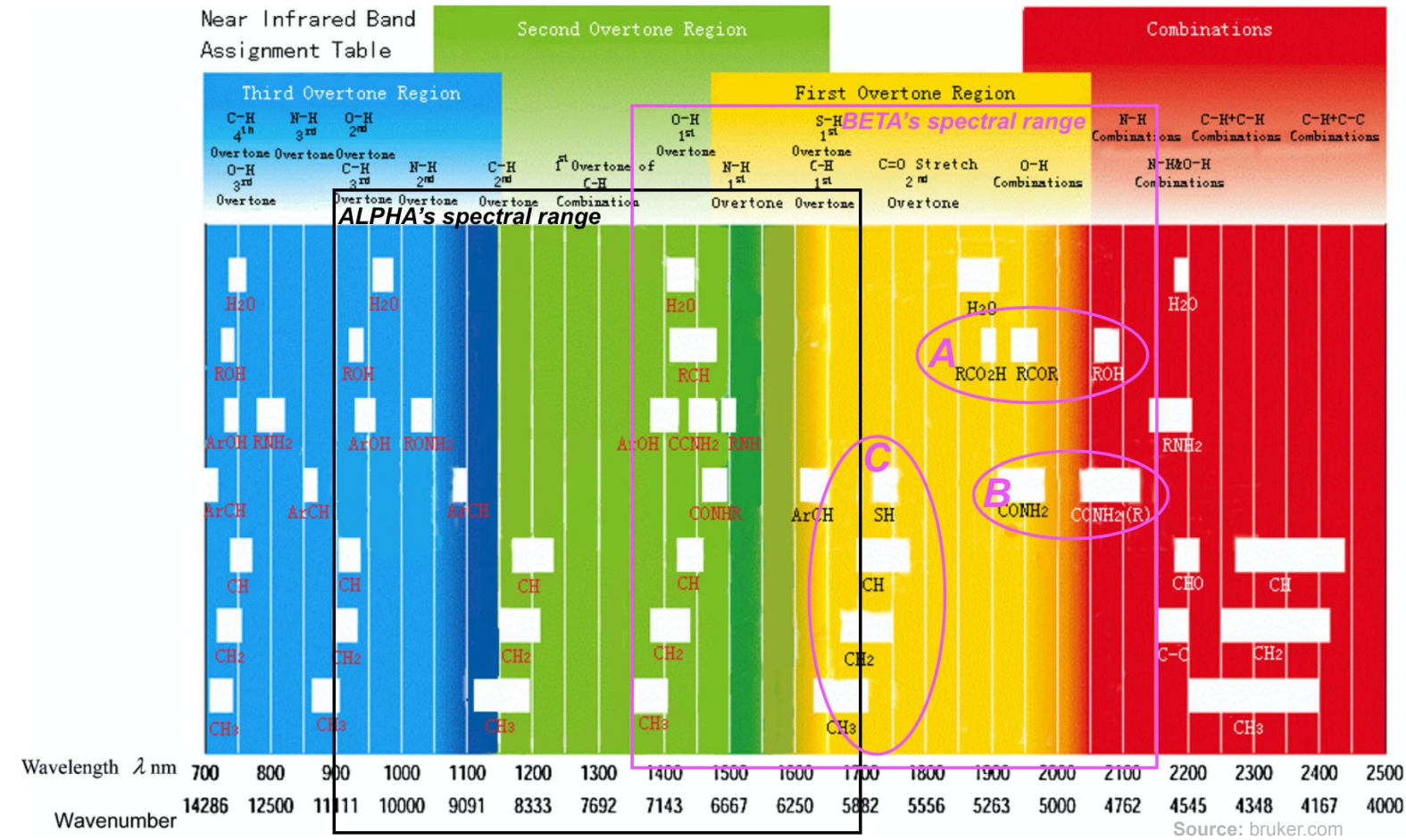
The **Premie ecosystem** is composed of the Premie sensor, supported by cloud-based computation, and a portfolio of four desktop and mobile applications directed to Neonatal Intensive Care Units and Human Milk Banks.



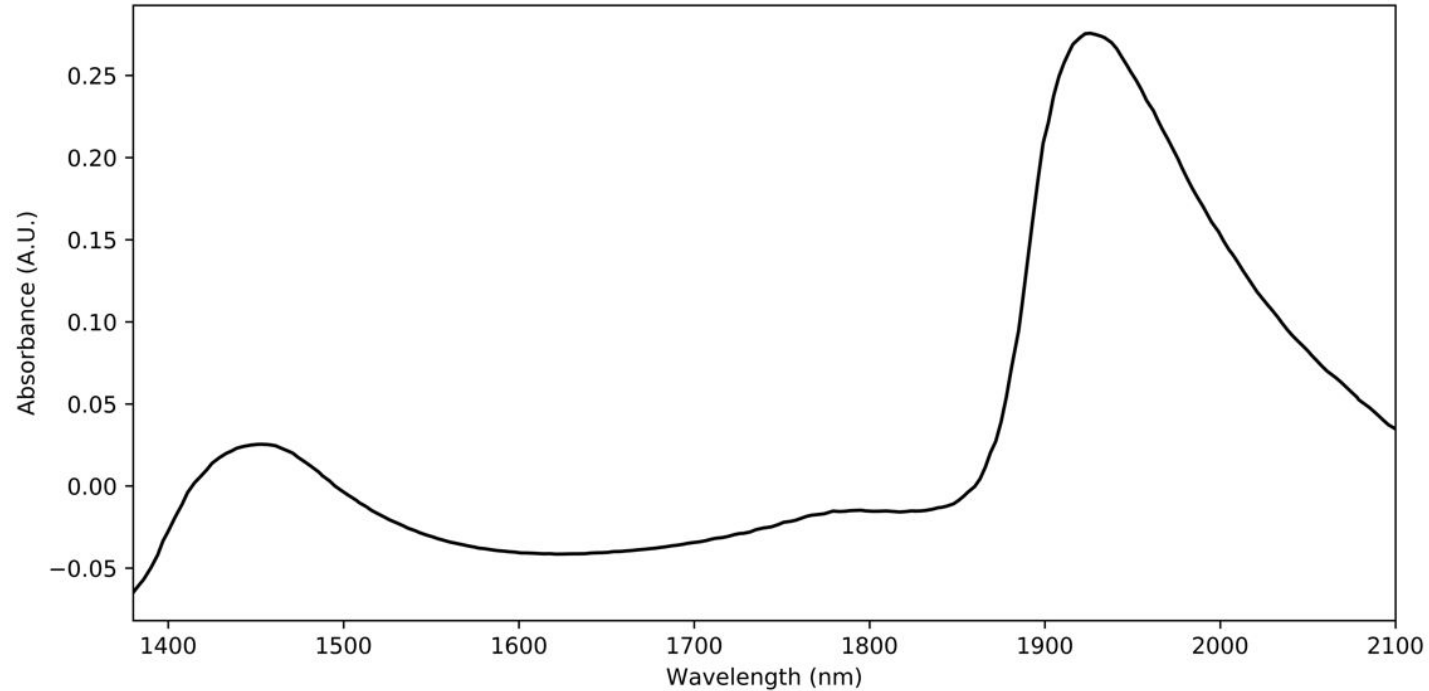
# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



Human milk spectrum acquired with the Preemie Sensor.



# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive

## **Protein** (grams/100 mL)

Protein is the value contributing the most to the infant's growth.

## **Total Lipids** (grams/100 mL)

Fat is crucial for the development of the infant's neurological system.

## **Carbs** (grams/100 mL)

Crucial for energy intake and infant growth, they protect against pathogens and diseases.

## **Lactose** (grams/100 mL)

The main sugar in milk, it provides most of the energy needed by the growing infant.

## **HMOs** (grams/100 mL)

Oligosaccharides are unique to human milk, and serve to feed the gut microbiome.

## **Energy** (kcal/100 mL)

Calculated from other parameters, caloric intake is key for infant development.

## **Somatic Cells** (Low/High count)

High levels of somatic cells can be used to study breast health and prevent mastitis.

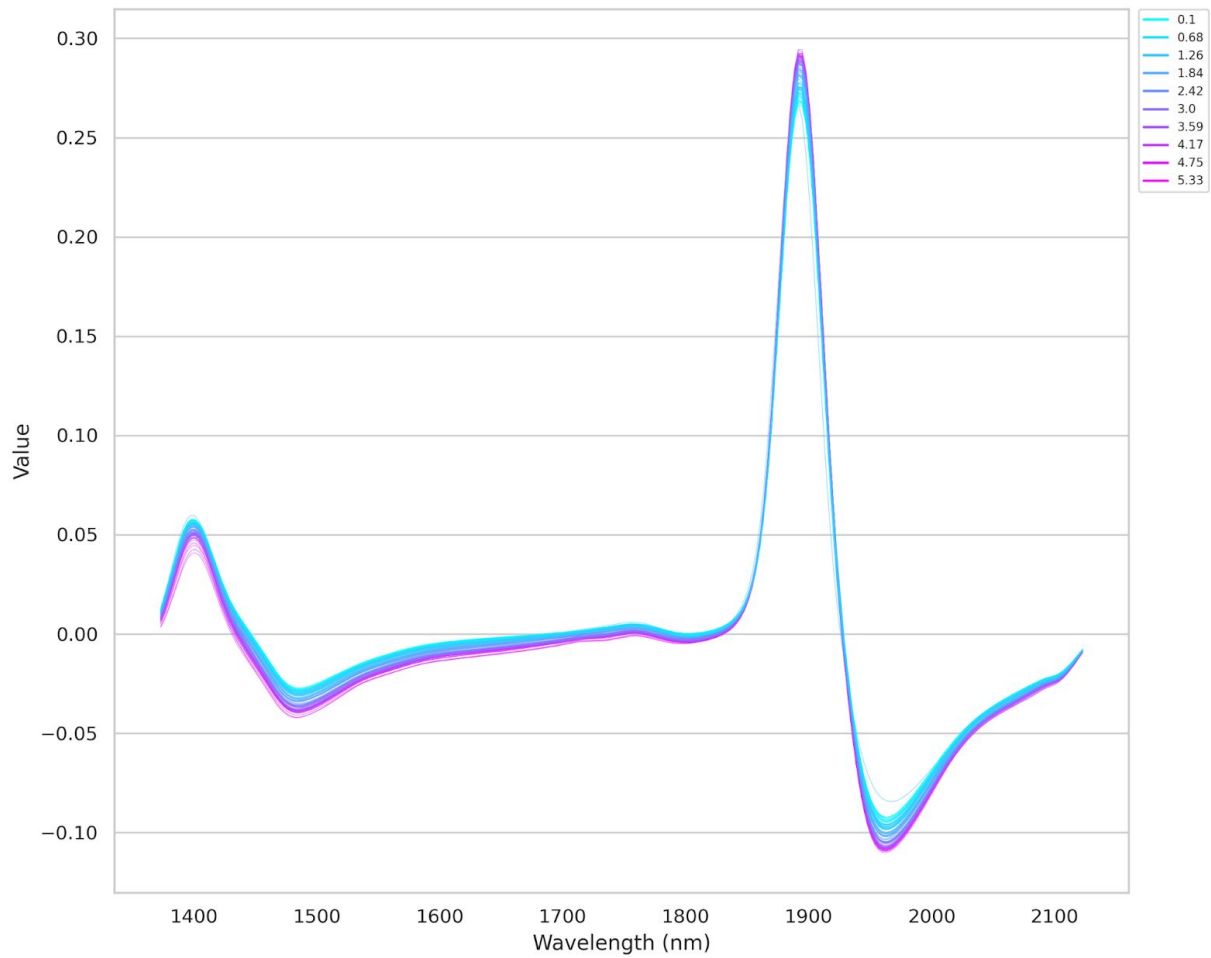
## **Freshness** (Fresh/Spoiled)

Total aerobic bacteria count determines the freshness and acceptability of the milk.



# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive

Human milk spectrum gby  
Lipids content



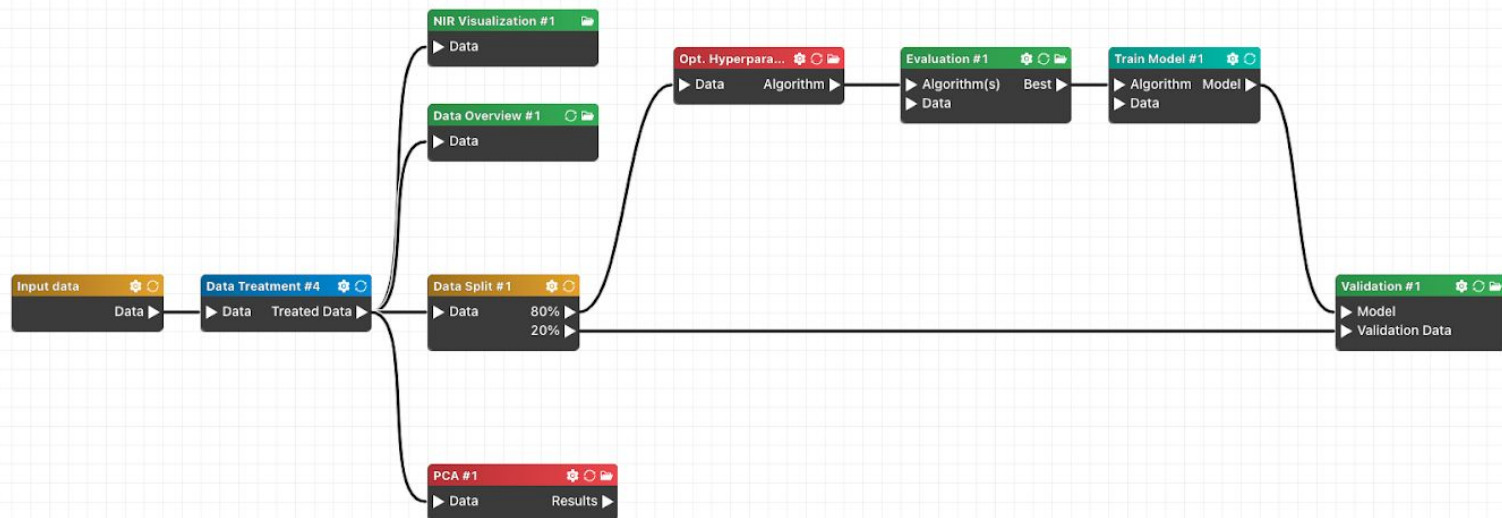
# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive

**SpecAI**

- Dashboard
- ML Models
- Workbenches**
- Trained
- Datasets
- User

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← Cow's milk workbench



*An intuitive drag-and-drop software for data mining and ML model development...*



# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive

SpecAI

Dashboard

ML Models

Workbenches

Trained

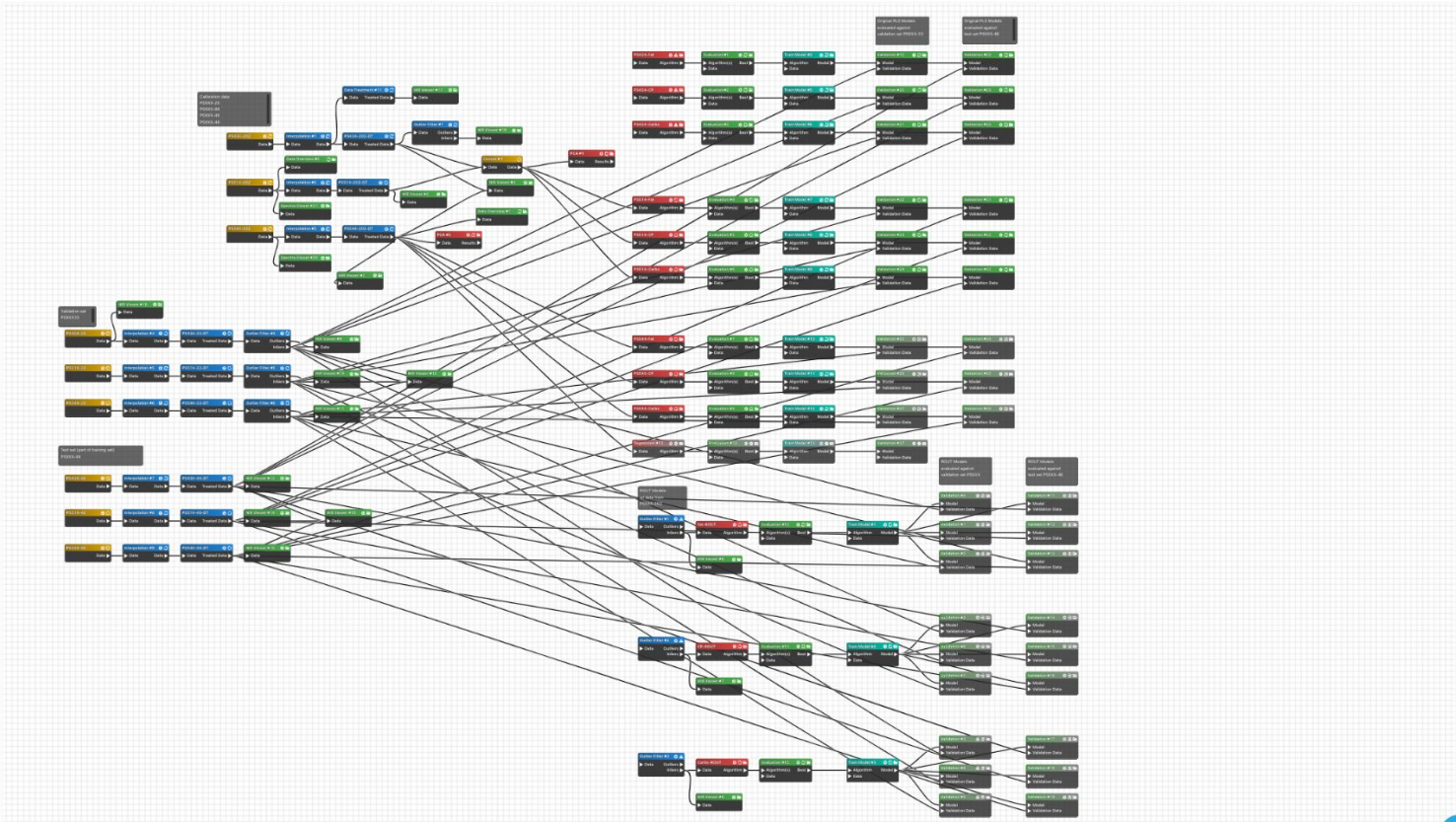
Datasets

User

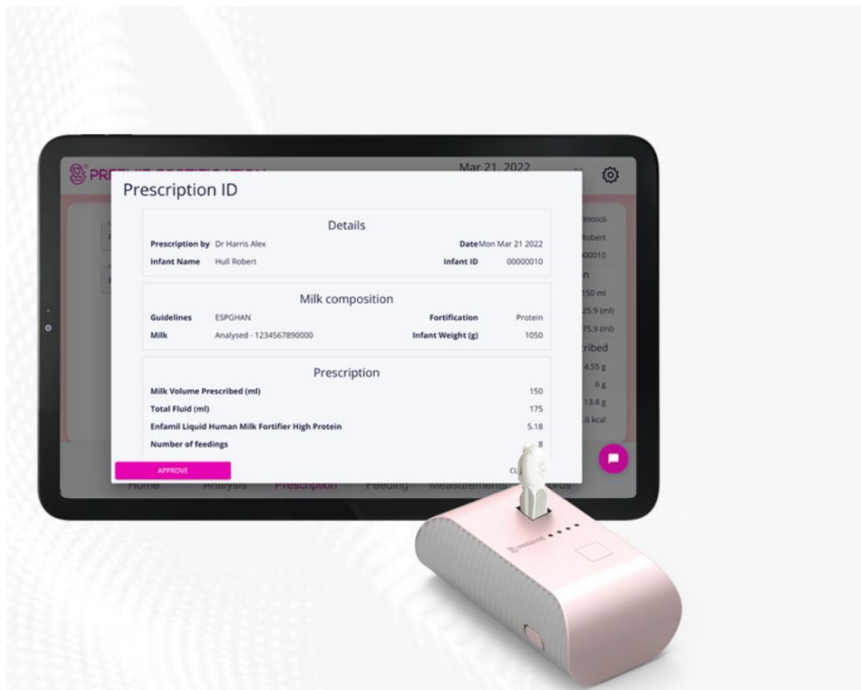
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← PM - Master Calibrations



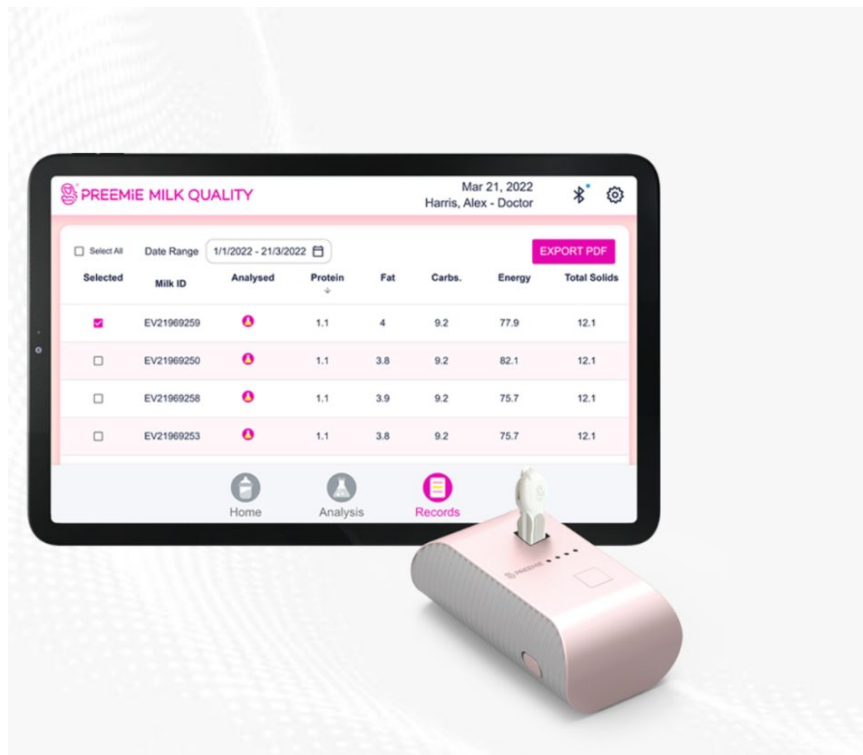
# The Preemie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



This software app is designed to only work with the Preemie sensor and to be used to test milk composition at the NICU.

- Designed to meet the needs of Neonatal Intensive Care Units for targeted fortification;
- Analysis of the composition of human milk for nutrition, freshness, and safety;
- Parameters measured: Total Protein, Total Lipids, Lactose, Total HMOs, Energy, Freshness, Somatic Cell Count;
- Automatic calculation of the suggested fortification;
- Customization of fortification guidelines and fortifiers used;
- Storage of relevant data about infant nutrition and growth in compliance with GDPR;
- Produces, exports, and saves reports.

# The Premie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



This software app is designed to only work with the Premie sensor and to be used to test milk composition, freshness, and safety at the HMB.

- Designed for Human Milk Banks;
- This software works with the Premie sensor;
- Analysis of the composition of human milk for nutrition, freshness, and safety;
- Parameters measured: Total Protein, Total Lipids, Lactose, Total HMOs, Energy, Freshness, Somatic Cell Count;
- Storage of relevant data about donor milk in compliance with GDPR;
- Produces, exports, and saves reports.

[Request a quote](#)

[Download the flyer](#)

The Premie Milk Quality software will be launched in the spring of 2021.

[Add your name to our list](#) to keep informed of our progress

# The Premie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



This software is designed to work with or without the Premie sensor and to be used to track the infant's nutritional intake and correlate it with the infant's growth at the NICU.

- Designed for Neonatal Intensive Care Units;
- Stand-alone desktop software (does not require the use of the Premie sensor);
- Comprehensive management of the infant's nutritional intake overtime;
- Correlation of the infant's nutritional intake with growth indicators such as weight, length, and head circumference;
- Allows digital prescription of fortification on a daily basis;
- Customization of fortification guidelines and of fortifiers used;
- Personalized introduction to fortification;
- Also works with Fortification app to enable personalized and tracked nutritional intake;
- Produces, exports, and saves reports;
- Key insights based on metadata.

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# The Premie System - Leveraging NIR Spectroscopy and AI to help preterm infants thrive



This software is designed to work with or without the Premie sensor and to be used to manage the donor milk at the HMB.

- Designed for Human Milk Banks;
- Stand-alone desktop software (does not require the use of the Premie sensor);
- Comprehensive management of the donor milk received;
- Stores key data about the donor milk encompassing all the key steps, from reception to storage, up to processing and delivery;
- Suggestion of the best donor milk to be pooled in order to achieve the highest milk quality;
- Generation of nutritional labels for each donor and pooled milk bag;
- Also works with Milk Quality app.

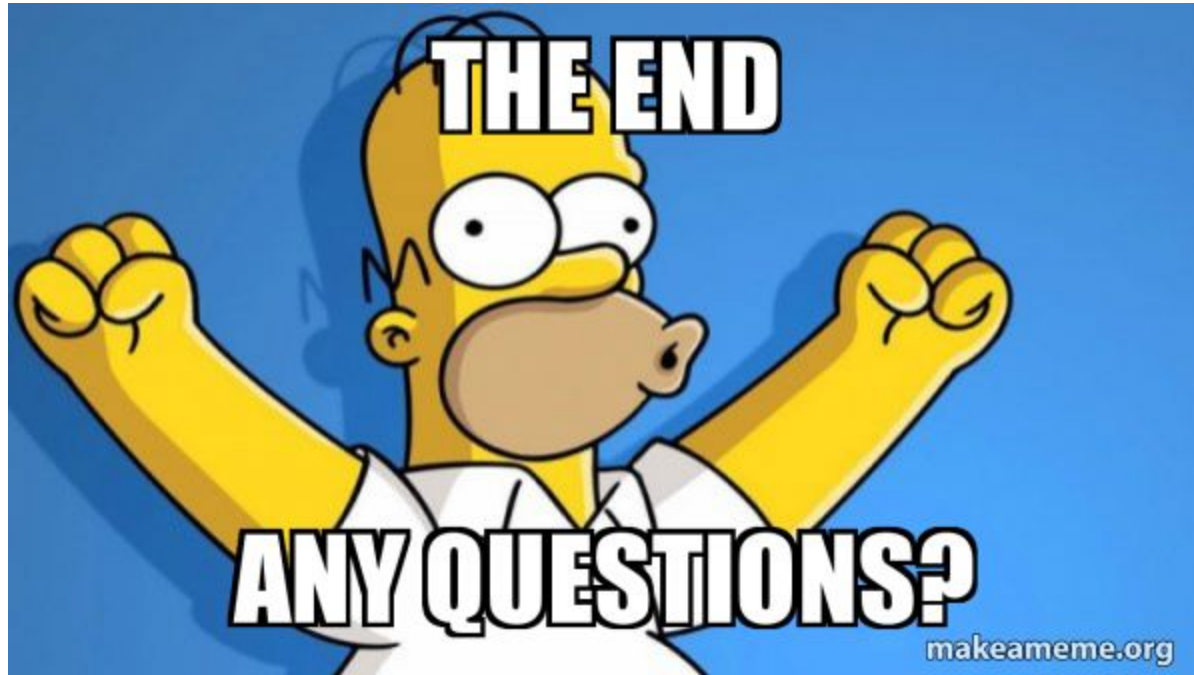
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The Premie Milk Tracker software will be launched in the spring of 2021.

[Add your name to our list](#) to keep informed of our progress

THANK YOU FOR YOUR ATTENTION!



you can reach out to me at [diogo@tellspec.com](mailto:diogo@tellspec.com)  
... or at a local craft brewery