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Cross-over fermentations and their potential in product development

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This chapter consists of two case studies.

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Abstract

Cross-over fermentations are processes in which a microorganism from one traditional fermentation process is introduced onto a new substrate and/or to a new microbial partner. When designed correctly, these novel combinations can result in fermented food products with enhanced product characteristics, such as enhanced nutritional value or aroma/flavor development. Here, we discuss two examples of cross-over fermentations and show the benefits of applying this new concept in novel product development. The first example covers the production of lupin quark using two lactic acid bacteria and in situ biofortification of this lupin quark by fermentation of Propionibacterium freudenreichii. P. freudenreichii was able to ferment lupin milk in mono and in co-cultures, whilst producing $\sim 3 \mu g$ of B_{12} per 100 gram of product. The second example covers the development of a novel food product called dairy miso, produced by fermenting quark with Aspergillus oryzae, resulting in a food product rich in aroma. These examples show the power of cross-over fermentations in novel product development or enhancement of product characteristics. The enormous diversity of microorganisms used in traditional fermentation processes and the vast number of alternative substrates offer numerous opportunities for the development of novel fermented products.

Introduction

Many classical food products in the world, like bread, cheese, wine, yoghurt, olives, vinegar, beer, tea, tempeh, soy sauce and many more are fermented [2]. Fermentation is ubiquitously present in all cultures, which all use their own raw materials and microbiological workhorses to convert it to the often so-typical products belonging to that culture. The periodic table of fermented foods by Gaenzle [3] nicely shows this large variety of food fermentations carried out across the globe. Although food fermentations have been around for centuries, the role of microbial life in fermentation was not known until the discovery of fermentation by Louis Pasteur [4]. Research regarding fermentations led to the isolation of dominant species of bacteria and yeasts present in these fermentations and ultimately to the use of single strain or mixed-culture defined starter cultures to start the fermentation process. The use of defined starter cultures led to better product quality control and higher product consistency [5]. However, a clear drawback of using single strain defined starters is the loss of microbial diversity in fermented foods and restriction of production of (beneficial) end-products limited to the metabolic repertoire of the used starter. Potentially, the industrialisation of artisanal fermentation processes thus decreases food functionality. This is exemplified by the fact that vitamin B_{12} presence in tempeh can be attributed to the presence of a (harmful) contaminant microbe and is thus not associated with the starter mold [6]. The use of good-manufacturing practices and starter cultures thus improves food safety, but potentially decreases food functionality. This hurdle could be overcome by replacing the contaminant bacteria with a safe alternative that also produces the beneficial compound, such as microorganisms with historical evidence of safe usage, the so-called GRAS (generally recognised as safe) status. Valuable sources of beneficial microorganisms might be other, distinctly different, fermented food products. The introduction of a microorganism from a traditional fermentation process to novel substrates and/or to a new fermentation partner is what we coined "cross-over fermentations" [1]. Considering the large metabolic diversity found in artisanal fermented foods, there

is a large potential for novel fermented food product development and fermented food product enhancements that needs to be explored.

In this chapter we aim to show the potential of cross-over fermentations by showing two examples of such fermentations. In the first example, cross-over fermentation is used to nutritionally enhance a previously in-house designed plant-based fermented food [7]. *Propionibacterium freudenreichii*, normally used in Swiss-type cheese fermentations, is applied to a plant-based product to enhance the B₁₂ content. In the second example cross-over fermentation is used to develop a novel food product with interesting organoleptic properties. *Aspergillus oryzae* is used on a dairy substrate to create a novel fermented dairy product with rich aromatic properties. A discussion on the benefits and drawbacks of the utilization of single-strain or multi-strain defined starter cultures is given to put the potential of cross-over fermentations into perspective.

Enhancing nutritional quality of fermented foods by cross-over fermentation: The lupin quark case study

Due to increasing world population numbers, consequent increased use of agricultural land and natural resources and increased carbon emissions the need for more sustainable dietary patterns is emerging. A large contributor to global greenhouse gas emissions is meat production [8]. Reducing global meat production thus could contribute significantly to reducing global greenhouse gas emissions. However, plant-based foods and dietary patterns are associated with a reduced uptake of several important micro nutrients, such as vitamin B_{12} [9]. One way to combat this, is to fortify plant-based foods by fermentation with producers of beneficial compounds. Vitamin B_{12} is produced de novo by prokaryotes, such as Propionibacterium freudenreichii [10]. Below we show an example of the development of a B_{12} fortified plant-based quark, made with lupin beans. A combination of Lactococcus cremoris and Lactobacillus plantarum was used to produce the initial lupin quark product, as

designed previously in our laboratory [7]. Here we assayed whether P. freudenreichii could be used to fortify this product with vitamin B_{12} . Important parameters such as acidification, metabolite production, population dynamics and vitamin B_{12} content were monitored.

Mono and co-cultures of *P. freudenreichii* are able to ferment lupin milk into quark

Lupin milk was inoculated with mono or co-cultures of P. freudenreichii, L. cremoris and Lb. plantarum, respectively and pH was monitored for a period of 4 days (see Figure 1.1). All bacteria were able to acidify lupin milk. Amongst the mono-cultures, Lb. plantarum showed fastest acidification (pH 4.7 ± 0.03 after 24h) which remained stable until the end of the fermentation. Both P. freudenreichii and L. cremoris showed slower acidification after 24h (pH 5.9 ± 0.06 and 5.8 ± 0.04 respectively) and had higher pH at day 4 (pH 5.2 ± 0.3 and pH 5.1 ± 0.1 respectively). Coculture of L. cremoris and Lb. plantarum showed similar trends as mono-culture of Lb. plantarum reaching similar final pH (4.6 ± 0.05) . Interestingly, all co-cultures containing P. freudenreichii reached a final pH between 5.1 and 5.4, which was significantly higher compared to mono-cultures of lupin milk fermented with Lb. plantarum and co-cultures containing Lb. plantarum (Tukey HSD, p<0.05). This is likely due to consumption of lactate and release of less acidic organic acids acetate and propionate into the lupin milk. Lactate has a pKa value of 3.86, propionate and acetate have a pKa value of 4.75 and 4.76 respectively, meaning lactate is 10x more acidic than propionate and acetate and consumption of lactate and full conversion of propionate to acetate would increase pH by 1 point respectively (disregarding potential differences in release of other components affecting pH such as NH₃). The slower acidification rate and higher final pH obtained with P. freudenreichii may have implications for product stability and safety.

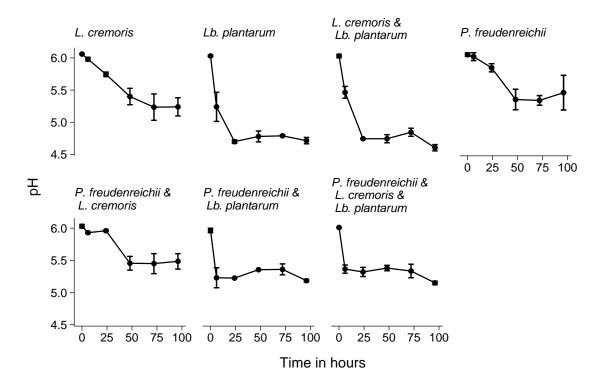


Figure 1.1: Acidification profiles of lupin quark.

Carbohydrate consumption and organic acid profiles of lupin quark

We measured the initial content of several carbohydrates in lupin milk; galactose (1.7 mM), glucose (0.7 mM), fructose (0.3 mM), sucrose (2.1 mM) and raffinose (0.4 mM) were quantified. These carbohydrates may act as primary carbon sources for *L. cremoris*, *Lb. plantarum* and *P. freudenreichii*. *L. lactis* is able to utilize fructose, galactose, glucose and sucrose, but is not able to utilize raffinose [7]. *Lb. plantarum* is able to utilize fructose, galactose, glucose, raffinose and sucrose [7]. *P. freudenreichii* is able to utilize fructose, galactose and glucose [11], but is not able to utilize sucrose and raffinose [12]. Our results support these claims, as we found all three bacteria to consume fructose, galactose and glucose, whilst raffinose utilization was not apparent for any of the bacteria (data not shown) and sucrose only for the LAB. Hence, competition between these carbon sources in co-cultures is conceivable (discussed below).

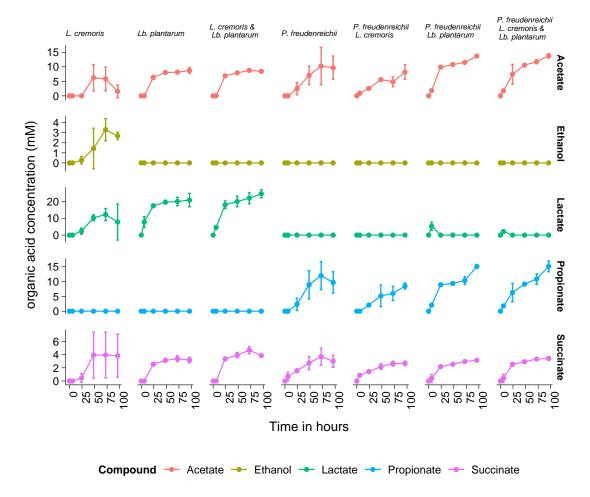


Figure 1.2: Organic acids and ethanol formation in lupin quark.

Fermentation of fermentable carbon sources in lupin milk resulted in the production of organic acids and ethanol (see Figure 1.2). All species produced acetate and succinate in mono-culture. Both *L. cremoris* and *Lb. plantarum* produced lactate in mono-culture, whereas ethanol was only produced by *L. cremoris* and propionate by *P. freudenreichii* in mono-culture. Interestingly, when *L. cremoris* was growing in co-cultures ethanol could not be detected anymore. Furthermore, when assuming cumulative production of lactate and acetate by *L. cremoris* and *Lb. plantarum* in co-culture, higher end-values of these compounds are expected based on the production of these compounds in mono-culture. This indicates there is competition between *Lb. plantarum* and *L. cremoris* for the same carbon sources. Interestingly, in co-cultures containing *P. freudenreichii* lactate was hardly detected, indicating *P. freudenreichii* lactate consumption rate could keep up with the lactate

production rate of both Lb. plantarum and L. cremoris, except for the initial hours of incubation where minimal lactate presence is detected when Lb. plantarum is present in the co-culture. Mono-cultures of Lb. plantarum reached around 21 mM lactate after 4 days. Assuming a similar amount of lactate was produced in co-cultures with P. freudenreichii, one would expect to find ~14 mM propionate and 7 mM acetate production by P. freudenreichii assuming a 2:1 propionate:acetate ratio in anaerobic conditions from complete lactate consumption. We found a production of ~ 15 mM propionate and 13.7 mM acetate. When assuming Lb. plantarum produced similar amounts of acetate in co-culture (8.7 mM), a total formation of 7 mM acetate by P. freudenreichii is found. These values nicely match with expected propionate: acetate ratio of 2:1 and expected total formation based on the lactate produced by Lb. plantarum. A similar trend for the co-culture with all three species is observed, although part of the expected formed lactate (~4 mM) cannot be accounted for. In co-cultures of P. freudenreichii and L. cremoris more propionate and acetate is formed than can be accounted for based on mono-cultures of L. cremoris and no ethanol formation is observed by L. cremoris, indicating at least partial competition for substrates between P. freudenreichii and L. cremoris. All in all these results do not indicate any negative effect of P. freudenreichii on metabolite production by Lb. plantarum and hence it is unlikely P. freudenreichii competes for carbon sources with Lb. plantarum. For interactions with L. cremoris at least some indication for substrate competition exists. This could be due to slower and less lactate release by L. cremoris compared to Lb. plantarum, making P. freudenreichii compete for sugars instead of relying mainly on lactate present in its environment (discussed below). It is plausible that, although being able to grow on and metabolize present sugars in lupin milk, P. freudenreichii prefers lactate whenever it is present and does not compete with the lactate-producer in its microbial consortium when there is sufficient supply of lactate. This hypothesis is supported by the fact that indeed a preference of lactate over glucose is reported for *P. freudenreichii* when both carbon sources are present [13].

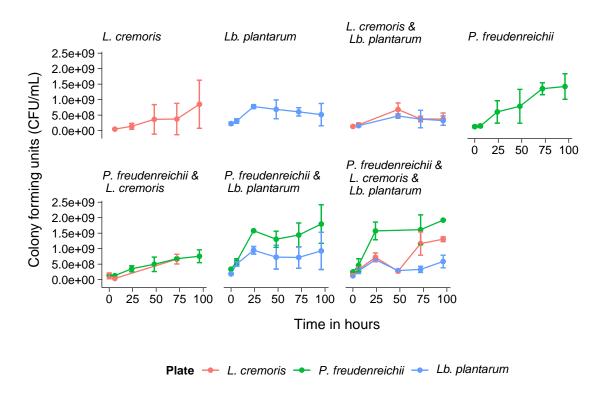


Figure 1.3: Bacterial growth during lupin quark production

Bacterial growth during lupin quark production

Lupin milk was found to support growth of all three bacteria in mono-culture (see Figure 1.3). P. freudenreichii was able to ferment lupin milk by itself reaching cell densities of $1.4*10^9$ cfu/mL, which was higher compared to L. cremoris $(8.5*10^8$ cfu/mL) and Lb. plantarum $(5.2*10^8$ cfu/mL). In co-cultures, both LAB seem to compete with each other as after 24h in co-culture with L. cremoris, Lb. plantarum cell numbers dropped below detection limit used in our study (10^6) only to recover later and L. cremoris cell numbers also decline to $3.7*10^8$ cfu/mL. Similarly, in combination with P. freudenreichii, L. cremoris was not detected at various time points indicating reduced growth. Interestingly, also P. freudenreichii cell numbers declined to $7.5*10^8$ cfu/mL.

The effects observed in co-culture between L. cremoris and P. freudenreichii or Lb. plantarum are not evident in co-culture with all three bacteria. Therefore the most plausible explanation for the drop in cell numbers of P. freudenreichii

when grown solely together with L. cremoris seems to be competition for substrates, as L. cremoris is able to utilize the same carbon sources as P. freudenreichii, but releases less and more slowly lactate to the lupin milk compared to Lb. plantarum, in which co-cultures reduced P. freudenreichii growth is not observed. This reduced release of lactate may trigger P. freudenreichii to compete for carbon sources, as lactate release by L. cremoris may be below P. freudenreichii requirements. This hypothesis would be supported by the fact that at 6 hours no lactate can be detected in co-cultures of P. freudenreichii and L. cremoris, whereas in cocultures with Lb. plantarum a minimum lactate presence is detected (see Figure 1.2). The release of lactate by Lb. plantarum seems to increase growth rate of P. freudenreichii compared to mono-cultures of P. freudenreichii, as higher cell numbers are found after 1 day. Growth of Lb. plantarum was not affected in coculture with P. freudenreichii, indicating indeed P. freudenreichii did not compete for carbon sources with Lb. plantarum. In general, P. freudenreichii is applicable in co-cultures with Lb. plantarum, whereas the combination with L. cremoris in our study is less promising. It would be interesting to see if similar growth behavior of P. freudenreichii and L. cremoris occurs when a small amount of lactate is added (~10 mM) at the initial stages of fermentation, thereby elucidating whether our observations are a result of substrate competition between the two microbes.

Amino acid profiles of lupin quark

Amino acid content was determined during lupin quark fermentation for 18 amino acids. Notably, initial contents and amino acid profile developments were variable between samples, showing biological variability between different batches of lupin beans processed into milk and as a result differences during lupin milk fermentation. For each mono-culture it was determined whether amino acids were present in higher or lower amounts after 96 hours compared to 0 hours. It must be noted higher amino acids amounts can occur either due to liberation from peptides or proteins, whilst de novo synthesis and export can also not be excluded. Due to the high variability, as rule of thumb for potential amino acid consumption or

Table 1.1: Amino acid release or consumption per species. (+)-sign indicates >20 percent release, (+/-)-sign indicates <=20 percent difference from starting concentrations, (-)-sign indicates >20 percent consumed during fermentation.

	LL	TMW	PF
Alanine	(+)	(+)	(+)
Aspartic acid	(+)	(+)	(-)
Glutamic acid	(+)	(+)	(+)
Glutamine Arginine	(-)	(+/-)	(-)
Glycine	(+)	(+)	(+/-)
Histidine	(+)	(+)	(-)
Isoleucine	(+)	(+)	(+)
Leucine	(+)	(+)	(+)
Lysine	(+/-)	(+)	(+)
Methionine	(+)	(-)	(+)
NH3	(+)	(+)	(+)
Phenylalanine	(+)	(+)	(+)
Proline	(+)	(+)	(+)
Serine	(-)	(-)	(-)
Threonine	(+/-)	(+/-)	(+/-)
Tryptophan	(+)	(+/-)	(+)
Tyrosine	(+)	(+)	(+)
Valine	(+)	(+/-)	(+)

release a 20% deviation from the initial start point value was taken (see Table 1.1). Out of 18 amino acids analyzed, 7 amino acids were released by all three bacteria during the fermentation (glutamate, alanine, proline, tyrosine, isoleucine, leucine and phenylalanine), see Appendix Figures 1.14, 1.15, 1.16. Furthermore all mono-culture samples contained higher amounts of NH₃ at 96 hours, indicating ammonia release from amino acid catabolism by all species [14].

For all three species significant release of free amino acids was observed (Figure 1.4), indicating some form of proteolytic or peptidase activity. Serine was found to be the sole amino acid consumed by all species and was depleted completely by all species at t=96 hours. Serine can be deaminated to pyruvate and can act as significant contributor to total fermentation end-products in *L. lactis* [15, 16] and *Lb. plantarum* [17] and likely is utilized as source of carbon by *P. freudenreichii* [18] as well. As reported previously, aspartate was consumed by *P. freudenreichii* and likely converted to fumarate by aspartate:ammonia lyase [19] to act as additional electron

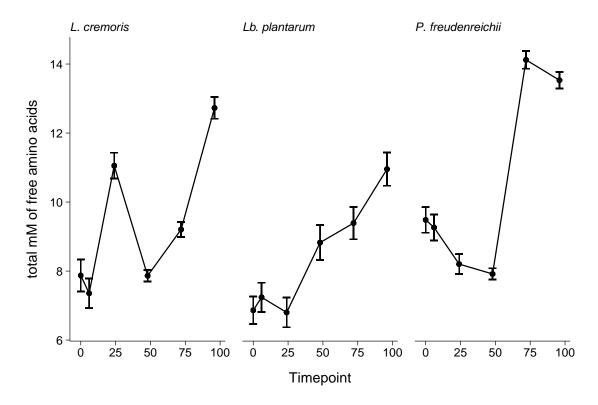


Figure 1.4: Total free amino acid content during lupin quark production by fermentation of *L. cremoris*, *Lb. plantarum* and *P. freudenreichii*

acceptor [20]. Next to aspartate and serine, also consumption of glutamine/arginine was observed for *P. freudenreichii*, in line with earlier reports [21–23]. *L. cremoris* was found to have similar or higher contents of free amino acids for 16 out of 18 amino acids. Next to serine, also utilization of glutamine was observed. Glutamine acts as one of the most important media constituents for high biomass yields and is essential for growth in environments with low amino acid contents [16]. Glutamine act as nitrogen donor in *L. lactis* and can be converted to glutamate and proline [24].

To evaluate whether specific bacteria could be correlated with specific amino acid abundances in co-cultures, a heatmap was constructed based on relative abundance (Z-scores, see materials and methods section). Mono-cultures of L cremoris were associated with the highest relative abundance of 16 out of 18 amino acids. Only glutamine/arginine and lysine abundance was found below average amongst samples. Arginine and lysine are major constituents of L lactis cell walls [25] and hence required for growth. Low abundance of alanine, aspartic acid, glycine and

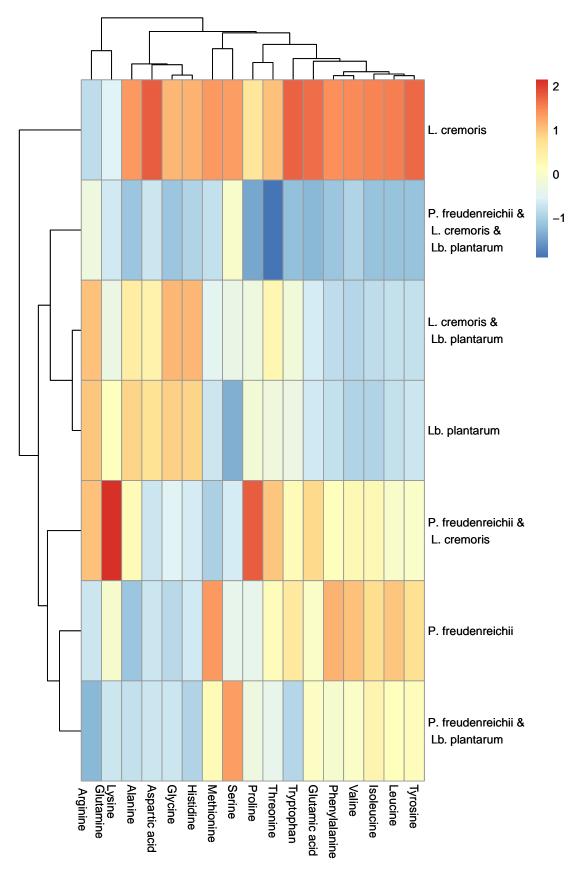


Figure 1.5: Relative abundance of amino acid contents in lupin quark after 96 hours. Negative values (blue) indicate relative low abundance, Positive values (red) indicate relative high abundance.

histidine were associated with fermentations containing *P. freudenreichii*. Likewise, fermentations containing *Lb. plantarum* were associated with low abundance of proline, threonine, trpytophan, glutamic acid, phenylalanine, valine, isoleucine, leucine and tyrosine. *Lb. plantarum* WCFS1 lacks biosynthethic pathways for valine, leucine and isoleucine [26] and hence require these amino acids from their environment. Furthermore, for other *Lb. plantarum* strains glutamic acid and threonine were also found to be esssential and phenylalanine and tryptophan stimulatory for growth [27]. Bacterial requirements for specific amino acids is thus reflected in the final free amino acid content of lupin quark. The increased content of most amino acids indicates there is no bacterial growth limitation in lupin quark due to amino acid limitations.

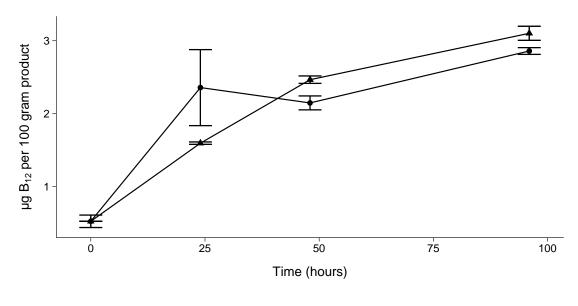
Vitamin B_{12} production in lupin quark

Fermented lupin milk was assayed for the presence of active vitamin B_{12} by reversed phase High performance liquid chromatography (RP-HPLC). After 4 days of fermentation samples containing P. freudenreichii in mono-culture contained $2.9\pm~0.05~\mu g~B_{12}$, P. freudenreichii and Lb. plantarum $3.1\pm~0.1~\mu g~B_{12}$ and P. freudenreichii, Lb. plantarum and L. cremoris $2.8\pm~0.04~\mu g~B_{12}$ per 100 gram of fermented product (see Table 1.2).

Interestingly, production of B_{12} was thus highest in the co-culture of P. freuden-reichii and Lb. plantarum compared to the mono-culture of P. freudenreichii or co-culture containing all three bacteria (p<0.05, tukey HSD), albeit at minimum differences. The production of B_{12} after 4 days per 100 gram product in all

Table 1.2: Lupin quark B_{12} contents at 96 hours.

Sample	B_{12} content (μ g/100 gram product)
P. freudenreichii	2.9 ± 0.05
P. freudenreichii, Lb. plantarum	3.1 ± 0.10
P. freudenreichii, Lb. plantarum, L. cremoris	2.8 ± 0.04
L. cremoris	0.0 ± 0.00
Lb. plantarum, L. cremoris	0.0 ± 0.04
Lb. plantarum	0.0 ± 0.00



Sample • P. freudenreichii A P. freudenreichii & Lb. plantarum

Figure 1.6: B_{12} formation in time in lupin quark produced by P. freudenreichii or P. freudenreichii and Lb. plantarum

samples more than meets the daily suggested intake of 2.4 μ g per day. To monitor production speed, additional B₁₂ measurements of lupin milk fermented with solely P. freudenreichii and with P. freudenreichii and Lb. plantarum were taken at 24 and 48h (see Figure 1.6). After 24h samples containing only P. freudenreichii contained $2.4\pm0.5~\mu$ g B₁₂ per 100 g and samples containing P. freudenreichii and Lb. plantarum contained $1.6\pm0.2~\mu$ g B₁₂ per 100 g. Considerable amounts of B₁₂ are thus produced on lupin milk within a day. The obtained yield on lupin is in the same range as found by Wolkers–Rooijackers, Endika, and Smid [28], who observed a yield of 0.97 μ g B₁₂ per 100 g lupin tempeh produced with P. freudenreichii. Lupin, other legumes and cereals allow for significant in situ B₁₂ production by P. freudenreichii [29]. P. freudenreichii is therefore a promising candidate for in situ B₁₂ enrichment of plant-based foods.

Conclusion lupin quark

In general, *P. freudenreichii* was able to ferment lupin milk in mono or in coculture. The presence of *P. freudenreichii* affects organic acids profiles, as not lactate but propionate and higher amounts of acetate can be found. Results indicate P. freudenreichii only competes for sugar carbon sources when there is no sufficient release of lactate by consortium members. The final product had a higher pH, probably due to consumption of lactate by P. freudenreichii. Amino acid data indicates free amino acid contents increase during fermentation and hence do not pose as growth-limiting factor for any of the bacteria. All obtained products fermented with P. freudenreichii contained vitamin B_{12} in high amounts, surpassing the daily suggested intake by consumption of 100 grams of fermented product already. P. freudenreichii thus has proven to be an interesting microbe for in situ B_{12} fortification of fermented food products, exemplified by our lupin milk fermentation.

Enhancing product characteristics of fermented foods by cross-over fermentation: The dairy miso case study

Cross-over fermentations can besides nutritional enrichment also be used for creating novel fermented food products or enhancing existing product characteristics. Below, an example by Dank et al. [1] is discussed in which miso, a traditional japanese fermented soybean paste, was combined with quark, unripened cheese commonly produced in Europe from cow's milk, to produce a novel food product called dairy miso.

Quark is made from heat-treated milk which is inoculated with starter lactic acid bacteria, usually *Lactococcus lactis* and in some cases rennet, resulting in acidification to a pH of ~4.5 and gelation. Traditionally, the whey is removed from the curd using linen cloth bags, whereas in industrial processes this is usually replaced by mechanical methods. The result of this process is a smooth creamy white product with a fresh and mildly acidic taste [30].

Miso is traditionally produced by fermenting soybeans with A. oryzae precultured on rice (called koji) in the presence of salt contents ranging from 55 to 200 g salt/kg product for up to 3 years [31]. In addition to soybeans alone, many variations in grain and bean substitutes can be used for making miso [32]. Koji

is made from cooked polished rice grains inoculated with $A.\ oryzae$ incubated at 30 to 35° C for 2-3 days whilst regularly mixing. Before the mould starts sporulation, it is inoculated on to the soybeans [33]. $A.\ oryzae$ has been used for solid-state fermentations already since 3000-2000 years ago in China and has a long history of use since 700 B.C in Japan for production of soy sauce, Japanese spirit (shochu), Japanese rice wine (sake) and miso [34]. $A.\ oryzae$ is known to secrete many hydrolytic enzymes during solid state fermentations [35], like lipases [36], proteases and amylolytic enzymes [37]. Furthermore, $A.\ oryzae$ has been shown to produce β -galactosidase [38]. These characteristics make $A.\ oryzae$ a potential candidate for fermentation of dairy substrates.

Dairy miso resembles sweet-scented blue mould cheese

Dairy miso was produced by inoculating koji (A. oryzae grown on rice) in quark in a 1:3 (weight/weight) ratio using 60 g/kg NaCl, a salt concentration used in production of red sweet miso [32]. Consequently, the aroma formation (volatile organic compounds, VOCs) over time was monitored by frequent sampling. VOC content increased drastically over time, see Figure 1.7. A total of 77 individual components were detected, in which the aroma profile was largely dominated by acids and ethyl esters thereof (file A.1, supplementary data).

The profiles of VOCs detected in the dairy miso were compared with those of commercial blue mould cheese and white mould cheese. The total amount of VOCs found in dairy miso exceeds the amount detected on blue and white mould cheeses with up to 3 times more total response (Figure 1.8). Compared to mould cheeses a relatively high amount of higher alcohols and esters was found in dairy miso, resulting in very strong sweet and floral notes and less pungent ketone smell typical for mould cheeses [39]. These sweet notes at lower salt contents are due to the production of fruity ethyl esters (i.e. ethyl pentanoate(apple), ethyl hexanoate(pineapple), ethyl heptanoate(fruit) and many others, see Figure A.1, supplementary data) derived from fatty acid metabolism and ethanol. In order to form ethyl esters in (dairy) miso, ethanol and acyl-CoA, which derive from free fatty acids, are required together with

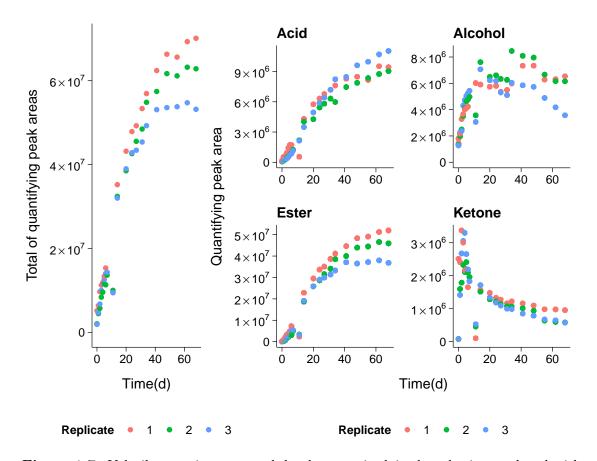


Figure 1.7: Volatile organic compound development in dairy-based miso produced with 60 g/kg NaCl and *A. oryzae*. The total volatile organic compound development is shown on the left. Each volatile organic compound was assigned to a compound type (acids, alcohols, esters and ketones) and summed. The total of each group at each time point is shown on the right. Aroma formation was followed over a course of 68 days. Biological replicates (n=3) are displayed by different colours.

alcohol O-acetyltransferase activity [40]. Thus, both ethanol (primary metabolism) and free fatty acid concentrations (lipolytic activity) may be the rate determining factors for final ethyl ester content found in dairy miso.

Traditional production practices influence final product characteristics

Salt content affects lipolytic activity of A. oryzae

In traditional miso production various sodium chloride contents are used to produce different kinds of miso flavours [32]. Addition of salt lowers the water activity (a_w) of products and correspondingly affects the fermenting microorganisms. Generally, traditional miso with a low salt content (<70 g/kg) tends to ferment

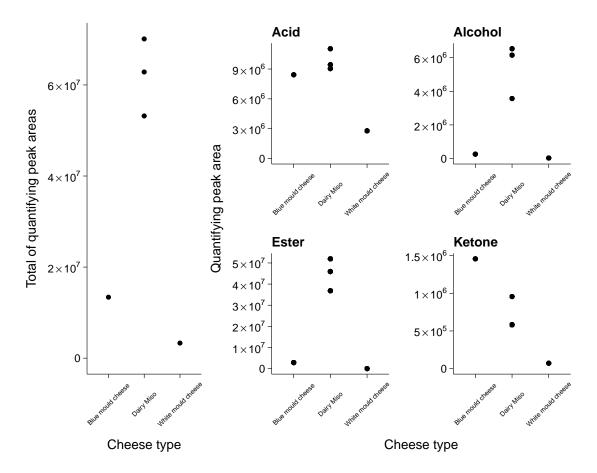


Figure 1.8: Comparison of volatile organic compound contents between a commercial blue mould cheese, white mould cheese and dairy miso of 68 days old produced with 60 g/kg NaCl and *A. oryzae*. The total volatile organic compound development is shown on the left. Each volatile organic compound was assigned to a compound type (acids, alcohols, esters and ketones) and summed. The total of each group is shown on the right.

quickly, resulting in a miso with a sweet taste, whilst miso with a higher salt content (>100 g/kg) has a more savoury taste [32].

Dairy miso produced with NaCl contents ranging from 0 to 200 g/kg show A. oryzae is not affected at large in terms of aroma production up to 80 g/kg NaCl and is able to produce significant amounts of aroma up to 200 g/kg NaCl (Figure 1.9).

However, at >100 g/kg salt significant lower aroma production rates are found compared to <80 g/kg salt containing dairy miso (Figure 1.10, file A.2, supplementary data) signifying a reduced metabolic capacity. Indeed visual observations showed more viscous samples above 100 g/kg salt containing dairy miso, indicating reduced proteolytic and/or lipolytic activity, an observation which is also made in

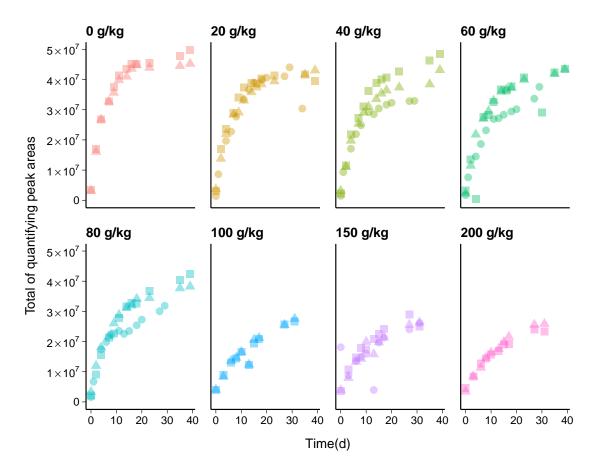


Figure 1.9: Total volatile organic compound development for dairy miso produced using NaCl contents ranging from 0 to 200 g/kg over a course of 30 days. Biological replicates (n=3) are displayed by different shapes.

blue cheese in which the addition of salt reduces proteolytic activity of *Penecillium* roqueforti [41].

Lower free fatty acids and ester contents (Figure 1.11) and production rates (file A.2, supplementary data) were found, pointing towards reduced lipolytic activity of $A.\ oryzae$. Primary metabolism of lactose was not affected at large between the different salt concentrations and the main metabolite produced remained ethanol (Figure 1.12). Primary metabolism of sugars was therefore not affected to large extends by increments of salt. Indeed, $A.\ oryzae$ has been shown to be able to grow at an a_w of 0.85 [42], whereas dairy miso with a salt content of 200 g/kg had an a_w of 0.861.

Next to ethanol also pyruvate, acetate, citrate, butyrate, glycerol, and propionate were detected (Figure 1.12). Ethanol, pyruvate and citrate production was not

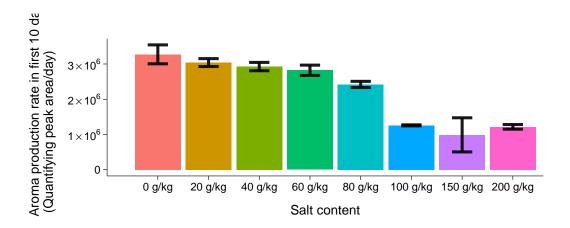


Figure 1.10: Volatile organic compound production rates for different NaCl contents estimated by fitting linear models for the first 10 days for biological replicates (0 to 80 g/kg NaCl n=3, 100,150,200 g/kg NaCl n=2). Slopes of the linear models were considered to be the aroma production rate per day.

notably affected by higher salt contents, agreeing with no noticable decline of glycolytic activity. Butyrate, a common milk fat hydrolysis product in blue cheese [41], glycerol a product of fat hydrolysis [43] and propionate (Figure 1.12, Figure A.2, supplementary data) production decreased at high salt contents. This is in agreement with the maximal lipolytic activity in blue mould cheese, which occurs between 40-60 g/kg NaCl [44]. These results clearly show fat hydrolysis slowed down by the addition of salt. It seems therefore that the main effect of salt is a decreased lipolytic activity, whereas glycolytic activity is not affected at large.

Initial fat content determines volatile organic compound composition

The dominant VOCs found in dairy miso produced with full fat quark mainly originate from fat degradation. Indeed, dairy miso produced with quark with a low fat content (0.5 g/100g) had lower ester contents compared to full fat quark (8.6 g/100g). Products of fat hydrolysis all declined drastically (Figure 1.13), clearly demonstrating the importance of milk fat hydrolysis in aroma formation of dairy miso and demonstrating the importance of soy bean oil for traditional miso. Accordingly, in blue mould cheeses lipase activity of the moulds is responsible for characteristic aroma due to liberation of free fatty acids and subsequent degradation into ketones

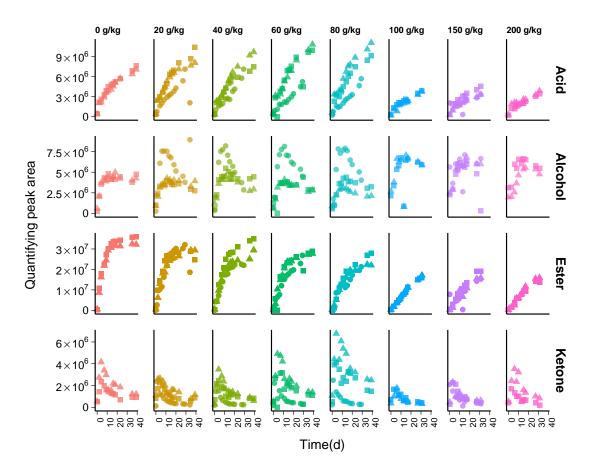


Figure 1.11: Volatile organic compound development per compound type for dairy miso produced using NaCl contents ranging from 0 to 200 g/kg over a course of 30 days. Biological replicates are displayed by different shapes (0 to 80 g/kg NaCl n=3, 100,150,200 g/kg NaCl n=2).

[39]. Notably, higher alcohol contents were found in low-fat quark compared to full-fat quark, showing alcohol formation during dairy miso production mainly originates from carbohydrate substrates present in the quark and rice, i.e. lactose and glucose.

Conclusion diary miso

In general, by using tradition process parameters like salt and fat content it is possible to steer volatile organic compound formation in dairy miso. Targeting both the fungal primary metabolism or extracellular fat hydrolysis by changing these parameters gives an opportunity to steer formation of specific compound groups, resulting in more sweet/floral or savory dairy miso. The use of *A. oryzae* for fermentation of quark resulted in a novel food product with interesting characteristics,

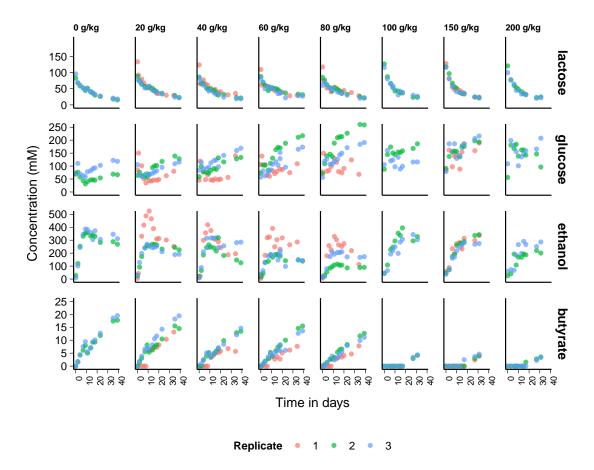


Figure 1.12: Metabolite consumption and production during dairy miso production using various NaCl contents and *A. oryzae*. Each miso was followed over a time period of at least 30 days. Biological replicates (n=3) are displayed by different colours.

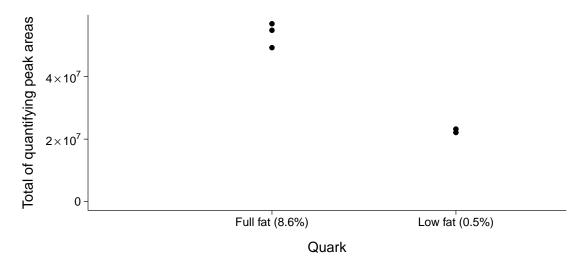


Figure 1.13: Effect of initial fat content on volatile organic compound formation of dairy miso after 28 days using 60 g/kg NaCl (n=3 for full-fat, n=2 for low-fat quark).

which exemplifies the possibilties for novel fermented food product development. Traditional process parameters can be used to affect the fermenting organism during cross-over fermentations, resulting the possibility to steer product characteristics during novel fermented food product development.

General discussion

Interesting spontaneous fermentations without addition of starter cultures are carried out all across the globe. The microorganisms in these fermentations convert raw material into fermented food products and thereby can increase shelf-life, nutritional value and organoleptic properties [45]. Manufacturer's practices such as back-slopping, temperature regimes and fermentation duration shapes microbial communities [46, 47] and re-using fermentation equipment decreases microbial diversity over time, as the fermentation will be driven more and more by the dominant species [48]. Historically speaking this has lead to isolation of these dominant species and the utilization of single-strain or multiple-strain defined starter cultures. A clear benefit of isolation of these dominant players is that they are adapted to fermentation of the raw material. Furthermore, the use of defined starters increases product consistency and safety [5]. In addition, if strains have been historically used for a long time they have evolved (are domesticated) to be better adapted to utilization of the raw material in which they are applied. Dairy L. lactis strains for instance have acquired genetic material that facilitates more efficient use of milk [49, 50]. Likewise, Saccharomyces cerevisiae can be clustered genetically based on its biotechnological application [51] and domestication of S. cerevisiae in beer brewing has lead to drastic changes in genome structure and stability [52]. Domestication leads to strains with desirable fermentation properties and to strains that have been better adapted to the raw material, leading to faster production processes. Furthermore, domestication of microbes can lead to the loss of undesirable traits, such as production of toxins [53, 54]. However, a clear drawback is that the metabolic activity displayed during fermentations using defined starters is limited to the genetic potential of the applied starter culture. Often, domesticated starters

have smaller chromosomes due to genomic decay [49, 53, 54] and therefore are less flexible for application in other raw material. Furthermore, utilization of defined starters instead of spontaneous fermentation could reduce nutritional quality of a product, such as exclusion of B_{12} producing *Klebsiella pneumoniae* or *Citrobacter freundii*, which are not associated with the starter mould, [55, 56] in tempeh.

Although often desirable and beneficial traits are displayed by defined-starters in production of conventional fermented food products, the genetic drawback may pose a limitation in novel food product development. Indeed, diversification of microbial communities in food fermentation is associated with more intense food flavor [57]. For instance, in cheese production non-starter lactic acid bacteria significantly contribute to aroma formation [58], even if they are in low abundance [59]; sourdough bread (spontaneous fermentation) has higher aromatic complexity and intensity compared to bread made with bakers yeast [60] and Chinese liquor Baijou, which is microbially very diverse, has more organoleptic complexity than whiskey which is microbially less diverse [57]. When designing novel products single strain genomic scarcity of domesticated strains thus may pose a hurdle. This is exemplified by an attempt to brew low-alcoholic 'fruity' beer. The high ethanol-forming nature of S. cerevisiae in its relation to release of 'fruity' volatile organic acids limits its application in the development of 'fruity' low-alcoholic beers (ignoring technological solutions) [61]. In contrast, application of non-domesticated non-conventional yeasts Cyberlindnera fabianii and Pichia kudriavzevii isolated from masau fruits from Zimbabwe [62] did result in fruity low-alcoholic beers [61]. The use of non-conventional yeasts genera such as Dekkera, Hanseniaspora, Pichia, Wickerhamomyces and others in beer brewing shows potential for development of novel craft beers with desirable properties such as reduced calory and alcohol contents or for bioflavoring [63]. Since in modern day era we have the scientific knowledge to construct which microbes in a microbial consortium may display the beneficial activity we may use these microbes in the design of novel fermented food products, aiming at increasing desirable organoleptic or nutritional properties. The vast microbial diversity out there in spontaneous fermentations carried out all across

the globe provides ample opportunities at identifying and applying microbes with beneficial traits in non-conventional novel food fermentations.

Conclusion

Cross-over fermentations are processes in which a microorganism from one traditional fermentation process is introduced onto a new substrate and/or to a new partner [1]. Here we show the potential of cross-over fermentations in nutritionally enriching food products or development of novel fermented foods. We demonstrated P. freudenreichii is an excellent candidate for in situ enrichment of B_{12} in food products. Its low nutritional requirements [19, 64] and preference of lactate over sugars [13] make it an excellent microorganism for inclusion in defined starter cultures. Cross-over fermentations also show a large potential in the development of novel food products, as exemplified by the dairy miso study. We showed interesting novel food products can be designed and taking into account traditional production parameters novel fermented food product characteristics can be steered. Next to enhanced nutritional quality or interesting organoleptic properties, cross-over fermentations may also be used to utilize locally grown substrates. The use of locally grown substrates instead of imported substrates, such as replacing soy with a native European bean such as lupin, can result in more sustainable food production [28] by reducing food mileages. Nutritional enrichments by fermentation with vitamin producers also enables dietary switches towards more plant-based protein sources, thereby showing great potential in applications aiding the protein transition from animal towards plant-derived protein sources which is needed to feed the world in the future [65]. The enormous diversity of microorganisms used in traditional fermentation processes and the vast number of alternative substrates offer numerous opportunities for the development of novel fermented products.

Declaration of interest

Declarations of interest: none.

Acknowledgements

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Materials and methods

Lupin quark

All Materials and methods (except for B₁₂ analysis, bacterial growth counts and amino acid data analysis, see below) for lupin quark study were identical to the methods used by Canoy [7] and are available upon request. Below a brief description of all methods is found.

Strains and pre-culture media

P. freudenreichii DSM 20271 was obtained from Deutsche Sammlung von Mikroorganismen und Zellkulturen (DSMZ) and routinely grown on Yeast extract lactate broth and agar with composition described in Dank et al. [66] in anaerobic conditions. Lb. plantarum TMW 1.460 was obtained from Lehrstuhl für Technische Mikrobiologie Weihenstephan (Technical University of Munich, Freising, Germany) and routinely grown on MRS broth and agar in microaerobic conditions. L. cremoris DSM 20388 was obtained from DSMZ and routinely grown on GM17 (Difco M17 supplemented with 0.5% w/v D-glucose) in aerobic conditions.

Lupin milk production

Lupin milk was produced by the methods described by Canoy [7] with slight modifications. Lupin bits from seeds of *Lupinus albus* were soaked overnight. The soaking water was removed and warm water was added. The mixture was ground for 5 minutes in a food processor (Waring commercial Laboratory blender) and filtered through a four-layered cotton cloth. Lupin milk was pasteurised by heating the milk to boiling point in a microwave (1800 W, 45 seconds) after which it was placed in a 95°C water bath for 60 seconds.

Lupin quark fermentation

Lupin quark was produced according to the methods of Canoy [7]. Greiner tubes were filled with 25 mL of pasteurized lupin milk and inoculated with 1 % of pre-cultures in mono-culture fermentations and in combinations with only 1 lactic acid bacteria. 0.5% inoculum was used for the lactic acid bacteria when both Lb. plantarum and L. cremoris were present. After inoculation lupin milk was vortexed and incubated at 30°C. Samples were taken at regular time intervals.

Bacterial growth quantification

Bacterial growth in lupin milk was analyzed by serial dilutions of 1 mL of lupin milk in Peptone Physiological Saline solution. Lb. plantarum was grown on MRS supplemented with either 20 mM sorbitol (in co-culture experiments with L. cremoris) or glucose and incubated in microaerophilic conditions. Lb. plantarum was grown on GM17 aerobically. P. freudenreichii was grown on YEL with composition described by Dank et al. [66] and incubated anaerobically. Lb. plantarum and L. cremoris plates were counted after 2 days, P. freudenreichii containing plates were counted after 7-10 days. Plates with counts between 10 and 500 were considered valid and cfu/mL was calculated using these counts. If 2 different dilutions were counted within this interval, the average cfu/mL of the two dilutions was used as calculated cfu/mL. Points were only displayed if both replicates at a specific time point were above detection limit (10⁶).

Analysis of extracellular organic acids and ethanol

For quantification of extracellular organic acids and ethanol the methods described by Dank et al. [66] were used. A standard curve of each component was added to the sequence to quantify each component.

Analysis of sugars

Analysis of sugars was performed according to the methods of Canoy [7].

Amino acid quantification and data analysis

Amino acid profiles were determined by HPLC according to the methods of Scott Jr et al. [67]. A heatmap was constructed using Pheatmap [68] in R-studio. Amino acid content was normalized using Z-scores [69], after which hierarchical clustering was performed amongst samples using complete-linkage clustering in Pheatmap [66].

Vitamin B_{12} quantification

Vitamin B_{12} content was determined using the following procedures: Extraction of B₁₂ was performed in 100 mL scott flasks containing 35 mL sodium acetate buffer (pH 4.5), 0.5 g Taka-diastase (from A. oryzae), 0.2 mL lysozyme (15%, from chicken egg white). Approximatly 10 g of sample was added after which the flasks were incubated in a 30°C waterbath for 30 minutes. Flasks were shaken by hand regularly in-between. After 30 minutes 0.2 mL (1%) Pepsin and 0.25 mL potassium cyanide (4%) was added and samples were placed back for 45 minutes. After 45 minutes, flasks were transferred to a 100°C waterbath for 30 minutes. After cooling to room temperature, the extract was transferred to 50 mL Greiner tubes and centrifuged at 4°C for 15 minutes. Extracts were filtered through Whatman grade 2v qualitative filter papers (pre-folded, 240 mm) and collected. Extract were then concentrated using Immunoaffinity columns (ds Easy-extract vitamin B₁₂, R-biopharm) into InertSep empty reservoirs (20mL). ~30 mL of filtrate was loaded in the reservoirs and run over the columns, after which columns were washed with 10 mL MiliQ water and flushed dry with a syringe. Next, 4 mL methanol (100%) was loaded over the column and collected in reaction tubes. Tubes were dried at 50°C on a heating block whilst flushing with nitrogen gas after which 1 mL of eluent for LC-MS (10mM ammonium formate + 1 mL formic acid per Liter) was added to the tube, mixed and vortexed. The concentrated extracted B_{12} was filtered through 0.2 μ m filters and placed in amber LC-MS vials upon analysis. B_{12} was detected by using Agilent LC-MS with 100mm*3.0mm HSS C18-3.5 μm column at a flow rate of 0.4 mL/min eluent with composition described above and injection volume of 15 μ L. An eluent gradient was used with 2 mobile phases. Phase A consisted per liter of 10 mM ammoniumformate with 0.1% formic acid in water and phase B same composition but then in methanol. At t=0 min 99% eluent A and 1% eluent B was used which changed gradually to 2% eluent A and 98% eluent B at 30 minutes. After each injection the sample was flushed using the start composition for 5 minutes. A calibration curve of vitamin B_{12} was prepared in order to be able to quantify B_{12} in each injection, after which final vitamin B_{12} contents were calculated using equation (1.1):

$$Concentration_{product}(\frac{\mu g}{100g}) = \\ Concentration_{detected}(\frac{\mu g}{ml}) * \frac{total\ extraction\ volume}{volume\ run\ over\ column} * \frac{100}{sample(g)}$$

$$(1.1)$$

Dairy miso

Materials and methods for the dairy miso case study are available at: Dank et al. [1]

Appendix A. Supplementary data

Supplementary material for Dank et al. [1] is available online at: https://doi.org/10.1016/j.lwt.2021.111041

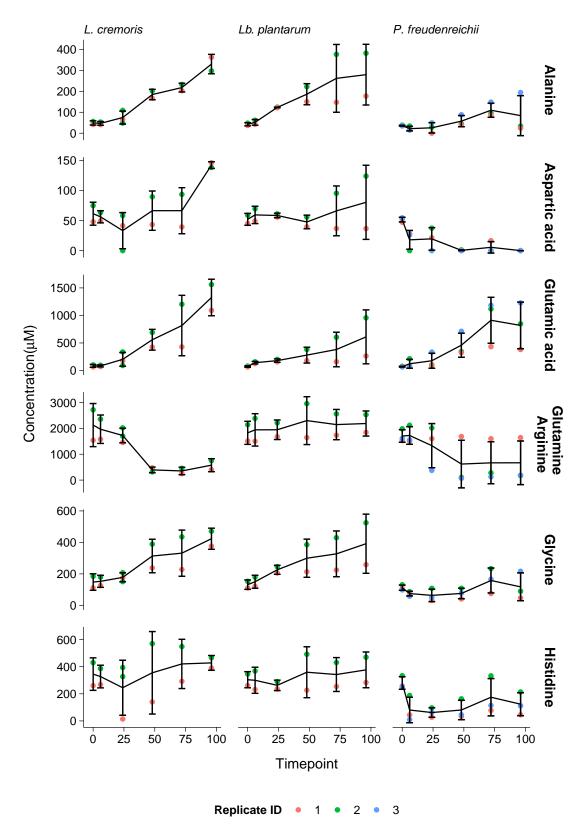


Figure 1.14: Amino acid profiles during lupin quark production

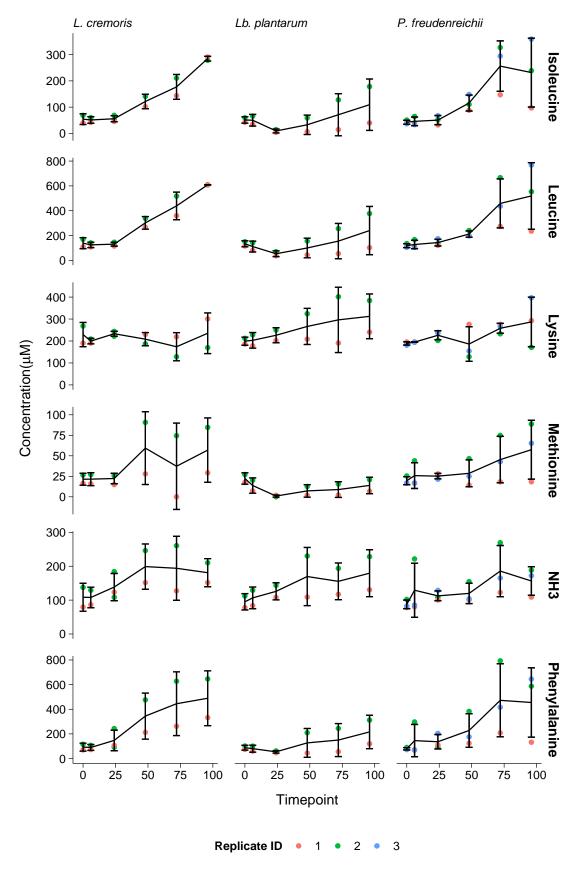


Figure 1.15: Amino acid profiles during lupin quark production

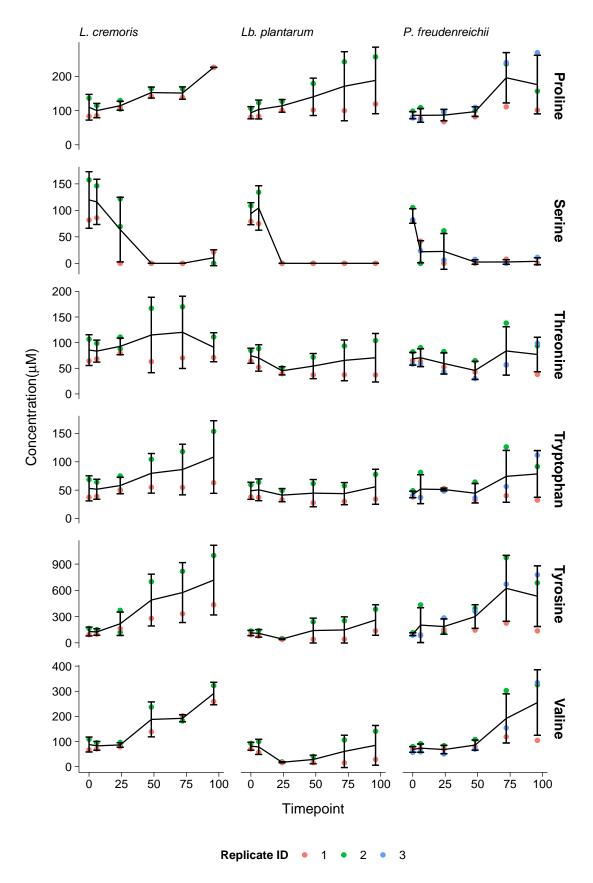


Figure 1.16: Amino acid profiles during lupin quark production

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