

1 **METABOLOMICS OF HEAT TREATED COLOSTRUM**

2  
3 **Heat treatment of bovine colostrum: Effects on colostrum metabolome**  
4 **and serum metabolome of calves**

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13  
14 **ABSTRACT**

15 Bovine colostrum is important for neonates' health due to its nutritive and non-nutritive  
16 components. Heat treatment of colostrum is a well-established management tool, but it  
17 may influence colostrum components and affect the health status of calves. In our  
18 previous studies, we had shown that colostrum proteome and serum proteome of calves  
19 was altered by heat treatment to different degrees. Our objectives in this study were to  
20 investigate the effects of heat treatment on colostrum metabolome and the effect of  
21 feeding heat treated colostrum on the serum metabolome of newborn calves. Further,  
22 the changes in serum metabolome from before to after colostrum feeding were  
23 characterized. Newborn Holstein female calves (n=10) were randomized within pairs  
24 and fed heat-treated (n=5; 60°C, 60 min) or raw (n=5) colostrum at 8.5% of birth BW  
25 by esophageal feeder within 1 h of birth. After a single colostrum feeding, calves were  
26 not fed until after the 8 h time point when milk was offered free-choice. Blood samples  
27 were taken immediately prior to feeding (0 h) and 8 h after feeding. The colostrum and  
28 serum metabolome were first analyzed using reverse-phase chromatography and  
29 tandem mass spectrometry (RPLC-MS), and serum metabolome was then further

30 analyzed using hydrophilic interaction chromatography and tandem mass spectrometry  
31 (HILIC-MS). In colostrum metabolome, 458 features were identified and 328 were  
32 annotated, and a trend of separation between raw and heated colostrum could be  
33 observed through multivariate analysis. In serum metabolome, 3360 features were  
34 identified and 1439 were annotated, but no trend of separation was observed between  
35 the two groups of calves fed raw colostrum vs. heat-treated colostrum. The serum  
36 metabolome presented substantial differences comparing before (0 h) and after  
37 colostrum feeding (8h), in particular a tripeptide,  $\beta$ -homovaline- $\beta$ -homoalanine- $\beta$ -  
38 homoleucine, and 1-(2-acetamido-2-deoxy- $\alpha$ -D-glucopyranosyl)-1D-myo-inositol had  
39 higher concentrations after colostrum feeding than before, along with other metabolites  
40 that were not fully annotated. Based on a relatively small sample size, our findings point  
41 to the effect of heat treatment on the change of colostrum metabolome, but not on the  
42 change of serum metabolome of calves fed raw colostrum vs. heat-treated colostrum.  
43 Further studies using larger sample size and complementary analytical techniques are  
44 warranted to further explore potential heat treatment induced alterations in colostrum  
45 metabolome.

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## INTRODUCTION

48 Colostrum, the first milk that neonates receive after birth, is rich in nutrients and non-  
49 nutritive biologically active factors (Hammon et al., 2013). Colostral nutrients  
50 including lactate, amino acids (especially alanine), and glycerol, and these nutrients can  
51 be used as substrates in neonates for gluconeogenesis within a short time (8 hour) after  
52 birth (Girard et al., 1992). The non-nutritive factors of the colostrum include potentially  
53 bioactive compounds, such as immunoglobulins, hormones and growth factors, which  
54 improve the growth, function, and absorptive capacity of the neonatal gastrointestinal  
55 tract (Hammon et al., 2013, Fischer et al., 2018), and can affect the serum metabolites  
56 of the bovine neonate (Zhao et al., 2018). Colostrum feeding thus not only fulfills  
57 nutritional requirements, but also improves growth and health in neonatal mammals  
58 (Blum, 2006, Guilloteau et al., 2009). Early intake of adequate amounts of high-quality

59 colostrum is critical for the health and growth of the bovine neonate (Godden et al.,  
60 2019), as a biological mechanism in early postnatal life when enhanced metabolic  
61 plasticity allows for an extended maternal care through colostrum and milk (Bartol et  
62 al., 2013). The concentrations of essential fatty acids, carotene, retinol, and  $\alpha$ -  
63 tocopherol were significantly higher in serum of calves fed colostrum on day 1 post  
64 natum compared with delayed colostrum-fed calves (Blum et al., 1997). In terms of  
65 feeding management, heat treatment of colostrum is used to decrease bacterial  
66 contamination, extend storage post-harvest, and control infectious agents that could be  
67 transmitted to the neonate (Fischer et al., 2018, Godden et al., 2019). However, heat  
68 treatment might impair the function of heat-labile bioactive compounds, such as  
69 immunoglobulins, whey proteins and enzymes, and cholesterol, as suggested for both  
70 bovine and human colostrum (Johnson et al., 2007, Sousa et al., 2014, Parrón et al.,  
71 2016).

72 Metabolomics is a high-throughput technique that can identify, quantify, and  
73 characterize hundreds to thousands of low-abundant metabolites from biological  
74 samples using targeted or global analytical approaches (Ryan and Robards, 2006).  
75 Based on blood samples of calves, metabolomics has identified the plasma biomarkers  
76 of immune response (Gray et al., 2015), and screened the absorption and transmission  
77 of colostrum components to serum within 8 to 36 h after birth (Zhao et al., 2018). Hence,  
78 a metabolomics-based overview of metabolite profiles could help us understand the  
79 effect of heat treatment on the colostrum metabolome, and the effect of feeding heat-  
80 treated colostrum on the serum metabolome of calves. Among metabolomics analyses,  
81 LC-MS has been widely used as a targeted measurement due to its high sensitivity and  
82 wide range of metabolite coverage (Kuehnbaum and Britz-McKibbin, 2013). Aiming  
83 to obtain a larger set of metabolites (non- and moderately polar compounds) in  
84 whole-body metabolome, untargeted metabolomics can be performed using reverse-  
85 phase liquid chromatography (RPLC, mainly C18-bonded silica columns) (Want et al.,  
86 2010, Dunn et al., 2011), and using hydrophilic interaction liquid chromatography  
87 (HILIC) that offers a complementary selectivity to RPLC (Ilves et al., 2012).

88 Our previous work showed that heat treatment (60°C, 60 min) altered the proteome  
89 profile of low-abundant proteins in colostrum and reduced insulin and immunoglobulin  
90 concentrations (Mann et al., 2020a). Further we showed that heat treatment also altered  
91 the serum profile of low-abundant proteins, but not immunoglobulins (IgA and IgG) in  
92 calves fed with heat-treated colostrum (Mann et al., 2020b). The effect of heat treatment  
93 on the colostrum metabolome, and the effect of heat-treated colostrum on the serum  
94 metabolome of calves have not yet been reported. We hypothesized that the colostrum  
95 metabolome can be altered by heat treatment due to the degradation of heat-labile  
96 molecules. If such changes affect biologically active colostrum components, the calves'  
97 serum metabolome can also be altered after feeding the heat-treated colostrum. Further,  
98 we hypothesized that the serum metabolome undergoes substantial changes within 8  
99 hours on day 1 after birth, due to the adaptation to postnatal life and/or due to colostrum  
100 feeding. Therefore, based on the metabolome revealed by RPLC in colostrum, and the  
101 combination of RPLC and HILIC in serum of calves at the time points of 0h and 8h  
102 after feeding, the objectives of this study were: *i*) to evaluate the effect of heat treatment  
103 on colostrum metabolome, *ii*) to evaluate the effect of heat treatment on calf serum  
104 metabolome, and *iii*) to characterize the difference in the serum metabolome between  
105 0 h and 8 h after colostrum feeding.

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## MATERIALS AND METHODS

### *Cows and Colostrum Samples*

109 All animal procedures were reviewed and approved by the Cornell University  
110 Institutional Animal Care and Use Committee (protocol no. 2018-0021). The study was  
111 performed between July and August 2018 on a commercial dairy farm in New York  
112 State after obtaining written consent from the owner. Holstein cows were housed  
113 indoors year-round in free-stalls and moved to the calving pen following a just-in-time  
114 approach.

115 Colostrum from all animals with at least 28 d of dry period length and that were  
116 clinically healthy immediately postpartum were eligible for enrollment, as described in

117 Mann et al. (2020a). In brief, colostrum of individual cows was harvested into sanitized  
118 buckets, and gently mixed with a whisk before taking an aliquot to test Brix% on a  
119 digital refractometer (Palm Abbe, Misco, Cleveland, OH). Colostrum  $\geq 22\%$  Brix and  
120  $\geq 8$  L total volume was eligible to be used in the study. Colostrum (n=5) was whisked  
121 to mix thoroughly while avoiding foam production, and then filled into 2 separate 4 L  
122 disposable bags (Perfect Udder, Dairy Tech, Inc., Windsor, CO). Raw colostrum bags  
123 were placed on ice for 30 min and then stored in a refrigerator at 4°C for up to 24 h.  
124 The paired aliquot of each colostrum batch was heat treated using a commercial  
125 pasteurizer (Dairy Tech, Inc., Windsor, CO) at approx. 60°C which lasted approx. 25  
126 min. After cooling down to approx. 43°C, the bags were removed and immediately  
127 placed on ice for 30 min to rapidly cool before storage at 4°C for up to 24 h.

### 128 *Calves and Colostrum Feeding*

129 Female Holstein calves born with a birth weight of 34.0 to 47.0 kg, absence of birth  
130 defects, and having been delivered without assistance. Calves were removed from dams  
131 within 10 min of birth and not allowed to suckle. Calves were enrolled to be fed raw  
132 (**R**; n=5) or heat-treated (**H**; n=5) colostrum following a randomized block design with  
133 2 calves per block according to the time of birth on the same day. Raw or heat-treated  
134 colostrum as prepared above was adjusted to 8.5% of the calf's birth BW (Conneely et  
135 al., 2014). None of the calves were fed their own dam's colostrum. Colostrum was  
136 administered to calves within 1 h of birth using an esophageal feeder (Dairy Tech., Inc.)  
137 according to manufacturer instructions ([www.dairytechinc.com](http://www.dairytechinc.com)) and consistent with  
138 farm protocols. Both treatments (Raw and Heated) of a single batch were administered  
139 to each pair of newborn calves on average within 2 h, and within a maximum of 4 h  
140 from each other. Bags of refrigerated raw or heat-treated colostrum were then placed in  
141 a 43°C water bath (MilkWorks, Dairy Tech., Inc.) for 20 min to warm to feeding  
142 temperature.

### 143 *Blood Sampling*

144 Blood samples were taken from the jugular vein of each calf immediately before  
145 colostrum feeding (0 h) and at 8 h after feeding. Blood was collected into evacuated 10

146 mL serum tubes (Monoject, Covidien, Dublin, Ireland) and was allowed to clot at room  
147 temperature for 10 min. Tubes were centrifuged for 20 min at 3,000 x g at 4°C within  
148 30 min after collection. Harvested serum samples were snap frozen in liquid nitrogen,  
149 stored at -20°C for < 24 h, and then stored at -80°C until analysis.

#### 150 ***Sample Preparation and Metabolomics Analysis***

151 Plasma samples (100 µL) were removed from -80°C to 4°C, and added 300 µL cold  
152 methanol (4°C) incubated for 1 h for protein precipitation. Samples were then removed  
153 from 4°C to room temperature for 20 minutes. The supernatant was collected after  
154 centrifugation at 13,000 rpm for 10 min at 4 °C and evaporated to dryness. The dry  
155 extracts were reconstituted with 100 µL 60% acetonitrile (for RPLC) or 50%  
156 acetonitrile with 0.1% formic acid (for HILIC) before analysis. Metabolomics  
157 measurements were done using reverse-phase liquid chromatography (RPLC) in  
158 colostrum and in serum, and additionally by hydrophilic interaction liquid  
159 chromatography (HILIC) in serum. Chromatographic separation was performed on a  
160 Vanquish UHPLC system with a SeQuant ZIC pHILIC column (5µm, 2.1 x 150mm)  
161 coupled to a Q Exactive™ HF Mass Spectrometer (Thermo Fisher Scientific, San Jose,  
162 CA, USA) for polar compounds, and a Vanquish UHPLC system with an Accucore  
163 Vanquish C18+ column (1.5µm, 2.1 mm id x 100mm) coupled to a Q Exactive™ HF  
164 Mass Spectrometer (Thermo Fisher Scientific, San Jose, CA, USA) for nonpolar  
165 compounds. A quality control sample was prepared by pooling equal volumes of each  
166 sample. Three internal standards, sulfadimethoxine, 13C-pyruvic, and 13C-valine (CIL,  
167 MA, USA) were added to all samples to assess MS instrument reproducibility. The  
168 measurement conditions were as follow: column temperature 45°C in RPLC and 24°C  
169 in HILIC, flow rate 320 µL/min in RPLC and 250 µL/min in HILIC, and injection  
170 volume 2 µL.

#### 171 ***Data processing and Statistical Analysis***

172 All MS/MS samples were aligned against the pooled quality control reference run, and  
173 peak picking was performed on individual aligned runs to create an aggregate data set.  
174 Following peak picking, unique spectral features (retention time and m/z pairs) were

175 grouped based on adducts and isotopes, and individual features or metabolites were  
176 normalized to all features. Compounds with 25% coefficient of variance (CV) were  
177 retained for further analysis. Principal component analysis (PCA) was applied to the  
178 data to check a general trend in an unsupervised way. Partial least squares discriminate  
179 analysis (PLS-DA) was used to maximize the fitness of variables discriminating  
180 between the two groups in a supervised way. The PLS-DA model was tested by crossed-  
181 validation and the validated model was further considered in sparse PLS-DA (sPLS-  
182 DA). Based on the high number of features in the untargeted metabolome, sPLS-DA  
183 was chosen to select the most predictive or discriminative features in the data that help  
184 classify the samples (Lê Cao et al., 2011). A paired t-test with false discovery rate (FDR)  
185 correction was used to compare treatment effects. All multivariate analyses (PCA, PLS-  
186 DA, sPLS-DA) and univariate analyses (t-test) were performed using MetaboAnalyst  
187 4.0 (Chong et al., 2019).

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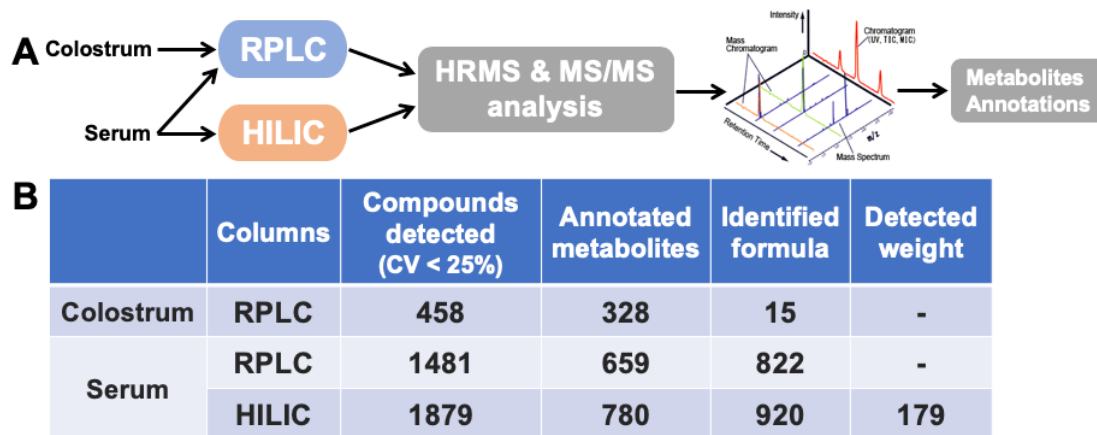
## 189 **RESULTS & DISCUSSION**

### 190 *Metabolomics workflow in colostrum and serum*

191 We used two complementary analytical methods of LC-MS: RPLC and HILIC (Figure  
192 1). The RPLC method was first used for both colostrum and serum samples. Based on  
193 the data obtained via RPLC, we observed a trend for separation in the metabolome  
194 profiles between raw and heated colostrum (Figure 2), but not between the two groups  
195 of calves fed raw colostrum vs. heated colostrum (Supplementary Figure 1). To further  
196 explore any differences in the serum metabolome profiles between the two treatment  
197 groups, the HILIC method was further applied to the serum samples.

198 In the colostrum metabolome, 458 metabolites were detected after normalization and  
199 removing the background and false positives, and 400 metabolites were annotated  
200 based on our spectral databases (Figure 1). In the serum metabolome, 1879 and 1481  
201 metabolites were detected after normalization and removing the background and false  
202 positives by RPLC and HILIC, respectively. Based on our spectral databases, 659  
203 metabolites were annotated, and 822 got a formula prediction in the RPLC data;

204 whereas 780 metabolites were annotated, 920 got a formula prediction and 179 got a  
 205 molecular weight in the HILIC data (Figure 1). Although untargeted metabolomics is  
 206 known for a relatively larger metabolite coverage, the annotation of metabolites is often  
 207 a challenging process (Cui et al., 2018). Therefore, it was expected that numerous  
 208 compounds could not be annotated, or could only be identified with a formula or weight.



209

210 **Figure 1.** Workflow of untargeted metabolomics data analysis of colostrum samples  
 211 and serum samples of calves (A), and global output of detected compounds, annotated  
 212 metabolites, identified formula and weight from RPLC and HILIC methods (B).

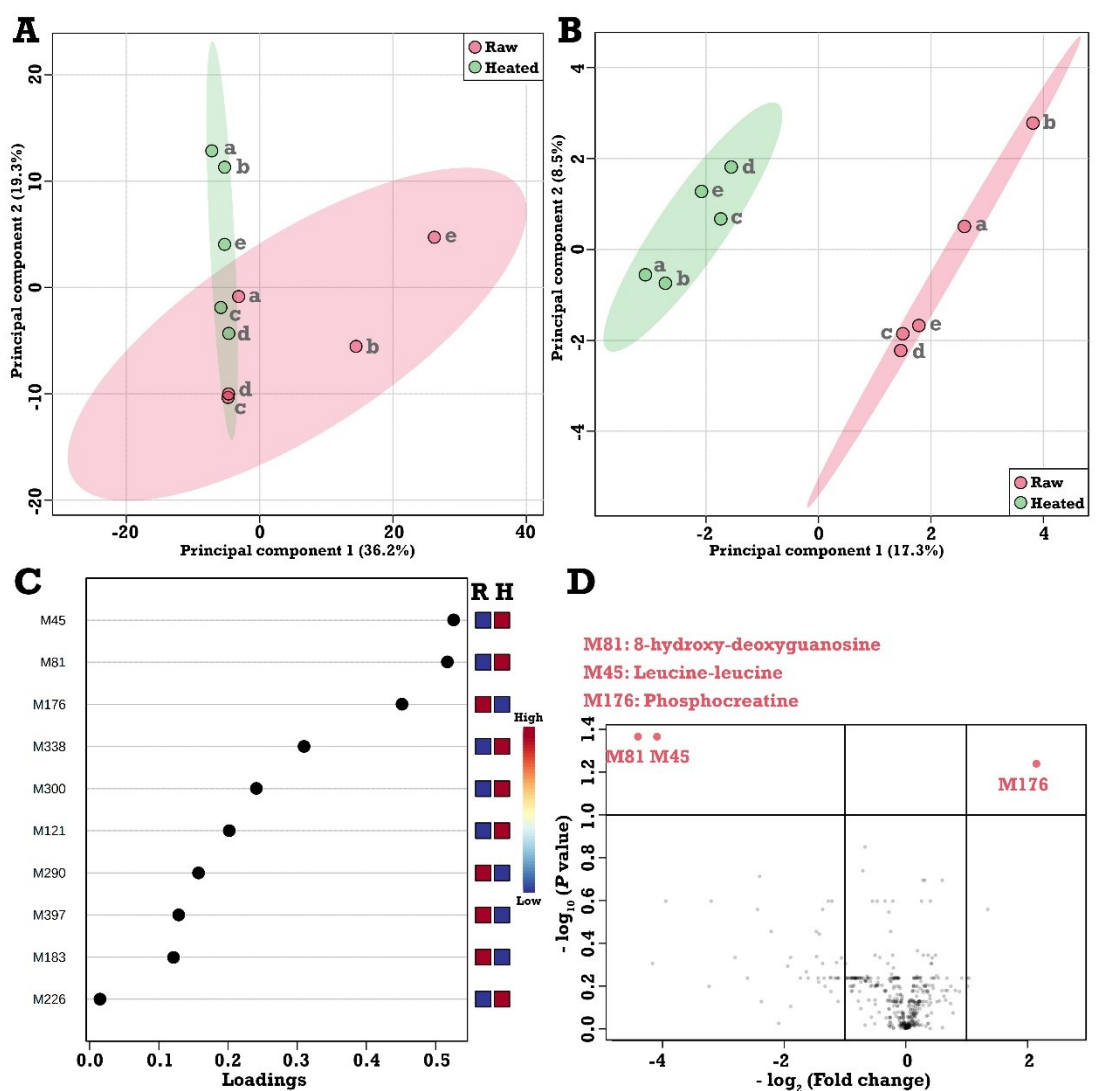
213

### 214 *Effect of Heat Treatment on Metabolome Profiles in Colostrum*

215 We observed a trend of separation in the metabolome profiles between raw and heated  
 216 colostrum by PCA (Figure 2-A) and by sPLS-DA (Figure 2-B). Three metabolites, 8-  
 217 hydroxy-deoxyguanosine, leucine-leucine, and phosphocreatine, were found to have a  
 218 relatively high variable importance in projection (VIP) score in the sPLS-DA (Figure  
 219 1-C), as well as a  $P$ -value < 0.10 (FDR adjusted) in the t-test (Figure 2-D). Both 8-  
 220 hydroxy-deoxyguanosine and leucine-leucine had a higher concentration in the heated  
 221 colostrum, compared with the raw colostrum, while phosphocreatine had a higher  
 222 concentration in the raw colostrum, compared with the heated colostrum. The most  
 223 likely explanation for the altered metabolite concentrations is that the direct or indirect  
 224 degradation of heat-labile molecules due to the heat treatment. As shown in our previous  
 225 study, heat treatment resulted in the reduction of total bacterial count (Mann et al.,



226 2020a), which could affect the concentration of colostrum metabolites due to the  
 227 different metabolic activity of an altered colostrum microbial community. Further, heat  
 228 treatment could also affect the structure of high-molecular-weight metabolites, for  
 229 example, it was suggested that the heat-induced cleavage of colostrum  
 230 oligosaccharides from colostrum lipids or proteins could increase the concentration of  
 231 free oligosaccharides in the colostrum (Fischer et al., 2018). There is a limited number  
 232 of studies that can provide plausible explanation for the concentration change of these  
 233 3 metabolites in particular, however, it could be expected that even more metabolites,  
 234 rather than only 3, could be altered by heat treatment in a study with a larger sample  
 235 size.



236

237 **Figure 2.** Effect of heat treatment on colostrum metabolome in pincipal component

238 analysis (PCA) (A), and sparse partial least square discriminant analysis (sPLS-DA)  
239 (B). Top 10 metabolites with the highest variables in prejection (VIP) scores of sPLS-  
240 DA were listed (C), and the volcano plot shows the significantly different metabolites  
241 between treatments (D).

242 In (A) and (B), the same superscripts above score symbols (a-e) indicate colostrum pairs  
243 of different treatments (raw vs. heated).

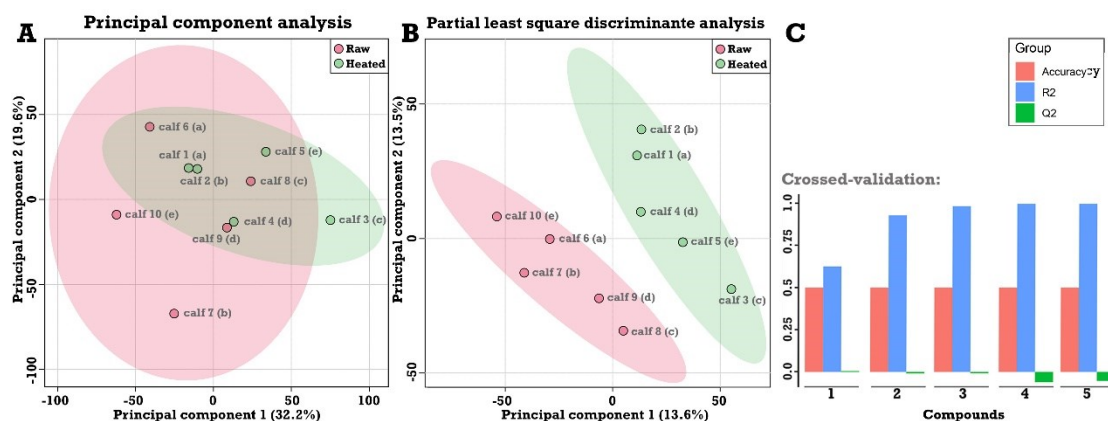
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#### 245 *Effect of Feeding Heat-Treated Colostrum on Serum Metabolome Profiles of Calves*

246 To account for the time series data of the serum metabolome analysis, data of 0 h (before  
247 colostrum feeding) were used as a baseline, and the ratios of 8 h relative to 0 h were  
248 used to compare the time-course of metabolome changes. We first evaluated the serum  
249 metabolome data obtained by RPLC only, to be consistent with the colostrum data  
250 analysis approach. As shown in the Supplementary Figure 1, using the RPLC data only,  
251 no separation of the serum metabolome was observed in the PCA scores plot. Further,  
252 the PLS-DA model had a poor performance, reflected by its low accuracy (<0.5 with 1  
253 to 5 components) and its negative Q2 revealed by crossed validation, which means that  
254 the model was not predictive or it was overfitted (Szymańska et al., 2012). To further  
255 explore any potential separation of the serum metabolome between the two treatment  
256 groups, the additional metabolome data set obtained by HILIC were added to the  
257 analysis. Based on this combined data, we were still not able to observe a clear  
258 separation of serum metabolome between the calves fed raw colostrum vs. heat-treated  
259 colostrum using PCA (Figure 3-A) and PLS-DA (Figure 3-B). The poor performance  
260 of the PLS-DA model (Figure 3-C) suggested that the effect of feeding heated colostrum  
261 on the serum metabolome was non-significant or below the detectable limit with the  
262 current sample size (n=5).

263 As shown in our previous paper, the calves fed heated colostrum had increased plasma  
264 insulin concentrations and an altered serum protein and enzyme profile that could be  
265 associated with carbohydrate metabolism, with no differences in circulating glucose  
266 concentrations at the same time points (Mann et al., 2020b). However, the observed

267 alterations in the metabolome profiles between the raw and heated colostrum did not  
 268 translate into any recognizable difference in the serum metabolome of calves. This was  
 269 consistent with our previous proteomics findings in a sense that fewer serum proteins  
 270 differed in abundance between the two groups of calves fed raw colostrum vs. heat-  
 271 treated colostrum, compared with the number of colostrum proteins that differed in  
 272 abundance between treatments (Mann et al., 2020b).



273  
 274 **Figure 3.** Based on the combined RPLC and HILIC data, possible differences of serum  
 275 metabolome (ratio of 8 h to 0 h) of calves fed raw or heated colostrum were presented  
 276 in pincipal component analysis (PCA) (A), and partial least square discriminant  
 277 analysis (PLS-DA) (B). Quality control of the PLS-DA model was tested by cross-  
 278 validation with 5 components (C).

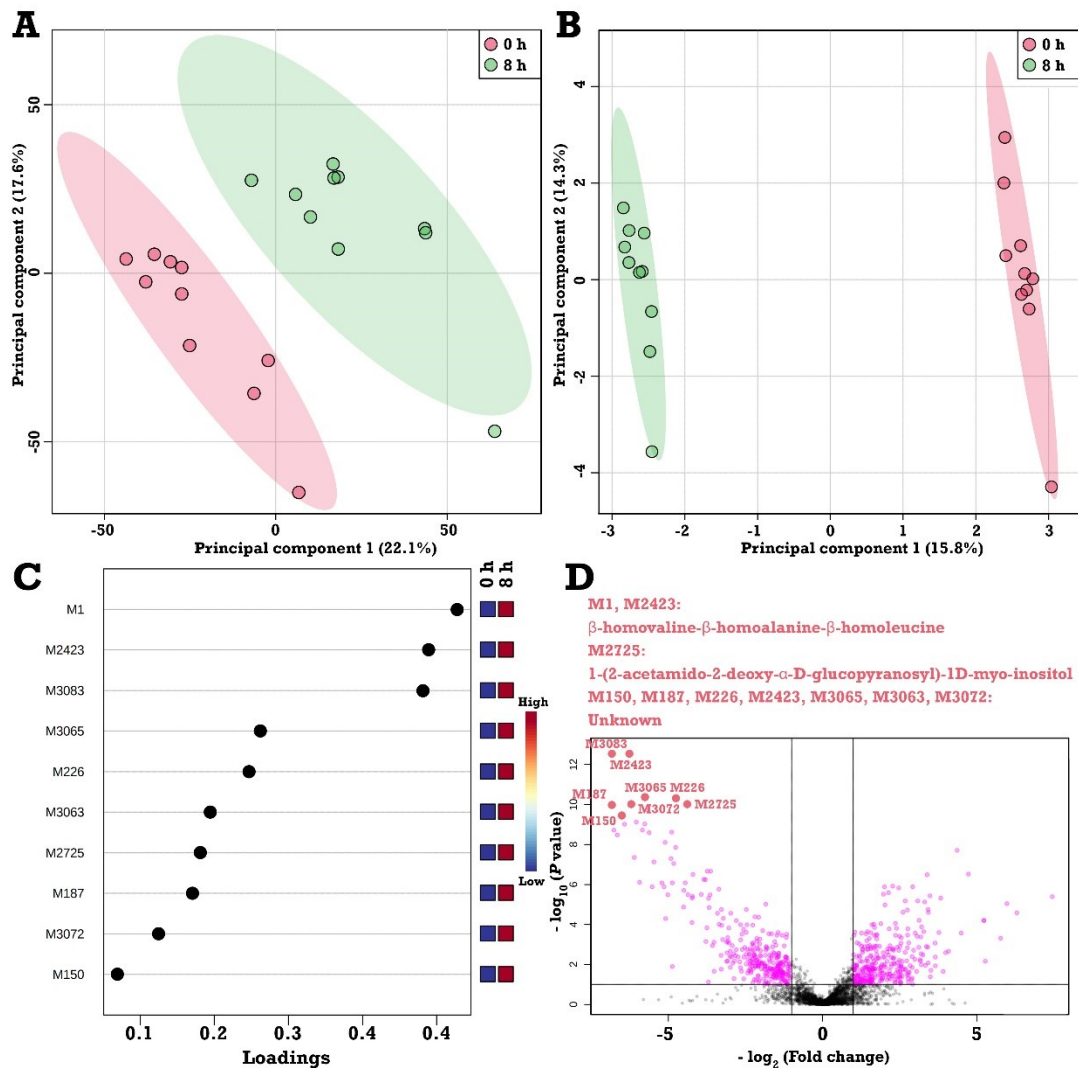
279 In (A) and (B), the same superscripts above score symbols (a-e) indicate colostrum pairs  
 280 of different treatments (raw vs. heated).

281

### 282 *Changes of Serum Metabolome Profiles from 0 h to 8 h Relative to Colostrum* 283 *Feeding*

284 We observed a clear time-course effect in the serum metabolome of calves, comparing  
 285 the profiles of the samples taken just before (0 h) and 8 h after colostrum feeding, as  
 286 shown in the heatmap (Supplementary Figure 2). In addition, the separation between 0  
 287 h and 8 h in the serum metabolome profiles was confirmed by PCA (Figure 4-A) and  
 288 sPLS-DA (Figure 4-B). However, due to the limitation of the used untargeted  
 289 metabolomics technology, a number of metabolites with high VIP scores in sPLS-DA

290 (Figure 4-C) could not be annotated by RPLC and HILIC. In the volcano plot, 10  
291 features were found to be significantly different between 0 h and 8 h (Figure 4-D). Only  
292 two of the most significant metabolites were annotated,  $\beta$ -homovalin- $\beta$ -homaalanine-  
293  $\beta$ -homeleucine (M1 and M2423) and 1-(2-acetamido-2-deoxy- $\alpha$ -D-glucopyranosyl)-  
294 1D-myo-inositol (M2725). The higher concentration of the tripeptide detected in the 8  
295 h serum sample is most likely indicative of the increased absorption of oligopeptides in  
296 the small intestine in the early stage of neonatal live in calves (Gilbert et al., 2008). The  
297 significantly different serum metabolome profile between 0 h and 8 h is likely a  
298 combined effect of colostrum uptake and adaptation from intrauterine to postnatal life.  
299 The serum metabolome, considered to be a snapshot of the current metabolic activity,  
300 is likely affected by factors such as the timing of colostrum feeding (within an hour  
301 after birth in the current study), as well as colostrum quality, bacterial count, and  
302 sufficient quantity of colostrum fed to the calves (McGuirk and Collins, 2004). Further,  
303 the serum metabolome might change over time as a function of decreasing metabolic  
304 plasticity in the newborn (Bartol et al., 2013).



305

306 **Figure 4.** Different profiles of serum metabolome of calves between 0 h and 8 h relative  
 307 to colostrum feeding in pincipal component analysis (PCA) (A), sparse partial least  
 308 square discriminant analysis (sPLS-DA) (B). Top 10 metabolites with the highest  
 309 variables in prejection (VIP) scores of sPLS-DA were listed (C), and the volcano plot  
 310 shows the significantly different metabolites between time points (D).

311

## 312 CONCLUSIONS

313 Colostrum contains several hundreds of small molecules, as demonstrated by an LC-  
 314 MS based quantification in this study. The concentration of the majority of these  
 315 molecules seemed to be unaffected by a commonly used heat treatment procedure,  
 316 however, we found 3 of the 458 colostrum metabolites to have an altered concentration

317 after heat treatment. Further studies are warranted to assess the repeatability and  
318 biological relevance of these concentration changes. Nevertheless, feeding the studied  
319 raw and heated colostrum batches to newborn calves did not trigger any detectable  
320 alterations in their serum metabolome profiles 8 hours after feeding. If any potential  
321 effects on the serum metabolome exist these were below the detection limit of the  
322 current study. Future research with an increased number of observations could help  
323 explore any minor effects, and studies with shorter or extended sampling intervals could  
324 help explore any shorter or longer term effects. The serum metabolome of calves was  
325 confirmed to undergo significant changes within the first 8 hours after the first feeding,  
326 which is likely a combined metabolic effect of colostrum uptake and adaptation to  
327 postnatal life.

328

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334 **REFERENCES**

- 335 Barta, O., V. Barta, and D. G. Ingram. 1972. Postnatal development of bactericidal  
336 activity in serum from conventional and colostrum-deprived calves. *Am J Vet Res*  
337 33(4):741-750.
- 338 Blum, J. 2006. Nutritional physiology of neonatal calves. *Journal of animal physiology*  
339 and animal nutrition 90(1-2):1-11.
- 340 Cui, L., H. Lu, and Y. H. Lee. 2018. Challenges and emergent solutions for LC-MS/MS  
341 based untargeted metabolomics in diseases. *Mass spectrometry reviews* 37(6):772-  
342 792.
- 343 Dunn, W. B., D. Broadhurst, P. Begley, E. Zelena, S. Francis-McIntyre, N. Anderson,  
344 M. Brown, J. D. Knowles, A. Halsall, and J. N. Haselden. 2011. Procedures for  
345 large-scale metabolic profiling of serum and plasma using gas chromatography and  
346 liquid chromatography coupled to mass spectrometry. *Nature protocols* 6(7):1060-  
347 1083.
- 348 Fischer, A. J., N. Malmuthuge, and M. A. Steele. 2018. The effect of heat treatment of  
349 bovine colostrum on the concentration of oligosaccharides in colostrum and in the  
350 intestine of neonatal male Holstein calves. *Journal of dairy science* 101(1):401-407.
- 351 Gilbert, E., E. Wong, and K. Webb Jr. 2008. Board-invited review: peptide absorption  
352 and utilization: implications for animal nutrition and health. *Journal of animal*  
353 *science* 86(9):2135-2155.
- 354 Girard, J., P. Ferre, J. Pegorier, and P. Duec. 1992. Adaptations of glucose and fatty acid  
355 metabolism during perinatal period and suckling-weaning transition. *Physiological*  
356 *reviews* 72(2):507-562.
- 357 Godden, S. M., J. E. Lombard, and A. R. Woolums. 2019. Colostrum management for  
358 dairy calves. *Veterinary Clinics: Food Animal Practice* 35(3):535-556.
- 359 Gray, D. W., M. D. Welsh, S. Doherty, F. Mansoor, O. P. Chevallier, C. T. Elliott, and  
360 M. H. Mooney. 2015. Identification of systemic immune response markers through  
361 metabolomic profiling of plasma from calves given an intra-nasally delivered  
362 respiratory vaccine. *Veterinary research* 46(1):7.
- 363 Guilloteau, P., R. Zabielski, and J. Blum. 2009. Gastrointestinal tract and digestion in  
364 the young ruminant: ontogenesis, adaptations, consequences and manipulations. *J*  
365 *Physiol Pharmacol* 60(Suppl 1):37-46.
- 366 Hammon, H. M., J. Steinhoff-Wagner, J. Flor, U. Schönhusen, and C. C. Metges. 2013.  
367 LACTATION BIOLOGY SYMPOSIUM: Role of colostrum and colostrum  
368 components on glucose metabolism in neonatal calves<sup>1,2</sup>. *Journal of Animal*  
369 *Science* 91(2):685-695. 10.2527/jas.2012-5758.
- 370 Johnson, J., S. M. Godden, T. Molitor, T. Ames, and D. Hagman. 2007. Effects of  
371 feeding heat-treated colostrum on passive transfer of immune and nutritional  
372 parameters in neonatal dairy calves. *Journal of dairy science* 90(11):5189-5198.
- 373 Kuehnbaum, N. L. and P. Britz-McKibbin. 2013. New advances in separation science  
374 for metabolomics: resolving chemical diversity in a post-genomic era. *Chemical*  
375 *reviews* 113(4):2437-2468.
- 376 Lê Cao, K.-A., S. Boitard, and P. Besse. 2011. Sparse PLS discriminant analysis:

377 biologically relevant feature selection and graphical displays for multiclass  
378 problems. *BMC Bioinformatics* 12(1):253.

379 McGuirk, S. M. and M. Collins. 2004. Managing the production, storage, and delivery  
380 of colostrum. *Veterinary Clinics of North America: Food Animal Practice*  
381 20(3):593-603. <https://doi.org/10.1016/j.cvfa.2004.06.005>.

382 Parrón, J. A., D. Ripolles, M. D. Pérez, M. Calvo, J. T. Rasmussen, and L. Sanchez.  
383 2016. Effect of heat treatment on antirotaviral activity of bovine and ovine whey.  
384 *International Dairy Journal* 60:78-85.

385 Pletts, S., J. Pyo, S. He, D. Haines, L. Guan, and M. Steele. 2018. PSI-19 Effect of  
386 extended colostrum feeding on serum IgG in newborn calves. *Journal of animal*  
387 *science* 96(suppl\_3):182-182. 10.1093/jas/sky404.396.

388 Ryan, D. and K. Robards. 2006. Metabolomics: the greatest omics of them all?  
389 *Analytical chemistry* 78(23):7954-7958.

390 Sousa, S. G., I. Delgadillo, and J. A. Saraiva. 2014. Effect of thermal pasteurisation and  
391 high-pressure processing on immunoglobulin content and lysozyme and  
392 lactoperoxidase activity in human colostrum. *Food chemistry* 151:79-85.

393 Szymańska, E., E. Saccenti, A. K. Smilde, and J. A. Westerhuis. 2012. Double-check:  
394 validation of diagnostic statistics for PLS-DA models in metabolomics studies.  
395 *Metabolomics : Official journal of the Metabolomic Society* 8(Suppl 1):3-16.  
396 10.1007/s11306-011-0330-3.

397 Triglia, R. P. and W. D. Linscott. 1980. Titers of nine complement components,  
398 conglutinin and C3b-inactivator in adult and fetal bovine sera. *Molecular*  
399 *Immunology* 17(6):741-748. [https://doi.org/10.1016/0161-5890\(80\)90144-3](https://doi.org/10.1016/0161-5890(80)90144-3).

400 Want, E. J., I. D. Wilson, H. Gika, G. Theodoridis, R. S. Plumb, J. Shockcor, E. Holmes,  
401 and J. K. Nicholson. 2010. Global metabolic profiling procedures for urine using  
402 UPLC-MS. *Nature protocols* 5(6):1005.

403 Zhao, X. W., Y. X. Qi, D. W. Huang, X. C. Pan, G. L. Cheng, H. L. Zhao, and Y. X.  
404 Yang. 2018. Changes in serum metabolites in response to ingested colostrum and  
405 milk in neonatal calves, measured by nuclear magnetic resonance-based  
406 metabolomics analysis. *Journal of Dairy Science* 101(8):7168-7181.  
407 <https://doi.org/10.3168/jds.2017-14287>.

408 Bartol, F.F., A.A. Wiley, D.J. Miller, A.J. Silva, K.E. Roberts, M.L.P. Davolt, J.C. Chen,  
409 A.-L. Frankshun, M.E. Camp, K.M. Rahman, J.L. Vallet, and C.A. Bagnell. 2013.  
410 LACTATION BIOLOGY SYMPOSIUM: Lactocrine signaling and developmental  
411 programming. *J. Anim. Sci.* 91:696-705. doi:10.2527/jas.2012-5764.

412 Ilves A, Harzia H, Ling K, Ots M, Soomets U, Kilk K. Alterations in milk and blood  
413 metabolomes during the first months of lactation in dairy cows. *Journal of dairy*  
414 *science*. 2012 Oct 1;95(10):5788-97. <https://doi.org/10.3168/jds.2012-5617>

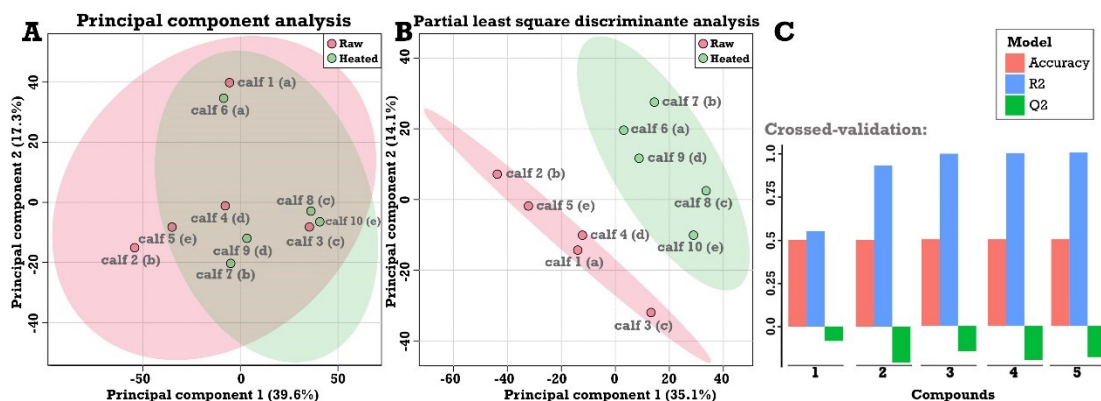
415 Chong, J., Wishart, D.S. and Xia, J., 2019. Using MetaboAnalyst 4.0 for comprehensive  
416 and integrative metabolomics data analysis. *Current protocols in bioinformatics*,  
417 68(1), p.e86. <https://doi.org/10.1002/cpbi.86>

418



419 **Supplementary Material**

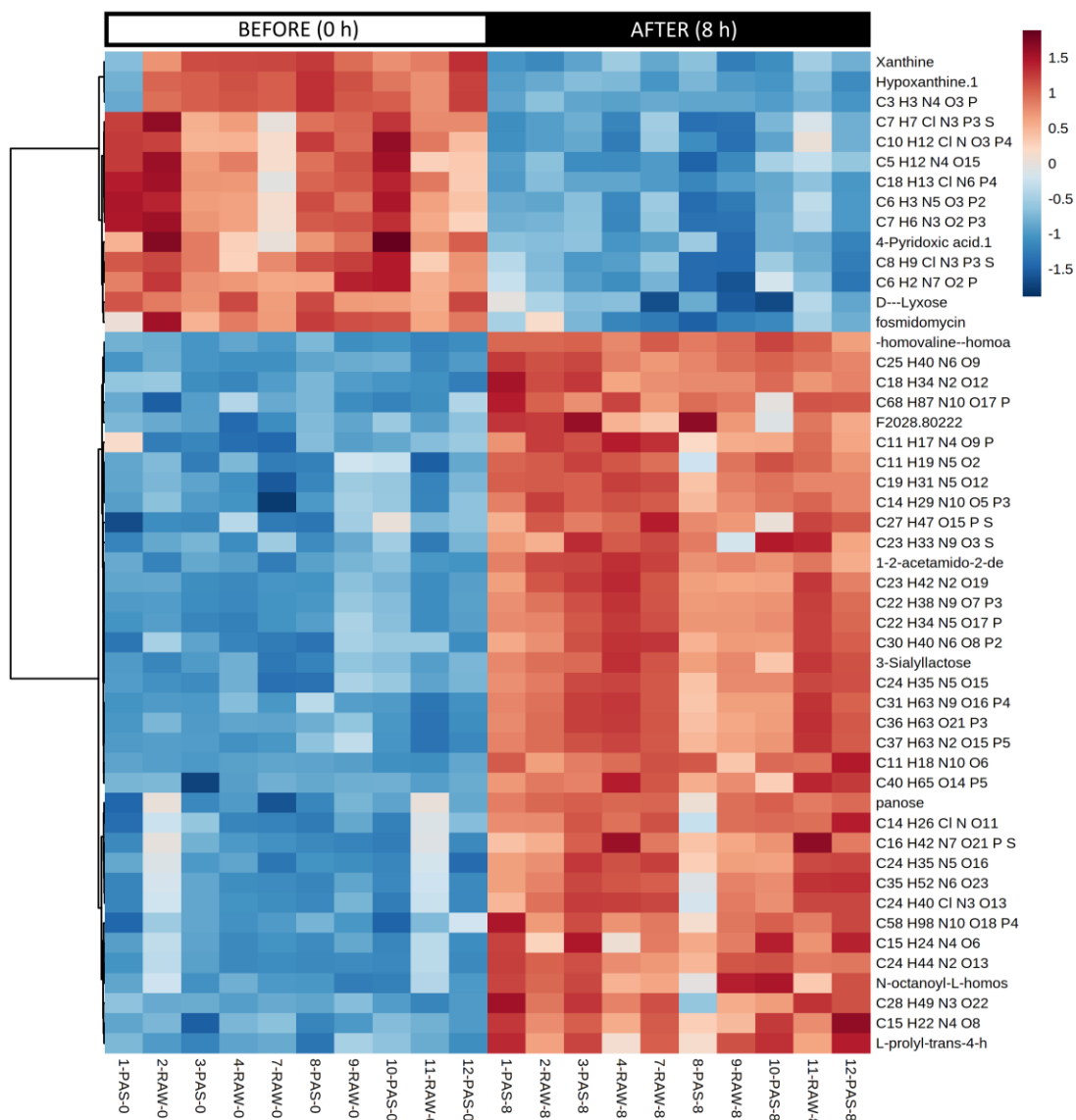
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421

422 **Supplementary Figure 1.** Based on the RPLC data, possible differences of serum  
423 metabolome (ratio of 8 h to 0 h) of calves fed raw or heated colostrum were presented  
424 in pincipal component analysis (PCA) (A), and partial least squares discriminant  
425 analysis (PLS-DA) (B). Quality control of the PLS-DA model was tested by cross-  
426 validation with 5 component (C).

427 In (A) and (B), the same superscripts above score symbols (a-e) indicate colostrum pairs  
428 of different treatments (raw vs. heated).



429

430 **Supplementary Figure 2.** Heatmap (relative concentrations) of serum metabolome of

431 calves immediately before (0 h) and 8 h after colostrum feeding. Top 50

432 metabolites/features found to be different between 0 h and 8 h by t-test. Red indicates

433 relatively higher concentrations, while blue indicates relatively lower concentrations.