## Detection and quantification of offal content in ground beef meat using vibrational spectroscopicbased chemometric analysis

Yaxi Hu<sup>1</sup>, Liang Zou<sup>2</sup>, Xiaolin Huang<sup>1</sup>, Xiaonan Lu<sup>1\*</sup>

<sup>1</sup>Food, Nutrition and Health Program, Faculty of Land and Food Systems, The University of British Columbia, Vancouver, V6T 1Z4, BC, Canada

<sup>2</sup>Department of Electrical and Computer Engineering, The University of British Columbia, Vancouver, BC, Canada

Corresponding authors: Prof. Xiaonan Lu, xiaonan.lu@ubc.ca;

## Table

|                 | LDA calibration |             |             |           | PCA-DA calibration |             |           | PLS-DA calibration |             |           |
|-----------------|-----------------|-------------|-------------|-----------|--------------------|-------------|-----------|--------------------|-------------|-----------|
| class           | # spectra       | specificity | sensitivity | precision | specificity        | sensitivity | precision | specificity        | sensitivity | precision |
| meat            | 40              | 100%        | 100%        | 100%      | 100%               | 93%         | 100%      | 100%               | 97%         | 100%      |
| beef honey comb | 65              | 100%        | 97%         | 100%      | 96%                | 51%         | 70%       | 97%                | 68%         | 80%       |
| beef liver      | 65              | 100%        | 100%        | 100%      | 100%               | 94%         | 100%      | 100%               | 100%        | 100%      |
| beef omasum     | 65              | 99%         | 100%        | 97%       | 92%                | 72%         | 60%       | 96%                | 72%         | 75%       |
| pork heart      | 65              | 99%         | 100%        | 97%       | 98%                | 97%         | 90%       | 96%                | 98%         | 83%       |
| pork kidney     | 65              | 100%        | 97%         | 100%      | 93%                | 95%         | 72%       | 99%                | 92%         | 95%       |
| pork liver      | 65              | 100%        | 100%        | 100%      | 100%               | 77%         | 98%       | 98%                | 95%         | 91%       |
|                 | LDA CV          |             |             |           | PCA-DA CV          |             |           | PLS-CA 10 fold CV  |             |           |
| class           | # spectra       | specificity | sensitivity | precision | specificity        | sensitivity | precision | specificity        | sensitivity | precision |
| meat            | 40              | 100%        | 100%        | 100%      | 100%               | 93%         | 100%      | 100%               | 93%         | 100%      |
| beef honey comb | 65              | 97%         | 74%         | 81%       | 96%                | 48%         | 69%       | 97%                | 62%         | 78%       |
| beef liver      | 65              | 100%        | 97%         | 100%      | 100%               | 94%         | 100%      | 100%               | 100%        | 100%      |
| beef omasum     | 65              | 96%         | 83%         | 77%       | 91%                | 74%         | 59%       | 95%                | 69%         | 70%       |
| pork heart      | 65              | 99%         | 96%         | 93%       | 98%                | 94%         | 90%       | 95%                | 98%         | 79%       |
| pork kidney     | 65              | 99%         | 94%         | 92%       | 93%                | 95%         | 72%       | 99%                | 92%         | 92%       |
| pork liver      | 65              | 99%         | 95%         | 96%       | 99%                | 75%         | 94%       | 98%                | 94%         | 91%       |
|                 | LDA prediction  |             |             |           | PCA-DA prediction  |             |           | PLS-DA prediction  |             |           |
| class           | # spectra       | specificity | sensitivity | precision | specificity        | sensitivity | precision | specificity        | sensitivity | precision |
| meat            | 15              | 100%        | 100%        | 100%      | 100%               | 93%         | 100%      | 100%               | 60%         | 90%       |
| beef honey comb | 35              | 91%         | 77%         | 60%       | 92%                | 80%         | 64%       | 94%                | 57%         | 65%       |
| beef liver      | 35              | 100%        | 100%        | 100%      | 100%               | 100%        | 100%      | 100%               | 100%        | 100%      |
| beef omasum     | 35              | 95%         | 54%         | 66%       | 96%                | 66%         | 74%       | 92%                | 71%         | 63%       |
| pork heart      | 35              | 98%         | 71%         | 89%       | 97%                | 83%         | 83%       | 96%                | 94%         | 82%       |
| pork kidney     | 35              | 95%         | 86%         | 75%       | 96%                | 80%         | 80%       | 96%                | 86%         | 79%       |
| pork liver      | 35              | 98%         | 86%         | 91%       | 99%                | 86%         | 97%       | 99%                | 86%         | 97%       |

**Table S1.** The best three models for the 7-class classification of all samples using FT-IR spectra

|            |           | LDA calibration |             |           | PCA-DA calibration |             |           | PLS-DA calibration |             |           |
|------------|-----------|-----------------|-------------|-----------|--------------------|-------------|-----------|--------------------|-------------|-----------|
| class      | # spectra | specificity     | sensitivity | precision | specificity        | sensitivity | precision | specificity        | sensitivity | precision |
| beef meat  | 40        | 100%            | 100%        | 100%      | 100%               | 93%         | 100%      | 99%                | 100%        | 91%       |
| beef offal | 195       | 100%            | 97%         | 100%      | 97%                | 89%         | 96%       | 99%                | 96%         | 98%       |
| pork offal | 195       | 98%             | 100%        | 97%       | 91%                | 100%        | 90%       | 96%                | 99%         | 96%       |
|            |           | LDA 10-fold CV  |             |           | PCA-DA 10-fold CV  |             |           | PLS-DA 10-fold CV  |             |           |
| class      | # spectra | specificity     | sensitivity | precision | specificity        | sensitivity | precision | specificity        | sensitivity | precision |
| beef meat  | 40        | 100%            | 100%        | 100%      | 100%               | 93%         | 100%      | 100%               | 93%         | 100%      |
| beef offal | 195       | 98%             | 94%         | 98%       | 97%                | 88%         | 96%       | 98%                | 95%         | 98%       |
| pork offal | 195       | 95%             | 98%         | 95%       | 89%                | 96%         | 88%       | 96%                | 99%         | 95%       |
|            |           | LDA prediction  |             |           | PCA-DA prediction  |             |           | PLS-DA prediction  |             |           |
| class      | # spectra | specificity     | sensitivity | precision | specificity        | sensitivity | precision | specificity        | sensitivity | precision |
| beef meat  | 15        | 100%            | 100%        | 100%      | 100%               | 80%         | 100%      | 96%                | 93%         | 61%       |
| beef offal | 105       | 92%             | 96%         | 91%       | 95%                | 90%         | 94%       | 96%                | 91%         | 95%       |
| pork offal | 105       | 97%             | 90%         | 96%       | 91%                | 96%         | 90%       | 94%                | 90%         | 93%       |

**Table S2.** The best three models for the 3-class classification of all samples using FT-IR spectra

| SIMCA model for 2-class beef offal using FT-IR spectra               |  |   |  |   |  |  |  |  |   |  |
|--|--|---|--|---|--|--|--|--|---|--|
| calibration: error rate 0, accuracy 100%                             |  |   |  | 10-fold CV                                    | : error rate 1%<br>99%                             | , accuracy                               | Prediction: error rate 0, accuracy 100%      |  |   |  |
| class  | specificity                                  | sensitivity                                 | precision                                | specificity                                   | sensitivity  | precision                                | specificity                                  | sensitivity  | precision                               |  |
| beef stomach   | 100%   | 100%  | 100%                                     | 98%   | 100%   | 99%                                      | 100%   | 100%   | 100%                                    |  |
| beef liver   | 100%   | 100%  | 100%                                     | 100%  | 98%  | 100%                                     | 100%   | 100%   | 100%                                    |  |
| LDA model for 2-class pork offal using FT-IR spectra                 |  |   |  |   |  |  |  |  |   |  |
| calibration: error rate 0, accuracy 100%                             |  |   |  | 10-fold CV: error rate 3%, accuracy 97%       |  |  | Prediction: error rate 9%, accuracy 92%      |  |   |  |
|  |  | 2   |  |   | 97%  |  |  | 9270   |   |  |
| class  | specificity                                  | sensitivity                                 | precision                                | specificity                                   | sensitivity  | precision                                | specificity                                  | sensitivity  | precision                               |  |
| class<br>pork heart &<br>kidney                                      | specificity<br>100%                          | sensitivity<br>100%                         | precision<br>100%                        | specificity<br>97%                            | sensitivity<br>98%                                 | precision<br>98%                         | specificity<br>86%                           | sensitivity<br>96%                                   | precision<br>93%                        |  |
| class<br>pork heart &<br>kidney<br>pork liver                        | specificity<br>100%<br>100%                  | sensitivity<br>100%<br>100%                 | precision<br>100%<br>100%                | specificity<br>97%<br>98%                     | <u>97%</u><br>sensitivity<br>98%<br>97%            | precision<br>98%<br>95%                  | specificity<br>86%<br>96%                    | 92%<br>sensitivity<br>96%<br>86%                     | precision<br>93%<br>91%                 |  |
| class<br>pork heart &<br>kidney<br>pork liver<br># of spectra in bee | specificity<br>100%<br>100%<br>f stomach and | sensitivity<br>100%<br>100%<br>pork heart & | precision<br>100%<br>100%<br>kidney grou | specificity<br>97%<br>98%<br>up calibration a | 97%<br>sensitivity<br>98%<br>97%<br>and 10-fold CV | precision<br>98%<br>95%<br>is 130, while | specificity<br>86%<br>96%<br>in prediction i | 92%<br>sensitivity<br>96%<br>86%<br>is 70. # of spec | precision<br>93%<br>91%<br>etra in beef |  |

Table S3. The optimized models for the 2-class classification of beef and pork offal using FT-IR spectra

## Figure



**Fig. S1.** Score plots of principal component analysis of  $2^{nd}$  derivative FT-IR spectra. Each symbol represents one type of the sample: star, beef meat; diamond, beef honey comb tripe; cross-mark, beef liver; circle, beef omasum; triangular, pork heart; dot, pork kidney; asteroid, pork liver.



**Fig. S2.** Score plot of LDA model for 3-class classification of all samples. Solid blue squares, black circles, and green diamonds represent beef meat, beef meat with beef offal and beef meat with pork offal in calibration dataset, respectively. Hollow blue squares, black circles, and green diamonds represent beef meat, beef meat with beef offal and beef meat with pork offal in prediction dataset, respectively.



**Fig. S3.** Score plot of LDA model for 3-class classification of pork offal. Solid purple diamonds, red squares and green circles represent beef meat with pork heart, with pork kidney and with pork liver in calibration dataset. Hollow purple diamonds, red squares and green circles represent beef meat with pork heart, with pork kidney and with pork liver in prediction dataset.



Fig. S4. Representative FT-IR (B) spectra of beef meat before and after spectral preprocessing.