

1 **SUPPLEMENTARY INFORMATION**

2
3 **Detection and classification of fentanyl and its precursors by**
4 **surface enhanced Raman spectroscopy**

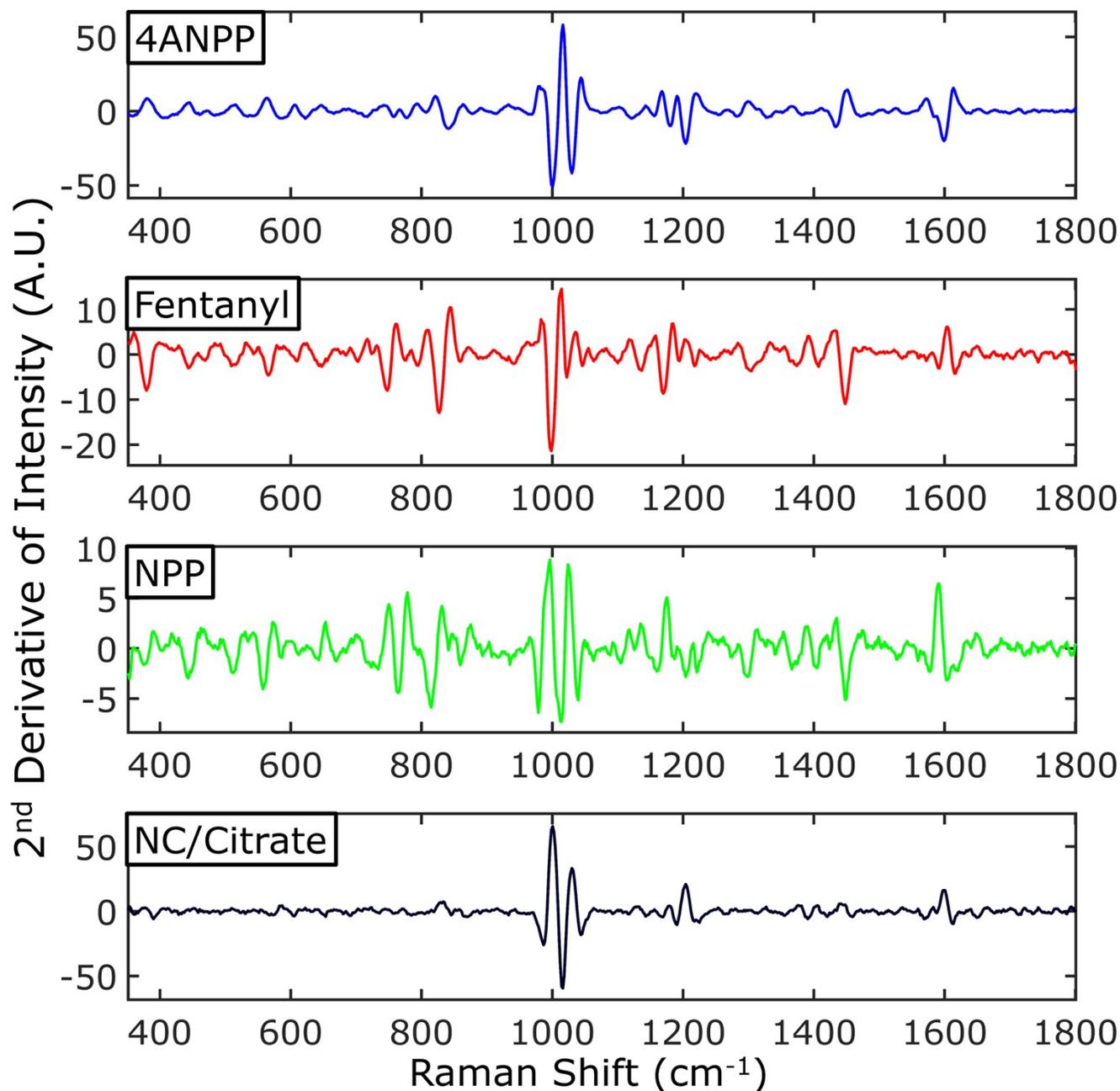
5
6
7 Rustin Mirsafavi ^a, Martin Moskovits ^b, Carl Meinhart ^{c,*}

8
9 ^a Department of Biomolecular Science and Engineering, University of California Santa
10 Barbara, Santa Barbara, California 93106, United States

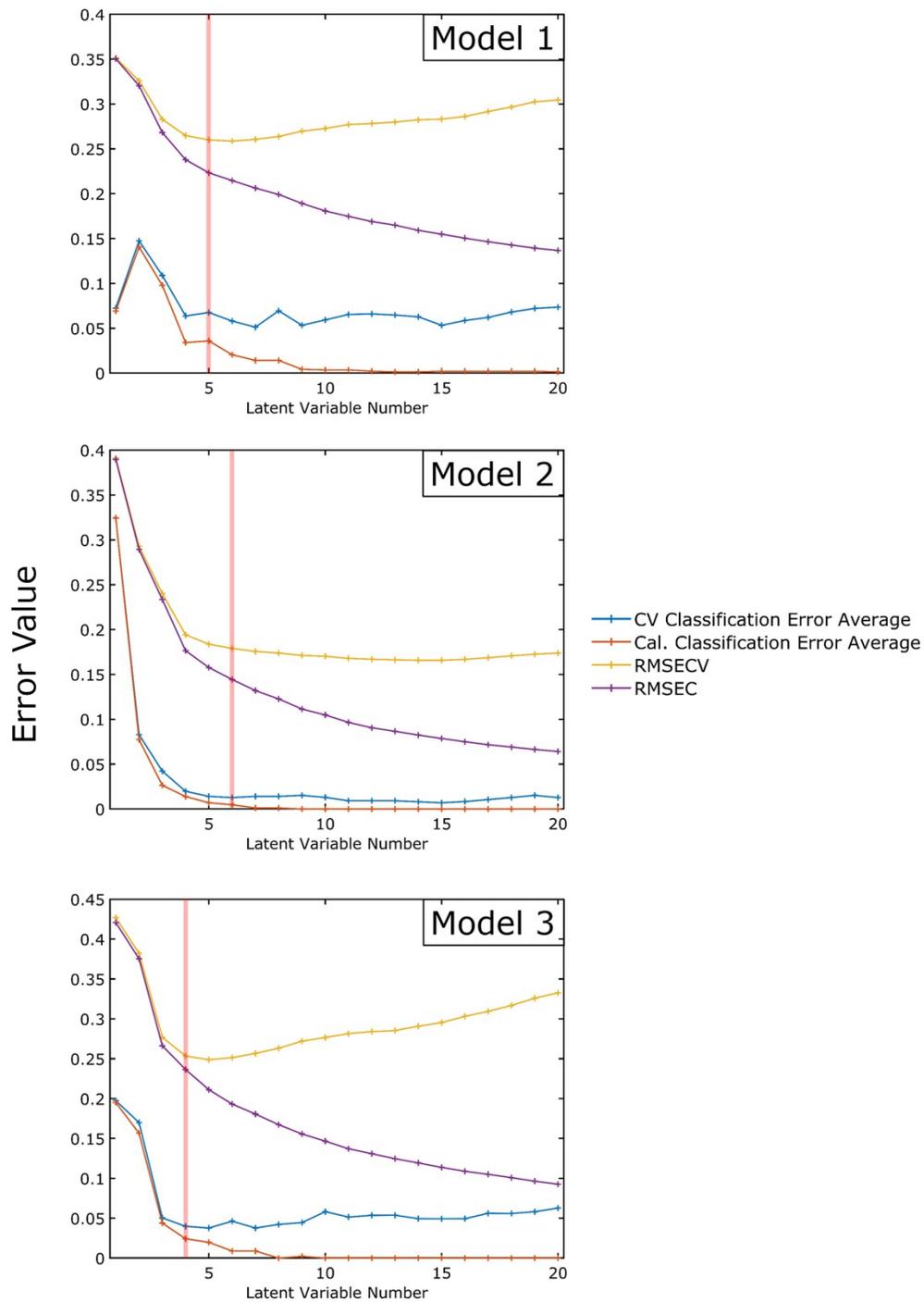
11
12 ^b Department of Chemistry and Biochemistry, University of California Santa Barbara,
13 Santa Barbara, California 93106, United States

14
15 ^c Department of Mechanical Engineering, University of California Santa Barbara, Santa
16 Barbara, California 93106, United States

17
18 * address correspondence to: meinhart@ucsb.edu



47 **Figure S1:** Preprocessed spectra of respective averaged spectra from figure 1. Preprocessing methods
48 are identical for each analyte. Preprocessing applied in order of application: multiplicative signal
49 correction with median ratio normalization (MSC), smoothing via Savitzky–Golay (SavGol) filter with 15
50 point filter width, 2nd order polynomial, and 2nd derivative, and lastly mean centering.

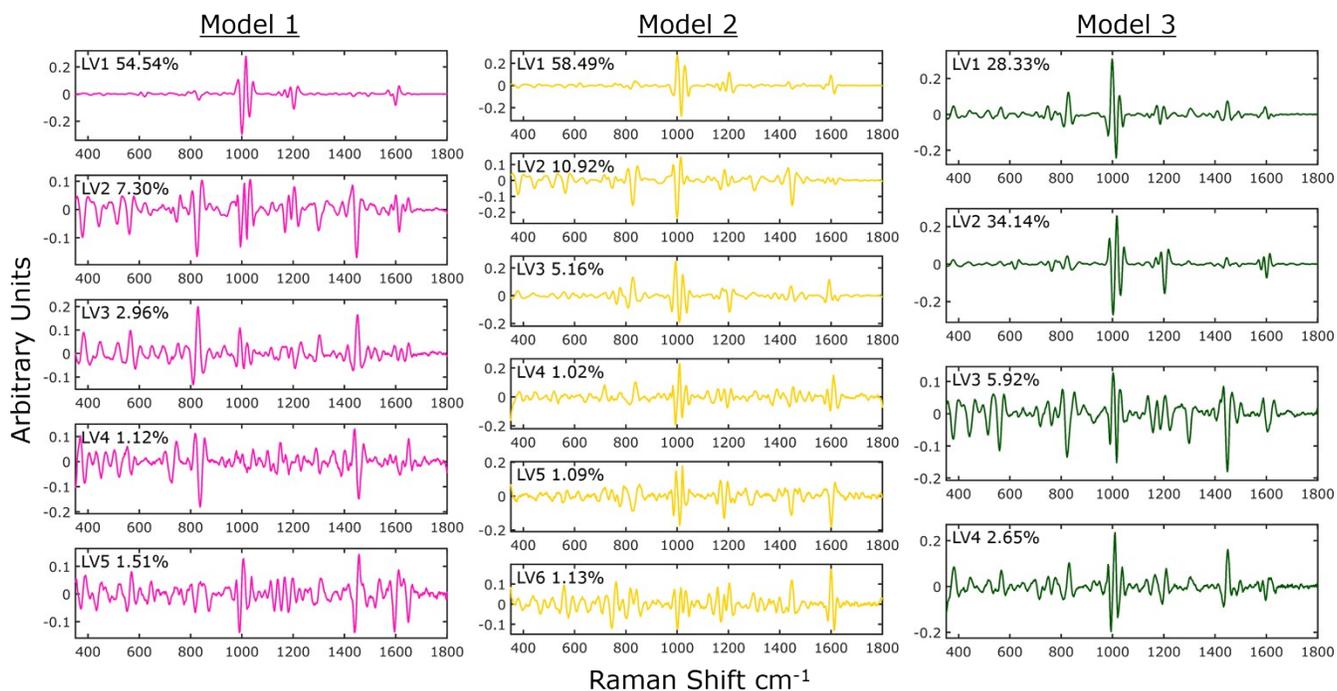


51

52 **Figure S2:** Error plots based on number of latent variables (LV) used. Plots for each model calibration
 53 are shown. Blue lines indicate average error in classification from cross validation (CV) results. Orange
 54 lines indicate average error in classification from calibration (Cal) results. Blue lines indicate root mean
 55 square error (RMSE) in CV results. Purple lines indicate root mean square error (RMSE) in Cal results.

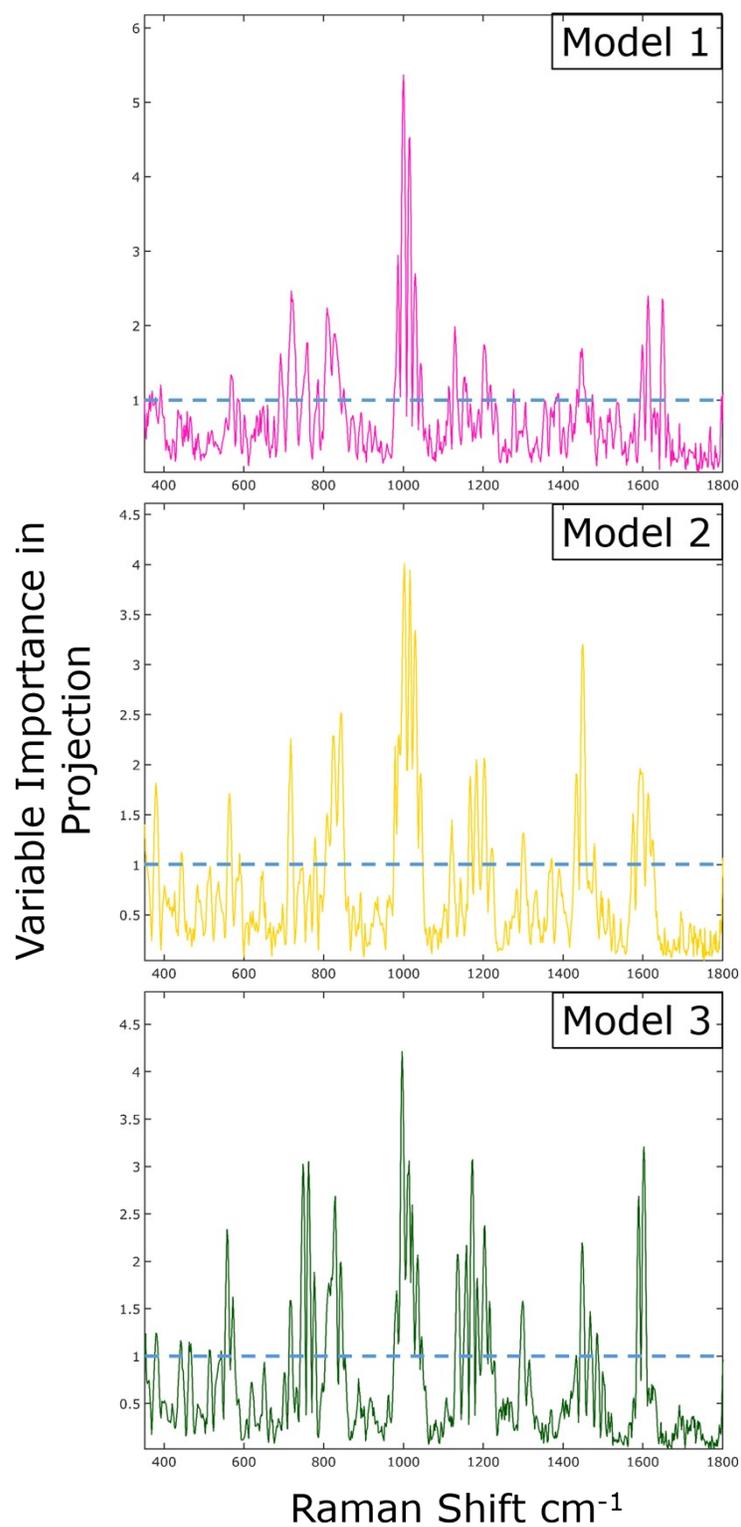
56

Vertical red line indicates number of LVs used.



57

58 **Figure S3:** Loadings plots for each model used in the hierarchical PLSDA approach presented in the
 59 manuscript. Number of latent variables per model were selected using information in figure S2. Criteria
 60 for number of LVs used were based on the lowest classification error, discrepancy between Cal and CV
 61 error, and an error reduction threshold of 20%.

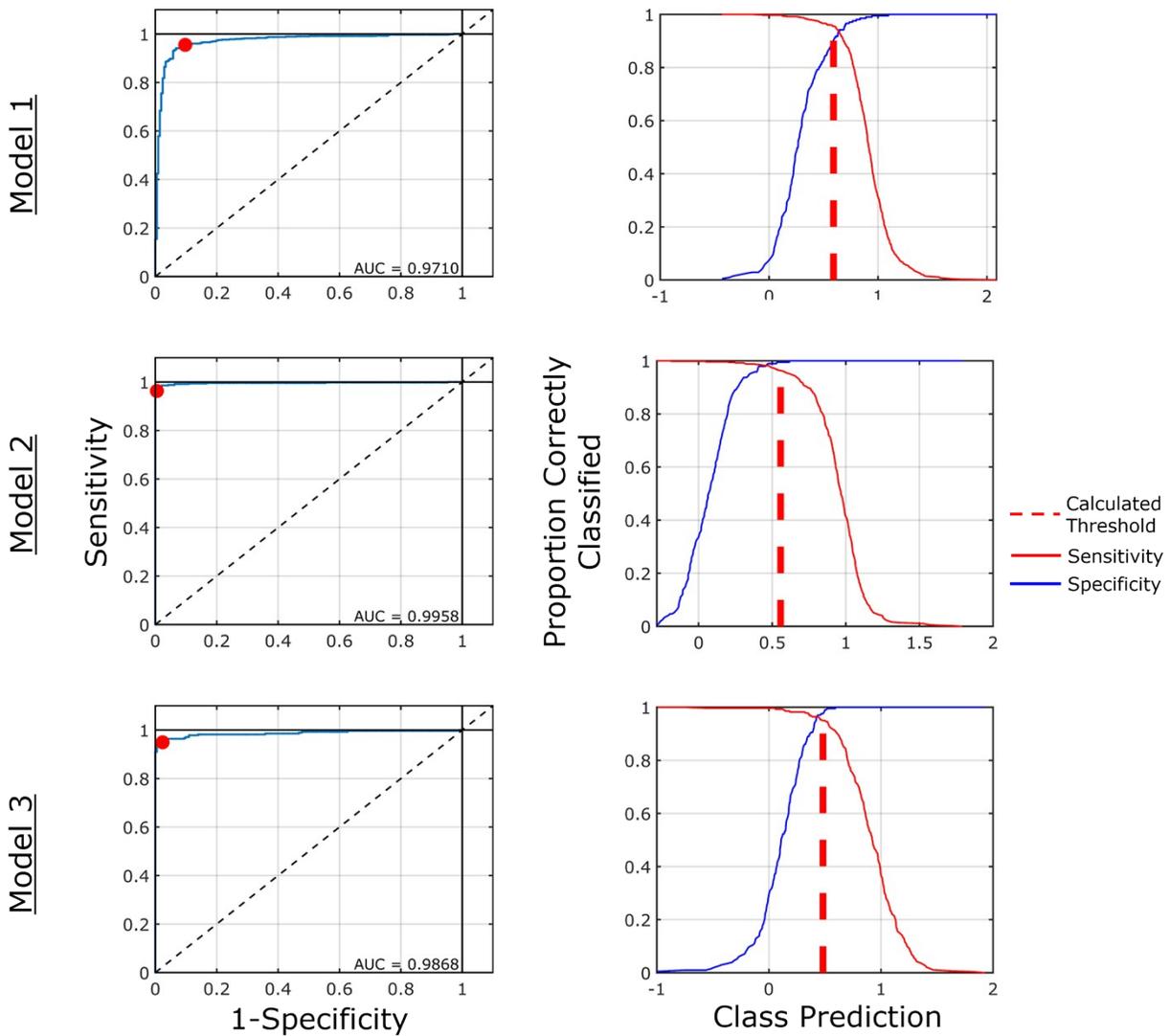


62

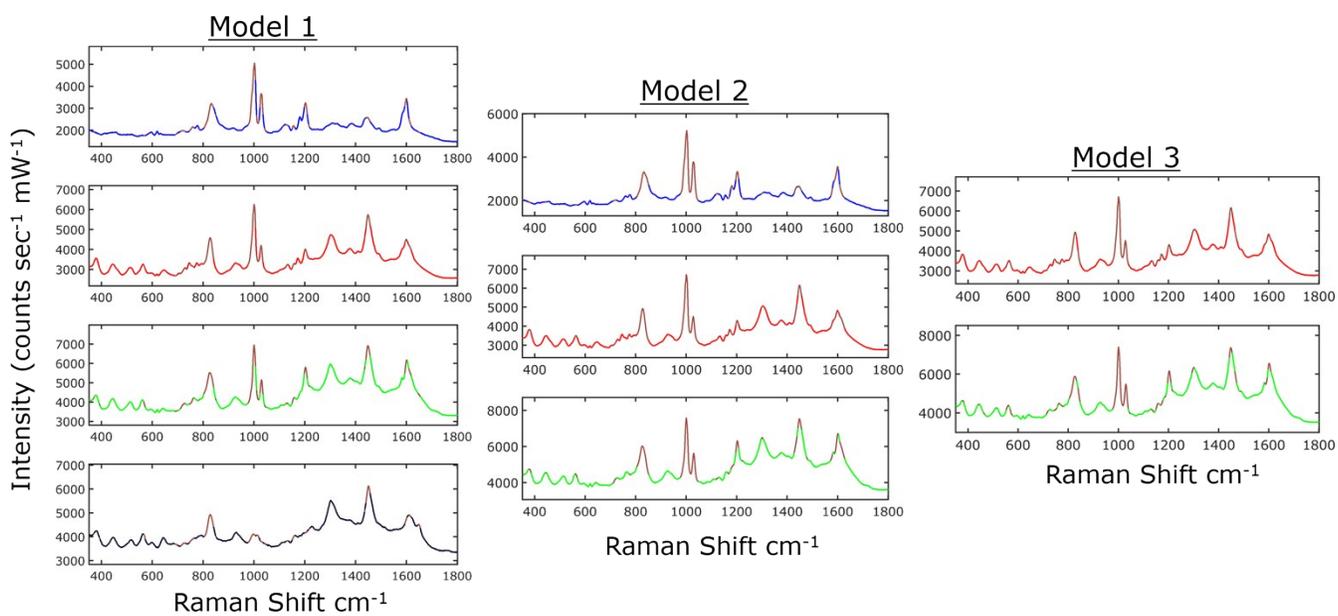
63 **Figure S4:** Plots of variable importance in projection (VIP) based on Raman Shift. Blue dashed line

64 indicates VIP score of 1, which is the threshold for importance determination. Scores above 1 indicate

65 Raman Shift of importance to model. The regions above threshold were used to identify bands that
66 were used for discriminating



67
68 **Figure S5:** Receiver operating characteristic curves for each model (rows) in the hierarchical PLSDA (left
69 column) and sensitivity and specificity curves derived from logistic regression for each model (right
70 column). The vertical dashed red line indicates the calculated threshold from the PLSDA model. Solid
71 red and blue curves indicate sensitivity and specificity, respectively. For each model class prediction
72 values are dummy variables. For model 1, 2, and 3 a class prediction value of 1 corresponds to the class
73 Negative Control, 4ANPP, and fentanyl, respectively and a class prediction value of 0 corresponds to
74 the class 4ANPP or fentanyl or NPP, fentanyl or NPP, and NPP, respectively.



75

76 **Figure S6:** Spectral regions indicated as important by VIP scores. Each model step has different regions

77 determined as important by VIP indicated with brown highlighting. The major regions to the models

78 are the peaks at 800, 1000, 1030, 1200, 1450, and 1600 cm⁻¹.