



Imaging – The Challenges in Objectively Evaluating Spatial Distribution in 2 and 3 Dimensions

Imaging – The Challenges in Objectively Evaluating Spatial Distribution in 2 and 3 Dimensions

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Aspects of Chemical Image Validation

- ❖ **Spectral Validation**
 - Information content
 - Spectral sampling volume
 - Calibration
- ❖ **Sampling Validation**
 - # of pixels required
 - # of images required
 - # of samples required
- ❖ **Spatial Validation**
 - Spotsize
 - Lateral precision/reproducibility
 - Spectral focal point vs. optical focus



Spectral Validation - Introduction

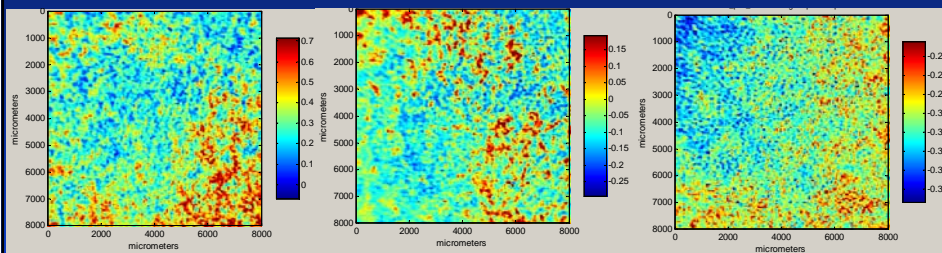
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- ❖ Chemical imaging provides full vibrational spectra at all pixels in an image
- ❖ While “pretty pictures” are easy to generate, understanding of spectral content behind images necessary for full interpretation
- ❖ Pixels with “pure” spectra are easy to classify but only observed when:
 - Materials are severely segregated or agglomerated
 - Large particles/domains exist ($>n \times \text{pixel size}$; $n = ?$)
- ❖ Most pixels in NIR images of “good” pharma samples are not pure
 - Most crucial components (e.g., API, lubricant) small ($< 50 \mu\text{m}$) and/or well-distributed
- ❖ PLS models often built on pure component spectra alone
 - Challenging to model all components at various concentrations
 - Potentially give rise to calibration error when nonlinearities exist



PEO/Lactose Blend NIR Images

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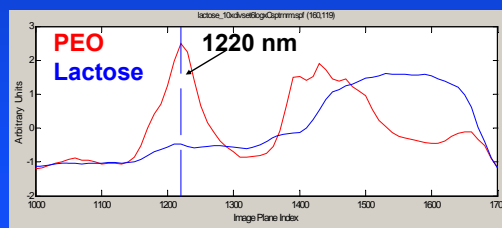


75% PEO
25% Lactose

50% PEO
50% Lactose

25% PEO
75% Lactose

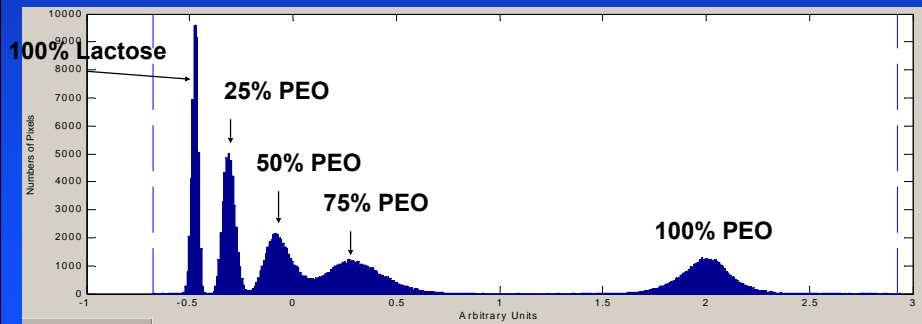
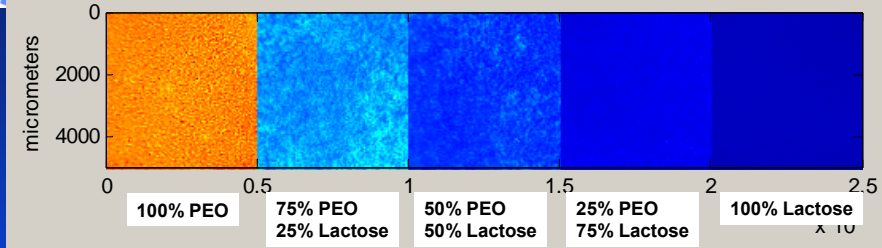
- ❖ Image spectra SNV normalized
- ❖ Red points = PEO domains
- ❖ Separate color scales





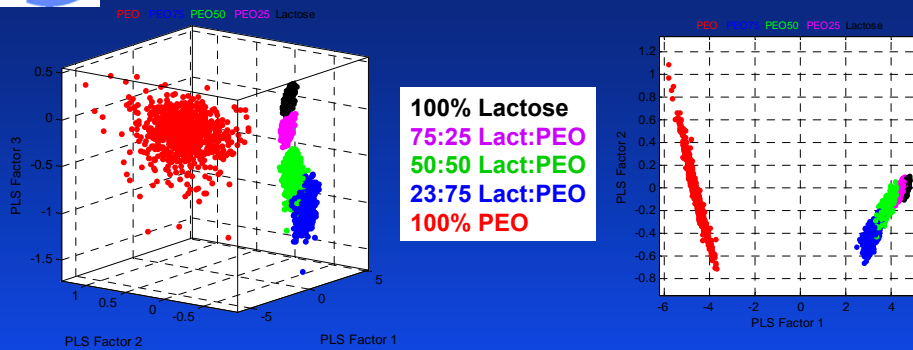
Common Color Scale

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NIR Image Pixel Trends

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- Spectra normalized, PLS library containing only pures
- Projection of prediction set onto space defined by 1st 3 PLS vectors
- Ideally should need only 1 PLS factor to model concentration
- Distribution indicates dramatic nonlinearity present in spectral system

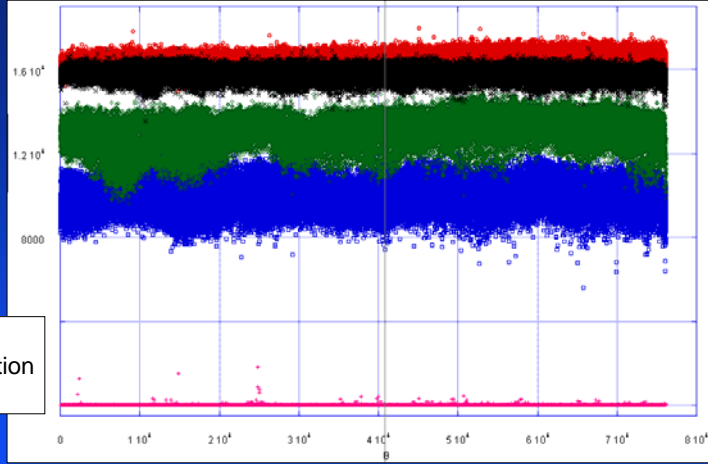


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NIR: Mahalanobis Distances From Pure PEO

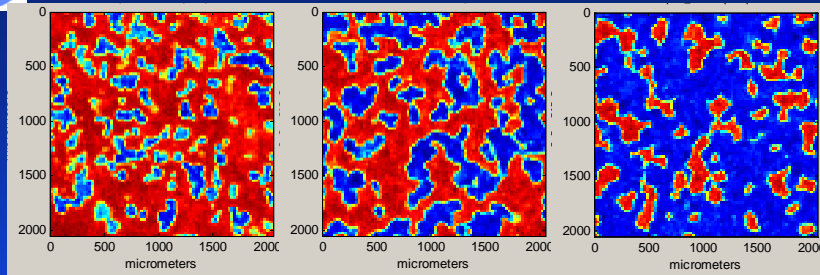
Lactose
25% PEO
50% PEO
75% PEO
PEO

normalized NIR
2-image calibration
3 lv



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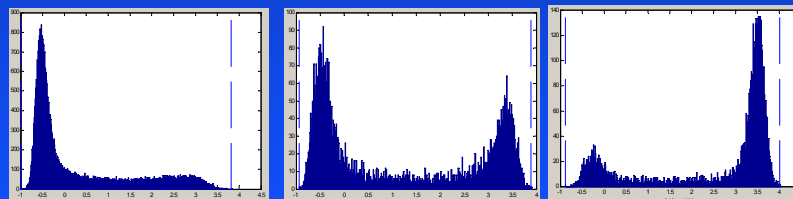
FT-IR Imaging = Low Penetration Depth



75% PEO

50% PEO

25% PEO

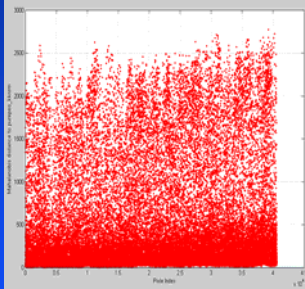




IR: Mahalanobis Distances From Pure PEO

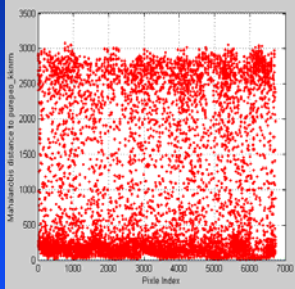
FT-IR
normalized only
2 pure image calibration set
3LV*

25% Lactose / 75% PEO



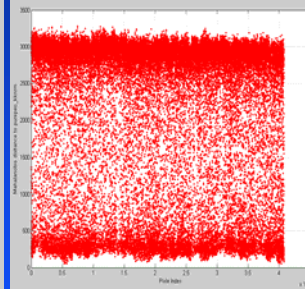
mean = 223
median = 38.9
max = 1632

50:50 mix



mean = 518
median = 201
max = 1852

75% Lactose / 25% PEO

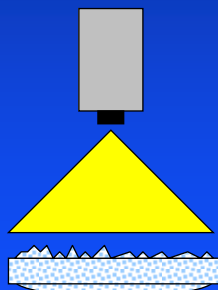


mean = 1062
median = 1342
max = 2036

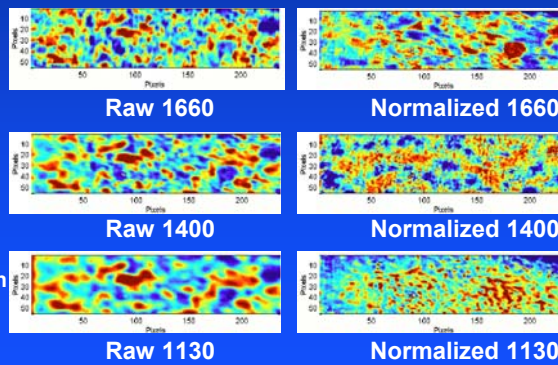


Depth Penetration vs. Wavelength

- ❖ Depth penetration increases at lower λ (eg, depth @ 1130 > 1400 > 1660)
 - Thus, penetration varies as: Raman (most) > NIR > IR (least)
- ❖ Penetration depth @ 1100nm = 3x depth at 1675 nm (Clarke *et al.*, *Appl. Spectr.* 2002, 56, 1475)
- ❖ Different sampling volume at each end of NIR spectrum



Increasing penetration



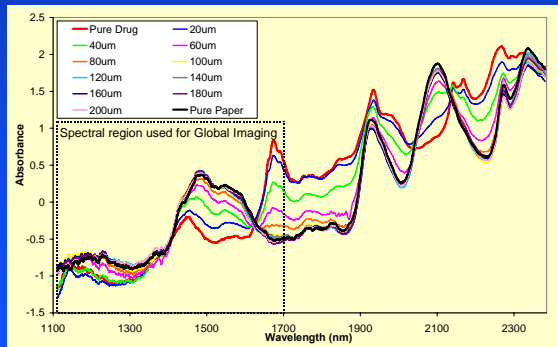
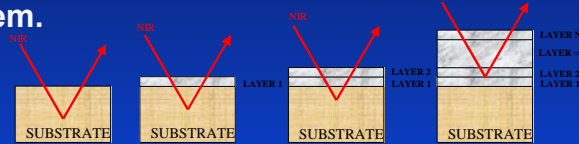


Experimental NIR Penetration Depth

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Slide courtesy of Fiona Clarke

❖ Measurement of DoP was performed using a layer system.



Varying NIR Sampling Volume w/ Wavelength

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Slide courtesy of Fiona Clarke

- If x and y are ~25 μm
- Know z is

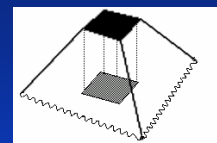
- 109 μm at 2380nm
- 777 μm at 1100nm

- At 2380 nm

- $A1 = 6.25 \times 10^{-8} \text{ m}^2$
- $A2 = 118.81 \times 10^{-8} \text{ m}^2$
- Volume = $5.534 \times 10^{-10} \text{ m}^3$

- At 1100 nm

- $A1 = 6.25 \times 10^{-8} \text{ m}^2$
- $A2 = 6038.3 \times 10^{-8} \text{ m}^2$
- Volume = $1615.6 \times 10^{-10} \text{ m}^3$



$$\text{Volume} = \frac{1}{3} D(A_1 + A_2 + \sqrt{A_1 \times A_2})$$

- Mass of Sample (presuming $\rho = 0.8 \text{ g/m}^3$)

- At 2380nm = 0.443 ng
- At 1100nm = 129.2 ng

- Using an analysis area of 5 x 5 mm area have 40,000 spectra

- At 2380nm = 0.018 mg
- At 1100nm = 5.2 mg

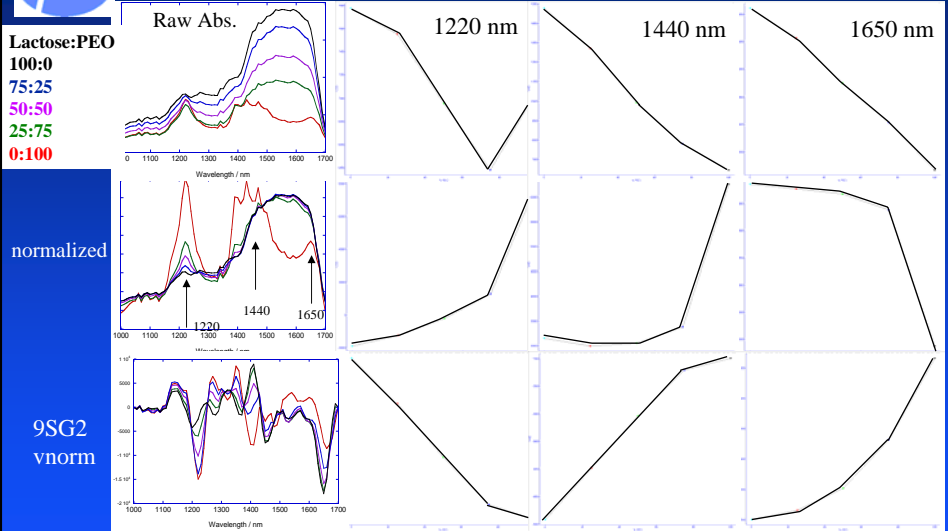
- Typical Dosage Form 300mg

- At 2380nm sampling 0.006%
- At 1100nm sampling 1.72%



Linearity vs. wavelength, preprocessing

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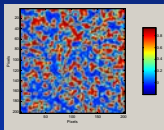


- Spectra generated by summing 200x200 pixel images to a single spectrum
- Significantly different intensity trends w/ wavelength

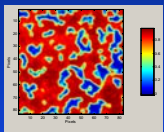


FT-IR 2-point PLS Model Results

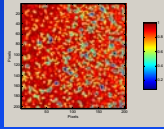
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25% PEO Sample
 5 mm x 5 mm
 ~41,000 pixels
 PEO prediction = 0.36



50% PEO Sample
 2 mm x 2 mm
 ~6700 pixels
 PEO prediction = 0.68

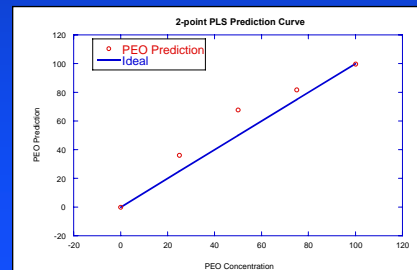


75% PEO Sample
 5 mm x 5 mm
 ~41,000 pixels
 PEO prediction = 0.82

PEO PLS Score Images Model built on pures only

Preprocessing:

- 1) KK Transform
- 2) 13-point SG2
- 3) Vector Normalization



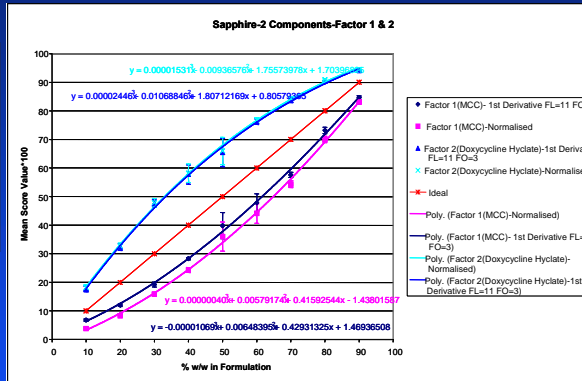
IR still nonlinear, but PEO is overpredicted (vs. lactose in NIR)



Pure Calibration: API/MCC NIR Images

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% w/w MCC	% w/w Doxycycline Hyclate
90	10
80	20
70	30
60	40
50	50
40	60
30	70
20	80
10	90



- Spectral nonlinearity also observed for API/MCC blends pressed into wafers and imaged w/ NIR
- 3 wafers at each concentration produced and imaged
- Mean PLS score for each image used to estimate concentration

Lisa Makein Ph.D. Thesis, 2007



Full Calibration Approach

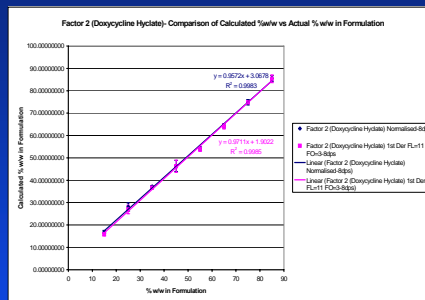
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Calibration Set

% w/w MCC	% w/w Doxycycline Hyclate
90	10
80	20
70	30
60	40
50	50
40	60
30	70
20	80
10	90

Validation Set

% w/w MCC	% w/w Doxycycline Hyclate
15	85
25	75
35	65
45	55
55	45
65	35
75	25
85	15



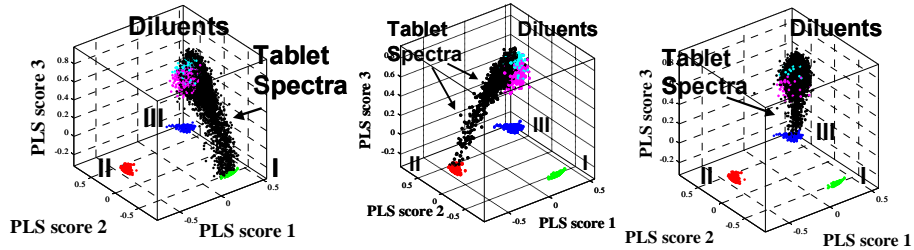
- When mixtures used to calibration, quantitative predictions are possible
- Challenge then becomes definition of sampling strategy

Lisa Makein Ph.D. Thesis, 2007



Raman Mapping

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Tablet w/ 0.5% API
(polymorph I)

Tablet w/ 0.5% API
(polymorph II)

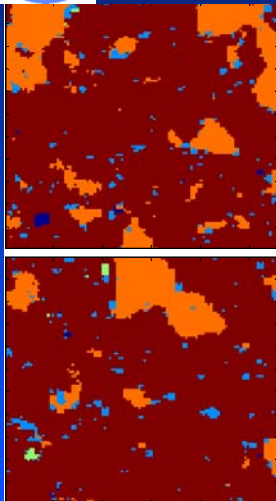
Tablet w/ 0.5% API
(polymorph III)

Multivariate classifier based on smallest Euclidean distance results in 50x over-prediction of API content



Raman Limit Test Validation

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API form I
API form II
API form III
Excipient 1
Excipient 2

- ◆ Test samples were manufactured containing 0.05% API form I; 0.05% form II; 0.40% form III
- ◆ Represents a limit check of 10% API polymorph conversion
- ◆ Several images acquired over multiple surfaces per tablet
- ◆ Several tablets of each dosage level tested



Raman Classification Results

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Sample	Surface	# pixels	I	II	III	% I	% II	% III	Ratio I	Ratio II	Ratio III
0.5 mg (1)	1	4961	36	21	388	0.73	0.42	7.8	8	5	87
0.5 mg (1)	2	4960	26	25	411	0.52	0.50	8.3	6	5	89
1 mg (2)	1	2501	13	17	181	0.52	0.68	7.2	6	8	86
1 mg (3)	1	1679	8	6	95	0.48	0.36	5.7	7	6	87
1 mg (3)	2	1681	2	7	115	0.12	0.42	6.8	2	6	93
1 mg (2)	2	12099	4	51	371	0.03	0.42	3.1	1	12	87
1 mg (2)	3	12099	37	12	394	0.31	0.10	3.3	8	3	89
AVE									6	6	88

- ❖ Demonstrates that homogeneous impurity can reliably be detected for each image
- ❖ Not defined: edge of failure (minimum pixels needed to detect)



Conclusions

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- ❖ Pharmaceutical chemical images contain primarily mixture spectra
 - Understanding how to deconvolute signals is key to interpretation
- ❖ Sampling depths vary between images or even in the same image
 - Wavelength dependence
 - Scattering efficiency dependence on particle sizes
 - Raman scattering cross sectional differences
- ❖ Absolute concentration or particle size determinations possible, but require full calibration models
 - Intensities may vary nonlinearly with concentration
 - Standard approach in bulk spectroscopy, but challenging for imaging
 - Definition of sampling strategy crucial for effective calibration
- ❖ Many applications may not require full quant
 - Can be validated semi-quantitatively or qualitatively



Acknowledgments

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