



Biomedical **Optics &** Optical Measurement

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Background

Pancreatic neuroendocrine tumors (PNETs) are a rare but increasingly more prevalent cancer, with diagnoses increasing six-fold over the last two decades. Surgery is the preferred method of treatment for the majority of PNETs, yet existing surgical localization methods provide poor contrast and resolution (Fig. 1), resulting in incomplete resections and pushing surgeons to perform more demolitive surgeries than necessary [1]. Better intraoperative localization techniques are needed to improve survival and quality of life.

Multiphoton microscopy (MPM) is a fast-growing optical imaging technique that provides label-Free tissue contrast at cellular-level



the pancreas using intraoperative ultrasound [3].

resolutions. However, MPM is limited to small, sub-mm fields of view, and necessarily would require a secondary imaging technique capable of macroscopic surveillance to direct sampling



Fig 2. Example fluorescence images of SSTR2labeled (A,B) PNET and (C,D) normal tissue. Red is high concentration, blue is low.

over a large area [2]. Notably, somatostatin receptor type 2 (SSTR2) is overexpressed in >80% of PNETs [1], indicating fluorescently-

tagged SSTR2 imaging (Fig. 2) could be used for wide-field localization to complement the inherent small field of view of MPM.

Objective

Our work tests the suitability of combined SSTR2 imaging and MPM for localizing PNETs, combining the labeled technique of SSTR2 fluorescence imaging with the label-free technique of MPM for enhanced contrast.

We imaged 12 fixed frozen patient samples with MPM and fluorescence imaging. Six samples were tumor and six normal pancreatic tissue. Five wavelength channels were obtained using MPM, selected to probe four endogenous fluorophores that are common biomarkers of disease (FAD, NADH, lipofuscin, and porphyrin) and second harmonic generation (SHG), a light scattering event exhibited by noncentrosymmetric molecules, predominantly collagen. Fig. 3 shows selected excitation and detection wavelengths.

	100
Fluorescence Intensity (a.u.)	90
	80
	70
	60
	50
	40
	30
	20
	10
	0

channel



Combined multiphoton microscopy and somatostatin receptor type 2 imaging of pancreatic neuroendocrine tumors

Methods



Fig 3. Emission spectra for the four endogenous fluorophores that dominate four of the five MPM channels for an excitation wavelength of 344 nm [4]. Actual excitation wavelengths used for all five MPM channels are listed in the legend. Colored overlays correspond to detection wavelength ranges for each

Fig 5. Selected MPM and SSTR2 images for one tumor (A) and normal (B) sample. Note the SSTR2 images are one region of interest chosen from the set of 10 used for analysis. Hematoxylin and eosin (H&E) images were obtained for all samples for ground truth validation. Images were brightened for viewing.

Texture features were extracted using Haralick's method for all five MPM images. For the SSTR2 images, 10 regions of interest were selected and a simple average intensity was calculated. Images were classified using linear discriminant analysis (LDA), and a leave-one-out approach used to determine LDA classifier accuracy [5].





Fig 4. Visualization of features and correlation between imaging channels. (A) Z-scores of features for each sample, and (B) heat matrices showing average correlation between imaging channels for all samples.

Results



Conclusions

We demonstrate that 4 features are sufficient to classify tumor and normal tissue with 100% accuracy using both MPM and SSTR2 images. Using only MPM images, we can obtain the same accuracy with the same number of features, indicating MPM could be used to determine surgical margins with high sensitivity and specificity. Using only SSTR2 images and 1 feature, we obtain an accuracy of 66.6%, indicating that SSTR2 provides sensitivity to disease, but the addition of MPM can improve sensitivity and specificity (Fig. 6).



Fig 6. (A) Bar chart of average SSTR2 average intensity for tumor and normal tissue. (B) Receiver operator characteristic (ROC) curve for classifiers developed using only the SSTR2 feature. (C) LDA projection for n=4 features for classifiers developed using both MPM and SSTR2 features. (D) ROC curve for classifiers developed using both MPM and SSTR2 features.

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