

Tumor density is associated with response to endobronchial ultrasound-guided transbronchial needle injection of cisplatin

C. Matthew Kinsey¹, Raúl San José Estépar², Jason H. T. Bates¹, Bernard F. Cole³, George Washko⁴, Michael Jantz⁵, Hiren Mehta⁵

¹Division of Pulmonary and Critical Care, University of Vermont Medical Center, Burlington, VT, USA; ²Department of Radiology, Brigham and Women's Hospital, Boston, MA, USA; ³Department of Mathematics and Statistics, University of Vermont, Burlington, VT, USA; ⁴Division of Pulmonary and Critical Care, Brigham and Women's Hospital, Boston MA, USA; ⁵Division of Pulmonary and Critical Care, University of Florida, Gainesville, FL, USA

Contributions: (I) Conception and design: CM Kinsey, H Mehta, R San José Estépar, G Washko, JHT Bates; (II) Administrative support: All authors; (III) Provision of study materials or patients: CM Kinsey, H Mehta, M Jantz; (IV) Collection and assembly of data: CM Kinsey, H Mehta; (V) Data analysis and interpretation: All authors; (VI) Manuscript writing: All authors; (VII) Final approval of manuscript: All authors.

Correspondence to: C. Matthew Kinsey, MD, MPH. Division of Pulmonary and Critical Care, University of Vermont Medical Center, 89 Beaumont Avenue, Given D208, Burlington, VT 05401, USA. Email: Matt.Kinsey@med.uvm.edu.

Background: Endobronchial ultrasound-guided transbronchial needle injection of cisplatin (EBUS-TBNI cisplatin) is a therapeutic option for patients with recurrent lung cancer. However, the tumor characteristics that influence the distribution of the agent following intratumoral delivery remain largely unknown.

Methods: We performed a retrospective evaluation of EBUS-TBNI cisplatin cases performed at two centers. Semi-automated tumor segmentation from CT scans was performed while blinded to the outcome of response. Twenty-four algorithmic radiomics features from two categories, Morphology (i.e., shape, volume) and Intensity (i.e., density), were extracted, and feature selection performed via least absolute shrinkage and selection operator (LASSO) regression. Models were constructed from clinicoepidemiologic variables and selected radiomics features and evaluated using the likelihood ratio chi-square assessment and Akaike's information criterion (AIC).

Results: Thirty-eight patients with available imaging data were analyzed. Based on RECIST criteria, 27 of 38 treated sites demonstrated complete or partial remission (71%). The top three features identified by LASSO regression were variance, energy, and kurtosis. All three are measures of intensity, a surrogate for tumor density. Two logistic regression models with the outcome of response were created, each with the top 3 categorical features: (I) an Intensity model including variance, energy, and kurtosis, and (II) a Morphology model including surface-to-volume ratio, spherical disproportion, and maximum 3-dimensional (3D) diameter. Only the Intensity model met criteria for significance (P=0.024), and it resulted in a lower AIC and higher pseudo R square value vs. the Morphology model.

Conclusions: Measures of tumor density are more highly associated with response to EBUS-TBNI cisplatin than measures of morphology.

Keywords: Lung cancer; intratumoral therapy; bronchoscopy

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Introduction

Over half of all advanced lung cancers will progress or recur despite appropriate therapy, a problem associated with a median overall survival of approximately 5 months (1). The advent of immunotherapy has improved this prognosis for the 20–50% of patients who respond, the majority of patients remain without effective therapies (2-4). Due to the lack of options for these patients, there has been increasing interest in direct delivery of agents into tumors for adjuvant or palliative indications (5-10). The rationale for this approach lies in the opportunity to achieve therapeutic concentrations of the agent within the tumor while minimizing exposure to the systemic circulation and offtarget organs.

The most commonly utilized direct delivery approach is endobronchial ultrasound-guided transbronchial needle injection of cisplatin (EBUS-TBNI cisplatin) (11-14). In contrast to intravenous administration, different regional concentrations of cisplatin may be achieved depending on where within the tumor the agent is delivered. Based on initial descriptions (15), the two US institutions that have reported using EBUS-TBNI cisplatin independently adopted a practice of delivering up to 40 mg of cisplatin into the tumor at each treatment (11,13). This dose, however, has been selected on entirely empirical grounds. Furthermore, there are no guidelines as to where within the tumor the cisplatin should be injected to maximize the effective distribution. The administration of cisplatin by EBUS-TBNI could potentially be very heterogeneous depending on the spatial injection pattern that is employed. In contrast to the heterogeneous distribution achieved following IV administration (that in part results from varying blood vessel density) appropriately selecting the dose and delivery sites within the tumor for EBUS-TBNI will allow us to optimize the distribution and efficacy of the agent. However, we must first understand the tumor characteristics that influence the final distribution of the agent.

It is apparent that tumors with large volumes or greater maximum diameters may be more challenging to treat due to the longer diffusion distances and lower effective concentration of a single EBUS-TBNI dose. It also seems reasonable to suppose that regional variations in cisplatin diffusivity could play an important role in the therapeutic effectiveness of EBUS-TBNI by influencing how well cisplatin is able to be distribute throughout the tumor before being cleared into the vasculature by the tumor's

Kinsey et al. Tumor density and response to EBUS-TBNI cisplatin

blood supply. Testing this latter idea directly is challenging because cisplatin diffusivity is not easily measured *in situ*. On the other hand, diffusivity is likely to be reflected by the distribution of mass density of the tumor tissue, which itself can be determined from a 3-dimensional (3D) CT scan. Accordingly, the goal of the present study was to determine how a variety of pre-defined, quantitative, tumor image characteristics, termed "radiomics", influence the response of lung tumors to EBUS-TBNI cisplatin therapy (16,17). Radiomics features capture both morphologic features, such as maximum diameter, as well as intensity based features, which are markers of tissue density (18). Leveraging data from two centers, we sought to understand how features such as geometric structure and density influence response to EBUS-TBNI cisplatin therapy.

Methods

Study oversight

The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). This study was approved by the University of Vermont (UVM) Committee on Human Research in the Medical Sciences (CHRMS 17-075) and by The University of Florida (UFL) Institutional Review Board (201700864). Informed consent was not required by these oversight committees due to the retrospective nature of the study.

Study populations

All cases where EBUS-TBNI cisplatin performed between September 2010 and December 2017 were reviewed by the two institutions. All patients included in this series had recurrent lung cancer following radiation therapy. Recurrence was pathologically confirmed. Each case was presented at the local multidisciplinary tumor board and EBUS-TBNI cisplatin recommended by the respective group. The goal of therapy in all cases was local control, either due to a local recurrence or with palliative intent for treatment of a non-stentable airway obstruction. Cases without CT scans (e.g., only PET images) or with CT scans performed more than 5 weeks prior to onset of EBUS-TBNI therapy were excluded. Descriptive data and outcomes from portions of the two cohorts have been published previously (11,13).

CT scans for all included cases were assessed in a blinded fashion. Response to therapy was defined as either complete



Before EBUS-TBNI cisplatin

1 month after EBUS-TBNI cisplatin

Figure 1 Axial CT image of a right lower lobe lung cancer, before and after EBUS-TBNI cisplatin. EBUS-TBNI cisplatin, endobronchial ultrasound-guided transbronchial needle injection of cisplatin.

response (CR) or partial response (PR) based on the Response Evaluation Criteria in Solid Tumors (RECIST) 1.1 criteria (19). An example is show in *Figure 1*. All other imaging data were acquired via automated quantitative analysis.

Quantitative CT analysis

All CT scans were evaluated while blinded to the outcome variable of response. Semi-automated segmentation of the treated volume was performed as previously described using the freely available Chest Imaging Platform (https:// chestimagingplatform.org) (20-22). A single point was also placed on the right deltoid. Variance of the density of this point was measured to allow for normalization of CT scan reconstruction in the statistical models. Twenty-four radiomics features were then extracted from the segmented lesion based on previously published algorithms for assessment of intensity and morphology (https:// pyradiomics.readthedocs.io/en/latest/features.html, accessed 1/20/2019).

Statistical analysis

All statistical analyses were performed using STATA (Version 13, College Station, TX, USA). P values less than or equal to 0.05 were considered significant and all statistical tests were two-sided. In order to limit the degrees of freedom, demographic and clinical features were selected via backwards stepwise selection with an inclusion criteria of 0.10.

The higher dimensionality of radiomics features necessitated using the commonly utilized approach of logistic regression with least absolute shrinkage and selection operator (LASSO) regularization (23,24). This approach allows for selection of features in high dimensionality data while simultaneously penalizing correlated predictors. Two separate LASSO operations were performed, one within each radiomics category (*Figure 2*). The top three features from each category were selected for evaluation in logistic regression models.

Logistic regression models were constructed with the outcome of response to EBUS-TBNI cisplatin. Models were compared using the likelihood ratio test and Akaike's information criterion (AIC).

Results

Thirty-eight cases met criteria for inclusion in the analysis (28 UFL, 10 UVM). Characteristics of the cohort by response, are shown in *Table 1*. There were no significant differences in any of the variables in *Table 1* by response. There were also no significant differences in the distribution of any of those variables by institution. There was a significant difference in the range of slice thickness of obtained CT scans between the two institutions (UVM 0.9 mm, UFL 1–3.75 mm). There was no difference in the overall response rate (70% *vs.* 71%, P=0.62) between the two institutions.

For construction of the models, we first evaluated clinical variables as predictors of response to EBUS-TBNI cisplatin. Although our primary goal was to evaluate tumor features as predictors of response, clinicoepidemiologic variables were included to account for other important predictors. Backwards stepwise selection resulted in only gender and smoking remaining in the model (P=0.018). Test of interaction for gender and smoking was not significant (P=0.627).



Figure 2 Radiomics workflow. The cancer is first segmented in 3Ds, allowing distinction from other adjacent structures. This 3D structure is then analyzed using established radiomics algorithms related to either Morphology or Intensity. These radiomics features are then evaluated via LASSO regression to determine those most highly associated with response to the therapy. 3D, 3-dimension; LASSO, least absolute shrinkage and selection operator.

LASSO regression of all intensity features resulted in selection of variance, energy, and kurtosis. A separate LASSO regression of morphology features resulted in selection of maximum 3D diameter, surface to volume ratio, and spherical disproportion as the top three features. No feature alone was significantly associated with response (*Table 2*). For comparison we also included the selected variables from both the Intensity and Morphology categories in a single LASSO. The top 3 selected features were all related to Intensity (variance, energy, and kurtosis, respectively) followed by surface-to-volume ratio as the highest ranked Morphology feature.

Each of these sets of features were then included with gender and smoking and the two models compared. Models were also evaluated with inclusion of the deltoid variance measurement.

Evaluation of LASSO selected features demonstrated that inclusion of Morphology features with gender and smoking did not result in a significant chi-square test for the overall model (P=0.087), whereas inclusion of Intensity features did result in a significant model (P=0.024, *Table 2*).

Moreover, inclusion of Intensity *vs.* Morphology features resulted in a superior AIC (45 *vs.* 49), and pseudo R square (0.32 *vs.* 0.24), respectively.

There was no significant change in the overall performance of the models when the deltoid variance measurement was omitted from the Intensity and Morphology models (P=0.0125 vs. P=0.0743, respectively). Because there was a significant difference in the CT slice thickness obtained at the two different centers we also performed a stratified analysis. Stratifying the models to only UFL, did not result in a significant change in overall model performance for either the Intensity or Morphology models (P=0.014 vs. P=0.123).

Discussion

Over the last several years EBUS-TBNI cisplatin has evolved as a potential therapeutic option for patients with recurrent lung cancer, who previously received radiation to that region and are not receiving systemic cytotoxic therapy (8,11-15,25). Despite a robust response rate, the ideal

Table 1	Characteristics	of the	cohorts
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	EBUS-TBNI response			
Characteristics	Yes (n=27), No (n=11), n (%) n (%)		Ρ	
Age (y)*	61.2 (8.5)	62.9 (8.7)	0.585	
Gender			0.084	
Female	18 (66.7)	3 (27.7)		
Male	9 (33.3)	8 (72.7)		
Smoking, pack years*	43.7 (25.9)	60.2 (23.9)	0.069	
Histopathology			0.911	
Adenocarcinoma	12 (44.4)	4 (36.6)		
Squamous cell	11 (40.7)	6 (54.5)		
NSCLC (NOS/mixed)	1 (3.7)	0 (0)		
Small cell	3 (11.1)	1 (9.1)		
Stage			0.905	
I	1 (3.7)	0		
II	1 (3.7)	0		
IIIA	11 (40.7)	5 (45.5)		
IIIB	6 (22.2)	2 (18.2)		
IV	8 (29.6)	4 (36.4)		
Therapy at initial diagno	sis		0.698	
Chemotherapy/ radiation/surgery	2 (7.4)	1 (9.1)		
Radiation/surgery	0	1 (9.1)		
Chemotherapy	1 (3.7)	0		
Radiation	2 (7.4)	1 (9.1)		
Chemotherapy/ radiation	22 (81.5)	8 (72.7)		
Therapy following EBUS	0.796			
Chemotherapy	4 (14.8)	2 (18.1)		
Re-irradiation	3 (11.1)	0		
Immunotherapy	2 (7.4)	0		
None	18 (66.7)	9 (81.8)		

*, mean (standard deviation). EBUS-TBNI cisplatin, endobronchial ultrasound-guided transbronchial needle injection of cisplatin; NSCLC, non-small cell lung cancer; NOS, not otherwise specified.

dosing and administration strategy for this therapy remains unknown. Although it is intuitive that the relationship of tumor size (a proxy for the total number of tumor cells) to cisplatin dose may be a driver of overall tumor response there is accumulating evidence that tumor density may also be important. For instance, our group recently completed a computational modeling analysis that demonstrated the critical importance of the diffusion rate in determining the efficacy of the therapy (26).

Multiple factors are known to affect the diffusion of an agent through a tumor. Several of the most prominent include density of the tissue, rate of uptake of the agent to the intracellular compartment, and the distribution and flow of blood through the local vascular bed that serves as a sink for the agent. Tissue density in particular may vary widely among tumors and includes regions of both lowdensity necrotic tissue and high-density collagen produced by the tumor. These considerations motivated the current investigation.

This is the first multicenter analysis of this therapy, and the largest to date. We leveraged quantitative imaging techniques to perform multiparametric measurements from tumors treated with EBUS-TBNI cisplatin. Surprisingly, measures of tumor volume were not as highly associated with response to EBUS-TBNI cisplatin as measures of density. It is important to note that several of the tumor features found to be important in this analysis are metrics of variation in tumor density, specifically variance and kurtosis. Energy is defined as the square of the mean intensity and is related more directly to the actual density of the lesion. Although not statistically significant by itself, energy was lower in the responders *vs.* the non-responders. One potential explanation for this finding is that high density regions may decrease diffusion of the agent.

Despite inclusion of two centers, the overall sample size is small due to the focused indication for which the procedure is performed. Thus, it is important to note that models constructed here have not been validated for prediction of response to therapy and are not sufficiently powered to do so. The goal of the models (constructed from both clinicoepidemiologic and radiomics features) was to gain insight into the underlying biology that may partially determine response while accounting for important confounders. Regardless of the performance of the models, LASSO regression of the radiomics features alone selected measures of density as more highly associated with response to EBUS-TBNI cisplatin. Similarly, radiomics features from only two categories, Intensity and Morphology, were evaluated to limit the degrees of freedom. These two were chosen due to their straightforward biological interpretation and preliminary data indicating their potential importance.

Features	EBUS-TBNI response			Features combined in model		
	Yes (n=27)	No (n=11)	Р	AIC	Pseudo R ²	Р
Density features				45.2	0.32	0.024
Energy	6.8×10 ⁷ (2.4×10 ⁷)	1.3×10 ⁸ (6.4×10 ⁷)	0.271			
Variance	1,220.5 (180.0)	837.5 (76.5)	0.193			
Kurtosis	13.1 (26.3)	33.7 (26.3)	0.245			
Morphology features				48.8	0.24	0.087
Surface to volume ratio	0.68 (0.07)	0.59 (0.08)	0.442			
Spherical disproportion	7.6×10 ⁻⁵ (1.8×10 ⁻⁵)	4.0×10 ⁻⁵ (1.7×10 ⁻⁵)	0.239			
Maximum 3D diameter (mm)	44.1 (4.5)	53.5 (6.2)	0.251			

Table 2 Selected radiomics features

EBUS-TBNI cisplatin, endobronchial ultrasound-guided transbronchial needle injection of cisplatin; AIC, Akaike's information criterion; 3D, 3-dimension.

We cannot comment on the association of other radiomics features. The CT scans evaluated in this investigation were obtained as part of clinical care. Thus, there were differences in CT parameters such as slice thickness between the two centers. However, stratifying the models based on center level variables (e.g., CT slice thickness) did not result in a significant difference in the results. Similarly, adjusting for reconstruction algorithms by including the density variance of the same anatomic regions across the CT scans did not change model performance.

In summary, our analysis of clinical data and radiomics features from a multicenter cohort of patients undergoing EBUS-TBNI cisplatin indicates that tumor density may be an important determinant of response to direct intratumoral therapy. These results have implications for further device development and drug delivery approaches.

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Footnote

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Conflicts of Interest: All authors have completed the ICMJE

uniform disclosure form (available at http://dx.doi. org/10.21037/jtd-20-674). CMK reports grants from NIH, during the conduct of the study; personal fees from Olympus America, grants and personal fees from Johnson and Johnson, personal fees from Boston Scientific, personal fees from Gala Therapeutics, outside the submitted work. In addition, CMK has a patent Methods for Computational Modeling to Guide Intratumoral Therapy pending and Equity holder of company, Quantitative Imaging Solutions, the performs image analysis work in lung cancer. RSJE reports grants from NHLBI, personal fees from Chiesi, personal fees from LeukoLabs, grants and personal fees from Boehringer Ingelheim, personal fees from Eolo Medical, outside the submitted work; and he is also a founder and co-owner of Ouantitative Imaging Solutions which is a company that provides image based consulting and develops software to enable data sharing. Dr. JHTB reports personal fees from Johnson and Johnson, outside the submitted work. In addition, Dr. JHTB has a patent Methods for computational modeling to guide intratumoral therapy (U.S. Patent Application No. 62/542,623. Filed: August 8, 2017 pending). GW reports grants from NIH, grants and other from Boehringer Ingelheim, other from Quantitative Imaging Solutions, other from PulmonX, grants from BTG Interventional Medicine, grants and other from Janssen Pharmaceuticals, other from GlaxoSmithKline, other from Novartis, other from Vertex, outside the submitted work; and Dr. GW's spouse works for Biogen. The other authors have no conflicts of interest to declare.

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Ethical Statement: The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). This study was approved by the University of Vermont (UVM) Committee on Human Research in the Medical Sciences (CHRMS 17-075) and by The University of Florida (UFL) Institutional Review Board (201700864). Informed consent was not required by these oversight committees due to the retrospective nature of the study.

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Kinsey et al. Tumor density and response to EBUS-TBNI cisplatin

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4832