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# **Dose-mass Inverse Optimization for Minimally-moving Thoracic Lesions**

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# Abstract

**Purpose**—In the last decade several different radiotherapy treatment plan evaluation and optimization schemes have been proposed as viable approaches, aiming in dose escalation or in an increase of healthy tissue sparing. In particular it has been argued that dose-mass plan evaluation and treatment plan optimization might be viable alternatives to the standard of care, which is realized through dose-volume evaluation and optimization. The purpose of this investigation is to apply dose-mass optimization to a cohort of lung cancer patients and compare the achievable healthy tissue sparing to the one achievable through dose-volume optimization.

**Materials and Methods**—Fourteen non-small cell lung cancer (NSCLC) patient plans were studied retrospectively. The range of tumor motion was below 0.5 cm and motion management in the treatment planning process was not considered. For each case dose-volume (DV) based and dose-mass (DM) based optimization was carried out. Nine-field step-and-shoot IMRT was used, where all of the optimization parameters were kept the same between DV and DM optimizations. Commonly used dosimetric indices (DIs) such as dose to 1% the spinal cord volume, dose to 50% of the esophageal volume, doses to 20% and 30% of healthy lung volumes, were used for cross-comparison. Similarly, mass-based indices (MIs), such as doses to 20% and 30% of healthy lung masses, 1% of spinal cord mass, 33% of heart mass, were also tallied. Statistical equivalence tests were performed to quantify the findings on the entire patient cohort.

**Results**—Both DV and DM plans for each case were normalized such that 95% of the planning target volume received the prescribed dose. DM optimization resulted in more organs at risk (OAR) sparing than DV optimization. The average sparing of cord, heart, and esophagus is 23%, 4%, and 6%, respectively. For the majority of the DIs, DM optimization resulted in lower lung doses. On average the doses to 20% and 30% of healthy lung were lower by about 3% and 4%, while lungs volumes receiving 2000 cGy and 3000 cGy are lower by 3% and 2%, respectively. The behavior of MIs was very similar. The statistical analyses of the results again indicated better healthy anatomical structures sparing with DM optimization.

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**Conclusions**—The presented findings indicate that dose-mass based optimization results in statistically significant OAR sparing as compared to dose-volume based optimization for NSCLC. However, the sparing is case dependent and it is not observed for all tallied dosimetric endpoints.

#### Keywords

dose; mass; volume; IMRT; lung; optimization

#### 1. Introduction

Lung cancer is the most common cause of cancer-related deaths worldwide. Two major types are small or non-small cell lung cancer. Non-small cell lung cancer (NSCLC) comprises about 84% of the diagnosed cases.(American Cancer Society, 2014) Definitive radiotherapy is suitable for approximately 40% of NSCLC cases. (Perez et al., 2004) It has been demonstrated that 70 Gy is a significant threshold in terms of survival benefits, (Kong et al., 2005) while doses of ~85 Gy are required to achieve 30 months of local progressionfree survival.(Martel et al., 1999) Phase I RTOG 0117 trial demonstrated that 74 Gy is the maximum tolerated dose in combined chemo-radiotherapy for that disease, indicating the detrimental effects of chemo-radiotherapy combination which prohibit dose escalation. (Auperin et al., 2006; Bradley et al.; Gopal et al., 2003a; Meadors et al., 2006) Healthy tissue tolerance is very often the dose limiting factor for a definitive lung cancer treatment. Symptomatic radiation-induced lung injury occurs in ~30% of the patients, while radiologic evidence occurs in ~50% of the NSCLC cases.(Mathew et al.; Movsas et al., 1997; Kocak et al., 2005; McDonald et al., 1995; Rodrigues et al., 2004; Evans et al., 2007; Graham et al., 1999; Marks et al., 2000; Fan et al., 2001; Fu et al., 2001; Anscher et al., 2003; Marks et al.; Ma et al., 2009)

Human respiration includes changes in both lung volumes and lung masses.(Wei *et al.*, 2005; Brecher and Hubay, 1955; Vermeire and Butler, 1968) While the changes in lung volumes are intuitive, the changes in lung masses are not obvious, and they have not been adequately explored and accounted for.(Nioutsikou *et al.*, 2005; Butler *et al.*, 2004) To date, mass information has been utilized only in evaluation of treatment plans and radiobiological modeling for NSCLC.(Butler *et al.*, 2004; Forster *et al.*, 2001; Mavroidis *et al.*, 2006; Nioutsikou *et al.*, 2005; Tucker *et al.*, 2006; Wei *et al.*, 2005) Dose-mass histograms (DMHs) were introduced for evaluation and review of thoracic treatment plans.(Butler *et al.*, 2004; Forster *et al.*, 2006; Nioutsikou *et al.*, 2001) Shortly after, the analytic rationale (not complete in our opinion) for their application was outlined.(Mavroidis *et al.*, 2006; Nioutsikou *et al.*, 2005) More recently a conceptual study, shedding more light on the mathematical formalism of dose-mass inverse optimization, was published.(Mihaylov and Moros, 2014)

The purpose of the present work is to retrospectively evaluate treatment plans generated through conventional dose-volume inverse optimization and newly developed dose-mass inverse optimization paradigm.

# 2. Materials and Methods

According to published data,(Keall *et al.*, 2006a; Stevens *et al.*, 2001; Mihaylov *et al.*, 2010) in nearly half of the lung cases the lesions move less than 0.5 cm in superior-inferior direction. The investigation herein is targeted toward those minimally moving lung lesions, since the effect of motion would not play a role in the treatment planning and the treatment motion management.(Keall *et al.*, 2006b; Keall *et al.*, 2001)

#### 2.1. Patients

Fourteen lung cancer patients, who had time-resolved (4D) computed tomography (CT) simulations, were retrospectively evaluated. The 4D CT scans were performed on a Philips Big Bore Brilliance multi-slice CT scanner (Philips Medical Systems, Cleveland, OH) interfaced with a Varian (Varian Medical Systems, Palo Alto, CA) real-time position management (v. 1.62) respiratory gating system(Kubo *et al.*, 2000). The patients were scanned under normal respiration without coaching. The tumor motion range was estimated from the reconstructed 4D CT data. In all patients selected for this study the tumor motion was within 0.5 cm, where the 0.5 cm threshold was determined from a sagittal projection on the 4D CT. In other words if motion in superior-inferior and anterior-posterior was less than 0.5 cm, the patients were selected for the study. The disease stages are T2 (3 patients), T3 (8 patients), and T4 (3 patients) with different nodal involvement from N0 to N3.

#### 2.2. Phase Selection and Contouring

A mid-ventilation phase, representing an average phase over the entire breathing cycle, was selected for external beam inverse treatment planning.(Wolthaus *et al.*, 2008) The GTV was contoured in the mid-ventilation phase of the breathing cycle by using anatomical correlation between CT simulation data set and available diagnostic imaging studies (i.e. CT, MRI or PET-CT). A Planning target volume (PTV) was generated by a uniform expansion of 1 cm around the GTV. The lungs were contoured on mid-ventilation phase CT data sets with the automatic lung contouring tools in Pinnacle<sup>3</sup> (Philips Medical Systems, Fitchburg, WI) treatment planning system (TPS). The lung contours were visually verified on each slice.

#### 2.3. Treatment Planning

For each patient an IMRT deliverable(Dogan *et al.*, 2006; Mihaylov and Siebers, 2008; Siebers and Mohan, 2003; Siebers *et al.*, 2002) optimization was performed. Two plans were generated – one with newly proposed dose-mass (DM) optimization,(Mihaylov and Moros, 2014) and another one based on the standard of care realized through dose-volume (DV) optimization.(Fredriksson, 2012; Shipley *et al.*, 1979; Wu and Mohan, 2000) The treatment plans consisted of 9 co-planar 6MV beams. DM and DV plans for each patient were normalized such that 95% of the PTV received the prescription dose. Once prescription was achieved, the doses to organs at risk (OARs) such as spinal cord, heart, esophagus, and lungs were iteratively lowered until standard deviation of the dose across the PTV in each plan became ~ 4%.(Aaltonen *et al.*, 1997) For the targets with either optimization scheme pure dose objectives were used. The objectives included minimum, maximum, and uniform

desired doses to the target. For the OARs the IMRT objectives were dose-volume and dosemass based, depending on the optimization scheme.

#### 2.4. Analysis

The dose distributions computed with the DM optimization were used as a reference to which the dose distributions computed with the DV optimization were compared. The metric used to perform the comparison was based on dose-volume indices (DVI), isovolumes (volumes encompassed by certain isodose line), dose-mass indices (DMI) derived from dose-mass histograms,(Butler *et al.*, 2004; Nioutsikou *et al.*, 2005) and isomasses (mass of healthy tissue receiving greater than pre-specified dose). The evaluated DVIs were DVI<sup>PTV</sup> 95% (dose to 95% of the PTV), DVI<sup>Cord</sup> 1%, DVI<sup>Heart</sup> 33%, DVI<sup>Esophagus</sup> 50%, DVI<sup>Lung</sup> 20%, and DVI<sup>Lung</sup> 30%. The compared DMIs were for 1% of the mass of the cord, 33% of the heart, 50% of the esophagus, and 20% and 30% of the lungs. DMIs are represented by the dose covering certain mass of an OAR while DVIs are doses covering a certain volume of an OAR.

A statistical equivalence test was used to determine the minimum dose, volume, or mass interval around the reference DIs, MIs, isovolumes, and isomasses, such that the reference and the compared index values were equivalent.(Mihaylov and Siebers, 2008; Mihaylov *et al.*, 2010) The test was performed for each index using two one-tailed paired *t*-tests(Rosner, 1986). The dose/fractional volume/mass interval was initially set to zero and the *t*- and *p*-values computed. Subsequently, the dose/fractional volume interval was progressively increased in 1 cGy/1 g steps until equivalence between the indices with p < 0.05 was reached.

# 3. Results

Both DV and DM plans were normalized such that 95% of the PTV received the prescription dose. Therefore, with either optimization scheme the therapeutic effects of the plans are supposed to be the same and dosimetric indices for the targets would not be evaluated further

#### 3.1. OAR DIs, MIs, Isovolumes and Isomasses

The results from the per-patient evaluation of the OAR normalized DVIs and isovolumes are presented in Figure 1. In the normalization of the tallied indices, the quantities obtained from the DM plans were used as a reference. Therefore, doses for different DVIs or isovolumes for different patients could be visualized together on a single plot.(Mihaylov *et al.*, 2007; Mihaylov and Siebers, 2008) In order to aid the evaluation of the obtained differences unity is denoted on the figure by a dotted line. If a normalized DV or isovolume is greater than unity then the DM optimization results in *lower* absolute value for that quantity and vice versa. Majority of DVIs for spinal cord, heart end esophagus demonstrate that DM optimization results in more OAR sparing than DV optimization (cf. top panel of Figure 1). The differences range from -23% (dose to 1% of the spinal cord for patient 3) to more than 60% (dose to 1% of the spinal cord for patient 5) with average sparing of cord, heart, and esophagus of 23%, 4%, and 6% respectively. Negative difference corresponds to

better lower dosimetric values with DV optimization. Bottom panel of the figure represents the healthy lung indices. The behavior is very similar to the spinal cord, heart and esophagus DVIs. For majority of the indices DM optimization yields lower lung doses. On average the doses to 20% and 30% of healthy lung are lower by about 3% and 4%, while lungs volumes receiving 2000 cGy and 3000 cGy are lower by 3% and 2% respectively.

Figure 2 represents the corresponding MIs and isomasses. For all OARs, the majority of the tallied indices indicate more healthy tissue sparing with DM optimization. The average DMIs for the spinal cord, the heart, and the esophagus have values very close to the average DVI differences. Doses to 20% and 30% mass of lung tissue differ between DM and DV optimization by 4% and 4.8%, while lung mass receiving more than 2000 cGy and 3000 cGy differ by 3% and 2.6% respectively.

#### 3.2. Statistical analyses

Table 1 contains the average value of the DVIs (estimated from the doses derived by the DM optimization) in cGy, the statistical equivalence in cGy, and the percent change in the dose index necessary to establish statistical equivalence. In addition, the bottom two rows of the table contain the lung volumes encompassed by 2000 and 3000 cGy isodose lines in  $cm^3$ , as well as the statistical equivalence interval and the percent change with respect to the average. The statistical equivalence tests demonstrate that the DVIs percent change for equivalency for the lungs range from 3.5% to 5.4%. However, the DIs to heart, cord, and esophagus differ from 8% to more than 40%. Table 2 is the counterpart of Table 1, with the only difference that the tallied quantities were derived from the dose-mass histograms. The statistically significant sparing of lung mass varies from 4% to almost 6.5%. The statistically significant differences in sparing of heart, esophagus, and spinal cord tissue are from 8% to 40%. Table 3 presents the statistical significance test results for generalized equivalent uniform doses for (gEUDs) for the OARs of interest.(Niemierko, 1997, 1999) The parameters a used in the calculation of the gEUDs is based on the available published values.(Wu and Mohan, 2000; Burman et al., 1991; Cella et al., 2014; Belderbos et al., 2005) The percent change with respect to the average gEUDs calculated from the DM plans again range from about 4% for the heart to nearly 100% for the spinal cord.

# 4. Discussion and Conclusion

Radiation toxicity and normal tissue injury is a common problem in radiotherapy.(Marks and Ma, 2007) Several studies have demonstrated that chemo-radiotherapy combination in cancer treatments has rather detrimental effects on normal tissue.(Bentzen and Trotti, 2007; Bradley *et al.*; Gopal *et al.*, 2003b) In case of NSCLC phase I RTOG 0117 trial demonstrated that combined chemo-radiation prevents dose escalation,(Bradley *et al.*, 2010) while single institution studies have reported on decreased total lung capacity and lung diffusing capacity as a result of chemo-radiotherapy combination.(Gopal *et al.*, 2003a) Those findings indicate that new approaches, allowing reduction of radiation induced toxicity in normal tissue, would benefit those patients who need radiation therapy as part of their standard of care.

Mihaylov and Moros

The findings herein show that on average DM based optimization results in better OAR sparing than DV optimization for lung cancer patients. This has been demonstrated by both comparing the observed differences on point-by-point basis as well as performing paired statistical analyses on the data. The statistical equivalence tests indicate sparing ranging from 4% to more than 40%. In case of the seventy individual DIs presented on Figure 1 twenty of them showed percent differences larger than the statically equivalent values quoted in Table 1. Therefore, in more than one quarter of the observed points the DM optimization results were at least as large as the quoted significant differences. In case of the gEUDs, the observed differences were in excess of the relative levels reported in Table 3 in eighteen out of fifty six individual data points for all patient, thereby indicating that in almost one third of all tallied gEUDs DM optimization outperforms DV optimization. Those lower doses can be used for normal tissue sparing or alternatively isotoxic dose escalation may be exploited.

Notably, target dose differences of 3% and more have observable clinical significance. (Bentzen, 2004; Dutreix, 1984; Mijnheer, 1996) It should be noted however, that the sparing is case dependent and it is not observed for all tallied dosimetric endpoints. The combined plots evaluating all of compared dosimetric quantities indicate that the most modest healthy tissue sparing is observed in the lungs and in the heart, while significantly better sparing is achieved in the spinal cord and the esophagus with dose-mass based inverse optimization. Investigation of DM optimization on an idealized simulated phantom indicated that DV optimization is a special case of DM optimization, where in homogeneous media there is no difference between the cost functions.(Mihaylov and Moros, 2014) The simple example presented therein also demonstrated the fact that in DM optimization dose is delivered to the target through lower density regions where the attenuation is lower.

In order to shed some light on the significance of the observed differences through Figures 1 and 2 as well as Tables 1 through 3 an normal tissue complication probability (NTCP) model based on the original work by Kutcher *et. al.* was developed.(Kutcher *et al.*, 1991) The organ dependent model parameters *n*, *m* and  $TD_{50}$  for the different anatomical structures have been derived from published studies. (Belderbos *et al.*, 2005; Burman *et al.*, 1991; Cella *et al.*, 2014; Semenenko and Li, 2008; Schultheiss, 2008) According to the model the differences in the gEUDs of an OAR may result in substantial change in the expected complication probability. If lung gEUD is 20 Gy, then 6% increase in dose will result in modest 3% increase of the NTCP. Similarly, if heart gEUD is 20 Gy, a change of 4% will result only in 2.5% increase in the NTCP. A change of 47.5% in esophageal gEUD of 20 Gy will result in about 9.5% increase in the NTCP predicted by the model. Obviously change in cord gEUD of ~100% for 20 Gy would result in rather small increase of the NTCP, but a change of that magnitude for gEUD of 30 Gy will result in NTCP increase of over 25%. Nonetheless, dose reduction to normal tissue, for adequate therapeutic dose to the tumors, would always benefit patients regardless of the model derived numbers.

It is possible that the advantages afforded by dose-mass inverse optimization over dosevolume inverse optimization can be attributed to further personalizing the dose optimization to a given patient by weighting the cost function components by the variable mass in every

voxel (density).(Mihaylov and Moros, 2014) In dose-volume optimization voxels are usually all of the same volume so the weighting is uniform.

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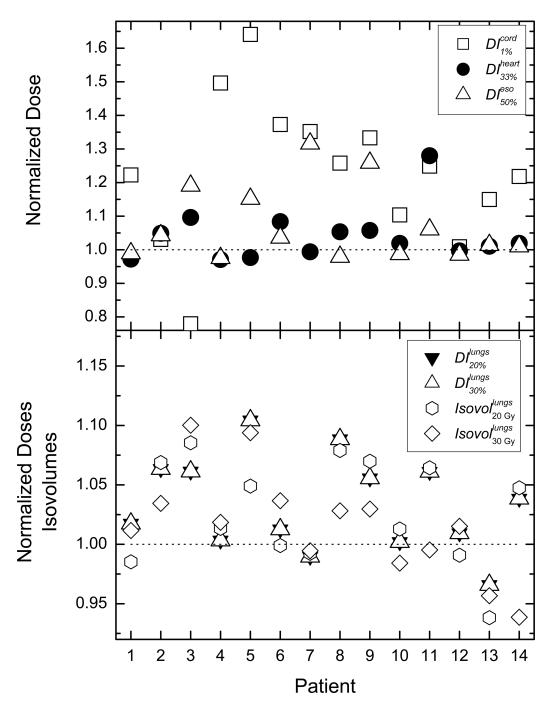
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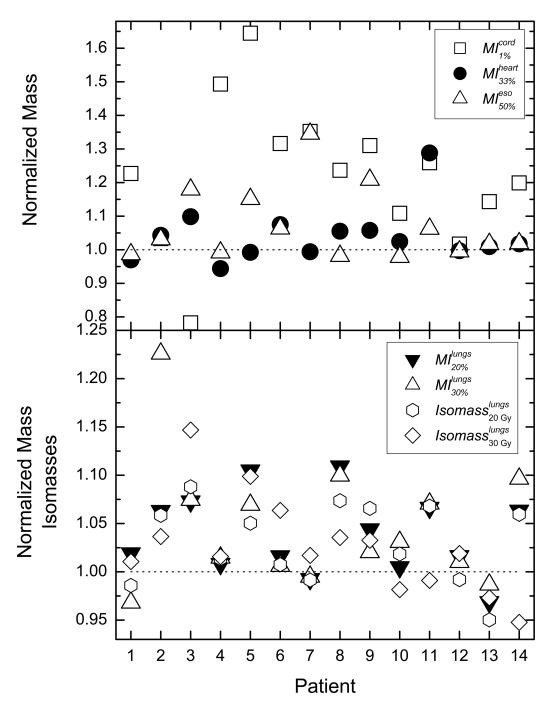
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#### Figure 1.

Normalized dose indices and isodose volumes for all patients. In the top panel the indices for the heart, spinal cord, and esophagus are presented, while in the bottom panel the lung data is plotted.



#### Figure 2.

The presented data is the same as in Figure 1, but in this case the dose data has been extracted from the dose-mass histograms. In the top panel are the normalized doses to 1% mass of the spinal cord, 33% of the heart mass, and 50% of the esophagus mass. In the bottom panel the presented data is for doses to 20% and 30% of lung mass, as well as the lung tissue mass receiving 2000 and 3000 cGy.

#### Table 1

Dose intervals at which statistical equivalence test indicates that the differences between DM and DV derived DVIs are statistically significant (p<0.05). The average doses or volumes are derived from the DM optimization.

Dose Volume Index	Average Value of Tallied Index [cGy or cm <sup>3</sup> ]	Statistical Equivalence Interval [cGy or cm <sup>3</sup> ]	Percent change for equivalency (% Sparing) [%]
heart DI33%	981.3	79	8.0
cord DI <sub>1%</sub>	1366.0	571	41.2
esophagus DI <sub>50%</sub>	443.8	81	18.3
lungs DI <sub>20%</sub>	2421	126	5.2
lungs DI <sub>30%</sub>	1708.5	93	5.4
Isovolume 2000 cGy	819.1	31	3.8
Isovolume 3000 cGy	510.8	17.1	3.5

# Table 2

The same as Table 1 but for the dose intervals derived from the dose-mass histograms.

Dose Mass Index	Average Value of Tallied Index [cGy or g]	Statistical Equivalence Interval [cGy or g]	Percent change for equivalency (% Sparing) [%]
heart MI <sub>33%</sub>	967.7	77	8
cord MI <sub>1%</sub>	1387.8	559	40.3
esophagus MI <sub>50%</sub>	442.7	74	16.8
lungs MI <sub>20%</sub>	2285	128	5.6
lungs MI <sub>30%</sub>	1572	101	6.4
Isomass 2000 cGy	253.5	9.8	3.9
Isomass 3000 cGy	159.5	7.0	4.4

# Table 3

The same as Table 1 but for generalized equivalent uniform doses derived from the dose-volume histograms.

gEUD	Average Value of Tallied Index [cGy]	Statistical Equivalence Interval [cGy]	Percent change for equivalency (% Sparing) [%]
heart ( $a = 6.0$ )	3058	118	4
cord ( $a = 7.4$ )	758	736	97
esophagus ( $a = 1.5$ )	1200	569	47.5
lungs ( <i>a</i> = 1.2)	1533	93	6.1