

Gradience-boosted automatic robust dose-mimicking for proton therapy

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Purpose

Dose-mimicking aims to generate treatment plans based on a reference dose distribution. The importance of dose-mimicking has grown substantially due to the increasing demand for rapid plan adaptation in adaptive radiotherapy—particularly in proton therapy, where dose uncertainty remains a significant concern. However, developing a unified, automated dose-mimicking module for proton therapy is challenging, especially when planning a dose equivalent to or superior to the reference dose. We proposed a generally applicable dose-mimicking framework for proton therapy planning, combined with a gradient-boosted (GB) approach.

Results

The GB approach increased the cost-function gradients during optimization by 85.3% for organs at risk (OARs) and 54.1% for targets. After GB optimization, gradients decreased by 63.2% in OARs and 9.57% in targets, indicating that the GB approach enables further improvement in plan quality. The HI of CTV in the reference was 0.20 ± 0.14 , and for the GB dose-mimicking plans, it was 0.16 ± 0.10 . The dose difference ($\text{Plan}_{\text{in-house}} - \text{Plan}_{\text{reference}}$, %) for CTV D_{95} was $0.80 \pm 2.00\%$, for CTV D_2 was $-2.69 \pm 3.22\%$, for OARs was $-3.39 \pm 7.59\%$, demonstrating improved dose conformity.

Methods

A GB cost function was designed and implemented for robust dose-mimicking. Ten clinically implemented plans from RayStation were used as references for automated dose-mimicking validation. The cost-function gradients during optimization were analyzed to demonstrate the effectiveness of the GB approach. Percentage differences of dose-volume histogram (DVH) metrics between reference and auto-generated plans were calculated. Moreover, the homogeneity index (HI) of the clinical target volume (CTV) was also calculated. All dose-mimicking was performed on an in-house treatment planning system.

Conclusion

This feasibility study demonstrates the potential of the GB approach in proton dose-mimicking. Owing to its plug-and-play nature, the proposed approach may have broader applicability in adaptive and general radiotherapy planning.

Table 1. Summary of DVH metric comparisons across the cost functions

	CTV HI	$\Delta\text{CTV } D_{95}$	$\Delta\text{CTV } D_2$	ΔOARs
Reference	0.20 ± 0.14			
Directly	0.25 ± 0.13	$-2.48 \pm 2.87\%$	$0.64 \pm 0.75\%$	$-3.77 \pm 8.36\%$
Automatic	0.18 ± 0.11	$0.67 \pm 1.46\%$	$-1.10 \pm 2.79\%$	$-2.91 \pm 7.25\%$
Automatic+GB	0.16 ± 0.10	$0.80 \pm 2.00\%$	$-2.69 \pm 3.22\%$	$-3.39 \pm 7.59\%$

Gradience Calculation of spots weight optimized by non-GB cost function

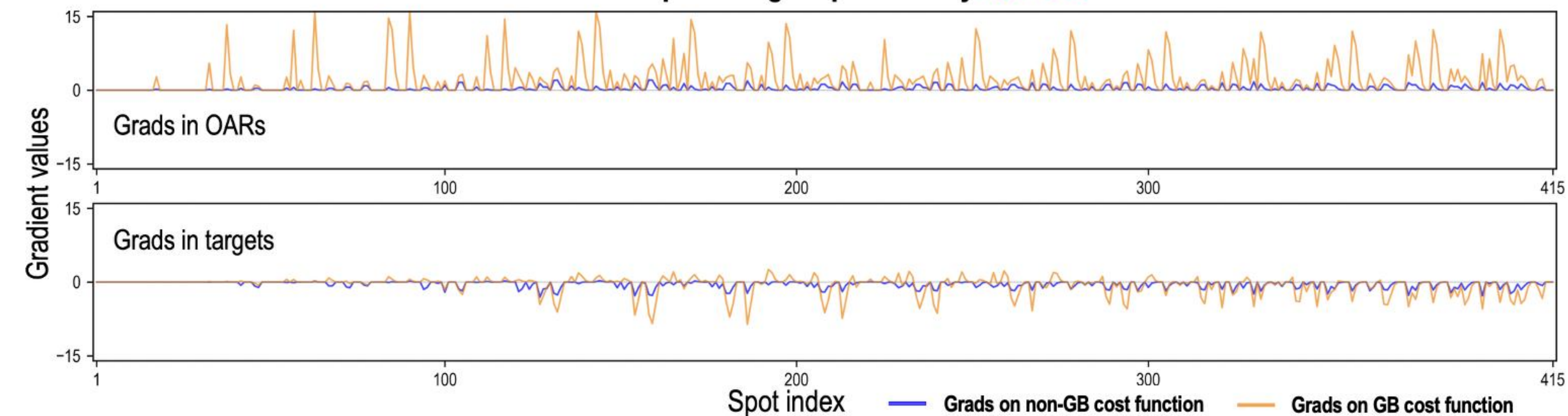


Figure 1. A comparison of the gradient between the non-GB cost function and the GB cost function.

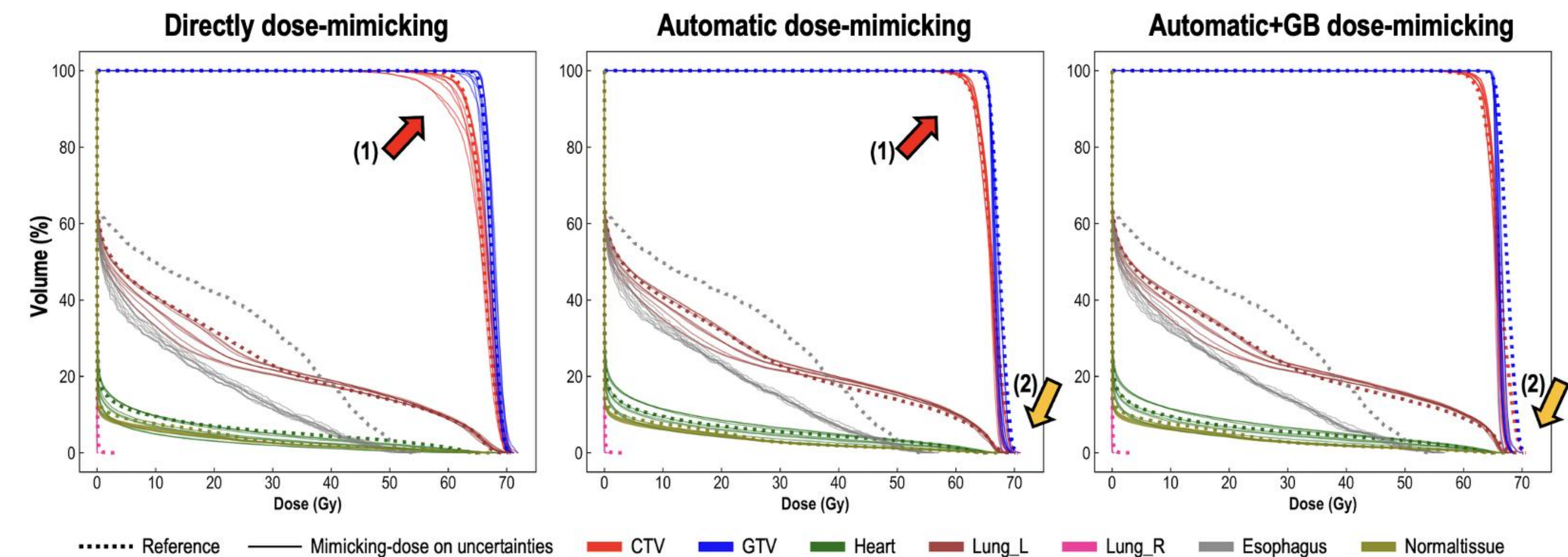


Figure 2. Example of dose optimizations (opt) using different cost functions.