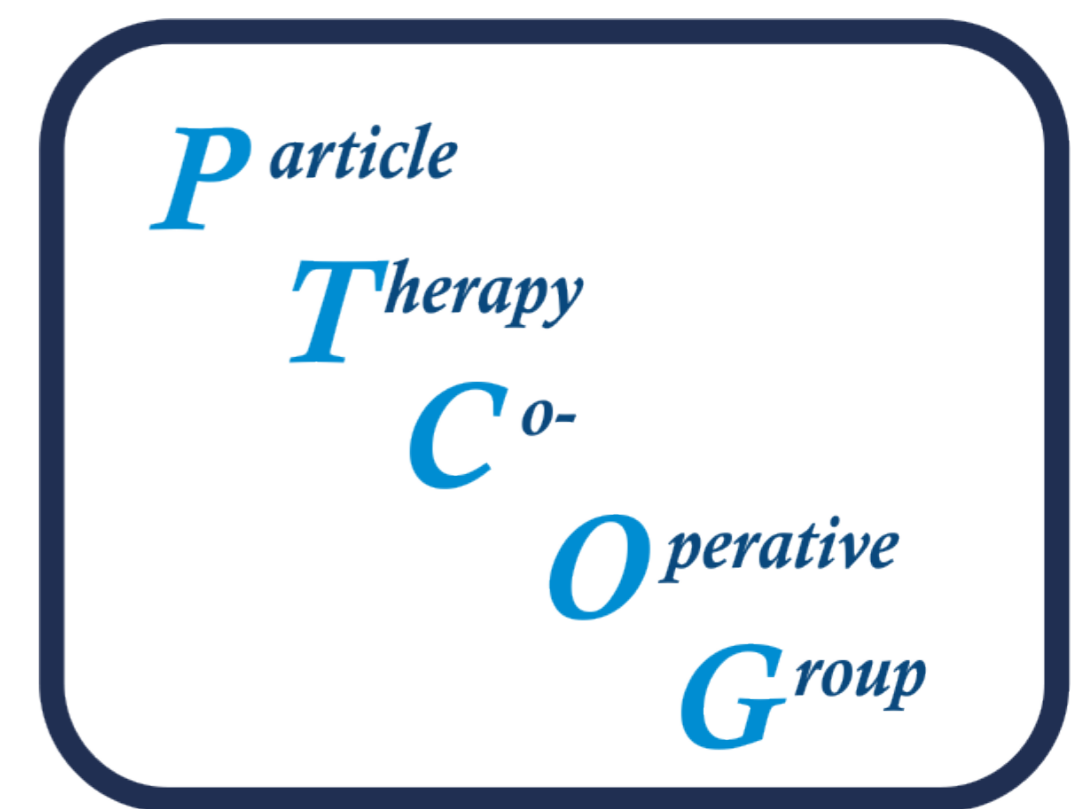


# Utilizing piecewise linear DVH based score functions to fully automate FLASH / IMPT dose optimization for objective treatment modality comparison

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2023 PTCOG Annual Meeting

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I am employed by Varian on the Medical Affairs team

My job currently includes testing new products and providing feedback including FLASH radiotherapy

I've been creating FLASH treatment plans since 2017

I used development builds of Eclipse and Non Clinical modes of the ProBeam delivery system for examples

DISCLAIMER:

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**A Siemens Healthineers Company**

*"The views expressed in this presentation are mine, and mine alone. They do not represent those of Varian, A Siemens Healthineers Company"*

## Disclaimer 2: FLASH Intellectual Property

- Varian intends to leverage all intellectual property protections and is committed to protecting our innovations throughout the world.
- Varian has numerous pending and issued patents worldwide related to FLASH therapy and technology

- 1 Dosimetric Scorecard Concepts
- 2 Direct Piecewise Linear Optimization
- 3 Dosimetric & Doserate Results



# Dosimetric Scorecard Concepts

Piecewise linear DVH based score functions precisely capture clinical intent

# 1

# Dosimetric Scorecards: Basic Principles

- Between two different patients, scores should not be directly compared
- Designed to analyze multiple plan options for the same patient/case
- Scorecards can be created for a single patient, but better to be created per protocol or class of patients
- Max score should not be achievable
  - Scorecard total
  - Per metric
- Powerful tool for retrospective plan quality analysis
  - Create dosimetric wish list to document best achievable today to reexamine in the future



# Building an individual scoring metric

METRIC EDITOR

Scorecard Structure Id: Parotdlps-PTV  
Plan Structure: Parotdlps-PTV  
Metric Type: MeanDose

Metric Comment: **4** ALARA (10-18Gy) /NRG-HN004 (26Gy)

METRIC BUILDER

Dose Units: Gy

RANK	VALUE	SCORE	VARIATION	COLOR
0	10	12	<input type="checkbox"/>	Dark Green
1	18	11.5	<input type="checkbox"/>	Bright Green
2	26	8	<input checked="" type="checkbox"/>	Yellow
3	35	0	<input type="checkbox"/>	Orange

**1** **2** **3**

**Mean Dose Score**

The graph plots Score (Y-axis, 0 to 10) against Dose [Gy] (X-axis, 10 to 35). The data points are: (10, 12), (18, 11.5), (26, 8), and (35, 0). A yellow diamond is placed at the point (26, 8), representing the variation range. The line is green for the first two points and yellow for the last two points.

1. Points assigned for mean dose in Gy

2. Metric points scorecard expressed in qualitative colors

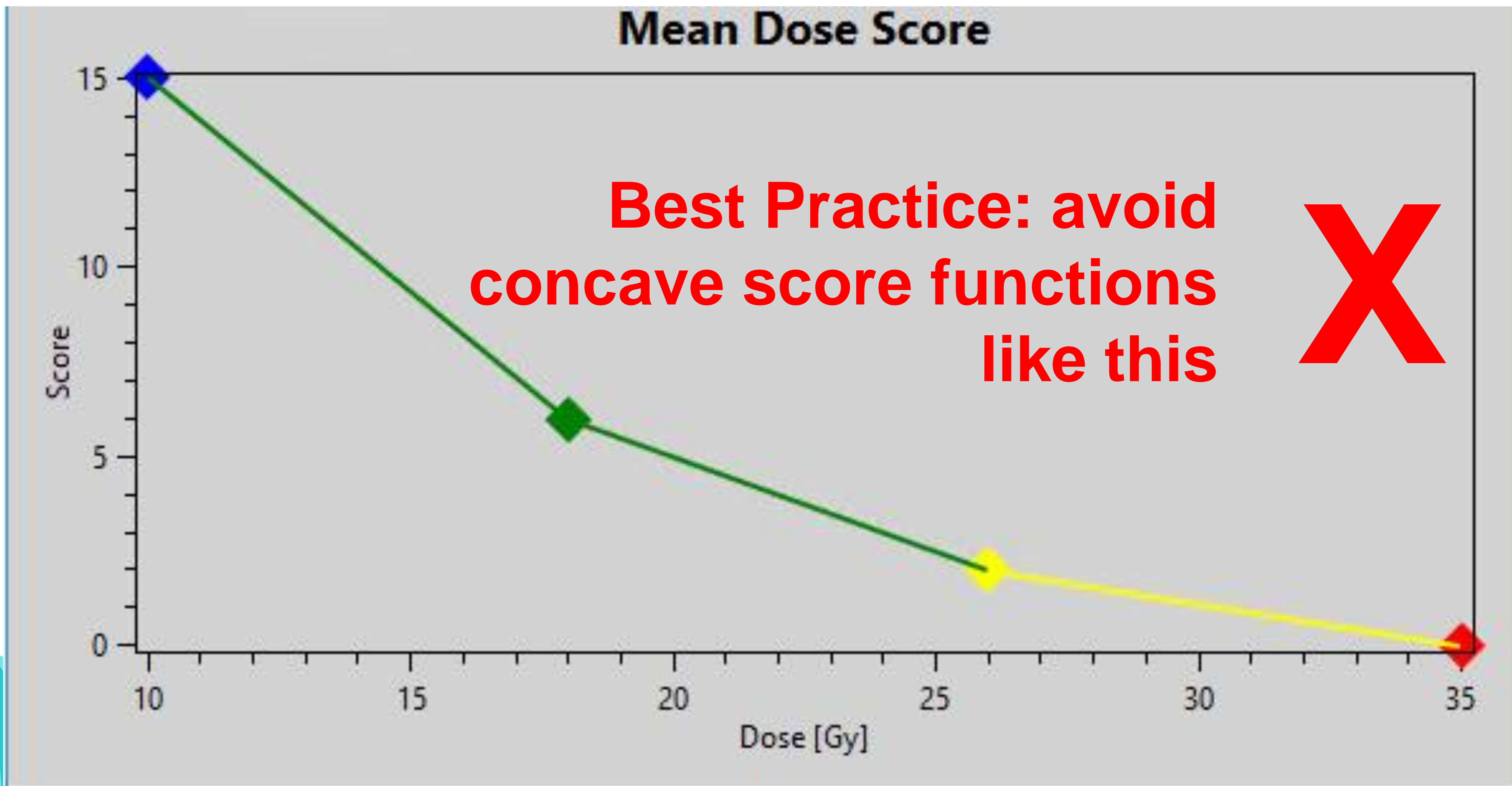
- Orange = 0-8 points
- Dark Green = Full points

3. Points plotted as a piecewise linear function

- Yellow symbolizes variation range

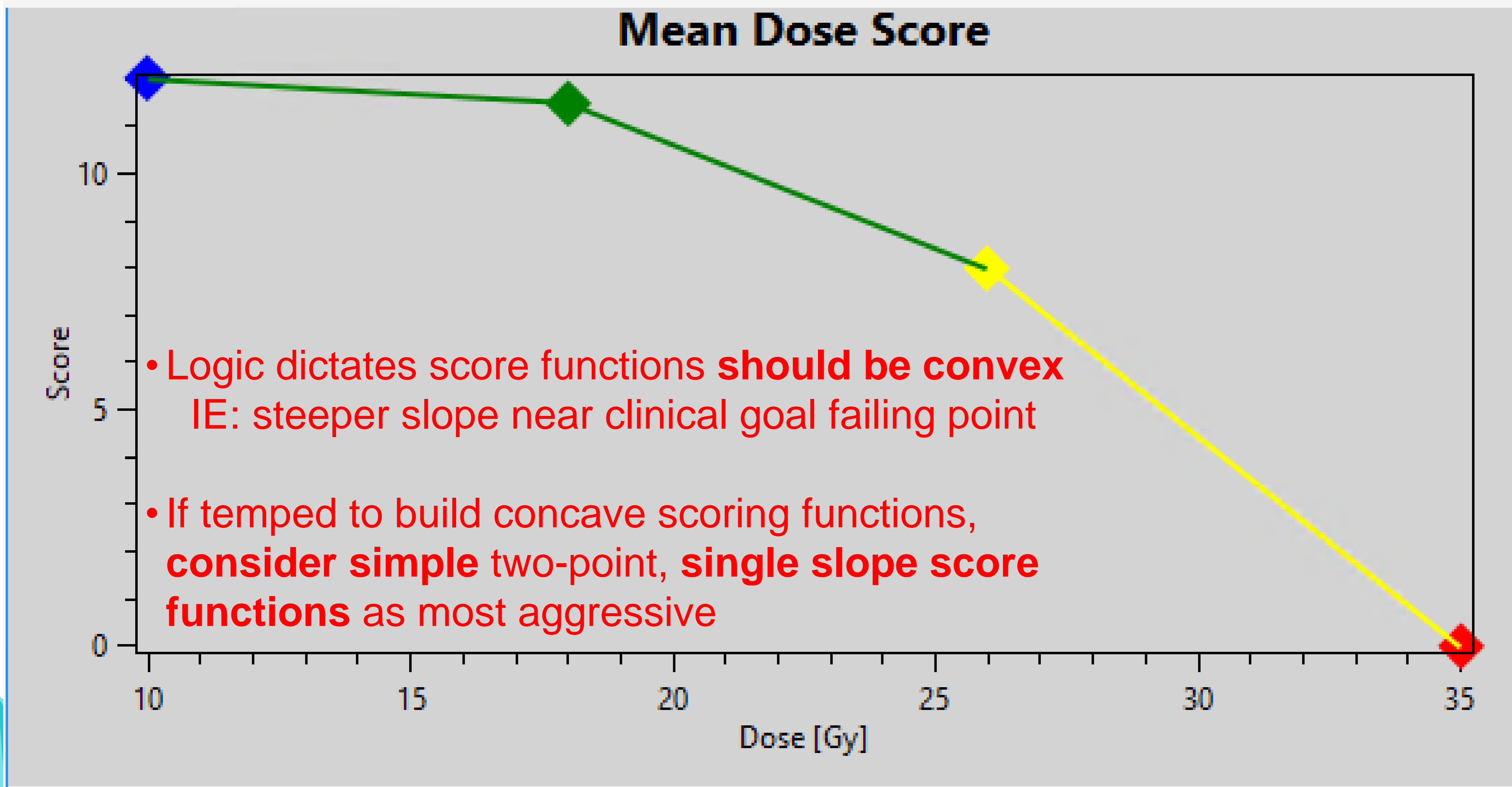
4. Comment box used for referencing protocol

# Scoring metrics should not be concave





# Scoring metrics should be convex



# Scorecard point distribution: Best Practices

- Balance Target metrics (up to 50%)

- Max/min dose
- % coverage
- Homogeneity
- Conformality

- OAR metrics

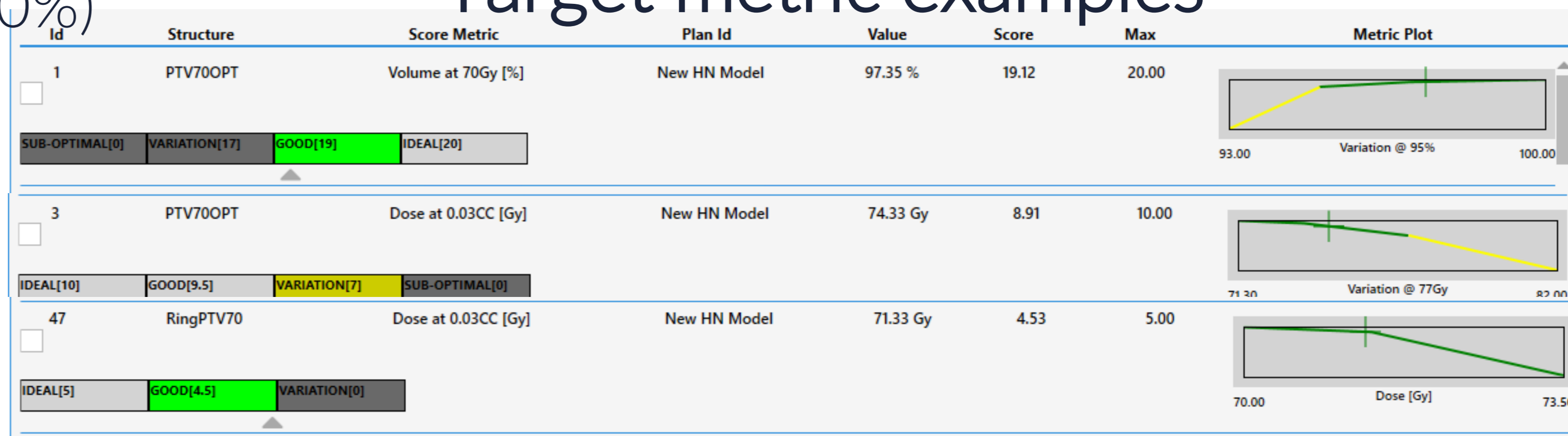
- Volume at Dose
- Mean dose
- Dose at Volume (0.03cc)

- Highest points to PTV coverage

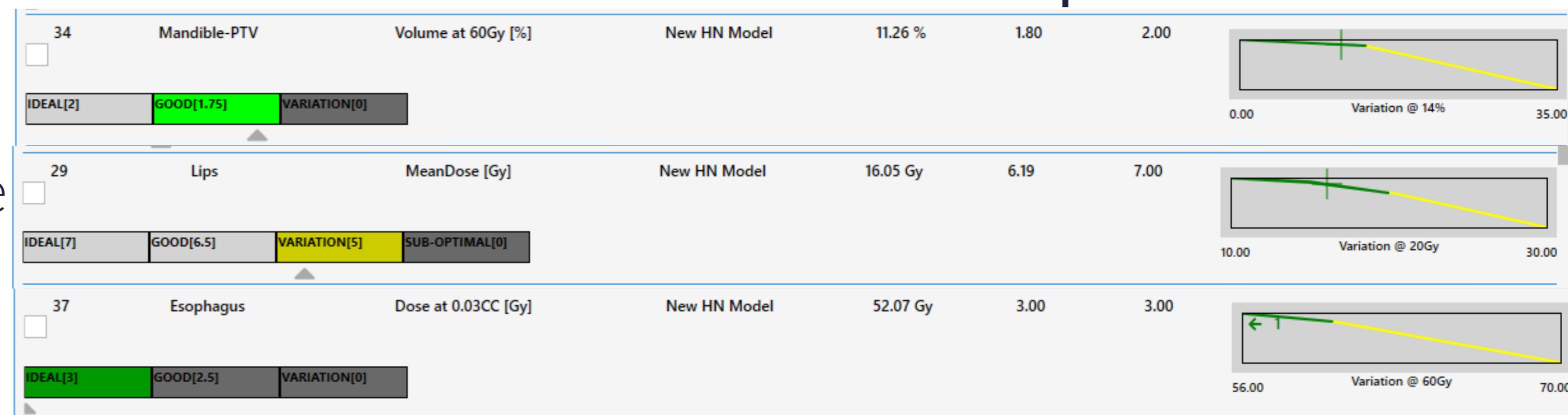
- Add multiple dose level rings

- Max is ideal (not achievable)

## Target metric examples



## OAR metric examples





# Direct Piecewise Linear Optimization

No stretchy quadratic functions: Higher Score = Better Plan

# 2

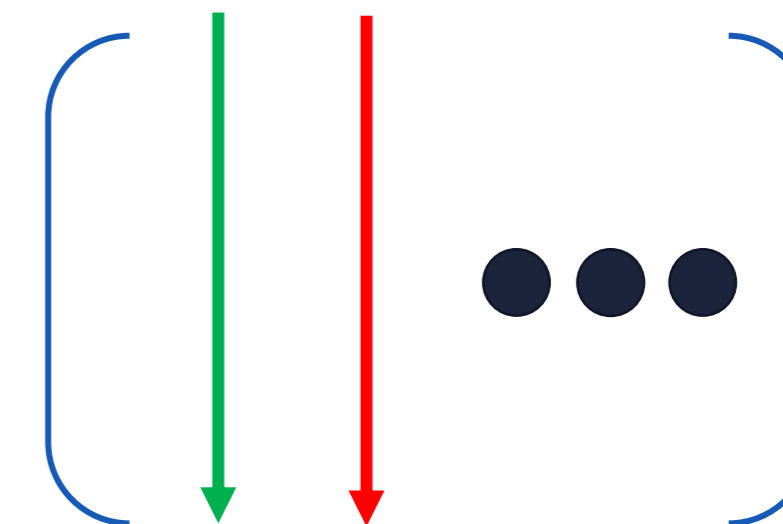
# Calculate Dose Influence Matrix

- Turn all but one spot completely off
  - Calculate the final dose
  - Flatten the dose to one dimension
  - Store as a column in 2D array
- Repeat for all spots
- End up with  $M \times N$  dose influence matrix
  - $M$  is number of pixels in patient volume,  $N$  is number of spots
  - Shows contribution of every spot to dose in every pixel

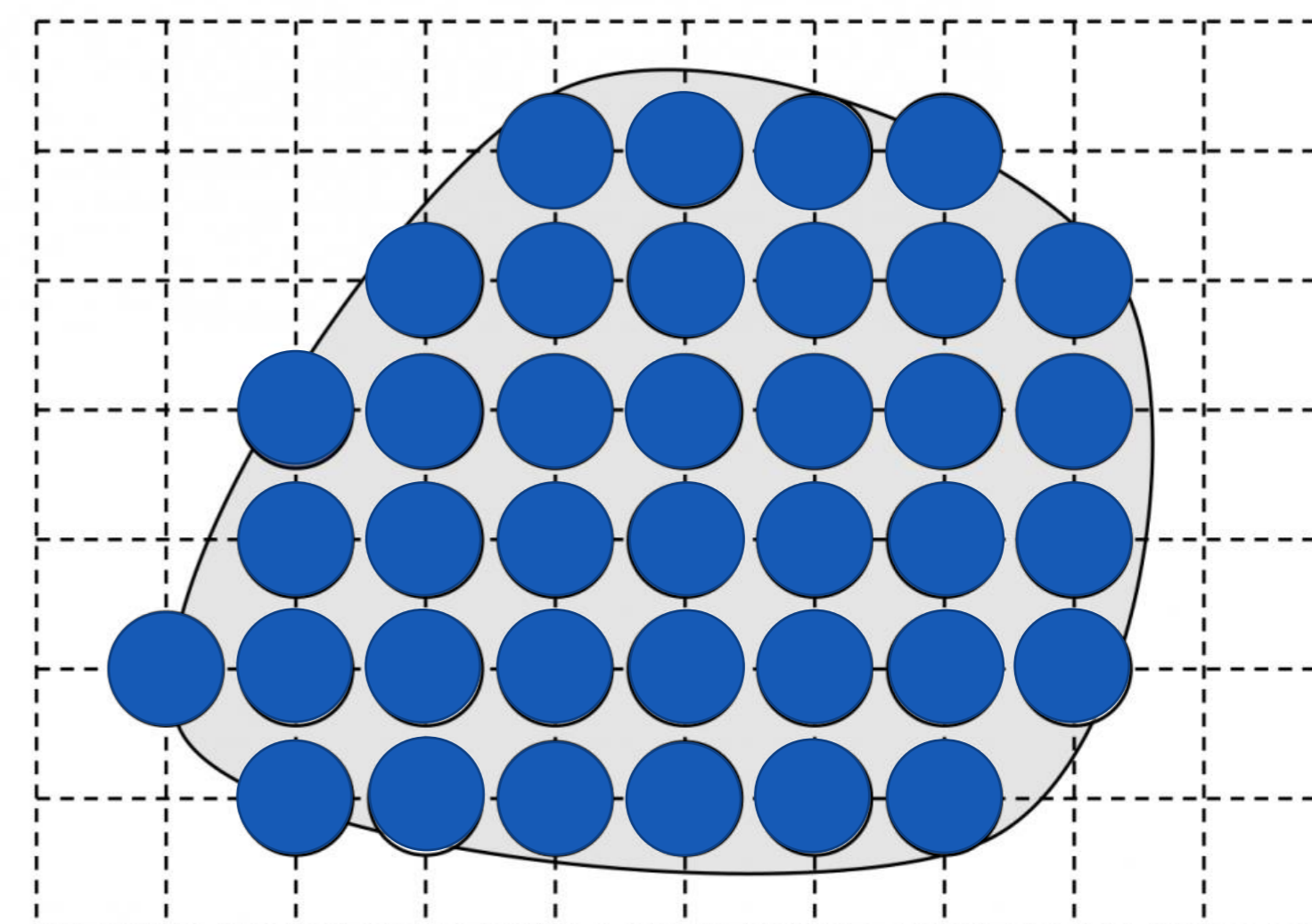
Dose Volume



Dose Influence



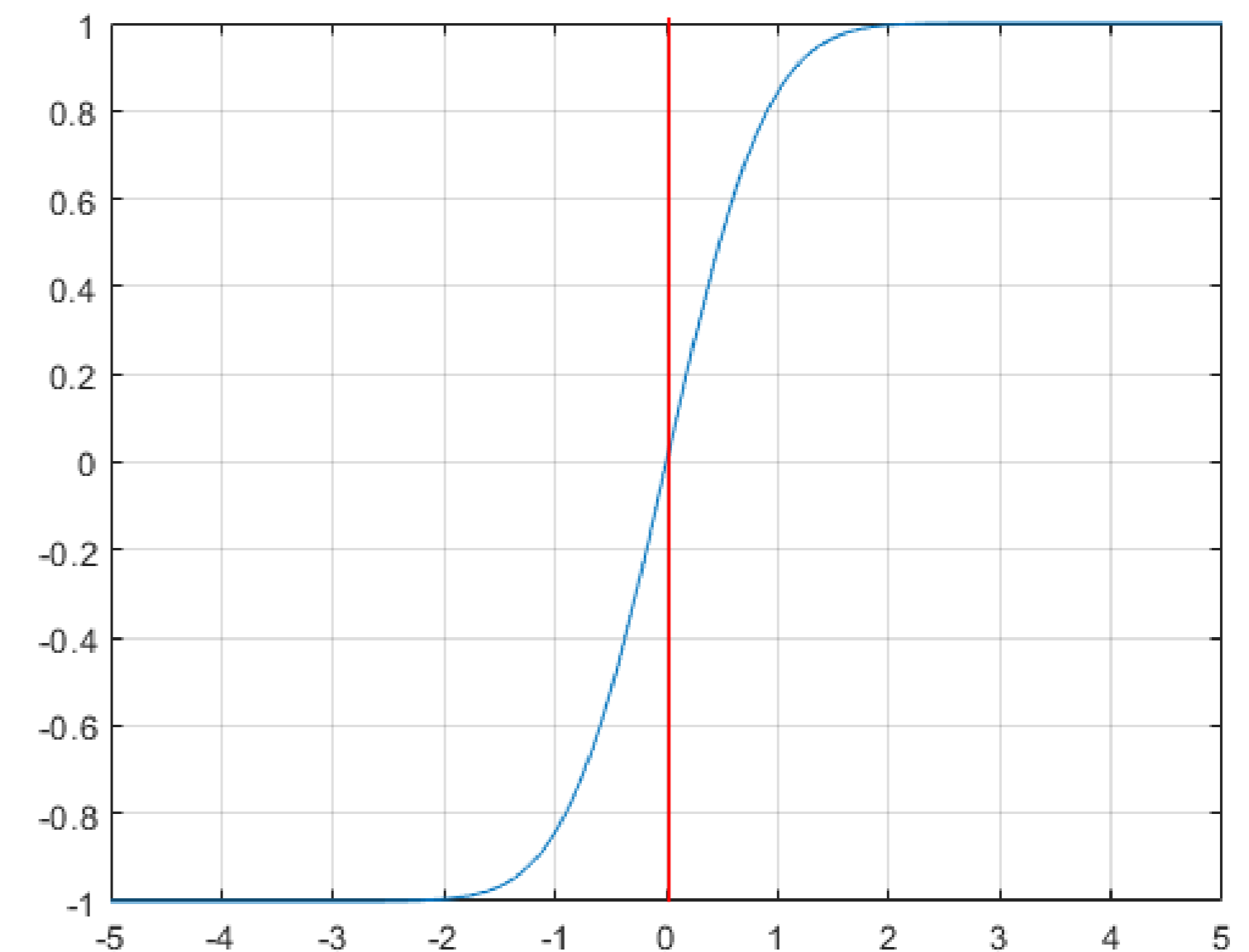
**Spot Scanning**



# Dose Influence Matrix Optimization

- Simple matrix multiplication to optimize spot weights based on cost function of Dose Vector
- Optimizable VaD and DaV objectives
- Penalizes pixels with dose above threshold
  - Uses smoothed step function
- Essentially analyzes one point/area on DVH
  - Depends on inputs to the smoothing function

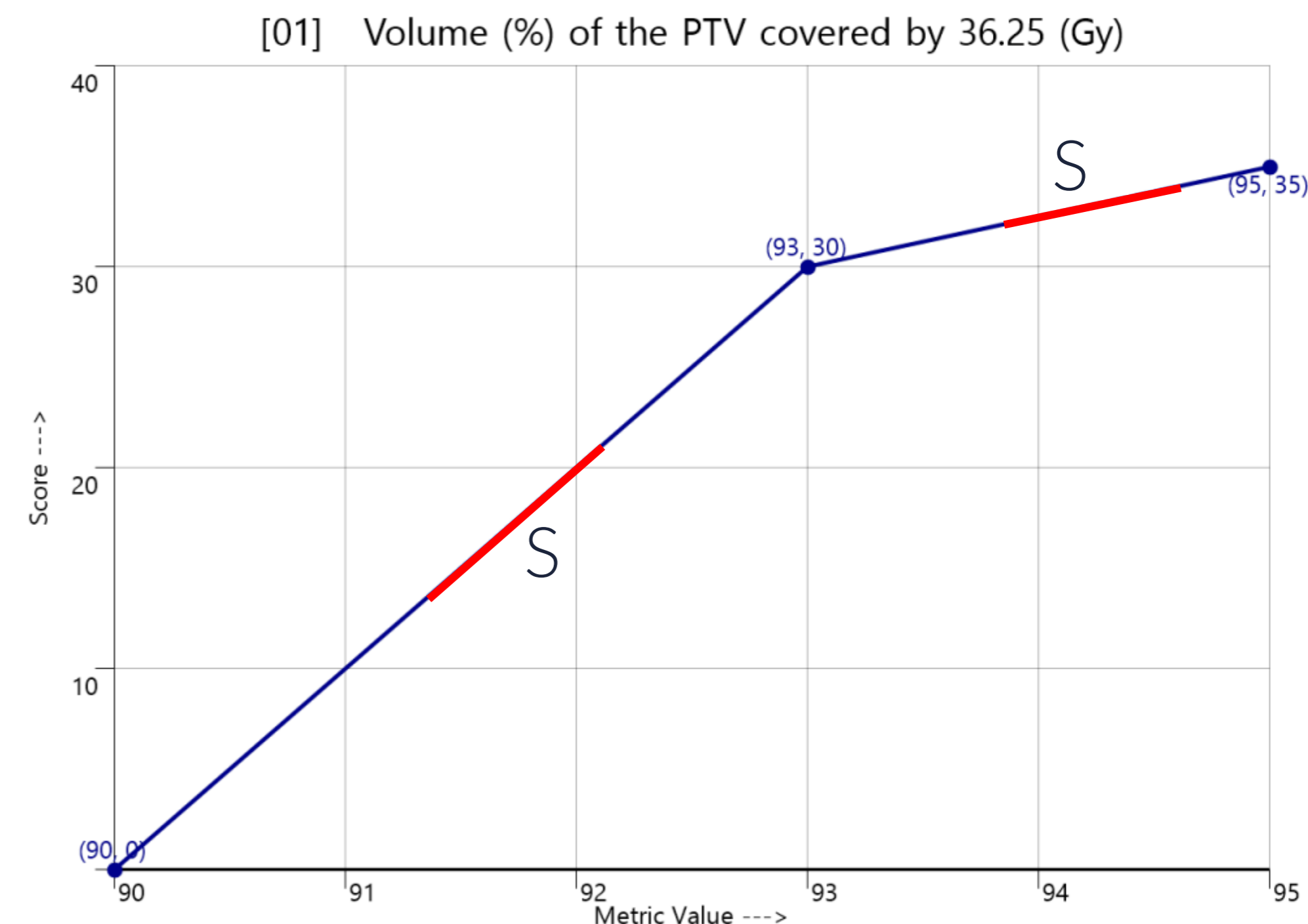
$$\begin{matrix} \text{Dose Influence} \\ (M \times N) \end{matrix} \begin{matrix} \text{Spot Weight Vector} \\ (N \times 1) \end{matrix} = \begin{matrix} \text{Dose Vector} \\ (M \times 1) \end{matrix}$$



# Piecewise linear slopes drive optimization

- Add up costs and gradients from all objectives and optimize

- For each pixel:  $\frac{\Delta VaD}{\Delta Dose}$
- For each spot:  $\frac{\Delta VaD}{\Delta Spot}$
- For each spot:  $\frac{\Delta Score}{\Delta Spot}$



[VaD Dose Gradient]<sup>T</sup>  
(1xM)

Dose Influence  
(MxN)

Instantaneous Slope of  
Score Function

Score Spot Gradient  
(Nx1)



# ScoreCard Based Optimization

Direct optimization on piecewise linear DVH based score function ranges

PLAN SCORECARD \*\*NOT VALIDATED FOR CLINICAL USE\*\*

SCORE CARD SELECTION  
Score Card ID: Plan Rx matches scorecard.  
SC\_HeadAndNeck-AAMD2023\_PlanStuc

PLAN SELECTION  
Patient ID: AAMD2023PLANSTUDY

Patient	Course	Plan	
AAMD2023PLANSTUDY	C2	Voronoi10MI	<input checked="" type="checkbox"/>

Plan Scores: AAMD2023PLANSTUDY: [C2] Voronoi10MU: 64.87/150.00 (43.25%)

Id	Structure	Score Metric	Plan Id	Value	Score	Max	Metric Plot
1	PTV63	Volume at 63Gy [%]	Voronoi10MU	100.00 %	10.00	10.00	
			Voronoi10MU	99.93	9.90		
2	PTV60	Volume at 60Gy [%]	Voronoi10MU	99.81 %	7.36	7.50	
			Voronoi10MU	99.85	7.39		
3	PTV60	Volume at 63Gy [%]	Voronoi10MU	98.49 %	0.00	2.50	
			Voronoi10MU	0.62	2.47		
4	PTV57	Volume at 57Gy [%]	Voronoi10MU	96.07 %	6.07	10.00	
			Voronoi10MU	96.83	6.83		
5	PTV57	Volume at 59.85Gy [%]	Voronoi10MU	92.76 %	0.00	2.50	
			Voronoi10MU	30.92	0.95		
6	PTV54	Volume at 54Gy [%]	Voronoi10MU	99.32 %	9.32	10.00	
			Voronoi10MU	97.39	7.39		
7	PTV54	Volume at 56.7Gv [%]	Voronoi10MU	98.31 %	0.00	2.50	
			Voronoi10MU				

optimization round complete.  
comment len (252 max): 194  
Saving optimized plan ...  
course id: C2  
plan id: SCVoronoi10MU  
NumberOfFractions: 30  
prescribedDose: 63.0  
planNorm: 1.0  
treatmentPercentage: 1.0  
Applying optimized spot weights...  
Calculating Dose...  
Snapshot Saved!

Plot Controls  
Total Score

### Optimized Plan Score

RELOAD PLAN



# Spine Dosimetric & Doserate Result

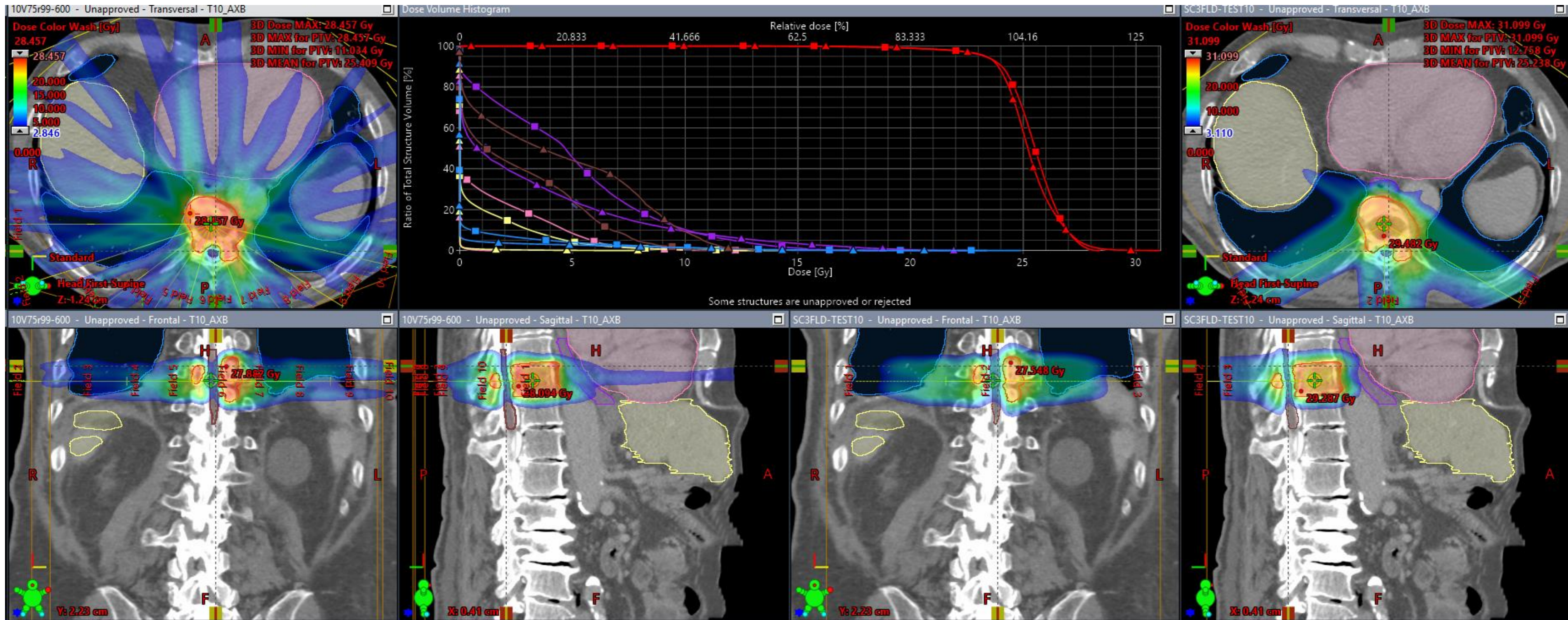
FLASH compared to IMPT standard of care via Scorecard Optimization

3



# SBRT spine 24Gy 1fx

## 10 field transmission flash vs. 3 field IMPT



Fields	Dose	Reference Points	Dose Statistics								
Show DVH	Structure	Approval Status	Plan	Course	Volume [cm <sup>3</sup> ]	Dose Cover. [%]	Sampling Cover. [%]	Min Dose [Gy]	Max Dose [Gy]	Mean Dose [Gy]	
<input checked="" type="checkbox"/>	SpinalCord	Unapproved	10V75r99-600	FlashST-SCtest9	2.6	100.0	100.0	101.9	0.000	11.329	2.561
<input checked="" type="checkbox"/>	SpinalCord	Unapproved	SC3FLD-TEST10	N-Opt	2.6	100.0	100.0	101.9	0.000	13.212	4.405
<input checked="" type="checkbox"/>	PTV	Unapproved	10V75r99-600	FlashST-SCtest9	55.7	100.0	100.0	100.0	11.034	28.457	25.409
<input checked="" type="checkbox"/>	PTV	Unapproved	SC3FLD-TEST10	N-Opt	55.7	100.0	100.0	100.0	12.758	31.099	25.238
<input checked="" type="checkbox"/>	Lungs	Unapproved	10V75r99-600	FlashST-SCtest9	3045.2	100.0	100.0	100.0	0.000	24.948	0.521
<input checked="" type="checkbox"/>	Lungs	Unapproved	SC3FLD-TEST10	N-Opt	3045.2	100.0	100.0	100.0	0.000	23.441	0.323
<input checked="" type="checkbox"/>	Liver	Unapproved	10V75r99-600	FlashST-SCtest9	1914.6	100.0	100.0	100.0	0.000	14.312	0.773
<input checked="" type="checkbox"/>	Liver	Unapproved	SC3FLD-TEST10	N-Opt	1914.6	100.0	100.0	100.0	0.000	8.037	0.024
<input checked="" type="checkbox"/>	Heart	Unapproved	10V75r99-600	FlashST-SCtest9	947.0	100.0	100.0	100.0	0.000	12.768	1.196
<input checked="" type="checkbox"/>	Heart	Unapproved	SC3FLD-TEST10	N-Opt	947.0	100.0	100.0	100.0	0.000	1.854	0.009
<input checked="" type="checkbox"/>	Esophagus	Unapproved	10V75r99-600	FlashST-SCtest9	12.7	100.0	100.0	100.3	0.000	18.810	4.780
<input checked="" type="checkbox"/>	Esophagus	Unapproved	SC3FLD-TEST10	N-Opt	12.7	100.0	100.0	100.3	0.000	22.466	3.126

FLASH therapy is under development and not available for commercial sale.

# SBRT spine 24Gy 1fx

## 10 field transmission flash vs. 3 field IMPT

Plan Scores: + [N-Opt] 10V75r99-600p: 277.31/310.00 (89.45%)  
+ [N-Opt] SC3FLD-TEST9: 257.38/310.00 (83.02%)

# Scorecard metrics (5 of 33 total)

Id	Structure	Score Metric	Plan Id	Value	Score	Max	Metric Plot
1	CTV <sub>EVAL</sub>	Dose at 99.9% [Gy]	10V75r99-600p	22.10 Gy	23.42	25.00	
			SC3FLD-TEST9	22.34 Gy	23.62	23.62	
2	PTV <sub>EVAL</sub>	Volume at 24Gy [%]	10V75r99-600p	88.58 %	12.86	20.00	
			SC3FLD-TEST9	89.99 %	14.98	14.98	
5	PTV <sub>EVAL</sub>	Dose at 0.035CC [Gy]	10V75r99-600p	28.80 Gy	13.00	15.00	
			SC3FLD-TEST9	30.25 Gy	5.15	5.15	
18	SpinalCord	Dose at 0.35CC [Gy]	10V75r99-600p	6.19 Gy	15.81	17.00	
			SC3FLD-TEST9	9.29 Gy	3.55	3.55	
24	Heart	Dose at 0.035CC [Gy]	10V75r99-600p	11.76 Gy	6.80	8.00	
			SC3FLD-TEST9	1.44 Gy	7.91	7.91	
8	CTV	Dose at 99.9% [Gy]	10V75r99-600p	19.44 Gy	1.00	1.00	
			SC3FLD-TEST9	20.43 Gy	1.00	1.00	
			10V75r99-600p	86.80 %	0.68	1.00	

# SBRT spine 24Gy 1fx

10 field transmission flash vs. 3 field IMPT vs. failed options and non-FLASH

Number of fields	Min MU score assigned	Min MU target	Score /310
2 (ML-IMPT)	0	-	!
3 (ML-IMPT)	0	-	257.38
5 (250MeV)	0	-	!
10 (250MeV)	0	-	290.14
10 (250MeV)	40	150	287.82
10 (250MeV)	40	300	290.34
10 (250MeV)	40	450	290.28
10 (250MeV)	80	450	289.36
10 (250MeV)	r99	600	284.10
10 (250MeV)	r99*	600	277.31

PTCOG 2022 Poster:

**A novel IMPT optimization method enforcing a minimum spot MU per energy layer for FLASH**

**P. Lansonneur\***, T. Leinonen, M. Ropo, L. Rosa, A. Magliari, M. Folkerts

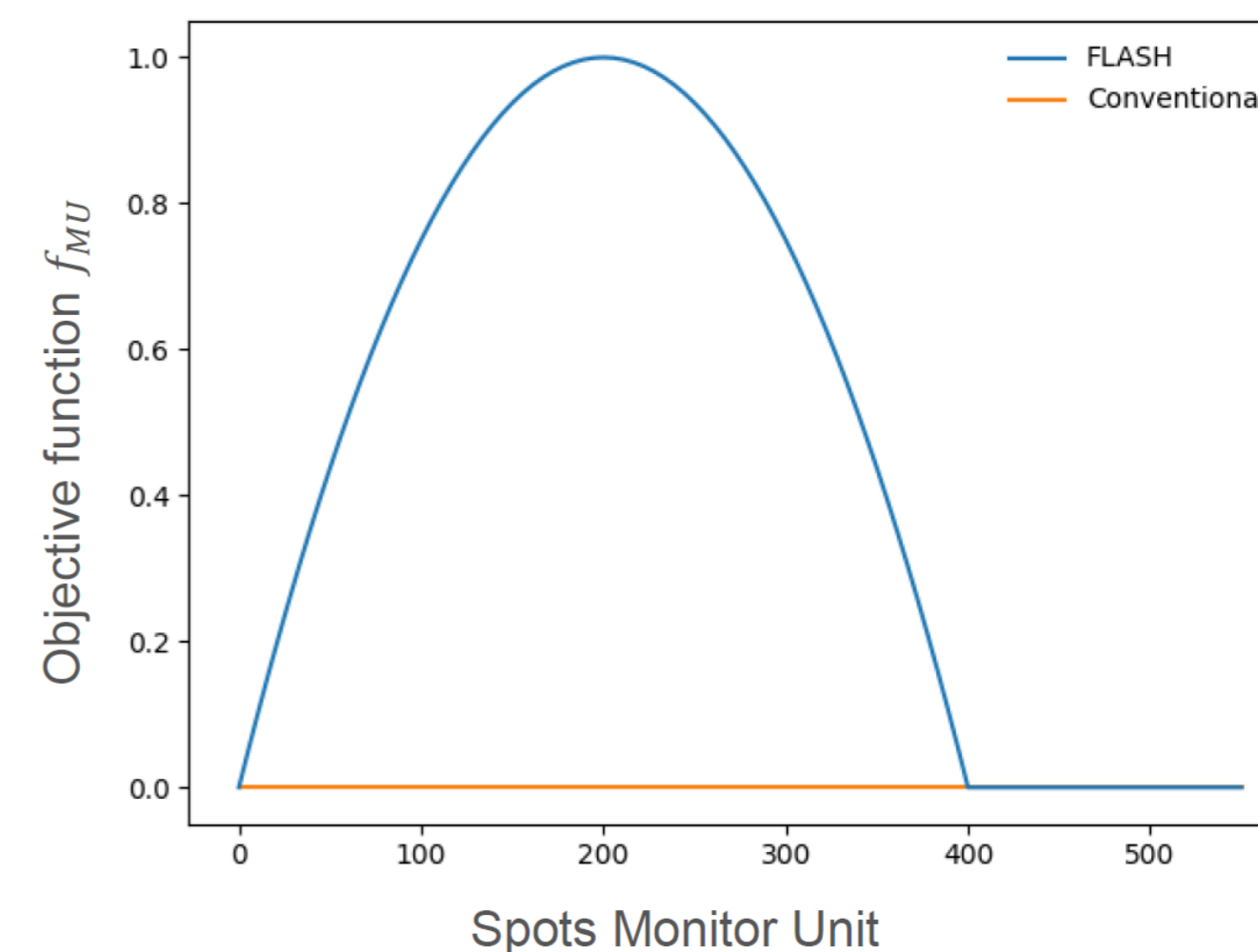
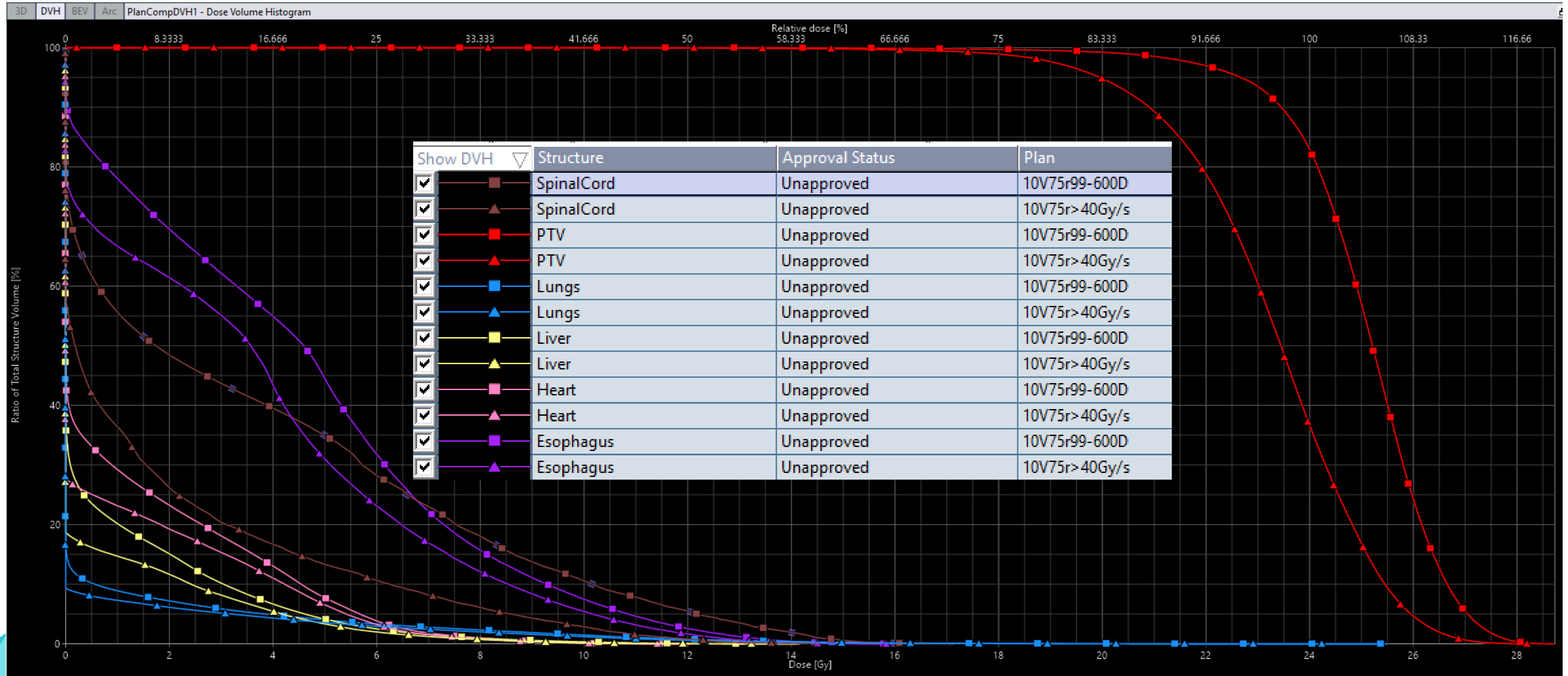


Fig. 1. Example of a minimum MU objective function, for a minimum MU  $MU_{min} = 400$ . Spots MUs above 200 tend to get increased to 400 while spots MUs below 200 tend to get reduced to zero and removed.

# SBRT spine 24Gy 1fx

PBS Dose Rate analysis: Minimum MU=600 (Dose Rate Threshold DVH >40Gy/sec)



# Scorecard Utility

Dosimetric Scorecards have great potential

- Current uses
  - Scoring treatment planning competitions
  - Quantifying dosimetric quality improvements of various techniques
    - energies, collimation devices, modalities, field arrangements
  - Tuning the inputs to common automated quadratic DVH point optimizers
    - RapidPlan and Ethos
  - Guiding manual treatment planning, even for novices
- Future uses
  - Published prospectively with popular trials to reduce variability for manual plans
  - Directly input to dose optimizers so only variability is technical limitation of hardware
- Dosimetric Scorecard evaluation tools have high availability
  - Varian MAAS GitHub, Elekta ProKnow, Sun Nuclear PlanIQ, etc

# Thank you!

Special Thanks to:

- Michael Folkerts
- Pierre Lansonneur
- Jessica Perez
- Miriam Krieger
- Lesley Rosa
- Alexander Katsis

