# **Transfer Function Optimization Based on a Combined Model of** Visibility and Saliency

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#### Introduction

- We addresses the challenge of obtaining clear visualizations of features of interest in volume visualization.
- We automatically optimize the conspicuity of features to match a simple-to-specify target distribution reducing the need for the user to tweak unintuitive visualization parameters.
- We take into account both visibility and saliency of features in the definition of conspicuity as required by the user.



## Background: Visibility weighted saliency metric

- Visibility-weighted saliency (VWS) [1] simultaneously indicates the perceptual saliency and visibility of features in volume rendered images.
- VWS is defined based on two components:
  - I. The Saliency field [2] is essentially a difference of Gaussian in 3D indicating the center-surround effect in a local neighborhood of voxels with respect to appearance attributes such as brightness and saturation
  - **II.** The Visibility field is computed from the opacity contribution of voxels to the final rendered image, and indicates viewpoint-dependent occlusions of the voxels [3] [4].

## **VWS-based Optimization of Transfer Functions**

(a) Nucleon data set; (b) Transfer function with 3 features with opacities set by the user in the ratio 0.1:0.3:0.6 (c) VWS graph indicates the red feature is prominent despite lower opacity; (d) After opacity towards relative visibility distribution of 0.1 : 0.3 : 0.6, the green feature is particularly emphasized; (e) The optimized transfer function. (f) VWS graph after optimization.

### Approach

• We define conspicuity to describe the opacity of a feature combined with the degree to which it is occluded by other features, and enhanced this in order to support

We exploit the visibility-weighted saliency metric to automatically adjust the relative conspicuity of features based on a user's specification of their relative importance.

A gradient descent with an inexact line search strategy is employed for iterative optimization, minimizing the following Objective Function:



where  $W_i$  is the visibility weighted saliency and  $t_i$  is a the user-defined importance of feature *i*, and *n* is the number of features.









- visualization tasks.
- Users typically have a general idea of how conspicuous certain features should be for a given task and then accordingly adjust parameters such as opacity values in the transfer function.
- + However the relationship between the opacity of voxels and the conspicuity of features in the final image is not linear, necessitating a trial-and-error process with the user having only indirect control through a set of complex unintuitive parameters.
- To address this need, we propose an iterative approach that automatically refines the opacity transfer function to achieve any given conspicuity distribution specified by the user.
- We employ an improved model of visibility that takes into account issues of saliency as well as occlusion and transparency.







(a) VWS plot of the Vortex simulation after a single optimization based on the first timestep; (b) Dynamically optimized for each time step; (c) Rendering of timestep 80 with the single optimization; (d) Timestep 80 with dynamic optimization.

### Main contributions

- A novel transfer function optimization approach using the visibility-weighted saliency metric
- Our automated technique optimizes the clarity of features in visualizations of 3D volume datasets.
- The approach achieve user-specified target distributions of feature conspicuity by adjusting the opacity transfer function iteratively.
- The automated approach is demonstrated to be useful in particular for optimizing the visualization of time-varying volume datasets.



Visualization, transfer function and VWS of Vortex: (a) feature dominates even though opacities are set to equal; (b) after optimization details in internal green and red features are more recognizable.

References

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