

# Computational fluid dynamics simulations guided by Fourier velocity encoded MRI

Vinicius de Carvalho Rispoli\* (vrispoli@pgea.unb.br)

Jon-Fredrik Nielsen† (jfniese@umich.edu)

Krishna Nayak‡ (knayak@usc.edu)

Joao Luiz Azevedo de Carvalho\* (joaoluiz@pgea.unb.br)

\*Electrical Engineering, University of Brasilia, Brazil – †Biomedical Engineering, University of Michigan, USA

‡Electrical Engineering, University of Southern California, USA

## Introduction

- Fourier velocity encoding (FVE) [1] provides considerably higher SNR than phase contrast (PC), and is robust to partial-volume effects [2].
- FVE data can be rapidly acquired, and low spatial resolution is tolerated [3,4].
- FVE provides the velocity distribution associated with a large voxel, but does not directly provides a velocity map.
- CFD can be an alternative to (or combined with) MR flow quantification [5]
- CFD has arbitrary SNR and spatio-temporal resolution
- Goal:** derive high-resolution velocity maps from simulated low-resolution FVE data [6] and use it to perform guided CFD simulations [5].

## Estimating the velocity map

- FVE spatial-velocity distribution,  $s(x, y, w)$ , model is:

$$s(x, y, w) = \left[ m(x, y) \times \text{sinc} \left( \frac{w - w_{pc}(x, y)}{\delta w} \right) \right] * \text{psf} \left( \frac{r}{\delta r} \right) \quad (1)$$

- Spatial blurring effects in FVE data are reduced, using the deconvolution algorithm proposed in ref. [7]:

$$\tilde{s}(x, y, w) \approx m(x, y) \times \text{sinc} \left( \frac{w - w_{pc}(x, y)}{\delta w} \right). \quad (2)$$

- Given a high-resolution spin-density map,  $\tilde{m}(x, y)$ , velocity  $\hat{w}_{fve}$  at  $(x_o, y_o)$  is estimated from  $\tilde{s}(x, y, w)$  as:

$$\hat{w}_{fve}(x_o, y_o) = \arg \min_w \left\| \frac{\tilde{s}(x_o, y_o, w)}{\tilde{m}(x_o, y_o)} - \text{sinc} \left( \frac{w - \omega}{\delta w} \right) \right\|_2 \quad (3)$$

## Numerical Procedure

- Navier–Stokes equation,

$$\rho \left( \frac{\partial \mathbf{v}}{\partial t} + \mathbf{v} \cdot \nabla \mathbf{v} \right) = -\nabla p + \mu \Delta \mathbf{v}, \quad (4)$$

is numerically solved with a modified SIMPLER algorithm [5].

- Discretization of the Navier-Stokes equation yields three linear systems:

$$\mathbf{S}_{\nu,i} \mathbf{v}_{i+1} = \mathbf{f}_{\nu,i}, \quad (5)$$

for each velocity component  $\mathbf{v} = \mathbf{u}, \mathbf{v}$  or  $\mathbf{w}$ .

- Approach [5]: solve the modified linear systems

$$\mathbf{v}_{i+1} = (\mathbf{S}_{\nu,i}^T \mathbf{S}_{\nu,i} + \lambda_{\nu} \mathbf{\Gamma}_{\nu}^T \mathbf{\Gamma}_{\nu}) (\mathbf{S}_{\nu,i}^T \mathbf{f}_{\nu,i} + \lambda_{\nu} \mathbf{\Gamma}_{\nu}^T \mathbf{v}_{mri}), \quad (6)$$

which corresponds to the optimal solution of the following regularization

$$J(\mathbf{v}_{i+1}) = \frac{1}{2} \|\mathbf{S}_{\nu,i} \mathbf{v}_{i+1} - \mathbf{f}_{\nu,i}\|^2 + \frac{\lambda_{\nu}}{2} \|\mathbf{\Gamma}_{\nu} \mathbf{v}_{i+1} - \mathbf{v}_{mri}\|^2. \quad (7)$$

- $\mathbf{\Gamma}_{\nu}$  adjusts the size of vector  $\mathbf{v}_{i+1}$  to that of  $\mathbf{v}_{mri}$ , and  $\lambda_{\nu}$  controls the weight of the regularization.

- Obtained solution is the best one that fits both Navier–Stokes and the MRI data.

## Experiments

- 3D PC-MRI data were acquired for a carotid flow phantom (Fig.1).
  - Voxel:  $0.5 \times 0.5 \times 1.0 \text{ mm}^3$ ; FOV:  $4.0 \times 3.5 \times 5.0 \text{ cm}^3$ ; NEX: 9; Venc: 50 cm/s.
- Spiral FVE data were simulated from PC-MRI, using  $\delta r = 1 \text{ mm}$  and  $\delta r = 2 \text{ mm}$  ( $\text{SNR}_{fve} > \text{SNR}_{pc}$ )
- $\hat{w}_{fve}$  maps were reconstructed from simulated FVE
- FVE-guided CFD velocity fields were compared with:
  - Pure CFD solution;
  - PC-guided CFD velocity field obtained using a single NEX of the PC scan (same scan time as FVE scan with  $\delta r = 1 \text{ mm}$ )
  - PC-guided CFD velocity field obtained using all 9-NEX of the PC scan

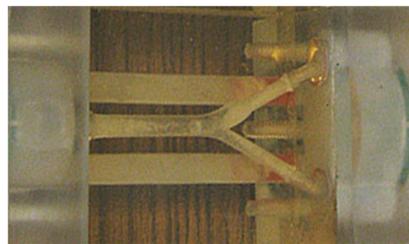


Figure 1: Pulsatile carotid flow phantom (Phantoms by Design, Inc., Bothell, WA).

## Results and Conclusion

- Figure 2 presents the FVE-estimated velocity maps,  $\hat{w}_{fve}$ . Abs. error was greater than 5 cm/s for:
  - 9% of the voxels for  $\delta r = 1 \text{ mm}$
  - 26.5% of the voxels for  $\delta r = 2 \text{ mm}$
- Figure 3 shows the PC-measured velocity field; and all CFD-simulated velocity fields: pure CFD, PC-driven CFD (1 and 9 NEX), and FVE-driven CFD ( $\delta r = 1$  and 2 mm).
  - Considerable qualitative improvement for FVE-driven results, when compared with the pure CFD result and with PC-driven CFD with similar scan time (1 NEX).
- Result 3:** Table 1 presents signal-to-error ratio (SER), relative to PC reference, for CFD results
  - Both FVE-driven solutions had higher SER than pure CFD and single-NEX PC-driven CFD
  - When evaluating 3D velocity vector  $\vec{v}$ , the SER gain for  $\delta r = 1 \text{ mm}$  (similar scan time): was 1.49 dB relative to pure CFD; and 3.65 dB relative to single-NEX PC-driven CFD.
- Conclusion:** Results show that FVE-guided CFD has better agreement with PC-measured velocity field than pure CFD.
  - 1 mm resolution spiral FVE dataset has same scan time as 1 NEX of a 0.5 mm resolution 3DFT PC dataset with same parameters
  - FVE dataset would have SNR 23 dB higher than that of PC

	pure CFD	CFD + 1D PC 1 NEX	CFD + sFVE $\delta r = 1.0 \text{ mm}$
SER <sub>u</sub>	2.97 dB	2.72 dB (↓)	3.93 dB (↑)
SER <sub>v</sub>	-0.25 dB	-0.88 dB (↓)	-0.36 dB (↓)
SER <sub>w</sub>	5.44 dB	6.21 dB (↑)	10.97 dB (↑↑)
SER <sub><math>\vec{v}</math></sub>	<b>6.57 dB</b>	<b>4.41 dB (↓)</b>	<b>8.06 dB (↑)</b>

Table 1: Signal-to-error ratio between each of the CFD approaches and the PC reference.

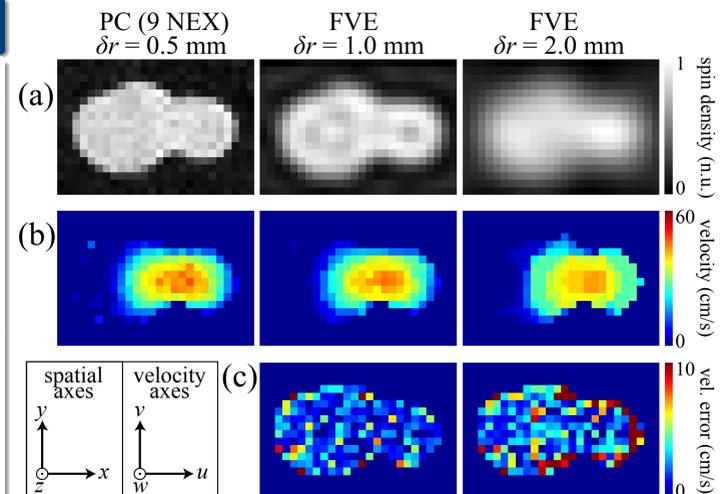


Figure 2: (a) Spin-density maps for PC (0.5 mm spatial resolution, 9 NEX), FVE with 1 mm spatial resolution, and FVE with 2 mm spatial resolution, for a slice perpendicular to a carotid phantom's bifurcation; (b) corresponding velocity maps; and (c) absolute error for the FVE-estimated velocity maps, relative to the PC reference.

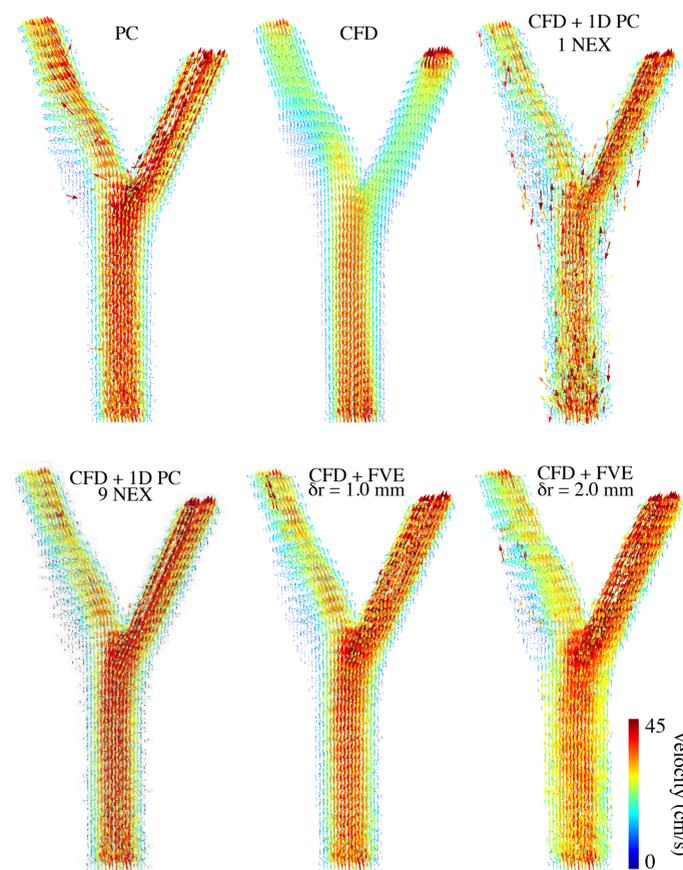


Figure 3: Vector field visualization of the velocity field ( $\vec{v}$ ) over the entire tridimensional volume of the carotid bifurcation of the phantom: PC; pure CFD; CFD guided by  $w_{pc}$ , reconstructed from 1 NEX and 9 NEX; CFD guided by  $\hat{w}_{fve}$ , recovered from simulated FVE data with  $\delta r = 1.0 \text{ mm}$  and  $2.0 \text{ mm}$ .

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