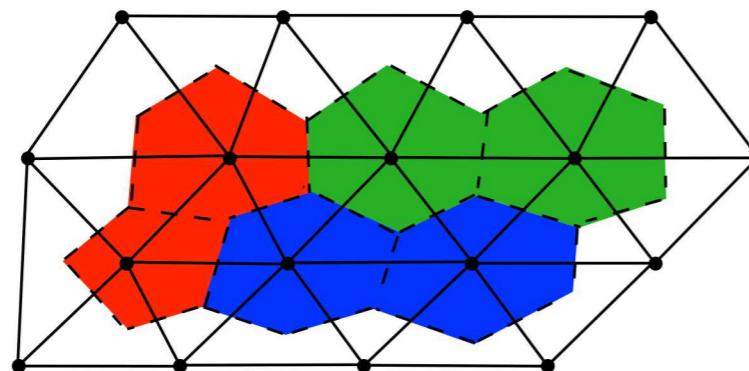
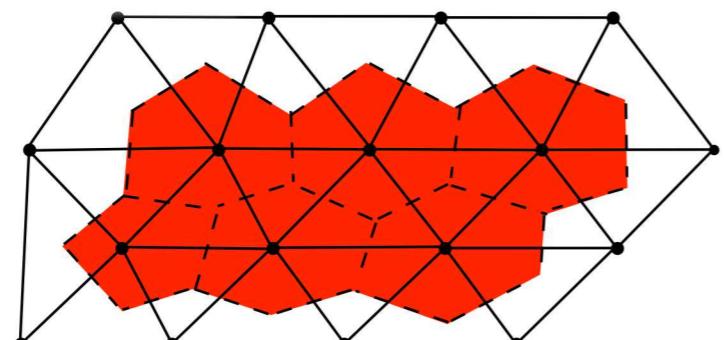


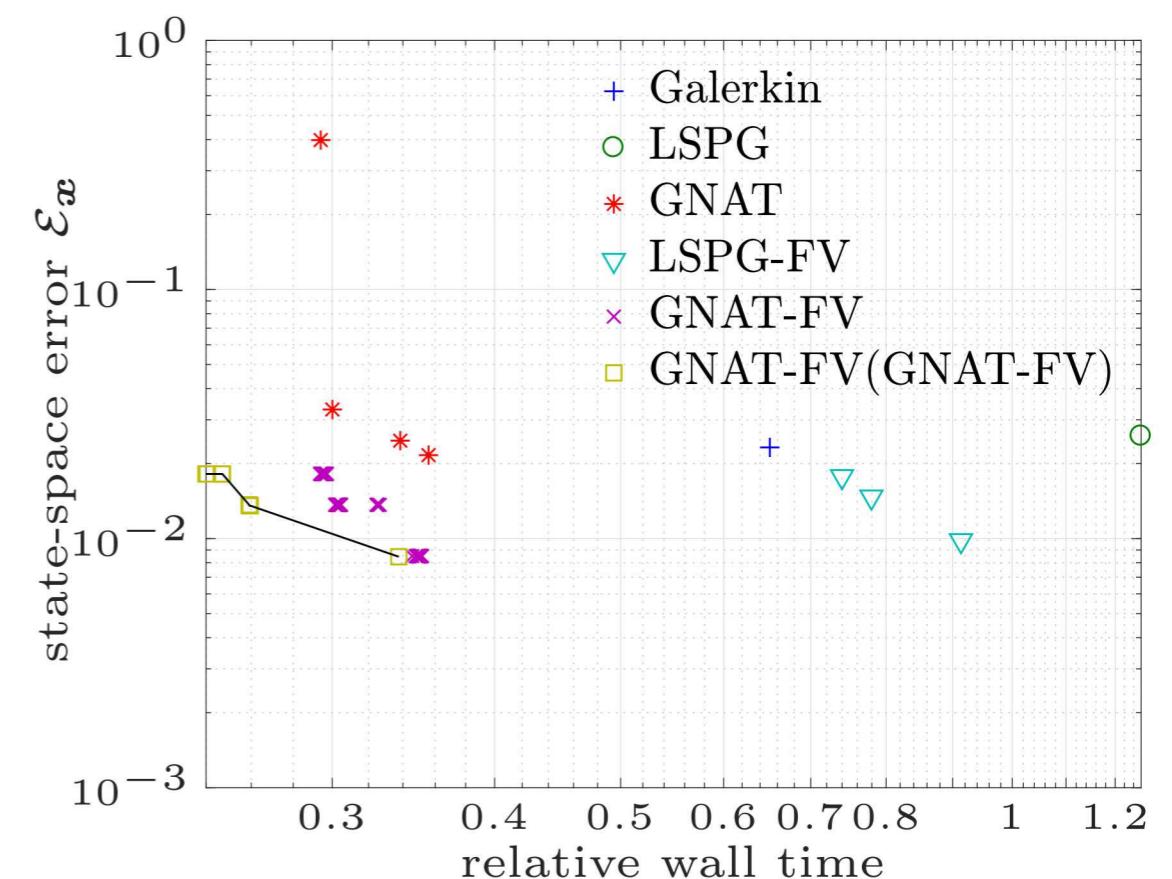
Conservative model reduction for finite-volume models



3 subdomains



1 (global) subdomain

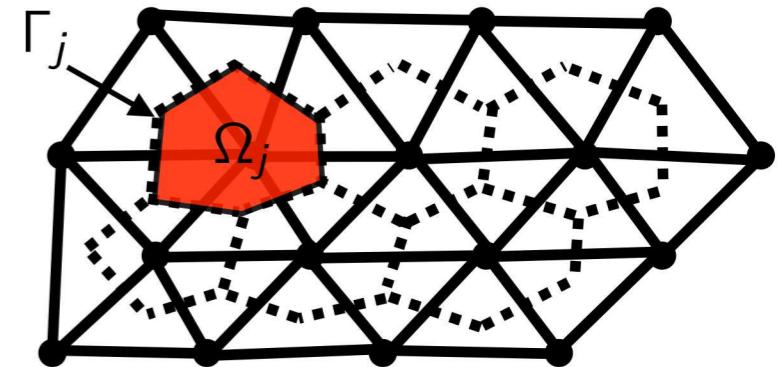


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- **Finite-volume method** widely used to discretize **conservation laws**
- **Conservation** is the primary problem structure for these models
- Existing reduced-order models **do not enforce conservation**
- **Goal:** construct reduced-order models that are **conservative**

Finite-volume method

$$\text{ODE: } \frac{d\mathbf{x}}{dt} = \mathbf{f}(\mathbf{x}; t)$$



Finite-volume method

$$\text{ODE: } \frac{d\mathbf{x}}{dt} = \mathbf{f}(\mathbf{x}; t)$$

$$x_{\mathcal{I}(i,j)}(t) = \frac{1}{|\Omega_j|} \int_{\Omega_j} \mathbf{u}_i(\vec{x}, t) \, d\vec{x}$$

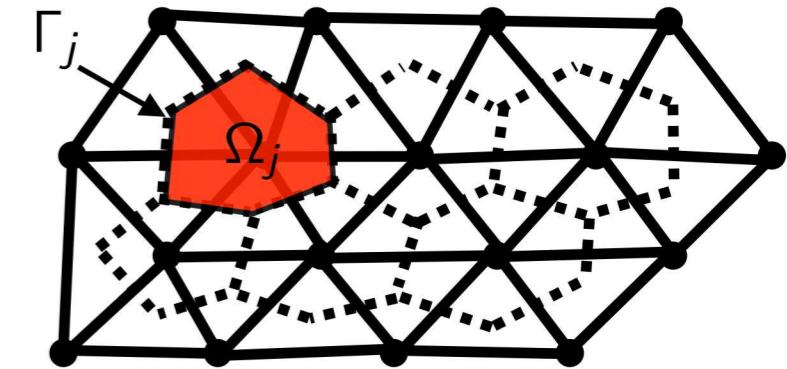
‣ average value of **conserved variable i** over **control volume j**

$$f_{\mathcal{I}(i,j)}(\mathbf{x}, t) = -\frac{1}{|\Omega_j|} \int_{\Gamma_j} \underbrace{\mathbf{g}_i(\mathbf{x}; \vec{x}, t) \cdot \mathbf{n}_j(\vec{x}) \, d\vec{s}(\vec{x})}_{\text{flux}} + \frac{1}{|\Omega_j|} \int_{\Omega_j} \underbrace{\mathbf{s}_i(\mathbf{x}; \vec{x}, t)}_{\text{source}} \, d\vec{x}$$

‣ flux and source of **conserved variable i** within **control volume j**

$$r_{\mathcal{I}(i,j)} = \frac{dx_{\mathcal{I}(i,j)}}{dt}(t) - f_{\mathcal{I}(i,j)}(\mathbf{x}, t)$$

‣ **rate of conservation violation** of **variable i** in **control volume j**



Finite-volume method

$$\text{ODE: } \frac{d\mathbf{x}}{dt} = \mathbf{f}(\mathbf{x}; t)$$

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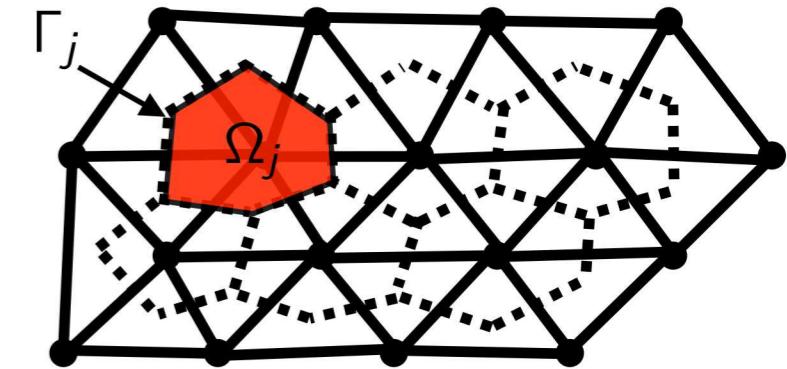
$$r_{\mathcal{I}(i,j)} = \frac{dx_{\mathcal{I}(i,j)}}{dt}(t) - f_{\mathcal{I}(i,j)}(\mathbf{x}, t)$$

‣ **rate of conservation violation** of **variable i** in **control volume j**

$$\text{ODE: } \mathbf{r}^n(\mathbf{x}^n) = 0, \quad n = 1, \dots, N$$

$$r_{\mathcal{I}(i,j)}^n = x_{\mathcal{I}(i,j)}(t^{n+1}) - x_{\mathcal{I}(i,j)}(t^n) + \int_{t^n}^{t^{n+1}} f_{\mathcal{I}(i,j)}(\mathbf{x}, t) dt$$

‣ **conservation violation** of **variable i** in **control volume j** over **time step n**



Reduced-order models

Galerkin

$$\frac{d\hat{\mathbf{x}}}{dt} = \Phi^T \mathbf{f}(\Phi\hat{\mathbf{x}}, t)$$

\Updownarrow

$$\frac{d\hat{\mathbf{x}}}{dt}(\Phi\hat{\mathbf{x}}, t; \mu) = \arg \min_{\hat{\mathbf{v}} \in \mathbb{R}^p} \|\mathbf{r}(\Phi\hat{\mathbf{v}}, \Phi\hat{\mathbf{x}}, t)\|_2$$

- min. sum of squared conservation-violation **rates**

LSPG

$$\Psi^n(\hat{\mathbf{x}}^n; \mu)^T \mathbf{r}^n(\Phi\hat{\mathbf{x}}^n) = \mathbf{0}$$

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$$\hat{\mathbf{x}}^n = \arg \min_{\hat{\mathbf{z}} \in \mathbb{R}^p} \|\mathbf{r}^n(\Phi\hat{\mathbf{z}})\|_2$$

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$$\underset{\hat{\mathbf{v}} \in \mathbb{R}^p}{\text{minimize}} \|\mathbf{r}(\Phi\hat{\mathbf{v}}, \Phi\hat{\mathbf{x}}, t)\|_2$$

subject to $\bar{\mathbf{C}}\mathbf{r}(\Phi\hat{\mathbf{v}}, \Phi\hat{\mathbf{x}}, t) = \mathbf{0}$

- min. sum of squared conservation-violation **rates**

subject to zero conservation-violation **rates**
over subdomains

LSPG

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- min. sum of squared conservation violations **over time step n**

subject to zero conservation violations **over time step n over subdomains**

Reduced-order models

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$$\frac{d\hat{\mathbf{x}}}{dt} = \Phi^T \mathbf{f}(\Phi\hat{\mathbf{x}}, t)$$

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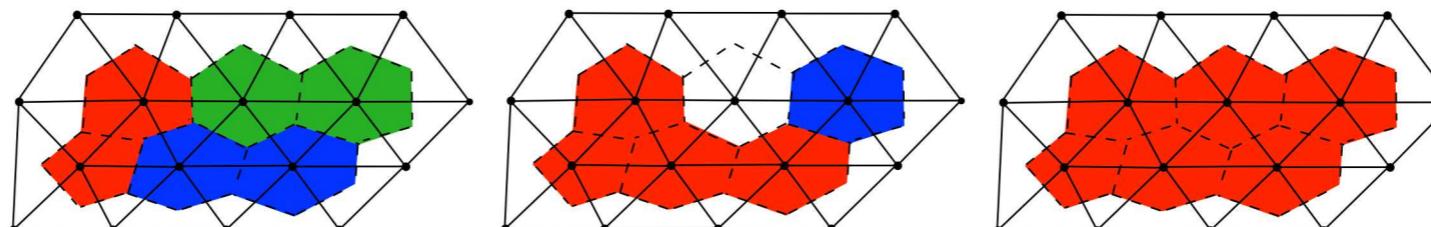
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- min. sum of squared conservation-violation **rates**
- subject to zero conservation-violation **rates**
- over subdomains

+ Conservation enforced over subdomains!



LSPG

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- min. sum of squared conservation violations **over time step n**
- subject to zero conservation violations **over time step n over subdomains**