

Reduced order modeling of geometrically parametrized discontinuous Galerkin formulation for the Stokes equation

Nirav Vasant Shah, Martin Hess and Gianluigi Rozza

Abstract The present work focuses on geometrical parametrization and reduced order modeling of Stokes flow. The importance of Stokes flow, advantages of discontinuous Galerkin method are introduced first. We also discuss the concept of geometric parametrization and its application along with importance of reduced order model technique. The full order model is based on discontinuous Galerkin method interior penalty formulation. The concepts of broken Sobolev spaces, relevant norms, jump and mean operator are introduced. The weak formulation is derived based in suitable space to obtain the full order model. We then introduce the concept of geometric parametrization. The operators are transformed from fixed domain to parameter dependent domain by exploring affine parameter dependence which results in efficient assembly of system matrix. Thereafter, proper orthogonal decomposition is applied to obtain basis for function space for reduced order model. By using Galerkin projection the linear system to be solved is projected onto reduced space. During the process, offline-online decomposition is used to separate computation of expensive parameter independent part and fast parameter independent part. Finally the technique is applied to test problem. The numerical outcomes presented include the experimental error analysis, eigenvalue computation and measurement of online simulation time. [13]

Nirav Vasant Shah

Scuola Internazionale Superiore di Studi Avanzati - via Bonomea, 265 - 34136 Trieste ITALY,
e-mail: snirav@sissa.it

Martin Hess

Scuola Internazionale Superiore di Studi Avanzati - via Bonomea, 265 - 34136 Trieste ITALY
e-mail: martin.hess@sissa.it

1 Introduction

The subject of mathematical applications in fluid mechanics starts with one of the variants of the Navier-Stokes equations, such as the Stokes equation. Almost all processes of fluid mechanics require considerations related to the Navier-Stokes equations. Navier-Stokes equation is non-linear, characterizing flow fluctuations. However, in case of laminar flow, i.e. when fluctuations are negligible, this linearized form of the Navier-Stokes equation is the Stokes equation.

Discontinuous Galerkin method (DGM) has found traction as numerical method for elliptic problems **pereire reference** as well as hyperbolic problems **Book on compressible flow reference**. This is due to its several advantages over Finite Element Method (FEM) and Finite Volume Method (FVM). In fact, DG method is considered as combination of FEM and FVM. DGM uses polynomial approximation of suitable degree providing higher accuracy as well as allows discontinuity at the interface, by the concept of numerical flux, allowing greater flexibility. This fact makes DGM naturally attractive to problems such as shock capturing due to presence of steep gradients or discontinuities. Additionally, since the Dirichlet conditions are applied as boundary penalty, it avoids necessity to work with subspace of FEM. Several variants of DGM exist based on computational advantages such as sparsity pattern or extension of computational stencil, complexity of numerical implementation etc.

Geometric parametrization has emerged as important application of Parametric Partial Differential Equations (PPDEs) and as alternative to shape optimization. The concept of geometric parametrization allows to transfer operator evaluated on one domain to another domain efficiently. For linear equations, this means exploiting affine parameter dependence as will be shown in later section. Model Order Reduction (MOR) on the other hand allows reducing the size of the system to be solved and working with the smaller system containing only dominant components and discarding the non-dominant components. It is pertinent to mention that identifying "dominant" components is critical to the success of model order reduction strategy. Optimization of engineering components using geometric parametrization combined with MOR for PPDEs has given quite useful results in the fields such as mechanical, naval and aeronautic designs. Also, the faster computations obtained by MOR has helped in many query context, real time computation and quick transfer of computational results to industrial problems.

In the present work, we first introduce Discontinuous Galerkin Interior Penalty Method (DG-IPM). We subsequently introduce notion of parametrization characterizing geometry of the domain under consideration, exploit affine parameter dependence and its application in the context of offline-online decomposition. We then apply Proper Orthogonal Decomposition (POD) for constructing reduced basis space and apply Galerkin projection to project the system of equations on the space constructed by POD. Finally we present a test problem to demonstrate the introduced method and present numerical result.

2 Discontinuous Galerkin formulation

Let $\Omega \subset \mathbb{R}^d$ be open bounded domain. The boundary of Ω , $\partial\Omega$ is divided into Neumann boundary Γ_N and Dirichlet boundary Γ_D i.e. $\partial\Omega = \Gamma_N \cup \Gamma_D$. The domain Ω is divide into N_{su} number of mutually non overlapping subdomains such that,
 $\Omega = \bigcup_{i=1}^{N_{su}} \Omega_i$, $\Omega_i \cap \Omega_j = \emptyset$, for $i \neq j$. Each subdomain is divided into nel number

of triangular elements τ_k such that $\Omega = \bigcup_{k=1}^{nel} \tau_k$. The triangulation \mathcal{T} is the set of all triangular elements i.e. $\mathcal{T} = \{\tau_k\}_{k=1}^{nel}$. The internal boundary $\Gamma = \{\partial\tau_k\}_{k=1}^{nel} \setminus \partial\Omega$. We represent \vec{n} as the outward pointing normal to an edge of element.

The Stokes's equation in strong form can be stated as,

$$-\nu \Delta \vec{u} + \nabla p = \vec{f}, \text{ in } \Omega, \quad (1)$$

$$\nabla \cdot \vec{u} = 0, \quad (2)$$

$$\vec{u} = \vec{u}_D, \text{ on } \Gamma_D, \quad (3)$$

$$-p\vec{n} + \nu\vec{n} \cdot \nabla \vec{u} = \vec{t}, \text{ on } \Gamma_N. \quad (4)$$

The vector variable velocity \vec{u} and scalar pressure p are the unknowns. ν is the material property known as kinematic viscosity. Vector \vec{f} is external force term or source term. \vec{u}_D is the Dirichlet velocity and \vec{t} is the Neumann value.

Before introducing weak form let us introduce broken Sobolev spaces for variables. The space for velocity is

$$\mathbb{V} = \{\vec{\phi} \in (L^2(\mathcal{T}))^d \mid \vec{\phi} \in (P^D(\tau_k))^d \quad \forall \quad \tau_k \in \mathcal{T}\}. \quad (5)$$

The space for pressure is

$$\mathbb{Q} = \{\psi \in (L^2(\mathcal{T})) \mid \psi \in (P^{D-1}(\tau_k)) \quad \forall \quad \tau_k \in \mathcal{T}\}. \quad (6)$$

Here, $P^D(\tau_k)$ denotes space of polynomials of degree at most D over τ_k .

In order to approximate the numerical flux we need the concept of Jump and Average operator. 1. For scalar quantity p the jump operator is defined as,

$$\begin{aligned} [p\vec{n}] &= p^+\vec{n}^+ + p^-\vec{n}^- \quad \text{on } \Gamma, \\ [p\vec{n}] &= p\vec{n} \quad \text{on } \Gamma_D. \end{aligned} \quad (7)$$

2. For vector quantity \vec{u} the jump operator is defined as,

$$\begin{aligned} [\vec{n} \cdot \vec{u}] &= \vec{n}^+ \cdot \vec{u}^+ + \vec{n}^- \cdot \vec{u}^- \quad \text{on } \Gamma, \\ [\vec{n} \cdot \vec{u}] &= \vec{n} \cdot \vec{u} \quad \text{on } \Gamma_D. \end{aligned} \quad (8)$$

3. The average operator is defined as,

$$\{\vec{u}\} = \frac{\vec{u}^+ + \vec{u}^-}{2}. \quad (9)$$

The weak form of Stokes equation is as follow,

$$a_{IP}(\vec{u}, \vec{\phi}) + b(\vec{\phi}, p) + (\{p\}, [\vec{n} \cdot \vec{\phi}])_{\Gamma \cup \Gamma_D} = l_{IP}(\vec{\phi}). \quad (10)$$

$$\begin{aligned} a_{IP}(\vec{u}, \vec{\phi}) &= (\nabla \vec{u}, \nabla \vec{\phi}) + C_{11}([\vec{u}], [\vec{\phi}])_{\Gamma \cup \Gamma_D} \\ &\quad - \nu(\nabla \vec{u}, [\vec{n} \otimes \vec{\phi}])_{\Gamma \cup \Gamma_D} - \nu([\vec{n} \otimes \vec{u}], \nabla \vec{\phi})_{\Gamma \cup \Gamma_D}. \end{aligned} \quad (11)$$

The penalty paramter $C_{11} > 0$ is an empirical constant to be kept large enough to maintain coercivity of bilinear form.

$$b(\phi, \psi) = - \int_{\mathcal{T}} \psi \nabla \cdot \vec{\phi}, \quad (12)$$

$$l_{IP}(\vec{\phi}) = (\vec{f}, \vec{\phi}) + (\vec{t}, \vec{\phi})_{\Gamma_N} + C_{11}(\vec{u}_D, \vec{\phi})_{\Gamma_D} - (\vec{n} \otimes \vec{u}_D, \nu \nabla \vec{\phi})_{\Gamma_D}. \quad (13)$$

Discrete form of equations can be written in Matrix form as,

$$\begin{pmatrix} A & B \\ B^T & 0 \end{pmatrix} \begin{pmatrix} U \\ P \end{pmatrix} = \begin{pmatrix} F_1 \\ F_2 \end{pmatrix}. \quad (14)$$

Stiffness matrix Solution vector Right hand side (Known)

Here,

$$\begin{aligned} A_{ij} &= \sum_{k=1}^d \left(\frac{\partial \phi_i}{\partial x_k}, \frac{\partial \phi_j}{\partial x_k} \right) + \sum_{k=1}^d C_{11}([\phi_i n_k], [\phi_j n_k])_{\Gamma \cup \Gamma_D} \\ &\quad - \sum_{k=1}^d \nu([\phi_i n_k], \{ \frac{\partial \phi_j}{\partial x_k} \})_{\Gamma \cup \Gamma_D} - \sum_{k=1}^d \nu(\{ \frac{\partial \phi_i}{\partial x_k} \}, [\phi_j n_k])_{\Gamma \cup \Gamma_D}. \end{aligned} \quad (15)$$

$$B_{ij} = - \int_{\mathcal{T}} \frac{\partial \phi_i}{\partial x_i} \psi_j + (\{\psi_j\}, [n \cdot \phi_i])_{\Gamma \cup \Gamma_D}. \quad (16)$$

1. Livelihood and survival mobility are oftentimes coutcomes of uneven socioeconomic development.
 - a. Livelihood and survival mobility are oftentimes coutcomes of uneven socioeconomic development.
 - b. Livelihood and survival mobility are oftentimes coutcomes of uneven socioeconomic development.

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graph TD
    U6[U(6)] --> U5a[U(5)]
    U6 --> O6[O(6)]
    U6 --> SU3[SU(3)]
    U5a --> O5a[O(5)]
    O6 --> O5b[O(5)]
    SU3 --> SU3_1[SU(3)]
    O5a --> O3a[O(3)]
    O5b --> O3b[O(3)]
    SU3_1 --> O3c[O(3)]
  
```

2. Livelihood and survival mobility are oftentimes outcomes of uneven socio-economic development.

In order to avoid simply listing headings of different levels we recommend to let every heading be followed by at least a short passage of text. Use the L^AT_EX automatism for all your cross-references and citations as has already been described in Sect. ??, see also Fig. 1.

For unnumbered list we recommend to use the `itemize` environment – it will automatically be rendered in line with the preferred layout.

- Livelihood and survival mobility are oftentimes outcomes of uneven socioeconomic development, cf. Table 1.
 - Livelihood and survival mobility are oftentimes outcomes of uneven socioeconomic development.
 - Livelihood and survival mobility are oftentimes outcomes of uneven socioeconomic development.
- Livelihood and survival mobility are oftentimes outcomes of uneven socioeconomic development.

Run-in Heading Boldface Version Use the \LaTeX automatism for all your cross-references and citations as has already been described in Sect. ??.

Run-in Heading Boldface and Italic Version Use the L^AT_EX automatism for all your cross-references and citations as has already been described in Sect. ??.

Use the L^AT_EX automatism for all your cross-references and citations as has already been described in Sect. ??.

Table 1 Please write your table caption here

Classes	Subclass	Length	Action Mechanism
Translation	mRNA ^a	22 (19–25)	Translation repression, mRNA cleavage
Translation	mRNA cleavage	21	mRNA cleavage
Translation	mRNA	21–22	mRNA cleavage
Translation	mRNA	24–26	Histone and DNA Modification

^a Table foot note (with superscript)

3 Section Heading

Instead of simply listing headings of different levels we recommend to let every heading be followed by at least a short passage of text. Further on please use the \LaTeX automatism for all your cross-references and citations as has already been described in Sect. ??.

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If you want to list definitions or the like we recommend to use the enhanced `description` environment – it will automatically rendered in line with the preferred layout.

- Type 1 That addresses central themes pertaining to migration, health, and disease. In Sect. ??, Wilson discusses the role of human migration in infectious disease distributions and patterns.
- Type 2 That addresses central themes pertaining to migration, health, and disease. In Sect. ??, Wilson discusses the role of human migration in infectious disease distributions and patterns.

3.1 Subsection Heading

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If you want to emphasize complete paragraphs of texts we recommend to use the newly defined class option and environment `svgraybox`. This will produce a 15 percent screened box 'behind' your text.

3.1.1 Subsubsection Heading

Instead of simply listing headings of different levels we recommend to let every heading be followed by at least a short passage of text. Further on please use the \LaTeX automatism for all your cross-references and citations as has already been described in Sect. ??.

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Theorem 1 *Theorem text goes here.*

Definition 1 Definition text goes here.

Proof Proof text goes here. □

Paragraph Heading

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Theorem 2 *Theorem text goes here.*

Definition 2 Definition text goes here.

Proof Proof text goes here. □

Trailer Head

If you want to emphasize complete paragraphs of texts in an Trailer Head we recommend to use

```
\begin{trailer}{Trailer Head}
...
\end{trailer}
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? Questions

If you want to emphasize complete paragraphs of texts in an `Questions` we recommend to use

```
\begin{question}{Questions}  
...  
\end{question}
```

> Important

If you want to emphasize complete paragraphs of texts in an **Important** we recommend to use

```
\begin{important}{Important}  
...  
\end{important}
```

! Attention

If you want to emphasize complete paragraphs of texts in an **Attention** we recommend to use

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\begin{warning}{Attention}  
...  
\end{warning}
```

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If you want to emphasize complete paragraphs of texts in an **Program Code** we recommend to use

```
\begin{programcode}{Program Code}  
\begin{verbatim}...\end{verbatim}  
\end{programcode}
```

Tips

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```
\begin{tips}{Tips}  
...  
\end{tips}
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```
\begin{overview}{Overview}
...
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```

Background Information

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```
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...
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```
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...
\end{legalttext}
```

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Appendix

When placed at the end of a chapter or contribution (as opposed to at the end of the book), the numbering of tables, figures, and equations in the appendix section continues on from that in the main text. Hence please *do not* use the `appendix` command when writing an appendix at the end of your chapter or contribution. If there is only one the appendix is designated “Appendix”, or “Appendix 1”, or “Appendix 2”, etc. if there is more than one.

$$a \times b = c \tag{17}$$

References

References

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2. all works by the author with a coauthor, ordered alphabetically by coauthor
3. all works by the author with several coauthors, ordered chronologically by year of publication.

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