# Assessing the potential of Jacobian-free Newton-Krylov methods for cell-centred finite volume solid mechanics

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#### Abstract

In this study, we explore the efficacy of Jacobian-free Newton-Krylov methods within the context of finite-volume solid mechanics. Traditional Newton-based approaches to solving nonlinear systems often require explicit formation and storage of the Jacobian matrix, which can be computationally expensive and memory-intensive. The Jacobian-free Newton-Krylov method circumvents this by employing Krylov subspace iterative solvers, such as GMRES, in conjunction with a Newton iteration scheme that approximates the action of the Jacobian through finite difference evaluations. This approach promises significant computational savings, especially for large-scale, complex simulations prevalent in solid mechanics. This article research systematically evaluates the performance of Jacobian-free Newton-Krylov methods by benchmarking them against conventional segregated methods on a suite of test problems, including elastic, plastic, linear and nonlinear geometry deformation scenarios. Key metrics such as convergence rate, computational cost, and robustness are analysed. Additionally, we investigate the impact of various preconditioning strategies on the efficiency of the Jacobian-free Newton-Krylov method. Our findings indicate that Jacobian-free Newton-Krylov methods can achieve comparable/superior/XXX convergence behaviour relative to traditional segregated methods, particularly in cases where YYYY. The results suggest that Jacobian-free Newton-Krylov methods are promising for advancing finite-volume solid mechanics simulations, offering a viable pathway for enhancing computational efficiency and scalability. EMPHASISE: easy to extend segregated frameworks, on contrast to exact Jacobian methoods.

Key FV points: - many FV codes were developed around a segregated solution procedure, which requires significant effort to extend to a full Newton method, e.g. in terms of Jacobian assembly, storage, and linear system solution. - this paper examines Jacobian-free Newton-Krylov as a straight-forward extension of the segregated approach, without the need for a full Jacobian

based method. - compact approximate Jacobian for preconditioner (more compact than FE approach) - implemented in OpenFOAM, and code and cases are made publicly available.

Keywords: Jacobian-free Newton-Krylov, Finite volume method, GMRES, OpenFOAM

## 1 Introduction

Finite volume formulations for solid mechanics are heavily influenced by their fluid mechanics counterparts, favouring segregated implicit and fully explicit methods. Segregated approaches, where the governing momentum equation is temporarily decomposed into scalar component equations, offer memory efficiency and simplicity of implementation, but the outer coupling Picard iterations often suffer from slow convergence. Explicit formulations are equally straightforward to implement and offer superior robustness but are only efficient for fast dynamics. In contrast, the finite element community commonly employs Newton-Raphson-type solution algorithms, which necessitate repeated assembly of the exact Jacobian and solution of the resulting block-coupled non-diagonally dominant linear system. Traditional Newton-based approaches, as commonly employed with finite element approaches, often require explicit formation and storage of the Jacobian matrix, which can be computationally expensive and memory-intensive. In addition, from a finite volume perspective, derivation, assembly, storage and solution of the resulting block-coupled system often require major refactoring of existing segregated frameworks or creating entirely new implementations. Consequently, similar block-coupled solution finite volume methods are rare in the literature [???]; The motivation of the current work is to seek (or exceed) the robustness and efficiency of block-coupled Newton-Raphons approaches in a way that can be easily incorporated into existing segregated solution frameworks. To this end, the current article examines the efficacy of Jacobianfree Newton-Krylov methods, where the quadratic convergence of Newton methods can potentially be achieved without deriving, assembling and storing the exact Jacobian.

Jacobian-free Newton-Krylov methods circumvent the need for the Jacobian matrix by combining the Newton-Raphson method with Krylov subspace iterative linear solvers, such as GMRES, and noticing that such Krylov solvers do not explicitly require the Jacobian matrix. Instead, only the action of the Jacobian matrix on a solution-type vector is required. The key step in Jacobian-free Newton-Krylov methods is the approximation of products between the Jacobian matrix and vectors using the finite difference method; that is

$$\mathbf{J}\mathbf{v} \approx \frac{\mathbf{F}(\mathbf{x} + \epsilon \mathbf{v}) - \mathbf{F}(\mathbf{x})}{\epsilon} \tag{1}$$

where **J** is the Jacobian matrix, **x** is the current solution vector (e.g. nodal displacements), **v** is a vector (e.g., from a Krylov subspace), and  $\epsilon$  is a small scalar perturbation. With an appropriate choice of  $\epsilon$  (balancing truncation and round-off errors), the characteristic quadratic convergence of Newton methods can be achieved without the Jacobian, hence the prefix *Jacobian-free*. This approach promises significant memory savings over Jacobian-based methods, especially for large-scale, but also potentially for execution time, with appropriate choice of solution components.

A crucial aspect of ensuring the efficiency and robustness of the Jacobian-free Newton-Krylov method is the choice of a suitable preconditioner for the Krylov iterations. This preconditioner is often derived from the exact Jacobian matrix to accelerate convergence in traditional Newton methods. However, we do not have direct access to the full Jacobian matrix in the Jacobian-free approach, necessitating an alternative strategy to approximate its action.

To this end, and to extend existing segregated frameworks, we propose using a compact-stencil approximate Jacobian as the preconditioner. This approximate Jacobian corresponds to the matrix typically employed in segregated approaches; similar approaches are successful in fluid mechanics applications [? ?]; however, it is unclear if such an approach is suitable for solid mechanics - a question which we hope to answer in this work. By leveraging this compact-stencil approximate Jacobian, we aim to effectively precondition the Krylov iterations, enhancing convergence while maintaining the memory and computational savings that define the Jacobian-free method. Similarly, if such an approach is efficient, it would naturally fit into existing segregated frameworks, as existing matrix storage and assembly can be reused.

The remainder of the paper is structured as follows: Section 2 summarises a typical solid mechanics mathematical model and its cell-centred finite volume discretisation. Section 3 presents the solution algorithms, starting with the classic segregated solution algorithm, followed by the proposed Jacobian-free Newton-Krylov solution algorithm. The performance of the proposed Jacobian-free Newton-Krylov approach is compared with the segregated approach on several varying benchmark cases in Section 4, where the effect of several factors are examined, including problem dimension, mesh, material model, nonlinear geometry, choice of preconditioner, and other solution parameter. Finally, the article ends with a summary of the main conclusions of the work.

#### 2 Mathematical Model and Numerical Methods

## 2.1 Governing Equations

WIP

#### 2.2 Cell-Centred Finite Volume Discretisation

WIP

## 3 Solution Algorithms

#### 3.1 Segregated Solution Algorithm

WIP

#### 3.2 Jacobian-free Newton-Krylov Algorithm

WIP

## 4 Test Cases

WIP

## 5 Conclusions

WIP

The main conclusions of the work are:

- WIP
- WIP

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## Appendix A WIP

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