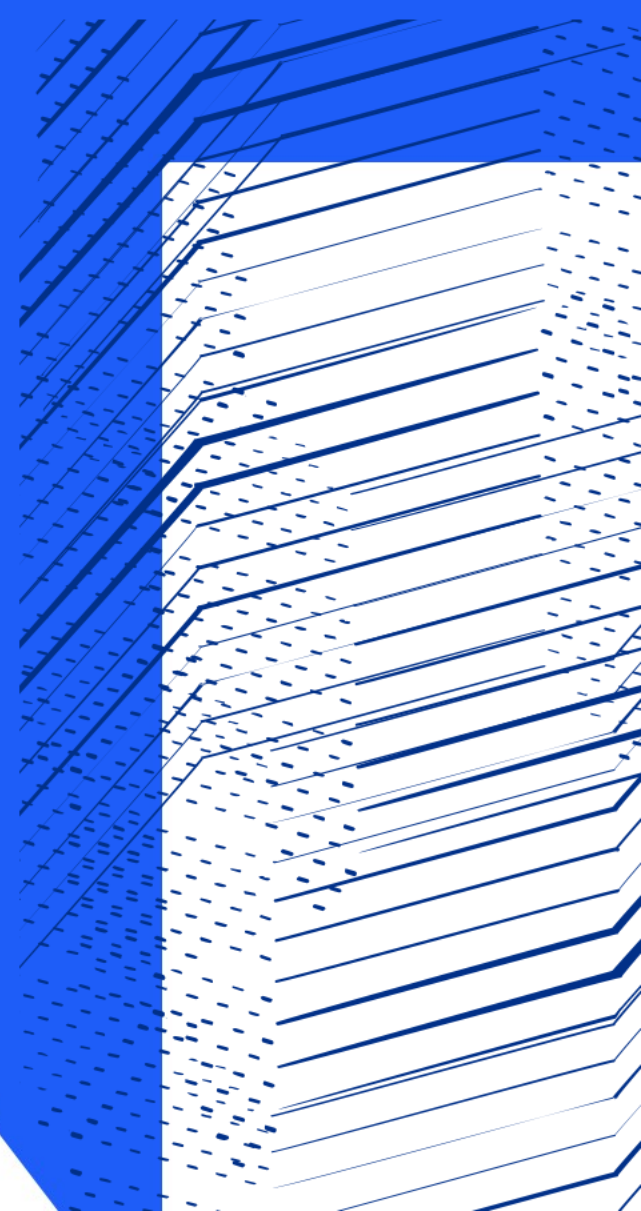




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# NEPTUNE: Numerical Analysis

Sue Thorne (PI) and Tyrone Rees (Co-I)



# Work Package Themes

Preconditioners for Plasma Modelling

Time Advance Techniques for Plasma Modelling

Coupling of Continuum (Fluid) and Particle Models for Plasma Modelling

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State-of-the-art Solution Continuation Techniques

Adjoint Methods for Fusion



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# Preconditioners for Plasma

Continuation of Mathematical Support Project

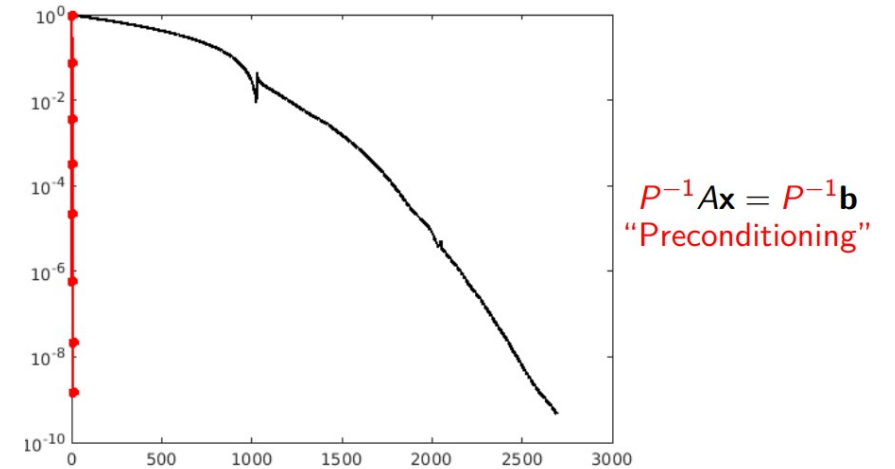
- Build on earlier deliverables

The proxyapp will have identified the most promising candidate preconditioner for NEPTUNE, and we will:

- Implement this in a documented library (probably PETSc-based) to be called by other NEPTUNE software
- Investigate preconditioning methods for coupled elliptic and parabolic systems.

## Deliverables

- Update the three technical reports previously delivered on preconditioning **(31/3/23 & 14/2/24)**
- Develop a technical specification for the software library **(31/3/23)**
- Identify a block preconditioner for implementation **(14/2/24)**
- Develop library and associated docs **(31/3/23 & 14/2/24)**



## Dependencies

- Agreed technical specification with Nektar++ team and other interested parties

# Time Advance Techniques

Continuation of Mathematical Support Project

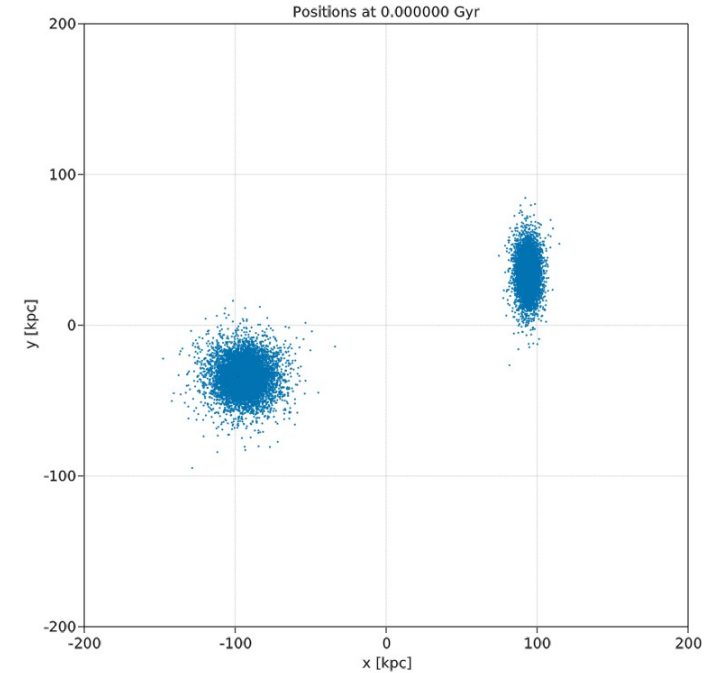
- Build on earlier deliverables

The proxyapp will have identified the most promising candidate time-stepping for NEPTUNE, and we will:

- Implement this in a documented library (probably PETSc-based) to be called by other NEPTUNE software

## Deliverables

- Update the three technical reports previously delivered on preconditioning **(31/3/23 & 14/2/24)**
- Develop a technical specification for the software library **(31/3/23)**
- Develop library and associated docs **(31/3/23 & 14/2/24)**



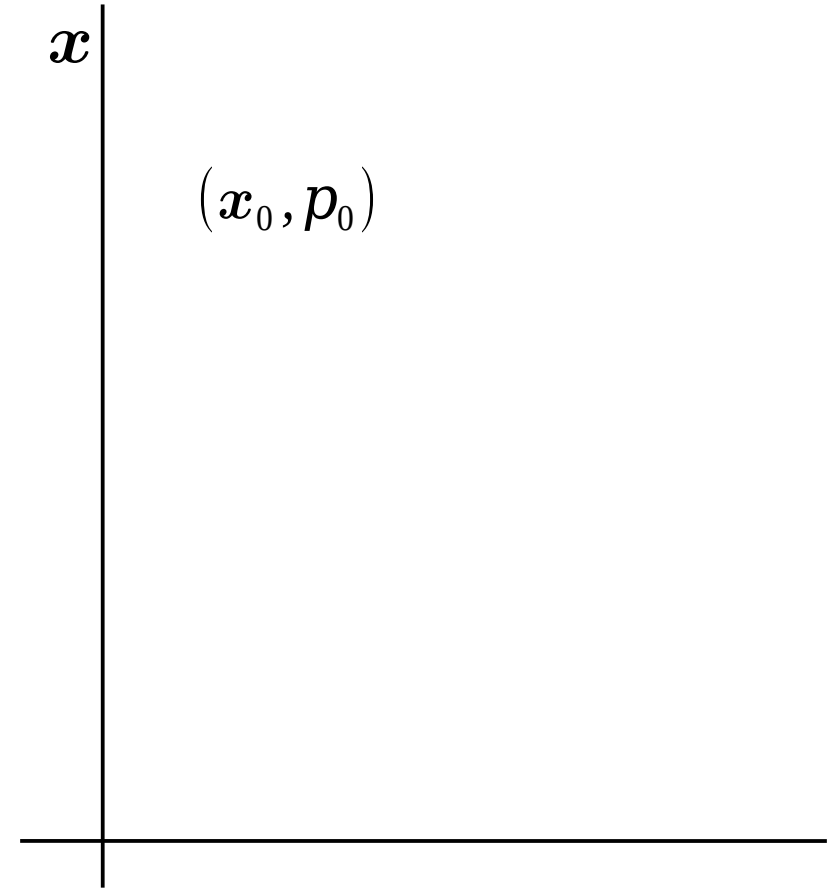
## Dependencies

- Agreed technical specification with Nektar++ team and other interested parties

# State-of-the-art Solution Continuation Techniques

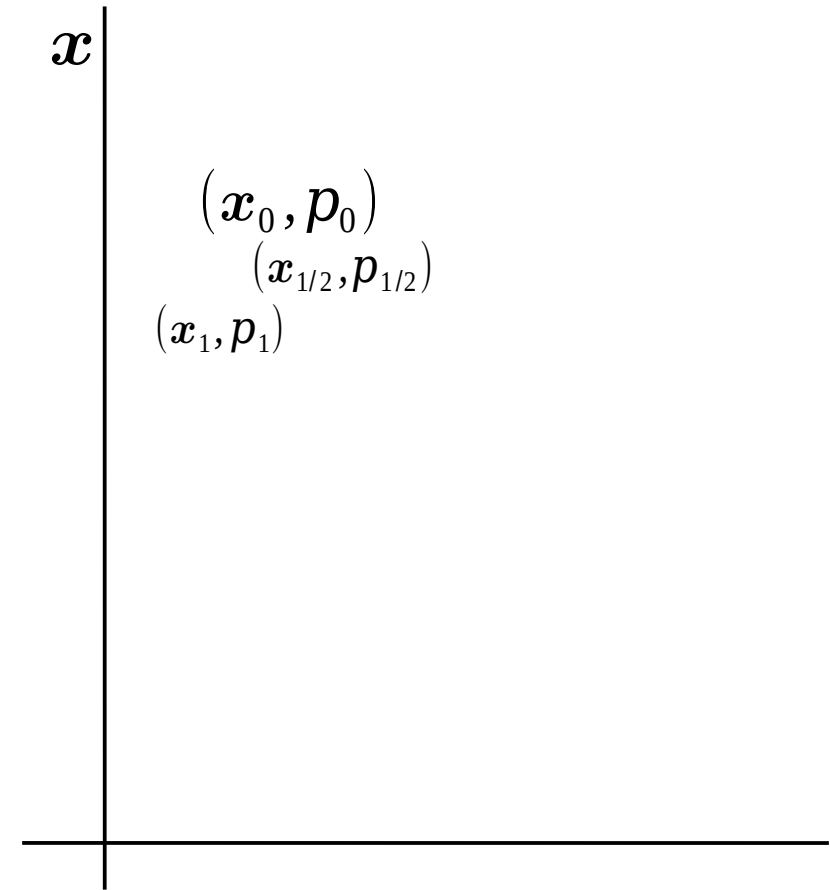
Find solutions to the nonlinear equations  
as a function of the real parameter, .

Given a known solution , we can continue it by  
computing a curve of solutions that passes  
through .



# Predictor-Corrector methods

These methods make a (cheap) prediction of the next point, and then use a more expensive method to correct the guess to lie on the solution curve.



# Predictor-Corrector methods

## Predictors

### Natural predictor

Based on the naïve choice of

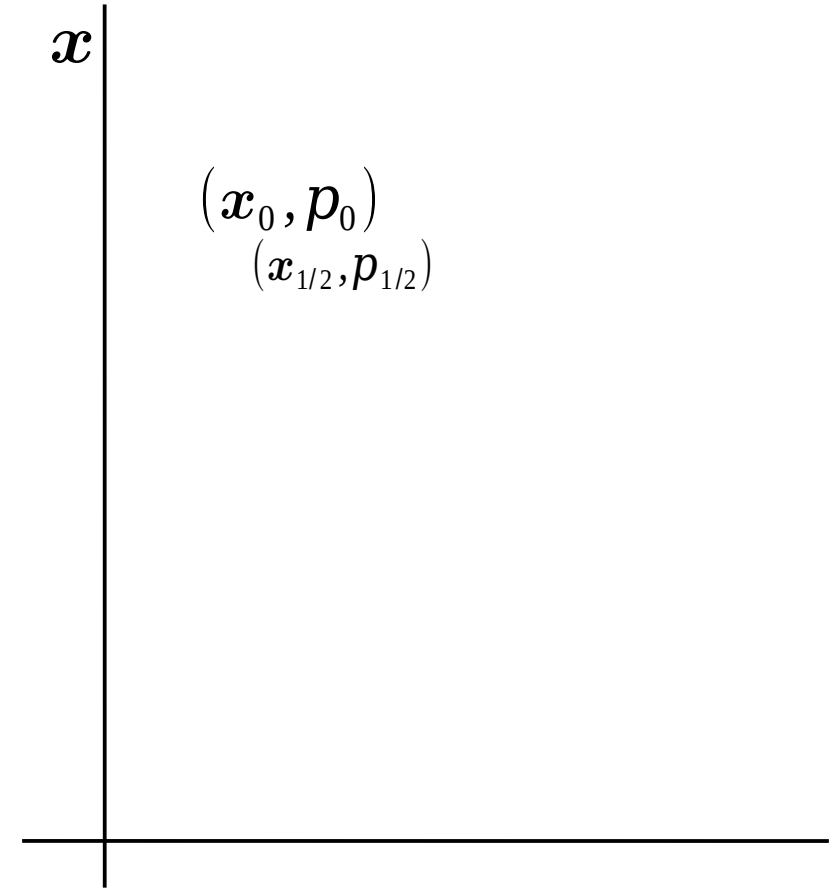
For some small step size .

### First order predictor

Uses derivative information

Where is (an approximation to) the tangent at

....



# Predictor-Corrector methods

## Predictors

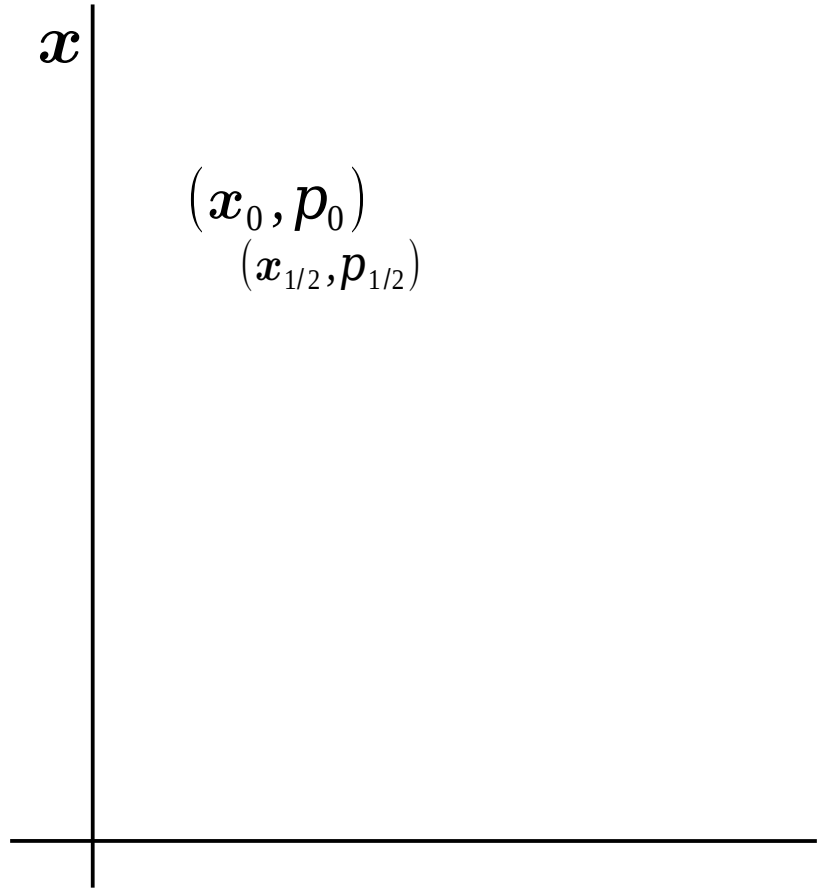
### Polynomial predictor

Uses least-squares regression to fit a polynomial of degree to the last solution vectors (), and uses this to generate the prediction step.

### Multiple predictor

Use multiple predictors with different steps sizes, and choose the largest step with sufficient decrease of the corrector.

Can be more robust, especially in problems from PDEs.





# Predictor-Corrector methods

## Correctors

### Newton's Method

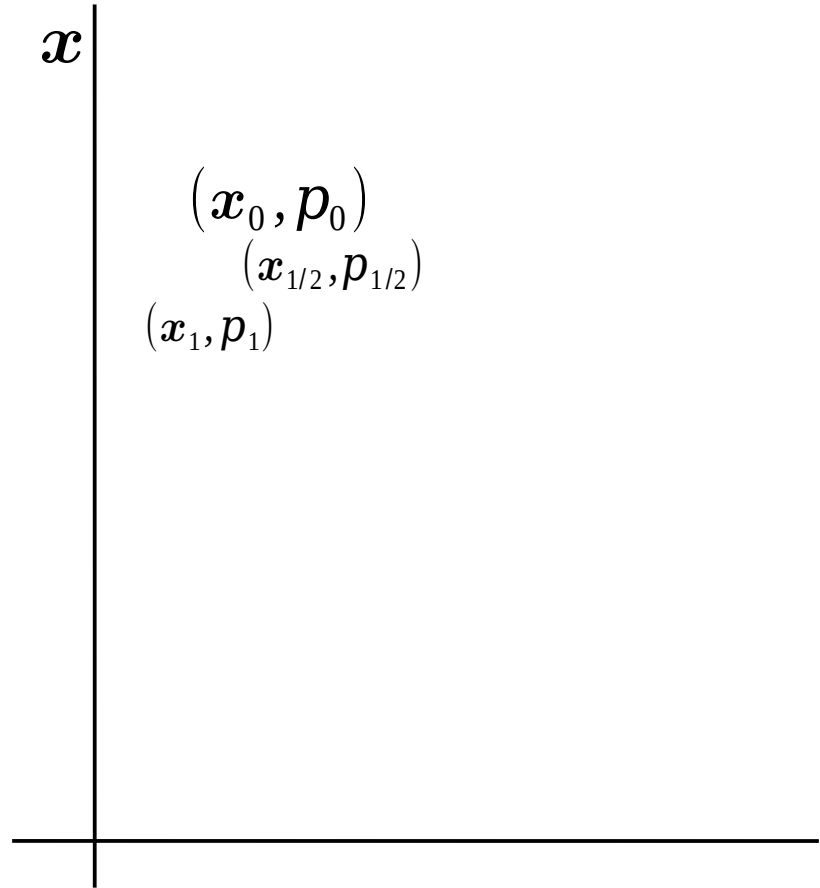
If solving , Newton's method takes the form:

**Problem:** The Jacobian of is non-square, so can't be inverted.

**Solution:** Use the Moore-Penrose pseudo-inverse,

This is equivalent to solving the NLLS problem

using a Gauss-Newton method.



# Predictor-Corrector methods

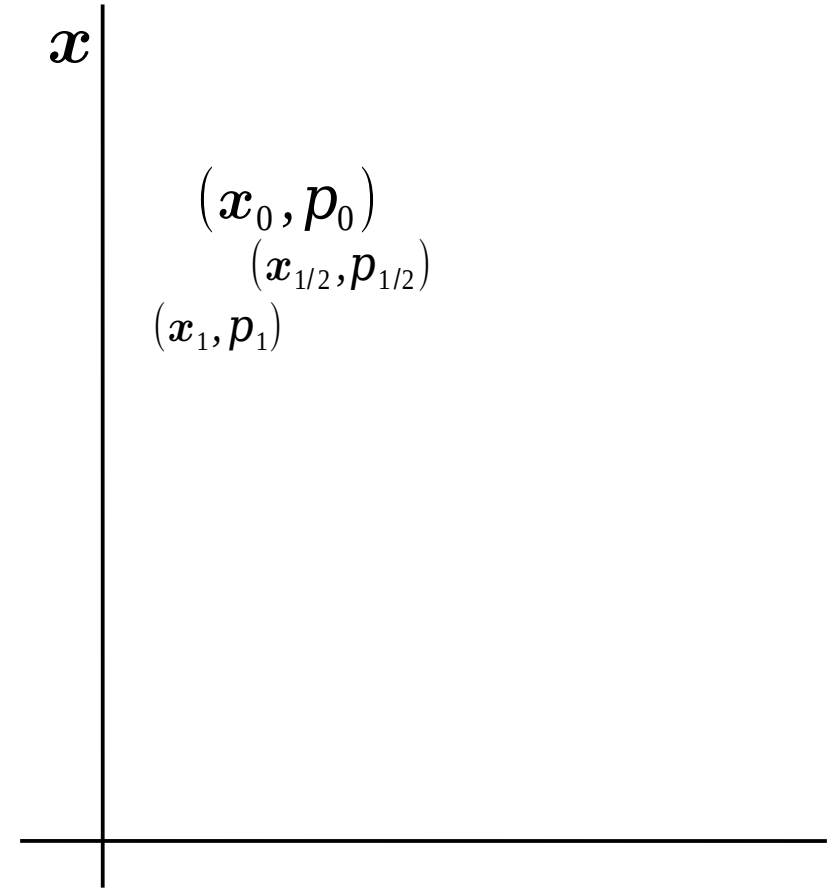
## Correctors

### Pseudoarclength continuation

We can also add constraints to the equation, to make the Jacobian invertible. For example, solve

where  $s$  is the pseudoarclength, an approximation of the arclength in the tangent space of the curve.

The Newton step in this case requires the solution of a square matrix:

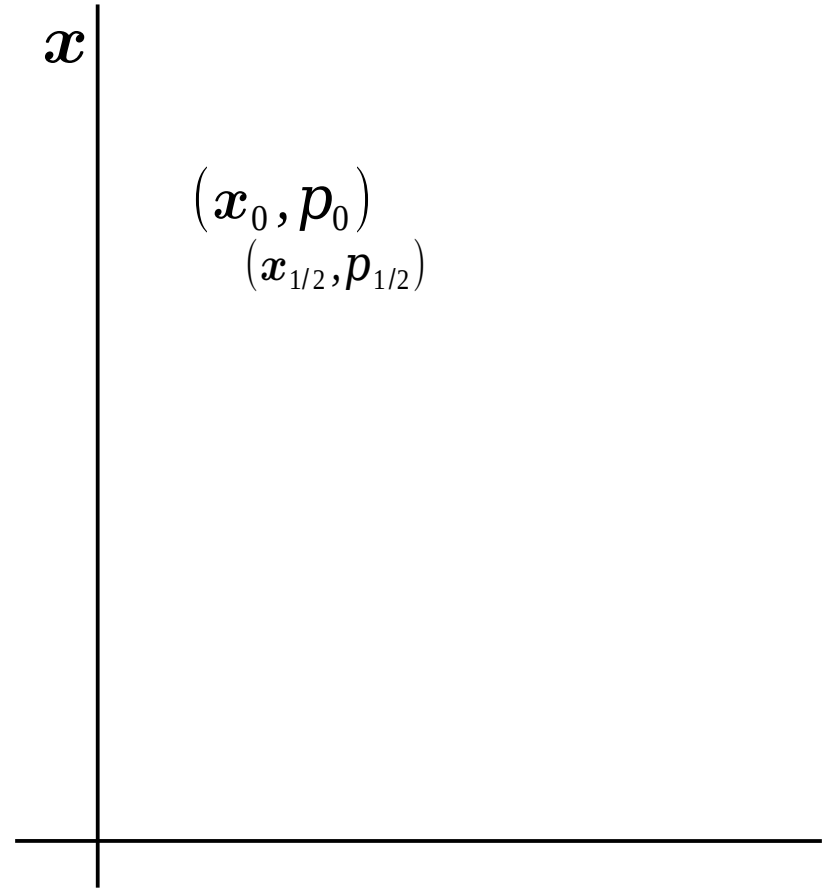


# Predictor-Corrector methods

## Step length

The predictor gives a direction, but we need to specify a length of step to take in that direction. If the region is smooth, a large step can be taken. If there is lots going on, we need to take a smaller step.

Various adaptive strategies have been proposed, which we will explore.

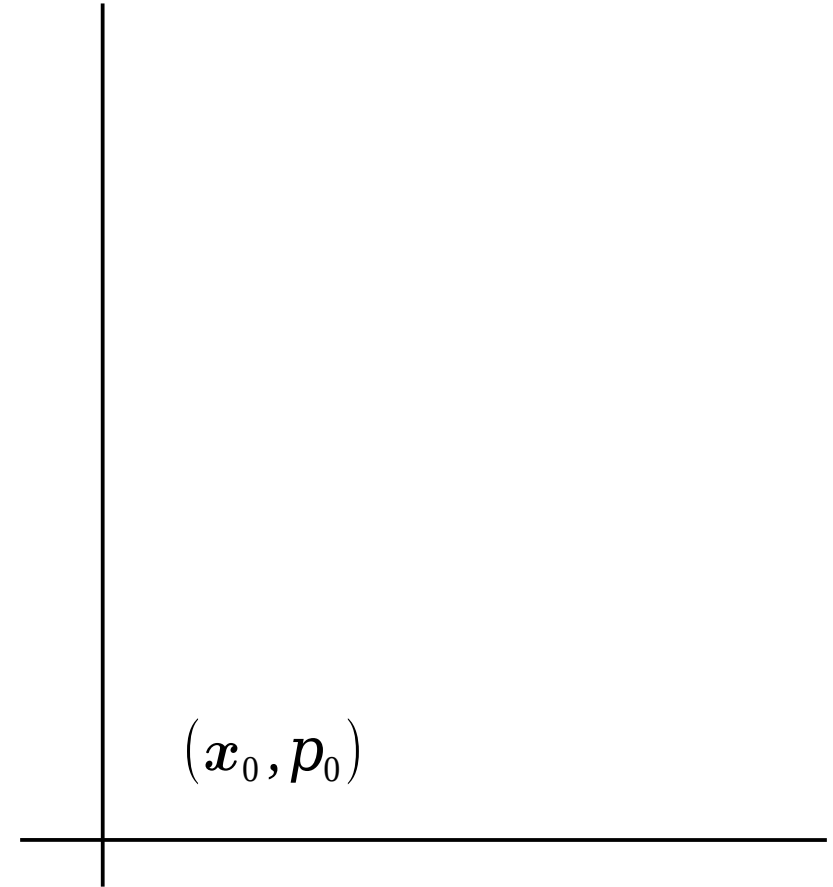


# Predictor-Corrector methods

## Special points

Points, such as turning points or bifurcation points, often need to be identified accurately.

Some of the methods discussed previously are more robust to such features than others.

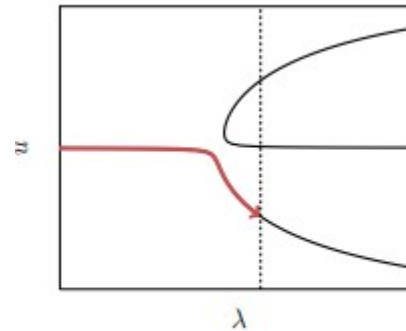


# Predictor-Corrector methods

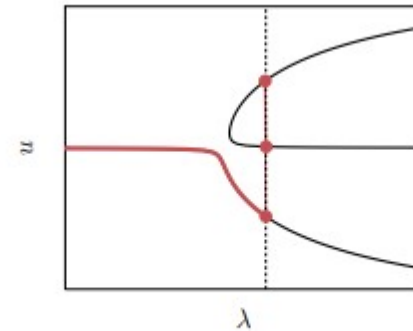
## Deflation

Deflation techniques [†] allow us to find multiple branches, and can be applied in case where the bifurcation diagram is disconnected.

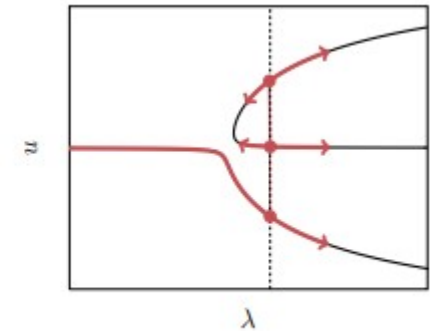
These work by modifying the nonlinear system so that Newton's method does not converge to a known root.



(a) Initial continuation



(b) Apply deflation



(c) Continuation of branches

[†] Farrell, Beentjes and Birkisson 2016 <https://arxiv.org/abs/1603.00809v1>

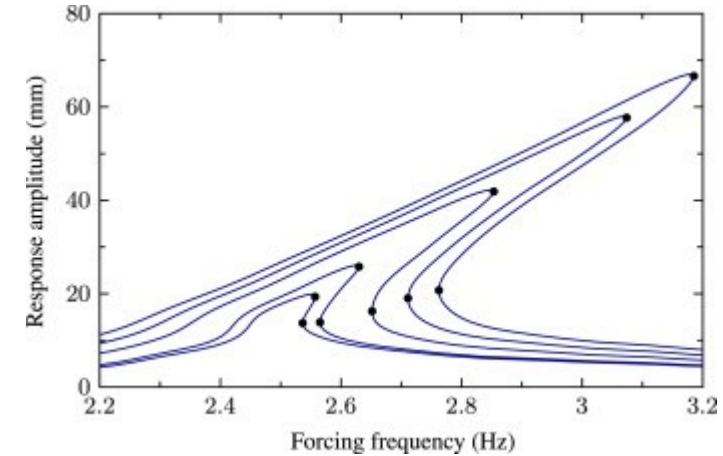
# State-of-the-art Solution Continuation Techniques

Investigate the state of the art in

- Predictor techniques
  - Corrector methods
    - Linear solver and other algebraic considerations
  - Step size selection
  - Critical point identification
- as applied in a HPC/Exascale environment applied to spectral element codes for plasma modelling.

## Deliverables

- Report summarising literature and software available for continuation methods. **(31/7/2023)**
- Proxyapp implementing a suitable technique on a test problem relevant to plasma modelling. **(14/2/2024)**
- Report/presentation summarizing proxyapp test results. **(14/2/2024)**



## Dependencies

- Success requires at least one representative problem for which solution continuation techniques will be applied to in NEPTUNE, with particular reference to the needs of the grant holders working in UQ.

# Coupling of Continuum (Fluid) and Particle Models for Plasma Modelling

Continuation of Mathematical Support Project

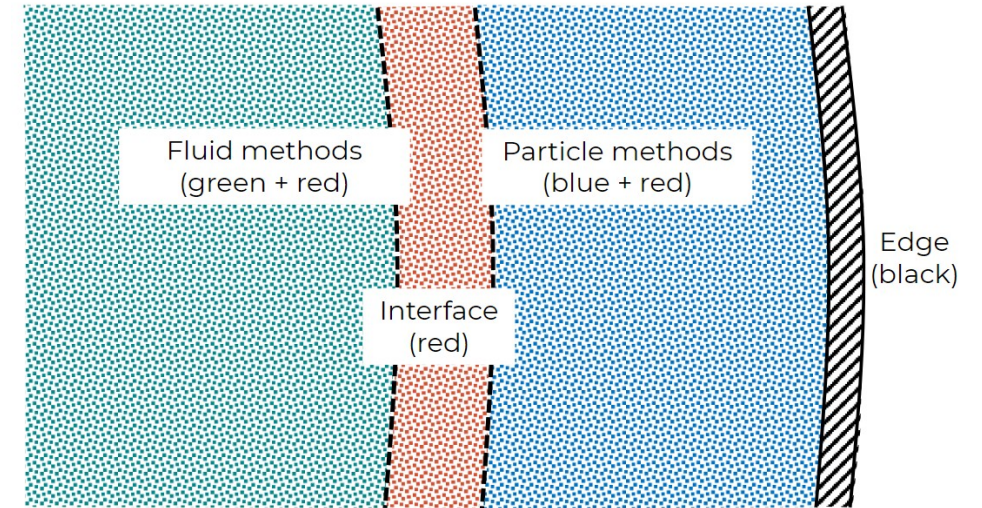
- Build on earlier deliverables

Three main coupling methods

- Kinetic-Diffusion Monte Carlo Method (KDMC)
  - Each MC particle alternates between fluid and kinetic actions
- Micro-Macro Hybrid Method (mMH)
  - Significant changes to NEPTUNE Programme required
- Spatial Hybridization (SpH)
  - Separation of concerns
  - Existing libraries identified: [CWIPi](#), MUI and preCICE

## Deliverables (31/3/2023)

- Software module for SpH method
  - Linking Nektar++ fluid and particle approaches
  - Allow investigation of the interface: Location? Size?
- Results from benchmark tests
- Updated reports



Spatial Hybridization (SpH) Approach

## Dependencies

- Agreed technical specification
- Provision of appropriate fluid and particle codes



# Adjoint Methods for Fusion

Build on knowledge developed within project from FARSCAPE2

- Derive and implement adjoint for ideal MHD, Grad-Shafranov equilibrium
- Use adjoint model to study stability/sensitivity and compare to literature
- Ubaid Qadri and Daniel Ward

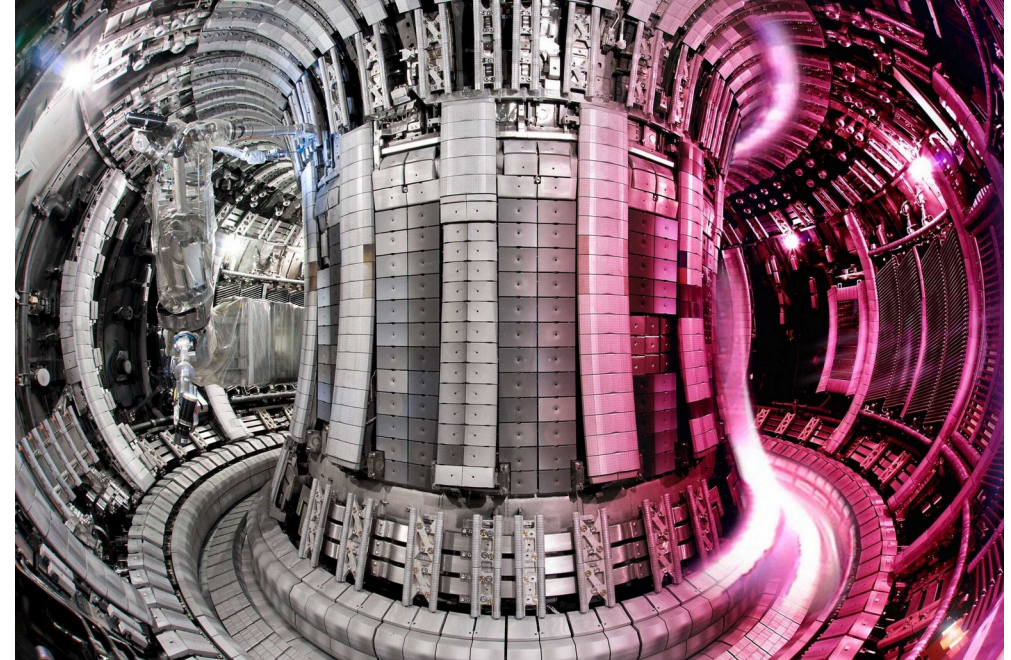
Identify state-of-the-art algorithms for generating and solving adjoint equations, and their applicability to plasma modelling, e.g., sensitivity analysis, optimization

- For sensitivity analysis, variational form is used and mean value theorem applied to write linear form  $\rightarrow$  adjoint problem

Identify algorithm and develop proxyapp

## Deliverables

- Report identifying current state-of-the-art algorithms for generating and solving adjoint equations that may be suitable for HPC/Exascale implementation particularly in the context of spectral element code for plasma modelling (31/7/23)
- Proxyapp and benchmark results (14/2/24)



## Dependencies

- Following literature and software review, feedback on areas to concentrate on