



# **Lunar Lander Truss Project**

AERO 423 - Aerospace Computational Methods

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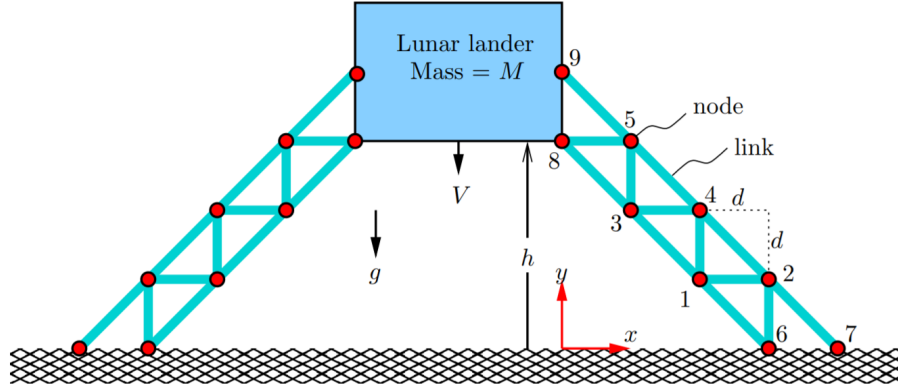
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### III Problem Description

The project will simulate the landing of robotic lunar rover. The landing dynamics are determined by the lander legs, which are flexible trusses that absorb the kinetic energy of a landing. The setup is illustrated in the figure below.



**Figure 1:** Lunar Lander problem setup that features a lander with four legs; in the figure only two are shown with the other two out of the plane of the page and not shown.

The lander has four legs, but only one will be simulated, shown on the right in the above figure. The other legs are calculated from the right leg since they are all symmetric. In addition, in-plane deformation will be assumed so that the problem remains two-dimensional. Each leg consists of a truss of nodes and links, as indicated above. Nodes 8 and 9 are bolted to the lander, and cannot move relative to each other; instead, these move vertically with the lander. In addition, upon landing, nodes 6 and 7 dig into the soil and cannot move.

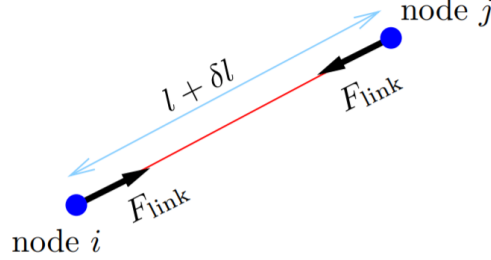
On the other hand, nodes 1-5 can move arbitrarily, and their motion is dictated by the forces acting through the links to which they are attached. Finally, the motion of the lander is determined by the forces acting on it, which are its weight and the forces of the legs acting through the attachment points.

#### Link Force Calculation

The nodes move because of the forces exerted on them by the links. It is assumed that these links have no mass (they are very light relative to the nodes) and that the tensile force in a link depends on how much the link is stretched,  $\delta l$ , and how fast it is being stretched,  $\dot{\delta l}$ :

$$F_{link} = k\delta l + \gamma\dot{\delta l} \quad (1)$$

To calculate the resulting force contributions at the two adjacent nodes - called  $i$  and  $j$  a few definitions must be made:



**Figure 2:** Force in one link.

$$\begin{aligned}
 \vec{x}_i &= [x_i, y_i] = \text{position of node } i \\
 \vec{x}_j &= [x_j, y_j] = \text{position of node } j \\
 \vec{v}_i &= [u_i, v_i] = \text{velocity of node } i \\
 \vec{v}_j &= [u_j, v_j] = \text{velocity of node } j \\
 l_0 &= \text{initial length of this link}
 \end{aligned} \tag{2}$$

The quantities appearing in Equation 1 can then be calculated as:

$$\delta l = |\vec{x}_j - \vec{x}_i| - l_0 \tag{3}$$

$$\hat{\delta} l = (\vec{x}_j - \vec{x}_i) \cdot \vec{e}_{ij} \tag{4}$$

where  $|\cdot|$  refers to the magnitude of a vector and

$$\vec{e}_{ij} = \frac{\vec{x}_j - \vec{x}_i}{|\vec{x}_j - \vec{x}_i|} \tag{5}$$

The force on nodes  $i$  and  $j$  due to this link are, respectively,

$$\vec{F}_{ij} = F_{link} \vec{e}_{ij} \tag{6}$$

$$\vec{F}_{ji} = -F_{link} \vec{e}_{ij} \tag{7}$$

As shown above, a positive  $F_{link}$  corresponds to a tension force that pulls the nodes closer together.  $\delta l$  is a positive when the link is stretched longer than its initial equilibrium length, and  $\hat{\delta} l$  is positive when the link is actively being stretched. So  $k\delta l$  is then a restorative force, while  $\gamma\hat{\delta} l$  is a damping term. At every node, the forces from the links sum together to exert a net force on the node. The node's acceleration is given by this total force divided by the node mass.

## Dynamics

Each free node of the truss in the lunar lander leg can move in the  $x$  and  $y$  direction. The acceleration of a free node is caused by the forces acting on it: its weight and the forces from the adjacent links. The lunar lander moves only vertically, by symmetry of the legs. The lander's (vertical) acceleration is caused by its own weight and the forces of the legs acting through nodes 8 and 9. At  $t = 0$ , the legs are in their equilibrium configuration, shown in Figure 1, with nodes 6 and 7 having just hit the ground, and with the rest of the nodes, and the lander, moving downward at speed  $V$ .

## IV Parameters

The parameters relevant to the problem are listed below. Note, the lunar lander mass includes the masses of the affixed nodes, 8 and 9, from each leg.

$T$	=	0.5	[s]	Time Horizon
$m_{mode}$	=	0.1	[kg]	Node Mass
$M$	=	100	[kg]	Lander Mass
$d$	=	0.2	[m]	Initial Truss Width/Height
$k$	=	$10^5$	[N/m]	Link Stiffness
$\gamma$	=	200	[Ns/m]	Link Damping
$g$	=	1.625	[m/s <sup>2</sup> ]	Acceleration Due to Gravity
$V$	=	6	[m/s]	Initial Impact (descent) Speed

## V Numerical Approach

To simulate the dynamics of the truss, use a state vector of 22 entries: the  $(x,y)$  positions and velocities of the 5 free nodes, and the height and vertical velocity of the lunar lander. The equations of motion will be of the form:

$$\dot{\mathbf{u}} = \mathbf{f}(\mathbf{u}) \tag{8}$$

where  $\mathbf{f}$  contains the physics (force-balance) calculations.

Three numerical integration techniques will be used to solve this system of ODEs: Forward Euler, second-order Adams Bashforth, and fourth-order Runge Kutta. When discretizing time, a constant time step  $\Delta t = T/N_t$  will be used, where  $N_t$  is the number of time steps.

# 1 Equations of Motion for a Free Node and for the Lunar Lander

Using the equations of motion for a free node and for the lunar lander, a function can be programmed that takes input of the state,  $\mathbf{u}$ , and any other required parameters, and computes the vector  $\mathbf{f}$ . Using the state corresponding to the initial equilibrium configuration,  $V = 0$ , and  $g = 0$ , the verification can be made that the function returns  $\mathbf{f}$  identically equal to zero.

## 1.1 Equations of Motion

**EOM for Free Nodes (1-5):**

$$\begin{bmatrix} \ddot{x}_i \\ \ddot{y}_i \end{bmatrix} = \frac{1}{m_{node}} \left( \sum_{i=1}^{elements} k\delta l + \gamma\dot{\delta} l \vec{e}_{ij} \right) - \begin{bmatrix} 0 \\ g \end{bmatrix} \quad (9)$$

**EOM for Lunar Lander (Nodes 8-9):**

$$\begin{bmatrix} \ddot{x}_i \\ \ddot{y}_i \end{bmatrix} = \frac{8}{M} \left( \sum_{i=1}^{elements} k\delta l + \gamma\dot{\delta} l \vec{e}_{ij} \right) - \begin{bmatrix} 0 \\ g \end{bmatrix} \quad (10)$$

## 1.2 MATLAB Implementation of EOMs

In order to create a function which outputs the vector  $\mathbf{f}$ , a function to calculate the summation of the forces on each node must be created. This function will take in the given node state, a matrix of the position in x and y, and the velocity in u and v, along with the specific node of interest and output the summation of forces. The node state is written as such:

$$\mathbf{u} = \begin{bmatrix} x_1 & y_1 & u_1 & v_1 \\ x_2 & y_2 & u_2 & v_2 \\ x_3 & y_3 & u_3 & v_3 \\ x_4 & y_4 & u_4 & v_4 \\ x_5 & y_5 & u_5 & v_5 \\ x_6 & y_6 & u_6 & v_6 \\ x_7 & y_7 & u_7 & v_7 \\ x_8 & y_8 & u_8 & v_8 \\ x_9 & y_9 & u_9 & v_9 \end{bmatrix} \quad (11)$$

The organization of the node state will allow for the plotting of the node state at given time steps in future numerical schemes. The summation of forces using this node layout is done by creating a for loop which loops to the maximum size of the inputted nodes matrix. Within the loop, each node is read against a list of corresponding nodes to determine the initial distance of the links. The links are either initially 0.2 or 0.2828 meters. Once the distance is found, the force of the node of interest and the surrounding nodes is summed together and the function outputs the total force.

The  $\mathbf{f}$  function can now be written to take in the node state  $\mathbf{u}$  and output  $\mathbf{f}$ . The function turns a state vector of positions and velocities into a vector of velocities and accelerations using the above equations of motion, while also accounting for the boundary conditions on nodes 6 and 7. Nodes 6 and 7 are not able to move from their bounded state due to their placement into the lunar surface. Therefore, the function sets the  $\mathbf{f}$  output for these nodes to all zeroes. The free node states are calculated using the respective equation of

motion. The lunar lander state is also calculated using its equation of motion with respect to the connected nodes of 8 and 9. However, the boundary condition that nodes 8 and 9 must remain 0.2 meters apart in the y direction is enforced through the neglecting of x plane velocities and accelerations.

The output of the  $\mathbf{f}$  function turns the input of a matrix of node positions and velocities into a  $36 \times 1$  column vector with the following form for all nine nodes:

$$\mathbf{f}(\mathbf{u}) = \begin{bmatrix} u_1 \\ v_1 \\ \dot{u}_1 \\ \dot{v}_1 \\ \vdots \\ u_9 \\ v_9 \\ \dot{u}_9 \\ \dot{v}_9 \end{bmatrix} \quad (12)$$

The function  $\mathbf{f}(\text{nodes})$  in the MATLAB code in the appendix reflects the imposed boundary conditions discussed, as well as the function that calculates the summed force at each node. The force summation function `node_force(nodes,node)` is also shown in the appendix code block.

### 1.3 Function with Initial Equilibrium Condition

The state corresponding to the initial equilibrium condition where  $V = 0$ , and  $g = 0$ , has been verified to output a vector of all zeros. This is expected output since there would be no forces acting on any of the nodes as the lander and truss system would simply be “sitting” in free space. In this equilibrium case, the output is a  $36 \times 1$  column vector of all zeros.

$$\mathbf{f}(\mathbf{u}) = [0 \ 0 \ 0 \ 0 \ \dots \ 0 \ 0 \ 0 \ 0]'$$

***Note:** this column vector is shown as transposed to allow for better readability.*



## 2 Approximate Jacobian Matrix for Time-Step Restriction

By perturbing individual components of the state vector  $\mathbf{u}$  from the initial configuration and repeatedly calling the  $\mathbf{f}$  function, an approximate Jacobian Matrix,  $\frac{\delta \mathbf{f}}{\delta \mathbf{u}}$ , can be constructed. The eigenvalues of this  $22 \times 22$  matrix can be found in the complex number plane and used to graphically determine the time-step restriction for the time stepping methods used.

### 2.1 Constructed Jacobian Matrix

The  $\frac{\delta \mathbf{f}}{\delta \mathbf{u}}$  matrix can be constructed by perturbing individual components of the state vector  $\mathbf{u}$  by a small amount of  $1 \times 10^{-6}$ . This perturbation will be referred to as  $h$ . The matrix will be constructed with the following form:

$$\frac{\delta \mathbf{f}}{\delta \mathbf{u}} = \begin{bmatrix} \frac{\delta f_1}{\delta x_1} & \frac{\delta f_1}{\delta x_2} & \frac{\delta f_1}{\delta x_3} & \cdots & \frac{\delta f_1}{\delta x_n} \\ \frac{\delta f_2}{\delta x_1} & \frac{\delta f_2}{\delta x_2} & \frac{\delta f_2}{\delta x_3} & \cdots & \frac{\delta f_2}{\delta x_n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ \frac{\delta f_n}{\delta x_1} & \frac{\delta f_n}{\delta x_2} & \frac{\delta f_n}{\delta x_3} & \cdots & \frac{\delta f_n}{\delta x_n} \end{bmatrix} \quad (13)$$

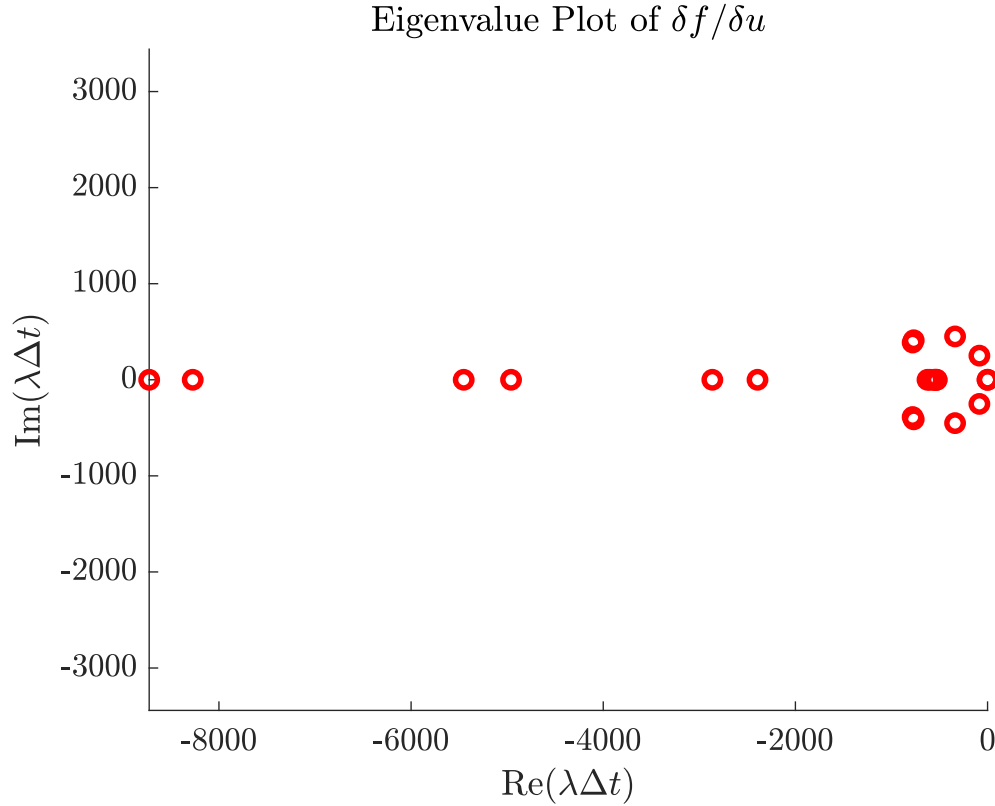
To find each individual derivative in the matrix Newton's difference quotient will be used. Using a limit as the  $h$  value approaches zero, the limit of the derivative of the function is defined as:

$$f'(a) = \lim_{h \rightarrow 0} \frac{f(a+h) - f(a)}{h} \quad (14)$$

In this case, each part of the  $\frac{\delta \mathbf{f}}{\delta \mathbf{u}}$  matrix will need to be filled in using this derivative function. In MATLAB, a function called `dfdu_matrix(nodes)` was created to output the  $22 \times 22$  matrix using an input of the initial node state.

## 2.2 Eigenvalues Plot of the Jacobian Matrix

The eigenvalues of the now populated  $22 \times 22$  matrix created using perturbed components can be calculated using the built-in MATLAB function `eig(matrix)`. The eigenvalue output of this function can then be plotted on imaginary versus real axes. Shown below is the plot of the eigenvalues for the  $\frac{\delta f}{\delta u}$  matrix.



**Figure 3:** Plot of the derivative matrix showing the real and imaginary parts of the eigenvalues used to determine the scaling of the maximum time step.

As seen in the above figure, the smallest real root on the plot is  $-8726$ . This value will be important in conjunction with the roots of each eigenvalue stability equation for the numerical methods Forward Euler, Adams Bashforth, and Fourth Order Runge-Kutta. The value will be used in the determination of scaling for the eigenvalues to place them into a stable regime to calculate the maximum allowable time step for the schemes.

## 2.3 Time-Step Restriction for Numerical Schemes

To find the maximum allowable time step for the numerical schemes in the case of the lunar lander dynamics, the eigenvalue stability plot must first be generated for each scheme. The plot will allow for the scaling of the  $\frac{\delta f}{\delta u}$  eigenvalues inside the stable regime.

### 2.3.1 Forward Euler Numerical Scheme Stability

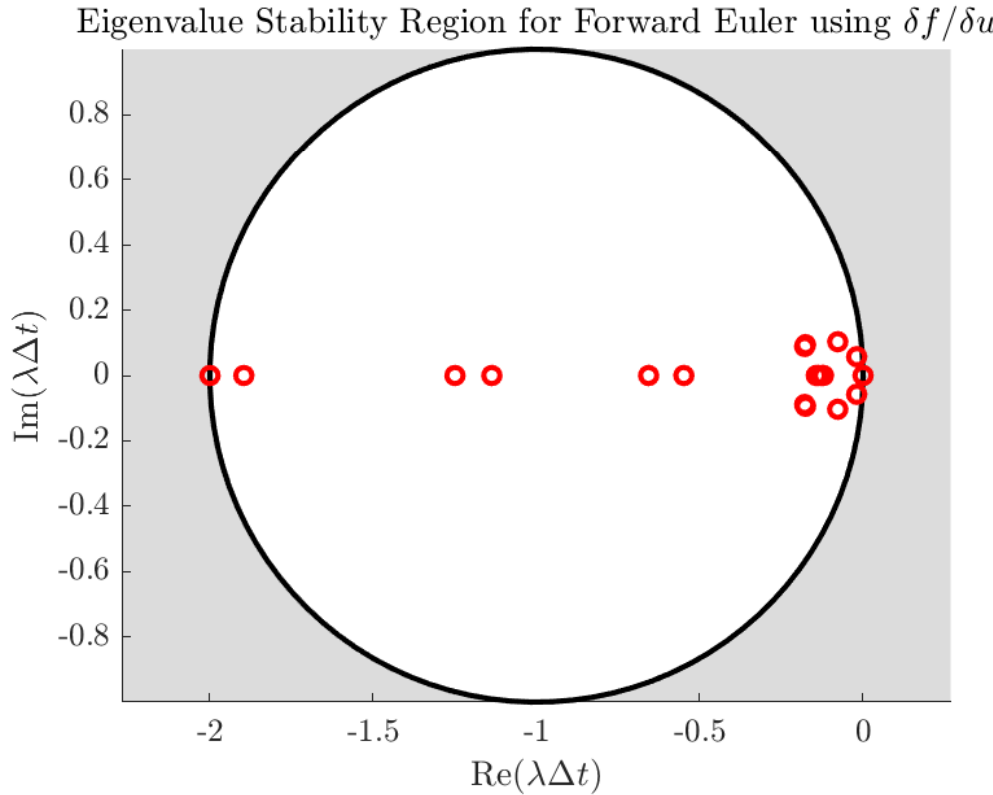
The eigenvalue stability of Forward Euler is given by the following equation:

$$\lambda \Delta t = e^{i\theta} - 1 \quad (15)$$

The equation can be plotted by specifying a  $\theta$  which ranges from 0 to  $2\pi$ . Much like the above figure, the real and imaginary parts of the equation are plotted to reveal a stability region. By observing that the smallest real root available on the Forward Euler contour as  $-2$ , a scaling factor can be created in order to fit the eigenvalues of the  $\frac{\delta f}{\delta u}$  matrix inside the stable regime.

$$scale_{FE} = \frac{-8726}{-2}$$

Applying this scaling factor to all the eigenvalues of  $\frac{\delta f}{\delta u}$ , the plot below can be created to show all values are now in the stable regime.



**Figure 4:** Plot of the eigenvalues of Forward Euler with the applied scaling factor to fit the eigenvalues of the  $\frac{\delta f}{\delta u}$  matrix inside the stability region.

The inverse of the scaling factor also reveals the maximum allowable time step for the Forward Euler numerical scheme with the given dynamics.

$$\Delta t_{FE} = 2.2914 \times 10^{-4} \text{ s}$$

The restriction on the time step is it must be less than this value or else the time-stepping method will be unstable and result in incorrect computations.

### 2.3.2 Adams Bashforth Numerical Scheme Stability

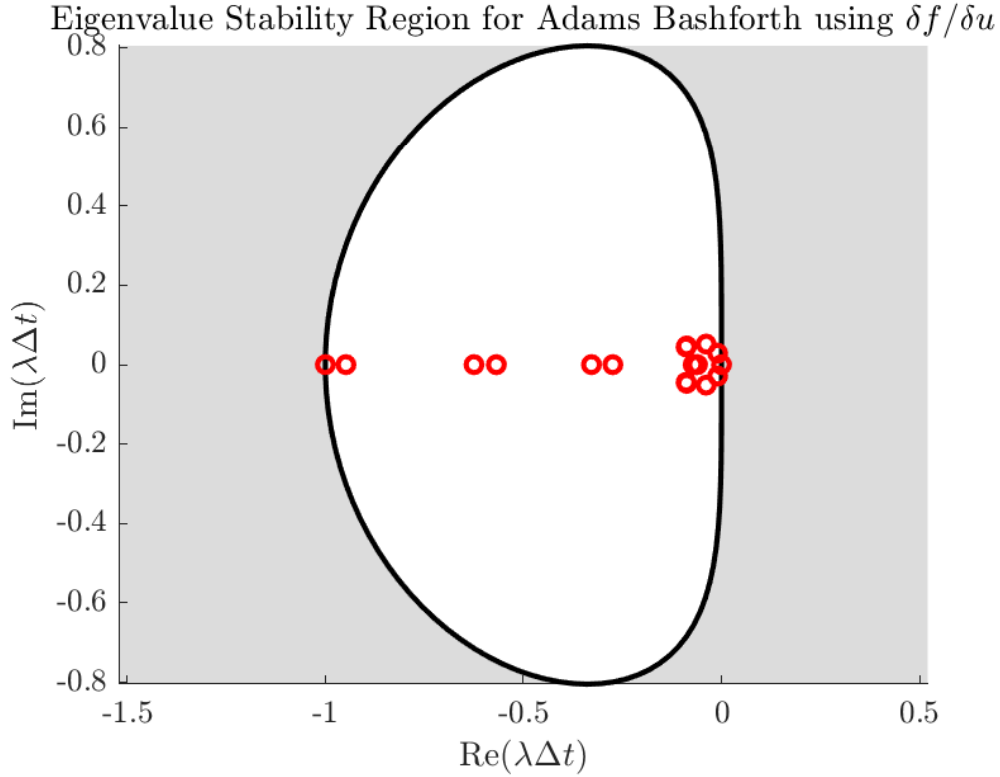
The eigenvalue stability of Adams Bashforth is given by the following equation where  $g = e^{i\theta}$ :

$$\lambda \Delta t = (g - 1) \frac{2g}{3g - 1} \quad (16)$$

The equation can be plotted by specifying a  $\theta$  which ranges from 0 to  $2\pi$ . By observing that the smallest real root available on the Adams Bashforth contour as  $-0.9997$ , a scaling factor can be created in order to fit the eigenvalues of the  $\frac{\delta f}{\delta u}$  matrix inside the stable regime.

$$scale_{AB2} = \frac{-8726}{-0.9997}$$

Applying this scaling factor to all the eigenvalues of  $\frac{\delta f}{\delta u}$ , the plot below can be created to show all values are now in the stable regime.



**Figure 5:** Plot of the eigenvalues of Adams Bashforth with the applied scaling factor to fit the eigenvalues of the  $\frac{\delta f}{\delta u}$  matrix inside the stability region.

The inverse of the scaling factor also reveals the maximum allowable time step for the Adams Bashforth numerical scheme with the given dynamics.

$$\Delta t_{AB2} = 1.1456 \times 10^{-4} \text{ s}$$

The restriction on the time step is it must be less than this value or else the time-stepping method will be unstable and result in incorrect computations.

### 2.3.3 Runge-Kutta Numerical Scheme Stability

The eigenvalue stability of 4th Order Runge-Kutta is given by the following equation where  $g = e^{i\theta}$ :

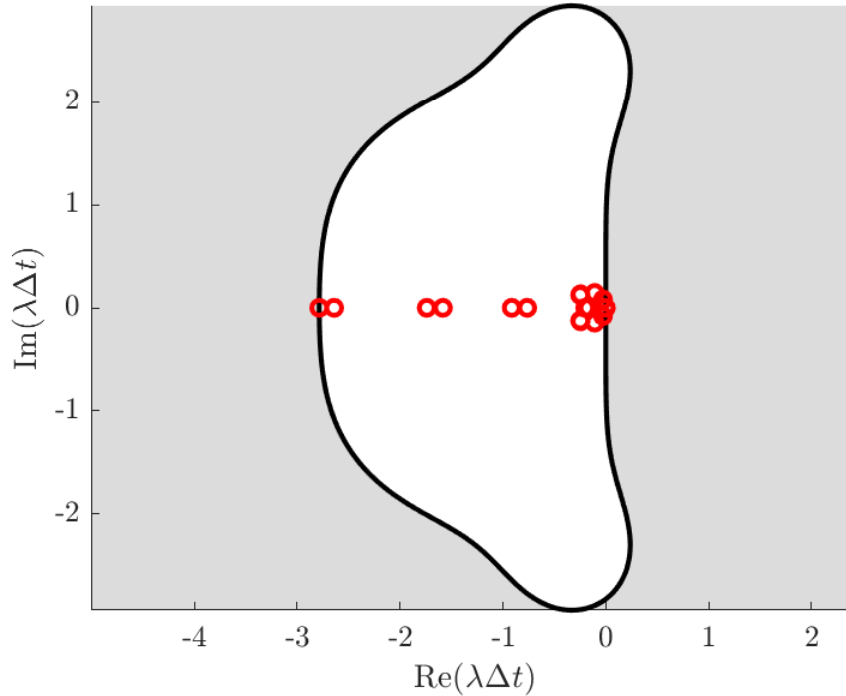
$$g = 1 + \lambda \Delta t + \frac{1}{2}(\lambda \Delta t)^2 + \frac{1}{6}(\lambda \Delta t)^3 + \frac{1}{24}(\lambda \Delta t)^4 \quad (17)$$

The equation must be numerically solved for  $\lambda \Delta t$  at a  $\theta$  which ranges from 0 to  $2\pi$ . Once the system of four equation is solved, the stability plot can be made by plotting the real and imaginary parts of  $\lambda \Delta t$ . By observing that the smallest real root available on the Runge-Kutta contour as  $-2.7853$ , a scaling factor can be created in order to fit the eigenvalues of the  $\frac{\delta f}{\delta u}$  matrix inside the stable regime.

$$scale_{RK4} = \frac{-8726}{-2.7853}$$

Applying this scaling factor to all the eigenvalues of  $\frac{\delta f}{\delta u}$ , the plot below can be created to show all values are now in the stable regime.

Eigenvalue Stability Region for 4th Order Runge-Kutta using  $\delta f / \delta u$



**Figure 6:** Plot of the eigenvalues of Runge-Kutta with the applied scaling factor to fit the eigenvalues of the  $\frac{\delta f}{\delta u}$  matrix inside the stability region.

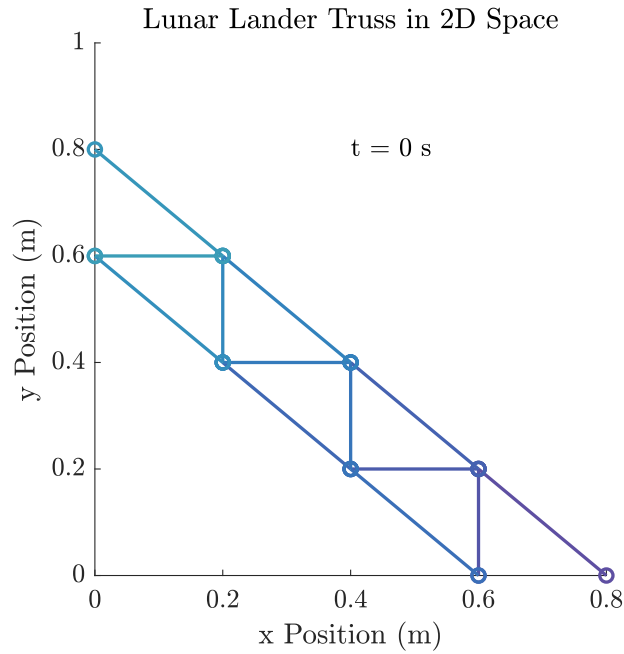
The inverse of the scaling factor also reveals the maximum allowable time step for the Runge-Kutta numerical scheme with the given dynamics.

$$\Delta t_{RK4} = 3.1919 \times 10^{-4} \text{ s}$$

The restriction on the time step is it must be less than this value or else the time-stepping method will be unstable and result in incorrect computations.

### 3 Implementation of Forward Euler (FE), Adams Bashforth (AB2), and Runge Kutta (RK4)

The implementation of Forward Euler, second-order Adams-Bashforth, and fourth-order Runge-Kutta time integration is detailed in this section. The verification of the maximum time steps calculated in the previous section will take place to ensure stability of the methods. For comparison purposes, a plot of the initial configuration of the lunar lander truss is shown below. This will be used to show that the implementation of these schemes results in a convergent and stable solution.



**Figure 7:** Plot of the lunar lander truss at  $T = 0$  before any numerical scheme is applied in order to show a comparison between dynamic and non-dynamic movement of the truss.

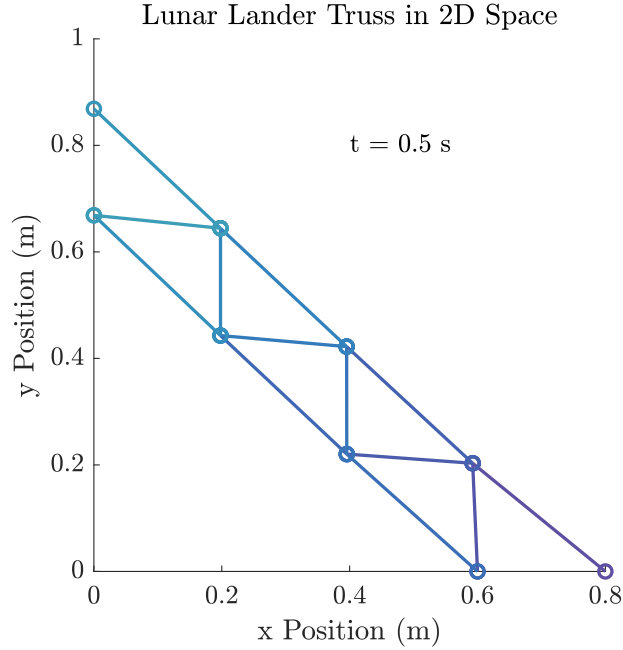
#### 3.1 Forward Euler Numerical Scheme Implementation

Forward Euler numerical method was implemented based off the following iteration equation:

$$\mathbf{u}^{n+1} = \mathbf{u}^n + \Delta t \mathbf{f}(\mathbf{u}^n)$$

Using this iteration equation a function called `FE(nodes, t)` was created in MATLAB to repeatedly call the function `f`. The input to the function is the state of the nodes in matrix form as described in the past details, as well as a vector of time that is based off of the time period of 0 to 0.5 seconds using the maximum time step decreased by 3% to ensure stability is maintained. Within the function calculates the  $\Delta t$  value by the difference of the first two time steps in the time vector.

The function then preallocates the output array using the size of the input node matrix and time step. Next, the node matrix is organized into a column state vector before that vector is used in the scheme. Since the  $f$  function takes input as the node matrix, a temporary matrix is created from the column state vector to be used as input. A for loop repeats these steps continually until the  $N - 1$  index is reached, where  $N$  is the maximum number of entries in the time vector.



**Figure 8:** Plot of the lunar lander truss at  $T = 0.5$  after all iterations of the Forward Euler scheme have taken place showing that stability is maintained at the tweaked maximum time-step values.

The plot of the lunar lander truss shows the iteration successfully converges and results in an expected result for a truss experiencing a load. Therefore, verification of the Forward Euler implementation is completed and can be relied on for the future simulations and results.

### 3.2 Adams Bashforth Numerical Scheme Implementation

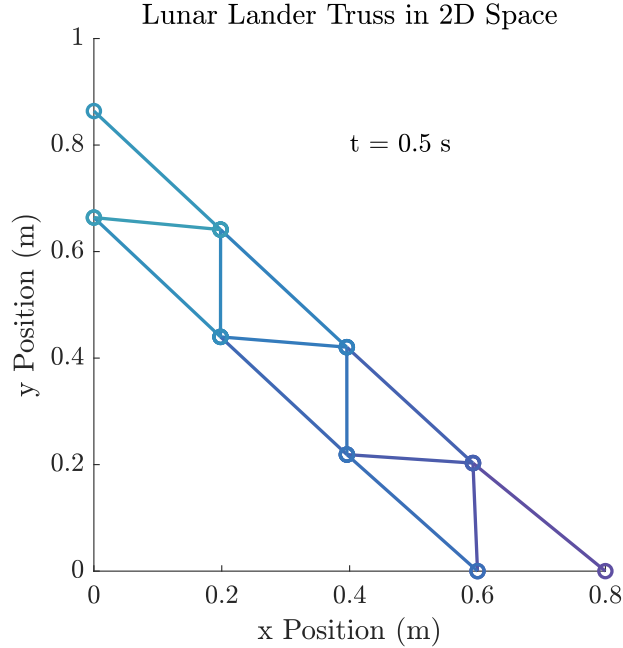
Adams Bashforth numerical method was implemented based off the following iteration equations:

$$\mathbf{u}^{n+1} - \mathbf{u}^n = \Delta t \left( \frac{3}{2} \mathbf{f}(\mathbf{u}^n, t^n) - \frac{1}{2} \mathbf{f}(\mathbf{u}^{n-1}, t^{n-1}) \right)$$

Using this iteration equation a function called  $AB2(\text{nodes}, \tau)$  was created in MATLAB to repeatedly call the function  $f$ . The input to the function is the state of the nodes in matrix form as described in the past details, as well as a vector of time that is based off of the time period of 0 to 0.5 seconds using the maximum time step decreased by 3% to ensure stability is maintained. Within the function calculates the  $\Delta t$  value by the difference of the first two time steps in the time vector.

The function then preallocates the output array using the size of the input node matrix and time step. Next, the node matrix is organized into a column state vector before that vector is used in the scheme. Since Adams Bashforth relies on two steps in time, an additional step in time was generated using one iteration of Forward Euler. This allows for the AB2 scheme to begin as there are now two known states. The  $f$  function takes input as the node matrix, therefore a temporary matrix is created from the column state vector to be

used as input. A for loop repeats these steps continually until the  $N - 1$  index is reached, where  $N$  is the maximum number of entries in the time vector.



**Figure 9:** Plot of the lunar lander truss at  $T = 0.5$  after all iterations of the Adams Bashforth scheme have taken place showing that stability is maintained at the tweaked maximum time-step values.

The plot of the lunar lander truss shows the iteration successfully converges and results in an expected result for a truss experiencing a load. Therefore, verification of the Adams Bashforth implementation is completed and can be relied on for the future simulations and results.

### 3.3 Runge-Kutta Numerical Scheme Implementation

Fourth Order Runge-Kutta Euler method can be implemented using the following update equation:

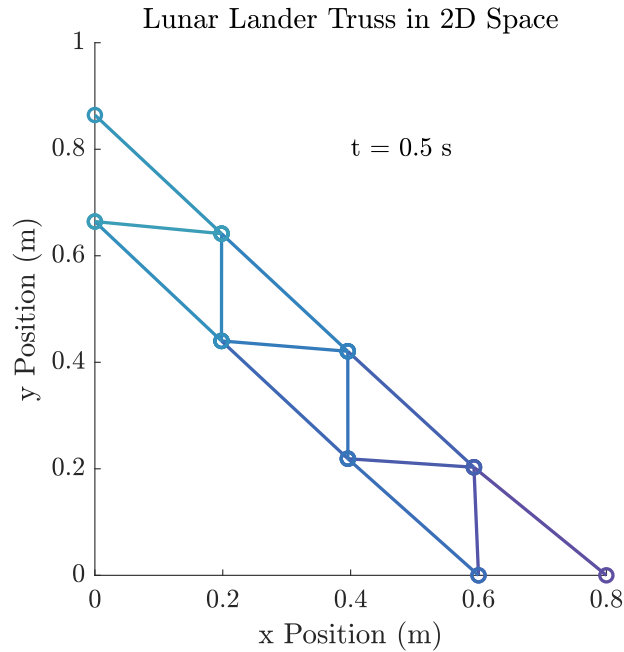
$$\begin{aligned} \mathbf{f}_0 &= \mathbf{f}(\mathbf{u}^n, t^n) \\ \mathbf{f}_1 &= \mathbf{f}\left(\mathbf{u}^n + \frac{1}{2}\Delta t \mathbf{f}_0, t^n + \frac{\Delta t}{2}\right) \\ \mathbf{f}_2 &= \mathbf{f}\left(\mathbf{u}^n + \frac{1}{2}\Delta t \mathbf{f}_1, t^n + \frac{\Delta t}{2}\right) \\ \mathbf{f}_3 &= \mathbf{f}(\mathbf{u}^n + \Delta t \mathbf{f}_2, t^n + \Delta t) \\ \mathbf{u}^{n+1} &= \mathbf{u}^n + \frac{\Delta t}{6}(\mathbf{f}_0 + 2\mathbf{f}_1 + 2\mathbf{f}_2 + \mathbf{f}_3) \end{aligned}$$

Using this iteration equation a function called `RK4(nodes, t)` was created in MATLAB to repeatedly call the function `f`. The input to the function is the state of the nodes in matrix form as described in the past details, as well as a vector of time that is based off of the time period of 0 to 0.5 seconds using the maximum time step decreased by 3% to ensure stability is maintained. Within the function calculates the  $\Delta t$  value by the difference of the first two time steps in the time vector.

The function then preallocates the output array using the size of the input node matrix and time step. Next, the node matrix is organized into a column state vector before that vector is used in the scheme. Since the



`f` function takes input as the node matrix, a temporary matrix is created from the column state vector to be used as input. The fourth order Runge-Kutta method relies on multiple steps within one time iteration, which deemed it necessary to have each of these steps continually calculated. A `for` loop repeats these steps continually until the  $N - 1$  index is reached, where  $N$  is the maximum number of entries in the time vector.

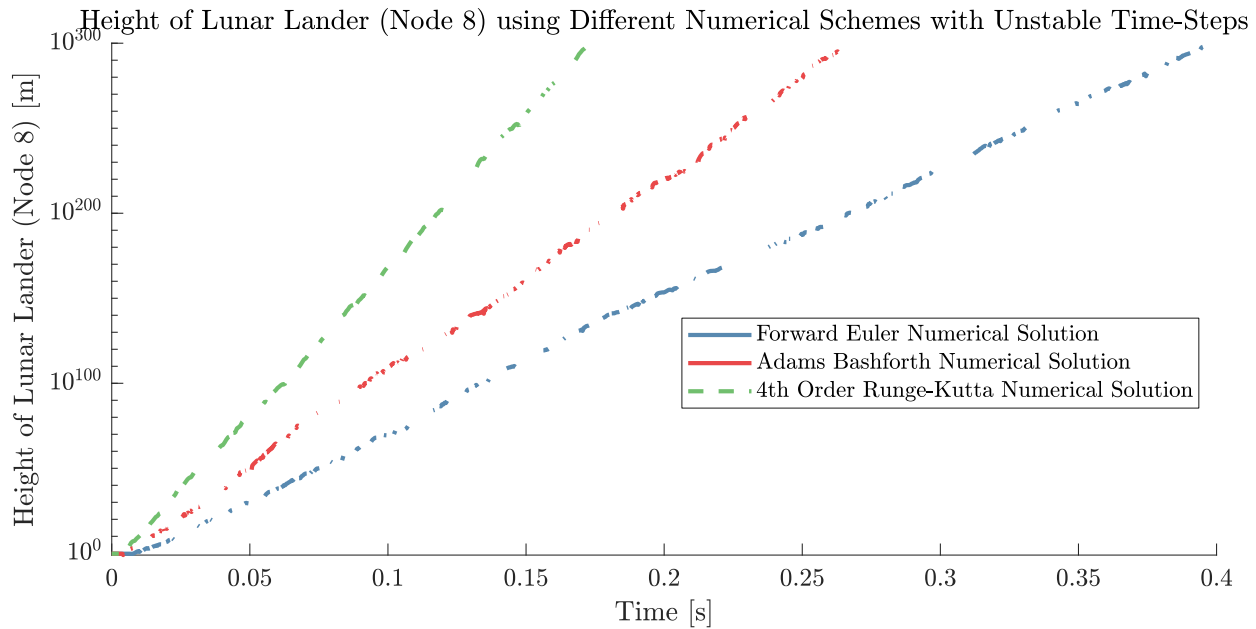


**Figure 10:** Plot of the lunar lander truss at  $T = 0.5$  after all iterations of the Runge-Kutta scheme have taken place showing that stability is maintained at the tweaked maximum time-step values.

The plot of the lunar lander truss shows the iteration successfully converges and results in an expected result for a truss experiencing a load. Therefore, verification of the Runge-Kutta implementation is completed and can be relied on for the future simulations and results.

### 3.4 Evidence of Instability at Doubled Time-Steps

Using the height of the lunar lander (node 8) as a function of time, the instability of the numerical scheme when using a time-step double in value of the maximum allowable time-steps respective to the schemes can be seen. This doubled time-step value puts the eigenvalues of the Jacobian matrix out of the stable regime that was previously defined. Therefore, none of the iterative methods converge to a proper solution and the results are astronomically large numbers.

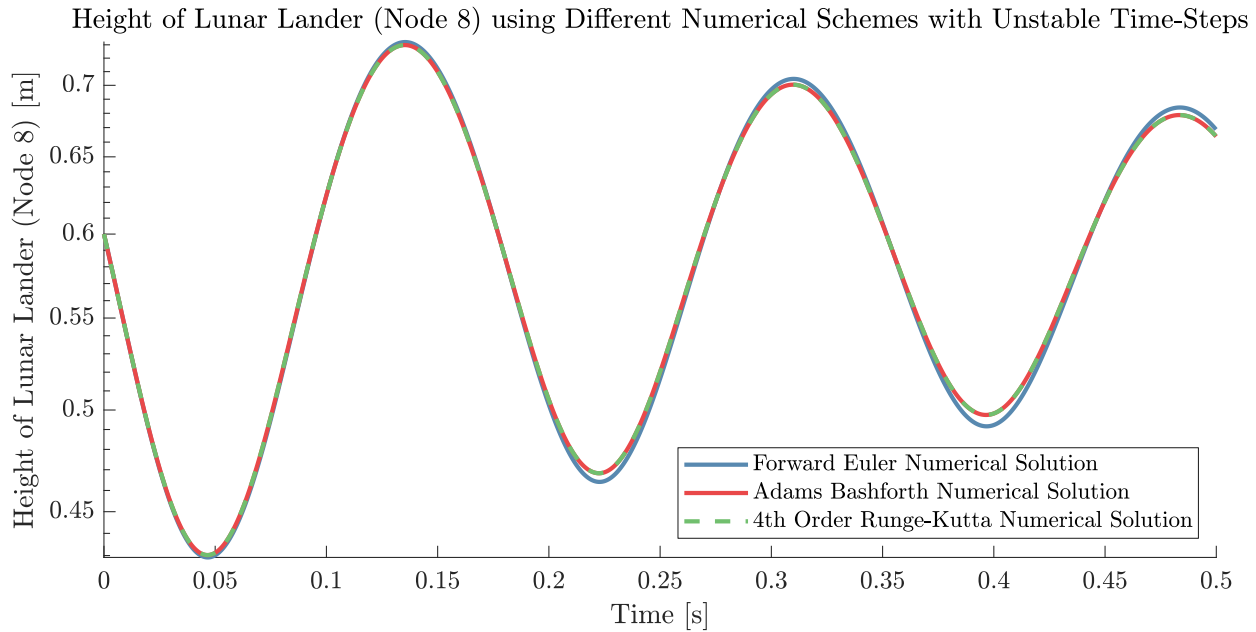


**Figure 11:** Plot of the instability associated with a doubled maximum time-step.

The above plot shows why it is important to determine the maximum allowable time-step and ensure the value used is some percent less than that for the numerical schemes to remain stable. The tweaked value used of a 3% decrease on this maximum time step will continue to be used to keep stability in the schemes.

## 4 Plot Height of Lander as a Function of Time

Using Forward Euler, Adams Bashforth, and fourth order Runge-Kutta, simulations can be performed up to  $T = 0.5$  with the largest possible time step for each method tweaked by a 3% decrease in order to plot the height of the lander. This plot will be height as function of time. The previously discussed functions and implementations are used to find the height of node 8, which corresponds to the actual lander height. After simulations are ran, the y component of node 8 is pulled out of the state vector for every time iteration. This is done for each numerical scheme to create the plot shown below.

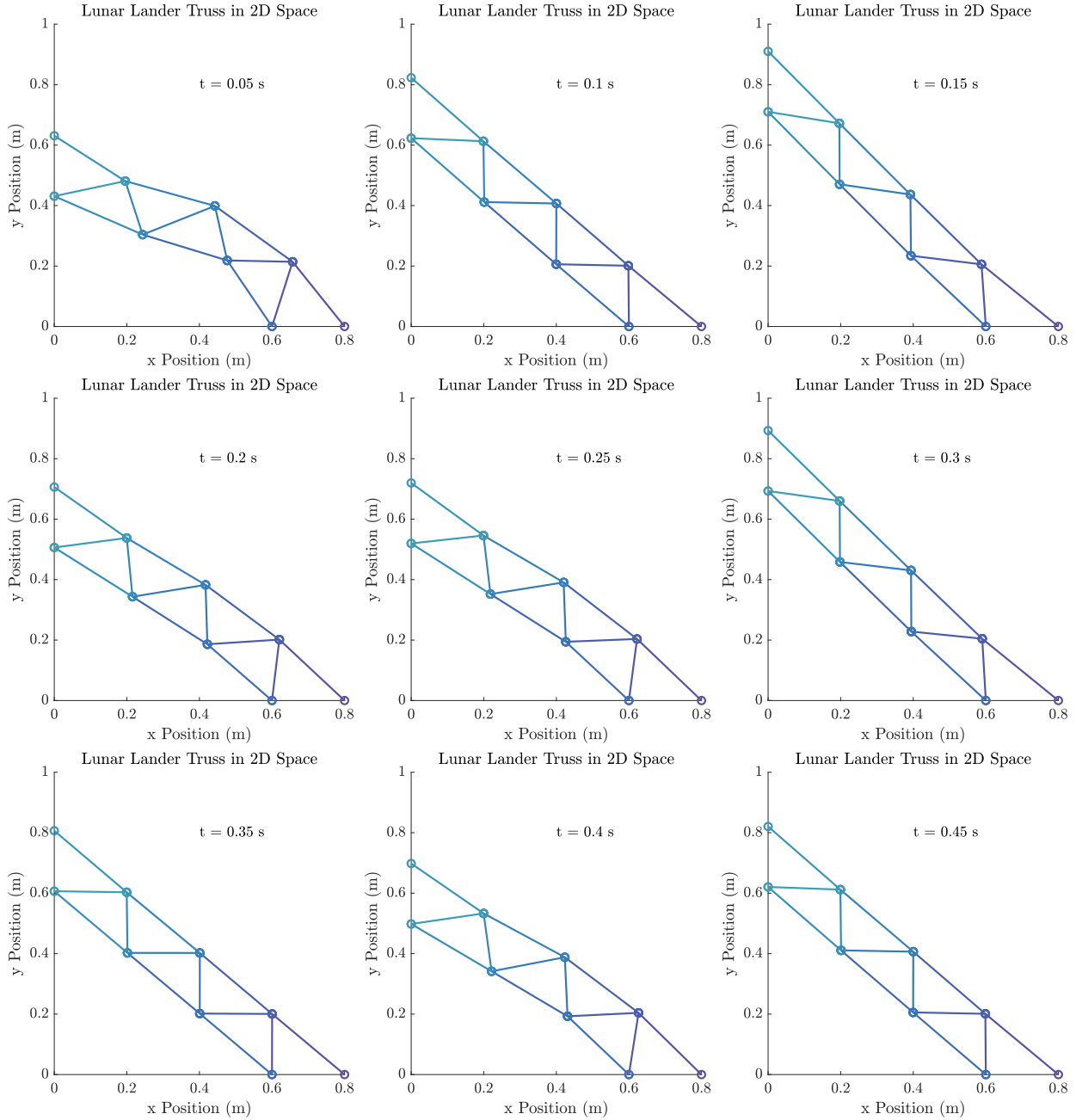


**Figure 12:** Plot of the oscillatory lunar lander height from 0 to 0.5 seconds using all three numerical schemes to see the differences imposed by each.

The differences in the methods can be seen in the plot. The Runge-Kutta and Adams Bashforth implementation are extremely similar and typically produce the same height value at each time interval; however, the Forward Euler differs in height, but still remains within expected error bounds for a first order numerical scheme. In the case a necessary method must be picked to use in future scenarios, Runge-Kutta would be best due to high convergence rate and accuracy as it is a fourth order approximation of the numerical solution.

## 5 Runge-Kutta Simulation of Lunar Lander Truss

The fourth order Runge-Kutta simulation can be ran at the largest possible time step with the aforementioned 3% tweak to ensure stability remains as the truss deforms. The nodes and links are plotted at  $t = 0.05, 0.1, 0.15, 0.2, 0.25, 0.3, 0.35, 0.4, 0.45$  seconds. These plots are seen below with the labeled time instances in the free space of each plot.



**Figure 13:** The nodes and links of the Lunar Lander truss are plotted at  $t = 0.05, 0.1, 0.15, 0.2, 0.25, 0.3, 0.35, 0.4, 0.45$  seconds showing the deformation undergone in the system due to the dynamics in the x and y plane.

The plots were generated using a function named `plotNodes` which takes in the node state matrix and the current time and outputs a figure of the plotted nodes and links and saves the image file for easy access and publishing. The state space column was converted to the node state matrix using the function `nodeSpace2nodes(nodeSpace)`.

The truss deforms as expected for a system taking a large load with a high downward velocity. The oscillatory nature of the truss is shown through the bouncing effect of the lunar lander and respective nodes. Looking at node 8 shows the height of the lander itself is changing as a function of time which corresponds to what was observed in the height as a function of time plot in the above section. This nature is common among dynamically damped systems and coincides with what is to be expected in a low gravity atmosphere, given link damping coefficient, and link stiffness.

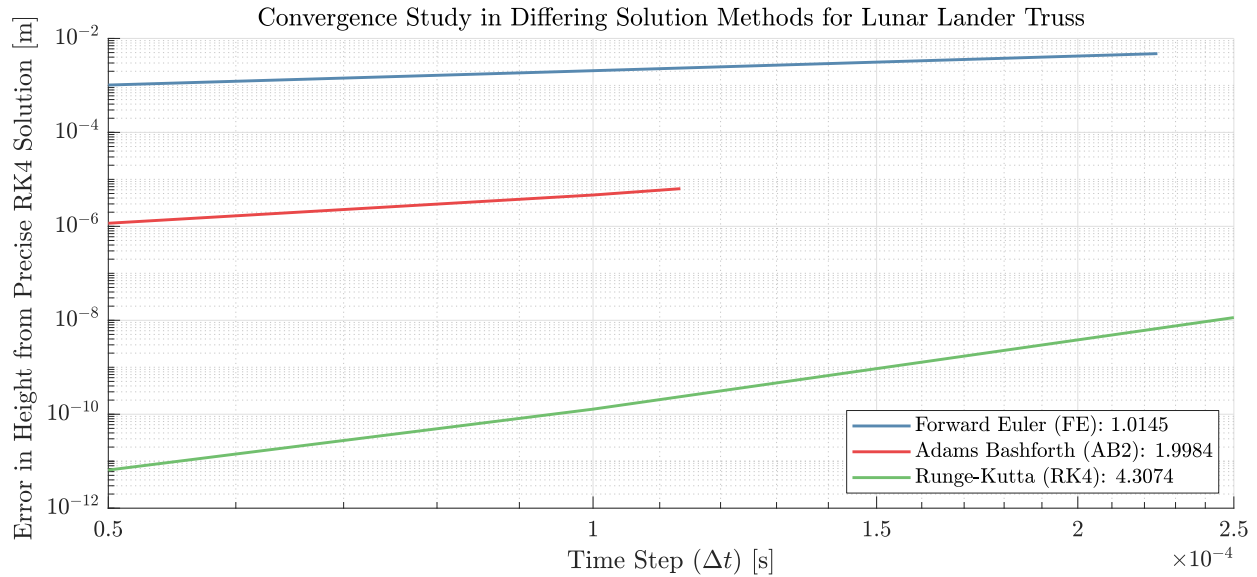
Not included in this report due to the technicality of the file format was the creation of a .gif file encapsulating the motion of truss from 0.01 to 0.5 seconds with a frame taken every 0.05 seconds. The animated image showed the oscillatory motion of the truss and how the damping of the system begins as the oscillations slow down and decrease in magnitude. The .gif is a great way of observing the nature of the lunar lander truss as it allows for another visual aspect to verify the simulations were ran satisfactory and produced valid results.

## 6 Time-Step Convergence Study to Determine Theoretical Convergence Rate

Using the lander position at  $T = 0.5$  as the output, a time-step convergence study can be completed to demonstrate that the theoretical convergence rate was achieved for each method. The exact solution was determined by using the Runge-Kutta function with 100,000 time steps in order to provide an extremely accurate solution. The other refined time steps for Forward Euler, Adams Bashfroth, and Runge-Kutta were then simulated and the output of the height of the lander at the final time was extracted and the error was calculated with the simple equation:

$$e_h = |h_{exact} - h_{simulated}| \quad (18)$$

The error was then plotted on a loglog scale to compare the time-steps with the calculated error. This plot is shown below and features a legend with the slope of each error line. The slope is equivalent to the approximate convergence rate of the utilized method.



**Figure 14:** Plot of the convergence of the numerical methods used to determine if the theoretical convergence rate was achieved.

As shown by the figure, the convergence rate achieved for Forward Euler with the given dynamics was 1.0145, this coincides with the theoretical expected rate of a first order iterative scheme denoted by  $\mathcal{O}(\Delta t)$ . For the Adams Bashforth method the slope was observed as 1.9984, which is approximately equal to the second order theoretical solution of a second order scheme,  $\mathcal{O}(\Delta t^2)$ . The theoretical fourth order Runge-Kutta method is also shown as the numerical scheme reaches a slope of 4.3074 for the implemented dynamics, showcasing a convergence rate of  $\mathcal{O}(\Delta t^4)$ . Therefore, all schemes have been demonstrated to output at the theoretical convergence rate

## 7 Conclusion

The following document details the process used to construct the simulation of a lunar lander using differential equations based on the physics of damped oscillations of stiff links connected to nodes in a truss. The stability regimes of the equations of motion were found for three numerical schemes, Forward Euler, Adams Bashforth, and Runge-Kutta. The maximum time-step value was then used to produce a simulated height plot as function of time to show the oscillatory nature of the dynamic equations of motion. The schemes were compared against themselves to ensure quality results were obtained. The fourth order Runge-Kutta scheme was used to generate plots of the truss at given time intervals to ensure the deformations coincide with physical intuition. The convergence of each implemented scheme was verified to ensure an approximate theoretical convergence order was achieved. The simulation of the lunar lander allowed for a real life application of a physical system using numerical methods on partial differential equations.

## A Appendix

The MATLAB code ran to generate the plots and numerical results in this document is attached below. Some function calls have been commented out in order to save time when running the code as locally stored matrices of values resulted in much better performance run time.

### A.1 List of Algorithms

1	MATLAB Script used to call implemented functions. . . . .	A-1
2	Function responsible for converting column space vector into node matrix . . . . .	A-7
3	Function responsible for outputing Jacobian matrix . . . . .	A-7
4	Function responsible for Runge-Kutta Implementation . . . . .	A-8
5	Function responsible for Adams Bashforth Implementation . . . . .	A-9
6	Function responsible for Forward Euler Implementation . . . . .	A-9
7	Function responsible for output of acceleration and velocity state space . . . . .	A-10
8	Function responsible for summation of forces on a node . . . . .	A-10
9	Function responsible for plotting truss layout in 2D . . . . .	A-12

### A.2 MATLAB Script Implementation

```

1 %Drake Rundell
2 %AE 423 - Project 1
3 %Due: 2/14/2020
4
5 clear; clc; close all;
6 set(groot, 'DefaultTextInterpreter', 'LaTeX');
7 set(groot, 'DefaultAxesTickLabelInterpreter', 'LaTeX');
8 set(groot, 'DefaultLegendInterpreter', 'LaTeX');
9 set(groot, 'defaultLegendFontSize', 10);
10 set(groot, 'defaultAxesFontSize', 12);
11 set(groot, 'defaultLineLineWidth', 1.5);
12 set(groot, 'defaultFigureColormap', linespecer);
13
14 %Parameters
15 T = 0.5; %units: [s]
16 V = -6; %units: [m/s]
17 d = 0.2; %units: [m]
18
19 %Initial node Position and Velocity (x,y,u,v for all nine nodes)
20 nodes = [2*d, d, 0, V; ...
21          3*d, d, 0, V; ...
22          d, 2*d, 0, V; ...
23          2*d, 2*d, 0, V; ...
24          d, 3*d, 0, V; ...
25          3*d, 0, 0, 0; ...
26          4*d, 0, 0, 0; ...
27          0, 3*d, 0, V; ...
28          0, 4*d, 0, V];
29
30 %% Eigenvalue Stability for Schemes using df/du matrix
31 dfdu = dfdu_matrix(nodes);
32
33 %Get eigenvalues of df/du matrix
34 dfdu_eig = eig(dfdu);
35

```



```

36 %Plot eigenvalues of df/du matrix
37 figure
38 hold on
39 scatter(real(dfdu_eig),imag(dfdu_eig),'or','LineWidth',2)
40 axis equal
41 title('Eigenvalue Plot of  $\Delta f / \Delta u$ ','Interpreter','LaTeX')
42 ;
43 xlabel('Re( $\lambda_{\Delta t}$ )','Interpreter','LaTeX');
44 ylabel('Im( $\lambda_{\Delta t}$ )','Interpreter','LaTeX');
45 set(gcf,'Color','w','Position',[200 200 800 400]);
46 export_fig Figures/eig_dfdu.eps -native
47
48 %Space out theta values for Stability Equations
49 theta = linspace(0,2*pi);
50
51 %Eigenvalue Stability for Forward Euler Scheme
52 lambda_dt_FE = exp(1i.*theta) - 1;
53
54 %Scale df/du matrix to fit in FE Scheme Eigenvalue Stability Region
55 scaleFE = min(real(dfdu_eig))/min(real(lambda_dt_FE));
56
57 %Plot scaled eigenvalues to plot of stable region
58 figure
59 hold on
60 fill(real(lambda_dt_FE),imag(lambda_dt_FE),[1,1,1],'Facecolor','w','EdgeColor','k','Linewidth',2);
61 scatter(real(dfdu_eig)/scaleFE,imag(dfdu_eig)/scaleFE,'or','LineWidth',2)
62 axis equal
63 title('Eigenvalue Stability Region for Forward Euler using  $\Delta f / \Delta u$ ','Interpreter','LaTeX');
64 xlabel('Re( $\lambda_{\Delta t}$ )','Interpreter','LaTeX');
65 ylabel('Im( $\lambda_{\Delta t}$ )','Interpreter','LaTeX');
66 set(gca,'Color',[0.8627 0.8627 0.8627])
67 set(gcf,'Color','w','Position',[200 200 800 400]);
68 export_fig Figures/eig_FE.eps -native
69
70 %Time Restriction for Forward Euler
71 dt_FE = 1/scaleFE;
72
73 %Eigenvalue Stability for AB2 Scheme
74 g = exp(1i.*theta);
75 lambda_dt_AB2 = (g-1) .* 2.*g./(3.*g-1);
76
77 %Scale df/du matrix to fit in AdamsBashforth Scheme Eigenvalue Stability Region
78 scaleAB2 = min(real(dfdu_eig))/min(real(lambda_dt_AB2));
79
80 %Plot scaled eigenvalues to plot of stable region
81 figure
82 hold on
83 fill(real(lambda_dt_AB2),imag(lambda_dt_AB2),[1,1,1],'Facecolor','w','EdgeColor','k','Linewidth',2);
84 scatter(real(dfdu_eig)/scaleAB2,imag(dfdu_eig)/scaleAB2,'or','LineWidth',2)
85 axis equal
86 title('Eigenvalue Stability Region for Adams Bashforth using  $\Delta f / \Delta u$ ','Interpreter','LaTeX');
87 xlabel('Re( $\lambda_{\Delta t}$ )','Interpreter','LaTeX');

```

```
87 ylabel('Im($\lambda\Delta t$)','Interpreter','LaTeX');
88 set(gca,'Color',[0.8627 0.8627 0.8627])
89 set(gcf,'Color','w','Position',[200 200 800 400]);
90 export_fig Figures/eig_AB2.eps -native
91
92 %Time Restriction for RK4
93 dt_AB2 = 1/scaleAB2;
94
95 %Eigenvalue Stability for RK4 Scheme
96 syms lambda_dt
97 lambda_dt_RK4_1 = zeros(1,max(size(theta)));
98 lambda_dt_RK4_2 = zeros(1,max(size(theta)));
99 lambda_dt_RK4_3 = zeros(1,max(size(theta)));
100 lambda_dt_RK4_4 = zeros(1,max(size(theta)));
101
102 for i = 1:max(size(theta))
103     eqn = exp(1i.*theta(i)) == 1 + lambda_dt + .5*lambda_dt^2 + 1/6 *
104         lambda_dt^3 + 1/24*lambda_dt^4;
105     sol = vpasolve(eqn,lambda_dt);
106     lambda_dt_RK4_1(i) = sol(1);
107     lambda_dt_RK4_2(i) = sol(2);
108     lambda_dt_RK4_3(i) = sol(3);
109     lambda_dt_RK4_4(i) = sol(4);
110 end
111 n = max(size(theta));
112 lambda_dt_RK4 = [lambda_dt_RK4_1(1:(n/2)) lambda_dt_RK4_2(((n/2)+1):
113     end) ...
114     lambda_dt_RK4_3(1:(n/2)) lambda_dt_RK4_4(((n/2)+1):
115     end) ...
116     lambda_dt_RK4_4(2:(n/2)) lambda_dt_RK4_3(((n/2)+1):
117     end) ...
118     lambda_dt_RK4_2(2:(n/2)) lambda_dt_RK4_1(((n/2)+1):
119     end)];
120
121 %Scale df/du matrix to fit in RK4 Scheme Eigenvalue Stability Region
122 scaleRK4 = min(real(dfdu_eig))/min(real(lambda_dt_RK4));
123
124 %Plot scaled eigenvalues to plot of stable region
125 figure
126 hold on
127 fill(real(lambda_dt_RK4),imag(lambda_dt_RK4),[1,1,1],'Facecolor','w',
128     'EdgeColor','k','Linewidth',2);
129 scatter(real(dfdu_eig)/scaleRK4,imag(dfdu_eig)/scaleRK4,'or','
130     LineWidth',2)
131
132 axis equal
133 title('Eigenvalue Stability Region for 4th Order Runge-Kutta using $\\
134     \Delta f/\Delta u$','Interpreter','LaTeX');
135 xlabel('Re($\lambda\Delta t$)','Interpreter','LaTeX');
136 ylabel('Im($\lambda\Delta t$)','Interpreter','LaTeX');
137 set(gca,'Color',[0.8627 0.8627 0.8627])
138 set(gcf,'Color','w','Position',[200 200 800 400]);
139 export_fig Figures/eig_RK4.eps -native
140
141 %Time Restriction for RK4
142 dt_RK4 = 1/scaleRK4;
143
144 %% Height of Lander with FE, AB2, and RK4
```

```

137 %Run simulation with FE using largest time step with 3.0% adjustment
    to
138 %prevent instability
139 dt_FE = dt_FE * 0.97;
140 t_FE = 0:dt_FE:T;
141 nodeSpaceFE = FE(nodes,t_FE);
142 h_FE = nodeSpaceFE(30,:);
143
144 %Final Result for Verification
145 nodesFE_final = nodeSpace2nodes(nodeSpaceFE);
146 figure
147 plotNodes(nodesFE_final,T);
148 export_fig 'Figures/final_FE.eps'
149
150 %Run simulation with AB2 using largest time step with 3.0% adjustment
    to
151 %prevent instability
152 dt_AB2 = dt_AB2 * 0.97;
153 t_AB2 = 0:dt_AB2:T;
154 nodeSpaceAB2 = AB2(nodes,t_AB2);
155 h_AB2 = nodeSpaceAB2(30,:);
156
157 %Final Result for Verification
158 nodesAB2_final = nodeSpace2nodes(nodeSpaceAB2);
159 figure
160 plotNodes(nodesAB2_final,T);
161 export_fig 'Figures/final_AB2.eps'
162
163 %Run simulation with RK4 using largest time step with 3.0% adjustment
    to
164 %prevent instability
165 dt_RK4 = dt_RK4 * 0.97;
166 t_RK4 = 0:dt_RK4:T;
167 nodeSpaceRK4 = RK4(nodes,t_RK4);
168 h_RK4 = nodeSpaceRK4(30,:);
169
170 %Final Result for Verification
171 nodesRK4_final = nodeSpace2nodes(nodeSpaceRK4);
172 figure
173 plotNodes(nodesRK4_final,T);
174 export_fig 'Figures/final_RK4.eps'
175
176 figure
177 axes('NextPlot','replacechildren','ColorOrder',linspace(3));
178 semilogy(t_FE,h_FE,t_AB2,h_AB2,t_RK4,h_RK4,'—','Linewidth',2);
179 title('Height of Lunar Lander (Node 8) using Different Numerical
    Schemes with Unstable Time-Steps');
180 legend('Forward Euler Numerical Solution','Adams Bashforth Numerical
    Solution','4th Order Runge-Kutta Numerical Solution','Location','
    Best')
181 xlabel('Time [s]');
182 ylabel('Height of Lunar Lander (Node 8) [m]');
183 set(gcf,'Color','w','Position',[200 200 900 400]);
184 export_fig Figures/lander_height.eps -native
185
186 %% Simulations with FE, AB2, and RK4 up to T = 0.5
187
188 %Initial Node Position
189 figure

```

```

190 plotNodes(nodes,0);
191
192 %RK4 Simulation for T = 0.5 at varying times
193 times = 0.05:0.05:0.5;
194 set(0,'DefaultFigureVisible','off')
195 for i = 1:max(size(times))
196     nodeSpaceRK4 = RK4(nodes,0:dt_RK4:times(i));
197     nodesRK4 = nodeSpace2nodes(nodeSpaceRK4);
198     figure
199     plotNodes(nodesRK4, times(i));
200 end
201 set(0,'DefaultFigureVisible','on')
202
203 %% Error Analysis
204
205 %First run RK4 with high resolution to define "correct" answer for
    height at
206 %T = 5;
207 t_RK4 = linspace(0,T,100000);
208 %nodeSpaceRK4 = RK4(nodes,t_RK4); disabled for time reasons
209 nodeSpaceRK4 = cell2mat(struct2cell(load('RK4_fine_simulation.mat')));
    ;
210 h_actual = nodeSpaceRK4(30,:);
211 h_actual = h_actual(end);
212
213 %Three Time Steps
214 t_3_FE = 0:2.2411e-4:T;
215 t_3_AB2 = 0:1.133e-4:T;
216 t_3_RK4 = 0:2.5e-4:T;
217 t_2 = 0:0.0001:T;
218 t_1 = 0:0.00005:T;
219
220 %FE Error Calculations at Three Points
221 nodeSpaceFE_3 = FE(nodes,t_3_FE);
222 h_FE_3 = nodeSpaceFE_3(30,:);
223 error_FE_3 = abs(h_actual - h_FE_3(end));
224
225 nodeSpaceFE_2 = FE(nodes,t_2);
226 h_FE_2 = nodeSpaceFE_2(30,:);
227 error_FE_2 = abs(h_actual - h_FE_2(end));
228
229 nodeSpaceFE_1 = FE(nodes,t_1);
230 h_FE_1 = nodeSpaceFE_1(30,:);
231 error_FE_1 = abs(h_actual - h_FE_1(end));
232
233 %AB2 Error Calculations at Three Points
234 nodeSpaceAB2_3 = AB2(nodes,t_3_AB2);
235 h_AB2_3 = nodeSpaceAB2_3(30,:);
236 error_AB2_3 = abs(h_actual - h_AB2_3(end));
237
238 nodeSpaceAB2_2 = AB2(nodes,t_2);
239 h_AB2_2 = nodeSpaceAB2_2(30,:);
240 error_AB2_2 = abs(h_actual - h_AB2_2(end));
241
242 nodeSpaceAB2_1 = AB2(nodes,t_1);
243 h_AB2_1 = nodeSpaceAB2_1(30,:);
244 error_AB2_1 = abs(h_actual - h_AB2_1(end));
245
246 %RK4 Error Calculations at Three Points

```

```
247 nodeSpaceRK4_3 = RK4(nodes,t_3_RK4);
248 h_RK4_3 = nodeSpaceRK4_3(30,:);
249 error_RK4_3 = abs(h_actual - h_RK4_3(end));
250
251 nodeSpaceRK4_2 = RK4(nodes,t_2);
252 h_RK4_2 = nodeSpaceRK4_2(30,:);
253 error_RK4_2 = abs(h_actual - h_RK4_2(end));
254
255 nodeSpaceRK4_1 = RK4(nodes,t_1);
256 h_RK4_1 = nodeSpaceRK4_1(30,:);
257 error_RK4_1 = abs(h_actual - h_RK4_1(end));
258
259 %Put time steps in vector for plotting
260 timestepsFE = [2.2411e-4 0.0001 0.00005];
261 timestepsAB2 = [1.133e-4 0.0001 0.00005];
262 timestepsRK4 = [2.5e-4 0.0001 0.00005];
263
264 %Calculate Slope on Loglog Plot
265 slope_FE = log10(error_FE_2/error_FE_1) / log10(0.0001/0.00005);
266 slope_AB2 = log10(error_AB2_2/error_AB2_1) / log10(0.0001/0.00005);
267 slope_RK4 = log10(error_RK4_2/error_RK4_1) / log10(0.0001/0.00005);
268
269 figure
270 axes('NextPlot','replacechildren','ColorOrder',linspace(3));
271 loglog(timestepsFE,[error_FE_3 error_FE_2 error_FE_1],timestepsAB2,[
    error_AB2_3 error_AB2_2 error_AB2_1],timestepsRK4,[error_RK4_3
    error_RK4_2 error_RK4_1]);
272 title('Convergence Study in Differing Solution Methods for Lunar
    Lander Truss','Interpreter','LaTeX');
273 xlabel('Time Step ($\Delta t$) [s]','Interpreter','LaTeX');
274 ylabel('Error in Height from Precise RK4 Solution [m] ','Interpreter',
    'LaTeX');
275 legend(['Forward Euler (FE): ', num2str(slope_FE)],['Adams Bashforth
    (AB2): ', num2str(slope_AB2)],['Runge-Kutta (RK4): ', num2str(
    slope_RK4)], 'Interpreter','LaTeX','Location','Southeast');
276 grid on
277 grid minor
278 set(gcf, 'Color', 'w', 'Position',[200 200 1000 400]);
279 export_fig Figures/lander_error.eps -native
```

*Algorithm 1: MATLAB Script used to call implemented functions.*

### A.3 MATLAB Function Implementation

```

1 function nodes = nodeSpace2nodes(nodeSpace)
2     %Convert column state space vector to node matrix in order to
   plot
3     nodes = [nodeSpace(1:4,length(nodeSpace))'; nodeSpace(5:8,length(
   nodeSpace))'; nodeSpace(9:12,length(nodeSpace))'; nodeSpace
   (13:16,length(nodeSpace))'; nodeSpace(17:20,length(nodeSpace))';
   ...
4         nodeSpace(21:24,length(nodeSpace))'; nodeSpace(25:28,
   length(nodeSpace))'; nodeSpace(29:32,length(nodeSpace))';
   nodeSpace(33:36,length(nodeSpace))'];
5 end

```

*Algorithm 2: Function responsible for converting column space vector into node matrix*

```

1 function dfdu = dfdu_matrix(nodes)
2     %Small Perturbation
3     h = 1e-6;
4     %Preallocate 22x22 Matrix
5     dfdu = zeros(22);
6     %Take initial derivative
7     f_0 = f(nodes);
8     %Begin array indexing
9     n = 1;
10    for i = 1:5
11        for j = 1:4
12            %Store node input as temporary to keep it from changing
   at
13            %every iteration
14            node_temp = nodes;
15            %Add perturbation to temp node matrix
16            node_temp(i,j) = node_temp(i,j) + h;
17            %Put temp node matrix into f function
18            df = f(node_temp);
19            %Take derivative using classic equation with h
   perturbation
20            dfdu(:,n) = (df(1:22) - f_0(1:22))/h;
21            n = n + 1;
22        end
23    end
24 end

```

*Algorithm 3: Function responsible for outputting Jacobian matrix*

```
1 function output = RK4(nodes,t)
2     %Setup RK4
3     dt = t(2) - t(1);
4     u = zeros(max(size(nodes))*min(size(nodes)),max(size(t)));
5     N = max(size(t));
6
7     %Organize column vector from node matrix
8     u(:,1) = [nodes(1,:)'; nodes(2,:)'; nodes(3,:)'; nodes(4,:)';
9     nodes(5,:)'; nodes(6,:)'; nodes(7,:)'; nodes(8,:)'; nodes(9,:)'];
10
11    %Perform RK4 method using column vector form
12    for i = 1:(N-1)
13        temp = [u(1:4,i)'; u(5:8,i)'; u(9:12,i)'; u(13:16,i)'; u
14        (17:20,i)'; ...
15        u(21:24,i)'; u(25:28,i)'; u(29:32,i)'; u(33:36,i)'];
16        k_0 = f(temp);
17
18        temp_k_1 = [k_0(1:4)'; k_0(5:8)'; k_0(9:12)'; k_0(13:16)';
19        k_0(17:20)']; ...
20        k_1 = f(temp + 0.5 .* dt .* temp_k_1);
21
22        temp_k_2 = [k_1(1:4)'; k_1(5:8)'; k_1(9:12)'; k_1(13:16)';
23        k_1(17:20)']; ...
24        k_2 = f(temp + 0.5 .* dt .* temp_k_2);
25
26        temp_k_3 = [k_2(1:4)'; k_2(5:8)'; k_2(9:12)'; k_2(13:16)';
27        k_2(17:20)']; ...
28        k_3 = f(temp + dt .* temp_k_3);
29
30        u(:,i+1) = u(:,i) + dt/6 .* (k_0 + 2.*k_1 + 2.*k_2 + k_3);
31    end
32
33    %output is matrix of x1 y1 v1 u1 for each node in column form for
34    %each
35    %time step
36    output = u;
```

*Algorithm 4: Function responsible for Runge-Kutta Implementation*

```

1 function output = AB2(nodes, t)
2     %Setup method
3     dt = t(2) - t(1);
4     u = zeros(max(size(nodes))*min(size(nodes)),max(size(t)));
5     N = max(size(t));
6
7     %Organize column vector from node matrix
8     u(:,1) = [nodes(1,:)'; nodes(2,:)'; nodes(3,:)'; nodes(4,:)';
9     nodes(5,:)'; nodes(6,:)'; nodes(7,:)'; nodes(8,:)'; nodes(9,:)'];
10    temp = [u(1:4,1)'; u(5:8,1)'; u(9:12,1)'; u(13:16,1)'; u(17:20,1)
11    ']; ...
12    u(21:24,1)'; u(25:28,1)'; u(29:32,1)'; u(33:36,1)'];
13
14    %Take initial step using Forward Euler
15    u(:,2) = u(:,1) + dt .* f(temp);
16
17    %Perform AB2 method using column vector form
18    for i = 2:(N-1)
19        temp1 = temp;
20        temp = [u(1:4,i)'; u(5:8,i)'; u(9:12,i)'; u(13:16,i)'; u
21        (17:20,i)'; ...
22        u(21:24,i)'; u(25:28,i)'; u(29:32,i)'; u(33:36,i)'];
23        u(:,i+1) = u(:,i) + dt .* (1.5 .* f(temp) - .5 .* f(temp1));
24    end
25
26    %output is matrix of x1 y1 v1 u1 for each node in column form for
27    each
28    %time step
29    output = u;
30 end

```

*Algorithm 5: Function responsible for Adams Bashforth Implementation*

```

1 function output = FE(nodes, t)
2     %Setup Forward Euler
3     dt = t(2) - t(1);
4     u = zeros(max(size(nodes))*min(size(nodes)),max(size(t)));
5     N = max(size(t));
6
7     %Organize node matrix into column vector
8     u(:,1) = [nodes(1,:)'; nodes(2,:)'; nodes(3,:)'; nodes(4,:)';
9     nodes(5,:)'; nodes(6,:)'; nodes(7,:)'; nodes(8,:)'; nodes(9,:)'];
10
11    %Implement Forward Euler Scheme
12    for i = 1:(N-1)
13        temp = [u(1:4,i)'; u(5:8,i)'; u(9:12,i)'; u(13:16,i)'; u
14        (17:20,i)'; ...
15        u(21:24,i)'; u(25:28,i)'; u(29:32,i)'; u(33:36,i)'];
16        u(:,i+1) = u(:,i) + dt .* f(temp);
17    end
18
19    %output is matrix of x1 y1 v1 u1 for each node in column form for
20    each
21    %time step
22    output = u;
23 end

```

*Algorithm 6: Function responsible for Forward Euler Implementation*



```

1 function udot = f(nodes)
2     %Constants
3     m_node = 0.1;
4     M = 100;
5     g = 1.625;
6
7     %Equation of Motions for all nine nodes organized into u,v,dot u,
8     and dot v form
9     udot = [[nodes(1,3:4)'; node_force(nodes,1)'/m_node] - [0 0 0 g
10    ]';
11             [nodes(2,3:4)'; node_force(nodes,2)'/m_node] - [0 0 0 g
12    ]';
13             [nodes(3,3:4)'; node_force(nodes,3)'/m_node] - [0 0 0 g
14    ]';
15             [nodes(4,3:4)'; node_force(nodes,4)'/m_node] - [0 0 0 g
16    ]';
17             [nodes(5,3:4)'; node_force(nodes,5)'/m_node] - [0 0 0 g
18    ]';
19             [0 0 0 0]';
20             [0 0 0 0]';
21             ([nodes(9,3:4))' .* [0;1] ; 8.*(node_force(nodes,8) ./M)'
22             .* [0;1]] - [0 0 0 g]');
23             ([nodes(9,3:4))' .* [0;1] ; 8.*(node_force(nodes,9) ./M)'
24             .* [0;1]] - [0 0 0 g]');
25 end

```

**Algorithm 7:** Function responsible for output of acceleration and velocity state space

```

1 function sum = node_force(nodes, node)
2     %Constants
3     gamma = 200;
4     k = 10^5;
5     sum = [0 0];
6     %Each node (1-9) with connections
7     links = [2 3 4 6;
8             1 6 4 7;
9             1 4 5 8;
10            1 2 3 5;
11            3 4 8 9;
12            1 2 NaN NaN;
13            2 NaN NaN NaN;
14            3 5 NaN NaN;
15            5 NaN NaN NaN];
16
17     %Test if connecting node exists to given node, and if it does
18     loop
19     %through to gather all forces
20     for i = 1:max(size(nodes))
21         if ismember(node, links(i,:)) == 1
22             if (node == 1 && (i == 2 || i == 4))
23                 d = 0.2;
24             elseif (node == 2 && (i == 6 || i == 1))
25                 d = 0.2;
26             elseif (node == 3 && (i == 4 || i == 5))
27                 d = 0.2;
28             elseif (node == 4 && (i == 3 || i == 1))
29                 d = 0.2;
30             elseif (node == 5 && (i == 3 || i == 8))

```

```
30         d = 0.2;
31     elseif (node == 6 && (i == 2))
32         d = 0.2;
33     elseif (node == 8 && (i == 5))
34         d = 0.2;
35     else
36         d = 0.2 * sqrt(2);
37     end
38
39     %Equation for link forces from project statement
40     x1 = nodes(node,1:2);
41     x2 = nodes(i,1:2);
42
43     v1 = nodes(node,3:4);
44     v2 = nodes(i,3:4);
45
46     e = (x2 - x1) ./ norm(x2 - x1);
47
48     %Delta l
49     dl = norm(x2 - x1) - d;
50     dl(abs(dl) < 1e-16) = 0;
51
52     %Dot Delta l
53     ddl = dot((v2 - v1), e);
54     ddl(abs(ddl) < 1e-16) = 0;
55
56     Fij = (k .* dl + gamma .* ddl) .* e;
57
58     %Sum all forces
59     if (norm(Fij) > 1e-16)
60         sum = sum + Fij;
61     end
62 end
63 end
64 end
```

*Algorithm 8: Function responsible for summation of forces on a node*

```
1 function plotNodes(nodes,t)
2     %Make each link
3     L_72 = [nodes(7,1:2); nodes(2,1:2)];
4     L_62 = [nodes(6,1:2); nodes(2,1:2)];
5     L_12 = [nodes(1,1:2); nodes(2,1:2)];
6     L_42 = [nodes(4,1:2); nodes(2,1:2)];
7     L_13 = [nodes(1,1:2); nodes(3,1:2)];
8     L_16 = [nodes(1,1:2); nodes(6,1:2)];
9     L_14 = [nodes(1,1:2); nodes(4,1:2)];
10    L_43 = [nodes(4,1:2); nodes(3,1:2)];
11    L_45 = [nodes(4,1:2); nodes(5,1:2)];
12    L_35 = [nodes(3,1:2); nodes(5,1:2)];
13    L_38 = [nodes(3,1:2); nodes(8,1:2)];
14    L_59 = [nodes(5,1:2); nodes(9,1:2)];
15    L_58 = [nodes(5,1:2); nodes(8,1:2)];
16
17    %Organize into x and y space
18    x = [L_72(:,1) L_62(:,1) L_12(:,1) L_42(:,1) L_13(:,1) L_16(:,1)
19        ...
20        L_14(:,1) L_43(:,1) L_45(:,1) L_35(:,1) L_38(:,1) L_59(:,1)
21        L_58(:,1)];
22    y = [L_72(:,2) L_62(:,2) L_12(:,2) L_42(:,2) L_13(:,2) L_16(:,2)
23        ...
24        L_14(:,2) L_43(:,2) L_45(:,2) L_35(:,2) L_38(:,2) L_59(:,2)
25        L_58(:,2)];
26
27    axes('NextPlot','replacechildren','ColorOrder',linspace(max(size
28    (x))*7));
29    plot(x,y,'-o')
30    title('Lunar Lander Truss in 2D Space');
31    xlabel('x Position (m)');
32    ylabel('y Position (m)');
33    xlim([0 0.8]);
34    ylim([0 1]);
35    set(gcf, 'Color', 'w', 'Position',[200 200 400 400]);
36    text(0.4,0.8,['t = ' num2str(t) ' s'], 'FontSize',12, 'Interpreter',
37    'LaTeX');
38    export_fig(['Figures/lander_truss_t_', num2str(t*100),'.eps'])
39 end
```

*Algorithm 9: Function responsible for plotting truss layout in 2D*