Aerospace 523: Computational Fluid Dynamics I

Homework: 1

Due: September 11th, 2020

1 Equation Classification

The differential equation (note, subscripts indicate differentiation)

$$aw_{xx} + bw_{xy} + cw_{yy} = f$$

is defined to be hyperbolic/parabolic/elliptic is b^2-4ac is positive/zero/negative, respectively. Show that this definition is consistent with the definition in the notes. Hint: convert the PDE to a system of two equations by defining $u = w_x$ and $v = w_y$

Firstly noting that $u = w_x$ and that $v = w_y$, this can be written as a system of two equations

$$au_x + bu_y + cv_y = f$$
$$v_x - u_y = 0$$

Defing the state vector as $\vec{u} = [u, v]$, we can write the system in matrix form,

$$\underbrace{\begin{bmatrix} a & 0 \\ 0 & 1 \end{bmatrix}}_{\underline{\underline{A}}_{1}} \underbrace{\frac{\partial}{\partial x} \begin{bmatrix} u \\ v \end{bmatrix}}_{\underline{\underline{A}}_{2}} + \underbrace{\begin{bmatrix} b & c \\ -1 & 0 \end{bmatrix}}_{\underline{\underline{A}}_{2}} \underbrace{\frac{\partial}{\partial y} \begin{bmatrix} u \\ v \end{bmatrix}}_{\underline{\underline{A}}} = \begin{bmatrix} f \\ 0 \end{bmatrix}$$

Then, since there is no time derivative in this system, classifying the equation for vectors \vec{k} that makes the determinant of \tilde{A} zero or,

$$\det\left(\tilde{A}\right) = \det\left(\underline{\underline{A}}_{1}k_{1} + \underline{\underline{A}}_{2}k_{2}\right) = \det\left(\begin{bmatrix}ak_{1} + bk_{2} & ck_{2}\\-k_{2} & k_{1}\end{bmatrix}\right) = 0$$

Taking the determinant of the 2×2 matrix, we have

$$(ak_1 + bk_2) k_1 + ck_2^2 = 0$$
$$ak_1^2 + bk_2k_1 + ck_2^2 = 0$$

Dividing through both sides by k_1^2 to get the relation that takes the form of the quadratic expression gives,

$$c\left(\frac{k_2}{k_1}\right)^2 + b\left(\frac{k_2}{k_1}\right) + a = 0$$

Solving for $\frac{k_2}{k_1}$ gives that the relationship is,

$$\boxed{\frac{k_2}{k_1} = \frac{-b \pm \sqrt{b^2 - 4ac}}{2c}}$$

As shown above, this is consistent with the notes since the relation b^2-4ac denotes whether the particular PDE is parabolic/hyperbolic/elliptic depending on whether the roots of $\frac{k_2}{k_1}$ are real, have imaginary parts, or are a double root.

2 Gram-Schmidt Orthonormalization and Projection

Given the following three vectors,

$$\vec{u}_1 = \begin{bmatrix} 1 \\ 2 \\ 0 \\ 0 \\ 0 \end{bmatrix}, \quad \vec{u}_2 = \begin{bmatrix} 0 \\ -1 \\ 0 \\ 3 \\ 0 \end{bmatrix}, \vec{u}_3 = \begin{bmatrix} 3 \\ 0 \\ 1 \\ 0 \\ -2 \end{bmatrix}$$

a. Use the Gram-Schmidt algorithm to compute an orthonormal basis (three vectors $\vec{v}_1, \vec{v}_2, \vec{v}_3$) for the space spanned by $\{\vec{u}_1, \vec{u}_2, \vec{u}_3\}$. You can write a program to do this.

The Gram-Schmidt algorithm can be defined as,

$$v_n = v_n - \sum_{i=1}^{n-1} \frac{\langle v_n, v_i \rangle}{\langle v_i, v_i \rangle} v_i$$

Where $\langle \phi, \psi \rangle$ is defined as the inner product with the corresponding set respectively such that,

$$<\phi,\psi> = \int_a^b \phi(x)\psi(x) \ dx$$

However, since this is dealing with vectors then applying the discrete version of the Gram-Schmidt algorithm gives,

$$<\vec{\phi},\vec{\psi}>=\vec{\phi}\cdot\vec{\psi}$$

Applying this algorithm in Python (attached at end of assignment) gives that the three vectors are

$$\vec{v}_1 = \begin{bmatrix} 0.44721 \\ 0.89443 \\ 0.00000 \\ 0.00000 \\ 0.00000 \end{bmatrix}, \quad \vec{v}_2 = \begin{bmatrix} 0.13188 \\ -0.06594 \\ 0.00000 \\ 0.98907 \\ 0.00000 \end{bmatrix}, \quad \vec{v}_3 = \begin{bmatrix} 0.67653 \\ -0.33827 \\ 0.28815 \\ -0.11276 \\ -0.57631 \end{bmatrix}$$

b. Project the vector $w = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 \end{bmatrix}^T$ into the space spanned by this basis, and write $w = w_{\parallel} + w_{\perp}$, where w_{\parallel} is the projection of w in to the space. Give both w_{\parallel} and w_{\perp} .

Projecting the vector onto the space spanned by the basis can be done through the following,

$$\vec{w}_{\parallel,i} = \underbrace{(\vec{w} \cdot \hat{v}_i)}_{\text{Scalar}} \underbrace{\hat{v}_i}_{\text{Direction}}$$

Conducting this over the size of the basis will give the total projection or,

$$ec{w}_{\parallel} = \sum_{i=1}^{N} \left(ec{w} \cdot \hat{v}_{i}
ight) \hat{v}_{i}$$

Then with the parallel component being defined the perpendicular component is,

$$\vec{w}_{\perp} = \vec{w} - \vec{w}_{\parallel}$$

Using the results from part a.) and looping through the vectors and outputting through Python gives the results to be,

$$\vec{w} = \underbrace{\begin{bmatrix} -0.14801 \\ 2.57401 \\ -0.71119 \\ 4.19134 \\ 1.42238 \end{bmatrix}}_{\vec{w}_{\parallel}} + \underbrace{\begin{bmatrix} 1.14801 \\ -0.57401 \\ 3.71119 \\ -0.19134 \\ 3.57762 \end{bmatrix}}_{\vec{w}_{\perp}}$$

3 Newton-Raphson

Write a computer program that solves the following system of nonlinear equations,

$$x^{2} + \sin(y) = 3$$
$$y^{3} - \frac{2x}{y} = -10$$

using the Newton-Raphson method, starting with the guess (x, y) = (1.5, 0.5). In your writeup, show all analytical derivations, the final answer, and a convergence history (table form) of the residuals.

The Newton-Raphson method is described by,

$$\Delta U_{k} = -\left(\frac{\partial R}{\partial U}|_{U_{k}}\right)^{-1} R\left(U_{k}\right)$$

Where $\frac{\partial R}{\partial U}|_{U_k}$ is the Jacobian matrix of the residual which can be expressed as,

$$\frac{\partial R}{\partial U}|_{U_k} = \begin{bmatrix} \frac{\partial}{\partial x} \left(x^2 + \sin(y) - 3\right) & \frac{\partial}{\partial y} \left(x^2 + \sin(y) - 3\right) \\ \frac{\partial}{\partial x} \left(y^3 - \frac{2x}{y} + 10\right) & \frac{\partial}{\partial y} \left(y^3 - \frac{2x}{y} + 10\right) \end{bmatrix}$$

$$\frac{\partial R}{\partial U}|_{U_k} = \begin{bmatrix} 2x & \cos(y) \\ -\frac{2}{y} & 3y^2 + \frac{2x}{y^2} \end{bmatrix}$$

Then the next iteration can be written to be where ΔU_k is from the definition above,

$$U_{k+1} = U_k + \Delta U_k$$

Implementing this method into Python gives the following results,

Using the method shown above I found that the final value through Newton-Raphson was (1.63692, 0.32625). This was found through 8 iterations but converged to machine precision on iteration 6 as shown in Table 1 below.

Table 1: Python output from Newton-Raphson Method.

Iteration	(x, y)	$ ec{e}_k $
0.0	(1.50000000, 0.50000000)	4.13386e+00
1.0	(1.66929589, 0.22958303)	4.52990e+00
2.0	(1.64522275, 0.29761827)	1.02956e+00
3.0	(1.63762332, 0.32377164)	8.19753e-02
4.0	(1.63692486, 0.32623250)	6.06626e-04
5.0	(1.63691966, 0.32625099)	3.37132e-08
6.0	(1.63691966, 0.32625099)	0.00000e+00
7.0	(1.63691966, 0.32625099)	0.00000e+00
8.0	(1.63691966, 0.32625099)	0.00000e+00

4 Edge Connectivity

In this problem you will write a code that identifies loops of connected points given a scrambled list of edges. The assignment came with two files: V.txt, which contains the (x, y) coordinates of the points(nodes); and E.txt which contains the list of edges. Each line in E.txt corresponds to one edge. It contains two integers, which are the node numbers (numbering starts at 1) of the two endpoints of that edge. The coordinates of node n are given on line n of V.txt. A loop is an ordered sequence of nodes in which the first and last nodes are the same, and each pair of consecutive nodes is connected by an edge. For a given loop, all of the provided edges have the node pairs numbered consistently(either clockwise or counterclockwise). Write a code that reads in the two files and performs the following:

- Prints out the number of loops
- Starting from the shortest loop and progressing to the longest, prints out the number of unique nodes and the list of nodes in each loop. Start the list of nodes with the smallest-index node number. Format the printing to show 10 numbers per line, with the numbers right-justified in aligned columns.
- Makes a plot of the loops by connecting the ordered nodes in each loop. Use a different color and symbol for each loop. You will find that one of the loops is much further away from the others, so make two plots, one with all of the loops, and one zoomed in to show all but the faraway loop.

In your writeup, explain your approach and algorithm, and include all of the requested output and plots. The documented code should go in the .zip file, but we should not have to run it to see the results.

Edge Connectivity Algorithm

- 1. My algorithm in an overview has two nested while loops with if conditional statements to determine the edge connectivity within the loops.
 - First while loop is used to loop through all the loops until the algorithm determines that it has found all the interior loops
 - The seconds while loop will loop through E.txt to find which nodes belongs to the loop in question
- 2. Then while in these while loops, inside I have two if statements
 - One if statement is used to determine the next node that is connected within the interior loop
 - The other if statement is used to determine if it has looped through all the interior nodes and has reached back around to the beginning of the interior loop
- 3. Outside of the inner while loop is another if statement that determines if there are values that still need to be looped over and if so it will pre-allocate values for when it loops through the next interior loop
- 4. Then once finished with these loops printing the values is done through unique and sort and remove all 0 entries to remove the possibility of concatenation errors

Implementing my above method, being more involved and extra variables, I was able to fprintf to Matlab in the right-justified format with 10 numbers per line. However, the next page I output the values to Table 2 as well. Code will be attached at the end of my assignment.

Table 2: Edge connectivity unique nodes per loop in ascending order.

Loop Number: 1, with 18 unique nodes 1	Table 2: Edge connectivity u	ınıque	nodes	per 100	op m a	iscenai	ing ord	ier.		
Loop Number: 2, with 60 unique nodes	Loop Number: 1, with 18 unique nodes									
Loop Number: 2, with 60 unique nodes	10	196	334	81	112	311	174	15	309	265
1 263 222 181 104 169 241 137 187 252 252 70 21 321 210 66 253 38 24 136 136 226 80 274 74 14 307 40 212 277 277 337 87 202 330 213 293 129 162 316 316 336 296 292 320 64 243 92 325 255 255 52 8 329 322 121 99 76 234 Loop Number: 3, with 122 unique nodes 2 51 232 256 100 182 122 54 48 89 20 185 341 201 247 283 132 180 323 333 4 285 141 7 98 120 82 110 264 264 75 61 128 207 305 229 295 50 271 271 90 91 224 66 95 123 154 157 331 331 279 227 191 291 133 45 248 171 239 34 33 262 143 27 233 154 157 331 331 279 277 191 291 133 45 248 171 239 34 33 262 143 27 233 154 153 39 34 35 260 149 101 46 30 73 326 290 35 317 78 198 166 118 84 208 175 245 Loop Number: 4, with 141 unique nodes 240 289 276 244 266 303 190 298 218 228 228 242 315 86 58 251 126 339 286 43 248 249 240 289 276 244 266 303 190 298 218 228 249 240 289 276 244 266 303 190 298 218 228 240 289 276 244 266 303 190 298 218 228 240 240 289 276 244 266 303 190 298 218 228 240 240 289 276 244 266 303 190 298 218 228 240 240 289 276 244 266 303 190 298 218 228 241 341 363 258 264 302 214 29 273 179 53 341 342 342 343	265	22	338	254	35	85	97			
	Loop Number: 2, with 60 unique nodes									
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100 100	252	70	21	321	210	66	253	38	24	136
State	136	226	80	274	74	14	307	40	212	277
Coop Number: 3, with 122 unique nodes	277	337	87	202	330	213	293	129	162	316
Loop Number: 3, with 122 unique nodes Image: Content of the property o	316	336	296	292	320	64	243	92	325	255
Second Process of Second Pro	255	52	8	329	322	121	99	76	234	
89 20 185 341 201 247 283 132 180 323 323 4 285 141 7 98 120 82 110 264 264 75 61 128 207 305 229 295 50 271 271 90 91 224 6 95 123 154 157 331 331 279 227 191 291 133 45 248 171 239 239 34 33 262 143 27 233 178 153 39 230 145 275 282 335 56 299 151 257 188 188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 4 240 290 155 14 268 108 267 93	Loop Number: 3, with 122 unique nodes									
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264 75 61 128 207 305 229 295 50 271 271 90 91 224 6 95 123 154 157 331 331 279 227 191 291 133 45 248 171 239 239 34 33 262 143 27 233 178 153 39 39 147 200 236 340 209 125 3 314 230 230 145 275 282 335 56 299 151 257 188 188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 245 245 245 245 248 166 118 84 208 175 245 Loop Number: 4, with 141 unique nodes 9 155 114 268 108	89	20	185	341	201	247	283	132	180	323
271 90 91 224 66 95 123 154 157 331 331 279 227 191 291 133 45 248 171 239 239 34 33 262 143 27 233 178 153 39 39 147 200 236 340 209 125 3 314 230 230 145 275 282 335 56 299 151 257 188 188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 5 317 78 198 166 118 84 208 175 245 245 245 246 247 94 115 197 158 156 116 107 250 250 11 272 168 124 269 319 62 225 161 161 177 96 79 261 184 297 72 134 240 240 289 276 244 266 303 190 298 218 228 242 315 86 58 251 126 339 286 43 243 240 240 240 240 368 17 177 170 277 170 275 255 146 60 69 71 109 159 42 131 83 258 248 363 258 204 302 214 29 273 179 53 36 285 246 105 67 211 308 16 189 26 215 235 246 105 67 211 308 16 189 28 28 204 302 214 29 273 173 231 26 26 215 235 246 105 67 211 308 16 189 28 28 204 302 214 29 273 179 53 37 38 300 249 270 13 313 106 148 238 205 38 300 249 270 13 313 106 148 238 205 38 300 249 270 13 313 106 148 238 205 38 300 249 270 13 313 316 306 348 348 348 39 300 249 270 13 313 306 348 348 348 348 348 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300 300	323	4	285	141	7	98	120	82	110	264
331 279 227 191 291 133 45 248 171 239 239 34 33 262 143 27 233 178 153 39 39 147 200 236 340 209 125 3 314 230 230 145 275 282 335 56 299 151 257 188 188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 5	264	75	61	128	207	305	229	295	50	271
239 34 33 262 143 27 233 178 153 39 39 147 200 236 340 209 125 3 314 230 230 145 275 282 335 56 299 151 257 188 188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 5 317 78 198 166 118 84 208 175 245 245 245 24 28 178 111 221 304 18 5 245 245 28 188 166 118 84 208 175 245 245 245 24 268 108 267 93 23 144 216 216 127 94 115 197 158 156 116 107	271	90	91	224	6	95	123	154	157	331
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	331	279	227	191	291	133	45	248	171	239
230 145 275 282 335 56 299 151 257 188 188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 245 5 317 78 198 166 118 84 208 175 245 Loop Number: 4, with 141 unique nodes 5 114 268 108 267 93 23 144 216 216 127 94 115 197 158 156 116 107 250 250 11 272 168 124 269 319 62 225 161 161 177 96 79 261 184 297 72 134 240 240 289 276 244 266 303 190 298 218 228 43 36 288 17 117 172	239	34	33	262	143	27	233	178	153	39
188 103 260 149 101 46 30 73 326 290 290 119 206 28 278 111 221 304 18 5 5 317 78 198 166 118 84 208 175 245 Loop Number: 4, with 141 unique nodes	39	147	200	236	340	209	125	3	314	230
290 119 206 28 278 111 221 304 18 5 245 245 178 198 166 118 84 208 175 245 Loop Number: 4, with 141 unique nodes 9 155 114 268 108 267 93 23 144 216 216 127 94 115 197 158 156 116 107 250 250 11 272 168 124 269 319 62 225 161 161 177 96 79 261 184 297 72 134 240 240 289 276 244 266 303 190 298 218 228 228 242 315 86 58 251 126 339 286 43 43 36 288 17 117 172 170 237 219 55 55 146 60 69 71 109	230	145	275	282	335	56	299	151	257	188
5 317 78 198 166 118 84 208 175 245 Loop Number: 4, with 141 unique nodes 4 4 5 114 268 108 267 93 23 144 216 216 127 94 115 197 158 156 116 107 250 250 11 272 168 124 269 319 62 225 161 161 177 96 79 261 184 297 72 134 240 240 289 276 244 266 303 190 298 218 228 228 242 315 86 58 251 126 339 286 43 43 36 288 17 117 172 170 237 219 55 43 36 258 204 302 214 29	188	103	260	149	101	46	30	73	326	290
Loop Number: 4, with 141 unique nodes 9 155 114 268 108 267 93 23 144 216 216 127 94 115 197 158 156 116 107 250 250 11 272 168 124 269 319 62 225 161 161 177 96 79 261 184 297 72 134 240 240 289 276 244 266 303 190 298 218 228 228 242 315 86 58 251 126 339 286 43 43 36 288 17 117 172 170 237 219 55 55 146 60 69 71 109 159 42 131 83 83 63 258 204 302 214 29 273	290	119	206	28	278	111	221	304	18	5
Loop Number: 4, with 141 unique nodes Image: square problem of the prob	5	317	78	198	166	118	84	208	175	245
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	245									
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Loop Number: 4, with 141 unique nodes									
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	9	155	114	268	108	267	93	23	144	216
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	216	127	94	115	197	158	156	116	107	250
240 289 276 244 266 303 190 298 218 228 228 242 315 86 58 251 126 339 286 43 43 36 288 17 117 172 170 237 219 55 55 146 60 69 71 109 159 42 131 83 83 63 258 204 302 214 29 273 179 53 53 25 176 102 138 194 183 193 327 113 113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205	250	11	272	168	124	269	319	62	225	161
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	161	177	96	79	261	184	297	72	134	240
43 36 288 17 117 172 170 237 219 55 55 146 60 69 71 109 159 42 131 83 83 63 258 204 302 214 29 273 179 53 53 25 176 102 138 194 183 193 327 113 113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205	240	289	276	244	266	303	190	298	218	228
55 146 60 69 71 109 159 42 131 83 83 63 258 204 302 214 29 273 179 53 53 25 176 102 138 194 183 193 327 113 113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205	228	242	315	86	58	251	126	339	286	43
83 63 258 204 302 214 29 273 179 53 53 25 176 102 138 194 183 193 327 113 113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205	43	36	288	17	117	172	170	237	219	55
53 25 176 102 138 194 183 193 327 113 113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205	55	146	60	69	71	109	159	42	131	83
53 25 176 102 138 194 183 193 327 113 113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205										
113 259 199 49 12 306 332 173 231 26 26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205										1
26 215 235 246 105 67 211 308 16 189 189 300 249 270 13 313 106 148 238 205										
189 300 249 270 13 313 106 148 238 205										

Above in Table 2 are the nodal values to the edge values for each given loop. Attached to the end is the tabulated output from Matlab Command Window.

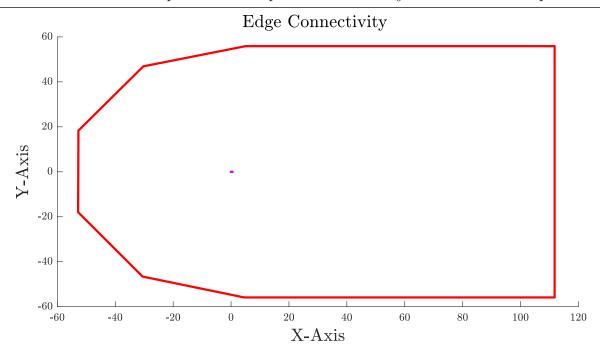


Figure 1: Full view of all loops.

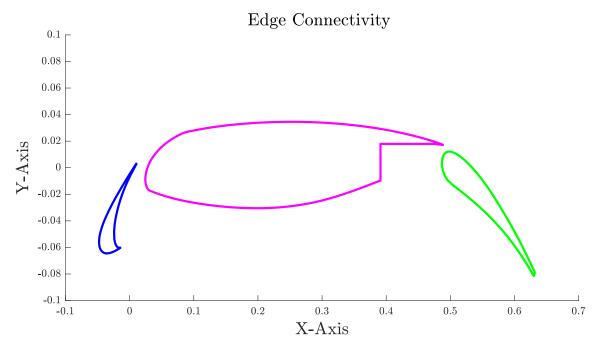


Figure 2: Zoomed in view of all loops.

Looking above to Figures 1,2 I can see that my Matlab code correctly implemented the iterations to determine the correct loops and then successfully tabulated them to the loops.

Python Code for Gram-Schmidt Orthonormalization

Algorithm 1: Gram-Schmidt Orthonormalization algorithm implementation in Python environment.

```
import numpy as np
    import math
 3
 4
    def write_file(v, filename):
 5
        f = open(filename,"w")
 6
 7
        output = ''
 8
        for i in range(len(v)):
            output += ' ' + str.format('{0:.5f}', v[i]) + ' ' + r'\\' # Output results to LaTeX
                 {\tt environment}
10
        f.write(output)
        f.close()
11
12
13
    def write_w(filename, projection):
        f = open(filename, "w")
14
15
        output = ''
16
17
        for i in range(len(projection)):
18
            output += str.format('{0:.5f}', projection[i]) + r'\\ ' # Output results to LaTeX environment
19
        f.write(output)
20
        f.close()
21
22
    # Pre-allocate matrices
23
    u = np.array([[1, 0, 3], [2, -1, 0], [0, 0, 1], [0, 3, 0], [0, 0, -2]])
24
    v = np.zeros(u.shape)
25
26
    # Apply Gram-Schmidt Algorithm
27
    for i in range(min(u.shape)):
28
        v[:,i] = u[:,i]
29
        for j in range(i):
30
            if j >= 0:
                v[:,i] = v[:,i] - np.dot(v[:,j], v[:,i])*v[:,j] # Apply inner product
31
        v[:,i] = v[:,i]/math.sqrt(np.dot(v[:,i], v[:,i])) # Normalize
32
33
34
    # Output results to LaTeX
    write_file(v[:,0], "v1")
write_file(v[:,1], "v2")
write_file(v[:,2], "v3")
35
36
37
38
39
    w = np.linspace(1, 5, len(v), dtype = int, endpoint=True)
40
    w_parallel = np.zeros(5)
41
    for i in range(min(u.shape)):
        print(i)
42
43
        v_norm = v[:,i] / np.linalg.norm(v[:,i])
44
        w_parallel += np.dot(w,v_norm)*v_norm
45
46
    w_perp = w - w_parallel
    write_w("w_parallel", w_parallel)
47
    write_w("w_perp", w_perp)
```

Python Code for Newton-Raphson Method

Algorithm 2: Newton-Raphson algorithm implementation in Python environment.

```
import numpy as np
 2
    import math
 3
 4
    # Pre-allocating values
 5
    N = 10 # Number of iterations
    u0 = np.matrix([1.5, 0.5]) # Initial guess
    u = np.zeros([N, 2])
    resid = np.zeros([N,1])
    u[0,:] = u0
10
11
    def f(dat):
        f1 = float(dat[0]**2 + math.sin(dat[1]) - 3) # f_1 function
12
13
        f2 = float(dat[1]**3 - 2*dat[0]/dat[1] + 10) # f_2 function
14
15
        return np.matrix([[f1], [f2]])
16
17
    def print_results(Uk, R):
        f = open('q3_results', "w") # Filename
18
19
        output = ''
20
21
        for i in range(len(u)-1):
           output += str.format('{0:.1f}',i) + r'& ('+str.format('{0:.8f}',Uk[i,0])+', '+str.format('
                {0:.8f}',Uk[i,1])+ r') &'+str.format('{0:.5e}',R[i,0])+ r'\\' # Output results to LaTeX
23
        f.write(output)
24
        f.close()
25
26
    def final_vals(u):
27
        f = open('q3_final_vals',"w") # Filename
28
29
        idx = len(u) - 1
30
        f.write('(' + str.format('{0:.5f}',u[idx,0])+', '+str.format('{0:.5f}',u[idx,1]) + ')')
31
        f.close()
33
    resid[0] = float(np.linalg.norm(np.transpose(f(u[0,:]))))
34
    for i in range(N-1):
35
        jacobian = np.matrix([[2*u[i,0] , math.cos(u[i,1])], [-2/u[i,1], 3*u[i,1]**2 + 2*u[i,0]/(u[i
            ,1]**2)]]) # Compute partial R/partial U @(U_k)
36
        deltaux = -np.linalg.inv(jacobian) * f(u[i,:]) # Compute the delta_Ux
37
38
        u[i+1,:] = u[i,:] + np.array([deltaux[0,0], deltaux[1,0]]) # Compute the next step
39
        resid[i+1] = np.linalg.norm(np.transpose(f(u[i+1,:]))) # Compute residual
40
41
    print(resid)
42
    print_results(u, resid) # Output results to LaTeX table
43
    final_vals(u)
```

Matlab Code for Edge Connectivity

Algorithm 3: Edge Connectivity algorithm implementation in Matlab environment.

```
clear all; clc; close all
 3
    set(groot, 'defaulttextinterpreter', 'latex');
    set(groot, 'defaultAxesTickLabelInterpreter','latex');
set(groot, 'defaultLegendInterpreter','latex');
 7
 8
    \% Load in values for E, V
    E = dlmread('E.txt'); Edat = E;
10
    V = dlmread('V.txt');
11
12
    % Initiate the first loop
13
    loops(1,:) = E(1,:);
14
    E(1,:) = [];
    loop_index = [1,2];
15
16
    while norm(size(E)) > 2.5 \% When deleting values norm([1,2]) = 2.236
17
        k = 2; % Iterator for loop matrix
18
         i = 1; % Iterator for iterating through E
19
         inloop = true; % Boolean conditional
         while inloop
20
21
             if i == \max(size(E)) + 1
22
                 i = 1; % Restart the loop if ran through all the points
23
             end
             node2 = E(i,2); % The next node in question
if loops(k-1, loop_index(1)) == node2 % If they are connected
24
25
26
                 loops(k, loop_index) = E(i,:); % Set values
27
                 E(i,:) = []; % Delete entries
28
                 if loops(1, loop_index(2)) == loops(k, loop_index(1))
29
                     inloop = false; % If loop has been completed, break
                 elseif size(E)*[1;0] == 1 \% Checks for the length of E
30
31
                     loops(k+1, loop_index) = E(1,:); % Handles the last index
32
                      inloop = false; % Removes itself from the
33
                 end
34
                 k = k + 1;
35
             else
                 i = i + 1;
36
37
             end
38
         end
39
         if norm(size(E)) > 2.5 % When deleting values norm([1,2]) = 2.236
40
             loop_index = loop_index + 2; % Increase the loop index by 2
loops(1:end, loop_index) = zeros(max(size(loops)), 2); % Pre-allocate
41
             loops(1,loop_index) = E(1,:); % Iniate
42
43
             E(1,:) = []; % Delete entries
44
45
    end
46
    num_loops = size(loops)*[0;1]/2; % Determine number of loops
fprintf(['The number of loops is ', num2str(num_loops)])
47
48
    loop_index = [7,8];
49
50
    for i = 1:num_loops
51
         dat = loops(1:end, loop_index(1)); % Grab values
         dat(dat == 0) = []; % Delete zero entry
52
53
54
         idx = find(dat == min(dat), 1);
55
56
         % Print tabulated values
         fprintf(['\n\nLoop Number: ',num2str(i), ', with ', num2str(max(size(dat))), ' unique nodes\n
57
              '])
58
         val_loop = true;
59
         k = 1;
60
         looptot = 1;
         while val_loop
61
62
             if idx == max(size(dat))
63
                 idx = 1;
64
65
             fprintf('%10d ', dat(idx))
66
             k = k + 1;
67
             idx = idx + 1;
             looptot = looptot + 1;
68
69
             if k == 11
70
                fprintf('\n')
71
                k = 1;
```

```
72.
              end
 73
              if looptot == max(size(dat))
 74
                 val_loop = false ;
 75
 76
 77
          loop_index = loop_index - 2;
 78
     end
 79
     %write_to_latex(loops)
 80
     loop_index = [7,8];
 81
 82
     ax = axes;
     ax.ColorOrder = [1 0 0; 0 0 1; 0 1 0; 1 0 1];
     ax.LineStyleOrder = {'-','--', '--', '-.', ':'};
 84
 85
     hold on
 86
     for i = 1:num_loops
 87
          indices1 = loops(1:end, loop_index(1)); indices1(indices1 == 0) = [];
 88
          indices2 = loops(1:end, loop_index(2)); indices2(indices2 == 0) = [];
 89
 90
          node1 = V(indices1,:);
 91
          sz = max(size(node1));
 92
         node1((sz+1):(sz+2),:) = [V(indices2(1),:); V(indices1(1),:)];
 93
          plot(node1(1:end, 1), node1(1:end, 2), 'linewidth', 2)
 94
 95
          loop_index = loop_index - 2;
     end
 96
     xlabel('X-Axis', 'fontsize', 16)
ylabel('Y-Axis', 'fontsize', 16)
title('Edge Connectivity ', 'fontsize', 16)
set(gcf, 'Color', 'w', 'Position', [200 200 800 400]);
 97
 98
99
100
101
     %export_fig('big_loops.eps')
     xlim([-0.1, 0.7])
102
103
     ylim([-0.1, 0.1])
104
     %export_fig('small_loops.eps')
105
106
      function write_to_latex(loops)
107
          fid = fopen('loop_results', 'w');
108
          loop_index = [7,8];
          num_loops = size(loops)*[0;1]/2;
109
110
111
          for i = 1:num_loops
112
              dat = loops(1:end, loop_index(1)); % Grab values
113
              dat(dat == 0) = []; % Delete zero entry
114
              idx = find(dat == min(dat), 1);
115
              string = append("Loop Number: ", num2str(i), ', with ', num2str(max(size(dat))), " unique
    nodes & & & & & & & \ \hline");
116
117
              fprintf(fid, '\n %s \n', string);
118
              val_loop = true;
119
              k = 1;
120
              looptot = 1;
              while val_loop
121
122
                  if idx == max(size(dat))
123
                      idx = 1;
124
                  end
125
                  if k == 10
126
                      lbreak = "\\"
                      fprintf(fid, '%10d %s', dat(idx), lbreak);
fprintf(fid, '\n');
127
128
129
                      k = 1;
130
                  else
131
                      fprintf(fid, '%10d &', dat(idx));
132
                      k = k + 1;
133
                      idx = idx + 1;
134
135
                  looptot = looptot + 1;
136
                  if looptot == max(size(dat))
137
                     val_loop = false ;
138
139
              end
140
              loop_index = loop_index - 2;
141
          end
142
     end
```

Matlab Command Window Output

The number of	loops is 4								
loop Number: 1	With 10	inimia nodeo							
10 10	196	334	81	112	311	174	15	309	265
22	338	254	35	85	97	167	13	309	200
22	330	254	35	0.5	97	167			
oop Number: 2	2, with 60 u	unique nodes							
1	263	222	181	104	169	241	137	187	252
70	21	321	210	66	253	38	24	136	226
80	274	74	14	307	40	212	277	337	87
202	330	213	293	129	162	316	336	296	292
320	64	243	92	325	255	52	8	329	322
121	99	76	234	37	77	192	150	312	
oop Number: 3	8 with 122	unique node							
2	51	232	256	100	182	122	54	48	89
20	185	341	201	247	283	132	180	323	4
285	141	7	98	120	82	110	264	75	61
128	207	305	229	295	50	271	90	91	224
6	95	123	154	157	331	279	227	191	291
133	45	248	171	239	34	33	262	143	27
233	178	153	39	147	200	236	340	209	125
3	314	230	145	275	282	335	56	299	151
257	188	103	260	149	101	46	30	73	326
290	119	206	28	278	111	221	304	18	5
317	78	198	166	118	84	208	175	245	318
223	44	59	130	164	163	41	284	310	140
88									
oop Number: 4				0.7527607	91764	272	410	and to	400.00
9	155	114	268	108	267	93	23	144	216
127	94	115	197	158	156	116	107	250	11
272	168	124	269	319	62	225	161	177	96
79	261	184	297	72	134	240	289	276	244
266	303	190	298	218	228	242	315	86	58
251	126	339	286	43	36	288	17	117	172
170	237	219	55	146	60	69	71	109	159
42	131	83	63	258	204	302	214	29	273
179	53	25	176	102	138	194	183	193	327
113	259	199	49	12	306	332	173	231	26
215	235	246	105	67	211	308	16	189	300
249	270	13	313	106	148	238	205	65	47
294	160	324	186	152	220	57	203	281	19

Figure 3: Matlab Command Window output for tabulated node values.