

## LAB03: ANALYSIS OF FINITE DIFFERENCE SCHEMES

## 1 Finite difference approximations

Mathematica implementation of finite difference calculus

```
In[1]:= x \[Element] Reals; $Assumptions = h > 0;
Dp[f_[x_]] := f[x + h] - f[x];
Dm[f_[x_]] := f[x] - f[x - h];
d[f_[x_]] := f[x+h/2]-f[x-h/2];
Dp[a_ f_[x_]]:=a Dp[f[x]]; Dp[a_+b_]=Dp[a]+Dp[b]; Dp[a_ (b_+c_)]:=a Dp[b]+a Dp[c]; Dp[a_]=0;
Dm[a_ f_[x_]]:=a Dm[f[x]]; Dm[a_+b_]=Dm[a]+Dm[b]; Dm[a_ (b_+c_)]:=a Dm[b]+a Dm[c]; Dm[a_]=0;
d[a_ f_[x_]]:=a d[f[x]]; d[a_+b_]=d[a]+d[b]; d[a_ (b_+c_)]:=a d[b]+a d[c]; d[a_]=0;
fdSort[expr_]:=Assuming[{h > 0, x > 0}, Sort[Level[expr, 1], Level[#1, {Depth[#1] - 1}] < Level[#2,
{Depth[#2] - 1}] &]];
Q[x_]=Subscript[Q,x];
Dp[f_[x_], p_] :=
  Together[Normal[1/h Series[Log[1 + z], {z, 0, p}]] /.
    Table[z^j -> Nest[Dp, f[x], j], {j, 1, p}]];
Dm[f_[x_], p_] :=
  Together[Normal[-1/h Series[Log[1 - z], {z, 0, p}]] /.
    Table[z^j -> Nest[Dm, f[x], j], {j, 1, p}]];
d[f_[x_], p_] := Together[Normal[2/h Series[ArcSinh[z/2], {z, 0, 2 p - 1}]] /.
  Table[z^j -> Nest[d, f[x], j], {j, 1, 2 p - 1}]];
Dp[f_[x_], p_, k_] :=
  Together[Expand[(Normal[1/h Series[Log[1 + z], {z, 0, p}]])^k] /.
    Table[z^j -> Nest[Dp, f[x], j], {j, 1, p k}]];
Dm[f_[x_], p_, k_] :=
  Together[Expand[(Normal[-1/h Series[Log[1 - z], {z, 0, p}]])^k] /.
    Table[z^j -> Nest[Dm, f[x], j], {j, 1, p k}]];
d[f_[x_], p_, k_] := Together[Expand[(Normal[2/h Series[ArcSinh[z/2], {z, 0, 2 p - 1}]])^k]
/. Table[z^j -> Nest[d, f[x], j], {j, 1, (2 p - 1)k}]];
{qt1,qxx2,qxx4}={Dp[f[x],1],d[f[x],1,2],d[f[x],2,2]}
```

In[2]:=

## 2 Interpolating polynomial

The Newton form of the interpolating polynomial of data  $\mathcal{D} = \{(t^n = nh, Q^n), n = 0, 1, \dots, r\}$  is

$$p_r(t) = Q^0 + [Q^1, Q^0](t - t^0) + \dots + [Q^r, \dots, Q^1, Q^0](t - t^0) \dots (t - t^{r-1})$$

```
In[2]:= pNewton[q_[t_],r_] := Sum[ Nest[Dp,q[0],j]/h^j Product[(t - n h),{n,0,j-1}]/j!,{j,0,r}];
Table[Simplify[pNewton[q[t],r]],{r,0,3}] // TableForm
```

$$\frac{q(0)}{1} + \frac{t(q(h) - q(0))}{h} + q(0)$$

$$\frac{t(-2q(h) + q(2h) + q(0))(t - h)}{2h^2} + \frac{t(q(h) - q(0))}{h} + q(0)$$

$$\frac{3tq(h)(6h^2 - 5ht + t^2) + (h - t)(3tq(2h)(t - 3h) + (2h - t)(tq(3h) + 3hq(0) - q(0)t))}{6h^3}$$

In[3]:=

Verify the above implementation for the first few interpolating polynomials

```
In[3]:= p1[t_] = pNewton[q[t],1]
```

$$\frac{t(q(h) - q(0))}{h} + q(0)$$

```
In[4]:= {p1[0],p1[h]}
```

```
{q(0),q(h)}
```

```
In[5]:= p2[t_] = pNewton[q[t],2]
```

$$\frac{t(-2q(h) + q(2h) + q(0))(t-h)}{2h^2} + \frac{t(q(h) - q(0))}{h} + q(0)$$

In[6] := Simplify[{p2[0], p2[h], p2[2h]}

{q(0), q(h), q(2h)}

In[7] := p3[t\_] = pNewton[q[t], 3]

$$\frac{t(q(h) - q(2h) - 2(q(2h) - q(h)) + q(3h) - q(0))(t-2h)(t-h)}{6h^3} + \frac{t(-2q(h) + q(2h) + q(0))(t-h)}{2h^2} + \frac{t(q(h) - q(0))}{h} + q(0)$$

In[8] := Simplify[{p3[0], p3[h], p3[2h], p3[3h]}

{q(0), q(h), q(2h), q(3h)}

In[9] :=

### 3 Linear multistep methods

In a linear multistep method (LMM) the solution to ODE  $q' = f(q, t)$  is sought by linear combination of values  $Q^n \cong q(t^n)$ ,  $F^n \cong (t^n, q(t^n))$  with  $t^n = nk$ .

#### 3.1 Adams-Bashforth

Adams-Bashforth schemes are obtained by integrating the ODE over interval  $[t^{n+r}, t^{n+r-1}]$

$$Q^{n+1+r} = Q^{n+r} + \int_{(n+r)k}^{(n+1+r)k} f(t, q(t)) dt,$$

and approximating  $f$  by the interpolating polynomial  $p_r(t)$ . The following computes the lhs, rhs of the above formula, setting  $n=0$ .

```
In[9] := AdamsBashforth[q_[t_], r_] :=
  {q[(r+1)k], q[r k] + Integrate[ pNewton[f[t], r] /. h->k, {t, r k, (r+1) k}]}];
ABschemes = Table[AdamsBashforth[q[t], r], {r, 0, 4}] // Apart;
ABschemes // TableForm
```

$$\begin{aligned} q(k) & f(0)k + q(0) \\ q(2k) & q(k) - \frac{1}{2}k(f(0) - 3f(k)) \\ q(3k) & \frac{1}{12}k(-16f(k) + 23f(2k) + 5f(0)) + q(2k) \\ q(4k) & q(3k) - \frac{1}{24}k(-37f(k) + 59f(2k) - 55f(3k) + 9f(0)) \\ q(5k) & \frac{1}{720}k(-1274f(k) + 2616f(2k) - 2774f(3k) + 1901f(4k) + 251f(0)) + q(4k) \end{aligned}$$

In[10] :=

#### 3.2 Adams-Moulton

Adams-Moulton are obtained by integrating the ODE over interval  $[t^{n+r-1}, t^{n+r}]$

$$Q^{n+r} = Q^{n+r-1} + \int_{(n+r-1)k}^{(n+r)k} f(t, q(t)) dt,$$

and approximating  $f$  by the interpolating polynomial  $p_r(t)$ . The following computes the lhs, rhs of the above formula, setting  $n=0$ .

```
In[10] := AdamsMoulton[q_[t_], r_] :=
  {q[r k], q[(r-1) k] + Integrate[ pNewton[f[t], r] /. h->k, {t, (r-1) k, r k}]}];
AMschemes = Table[AdamsMoulton[q[t], r], {r, 0, 4}] // Apart;
AMschemes // TableForm
```

$$\begin{aligned} q(0) & f(0)k + q(-k) \\ q(k) & \frac{1}{2}k(f(k) + f(0)) + q(0) \\ q(2k) & q(k) - \frac{1}{12}k(-8f(k) - 5f(2k) + f(0)) \\ q(3k) & \frac{1}{24}k(-5f(k) + 19f(2k) + 9f(3k) + f(0)) + q(2k) \\ q(4k) & q(3k) - \frac{1}{720}k(-106f(k) + 264f(2k) - 646f(3k) - 251f(4k) + 19f(0)) \end{aligned}$$

In[11]:=

## 4 Stability analysis

Define a function to obtain the characteristic polynomial given as a pair {lhs,rhs}

```
In[11]:= CharPoly[s_] := Module[{cp,g,F,Q},
  g[t_]=f[q[t]]; F[q_] = lambda q; Q[t_] = zeta^(t/k);
  cp = Simplify[s[[1]] - s[[2]] /. f->g /. f->F /. q->Q];
  Return[Simplify[cp /. k->(z/lambda)]];
];
CharPoly[ABSchemes[[1]]]
```

$-z + \zeta - 1$

In[12]:=

Compute and display the characteristic polynomials for Adams-Bashforth, Adams-Moulton schemes

```
In[12]:= ABCPs = Map[CharPoly[#]&,ABSchemes];
ABCps // TableForm
```

$$\begin{array}{l} -z + \zeta - 1 \\ (\zeta - 1)\zeta - \frac{1}{2}z(3\zeta - 1) \\ (\zeta - 1)\zeta^2 - \frac{1}{12}z(23\zeta^2 - 16\zeta + 5) \\ (\zeta - 1)\zeta^3 - \frac{1}{24}z(55\zeta^3 - 59\zeta^2 + 37\zeta - 9) \\ (\zeta - 1)\zeta^4 - \frac{1}{720}z(1901\zeta^4 - 2774\zeta^3 + 2616\zeta^2 - 1274\zeta + 251) \end{array}$$

```
In[13]:= AMCPs = Map[CharPoly[#]&,AMSchemes];
AMCPs // TableForm
```

$$\begin{array}{l} -z - \frac{1}{\zeta} + 1 \\ -\frac{1}{2}z(\zeta + 1) + \zeta - 1 \\ (\zeta - 1)\zeta - \frac{1}{12}z(5\zeta^2 + 8\zeta - 1) \\ (\zeta - 1)\zeta^2 - \frac{1}{24}z(9\zeta^3 + 19\zeta^2 - 5\zeta + 1) \\ (\zeta - 1)\zeta^3 - \frac{1}{720}z(251\zeta^4 + 646\zeta^3 - 264\zeta^2 + 106\zeta - 19) \end{array}$$

In[14]:=

Define a function to extract the boundary locus  $|\zeta|=1$ , i.e.  $\zeta = e^{i\theta}$

```
In[14]:= BLocus[p_] := z /. Solve[p == 0, z][[1]] /. zeta->Exp[I theta];
BLocus[ABCps[[1]]]
```

$-1 + e^{i\theta}$

In[15]:=

Compute and display the boundary locii for Adams-Bashforth, Adams-Moulton schemes

```
In[15]:= ABBLs = Map[BLocus[#]&, ABCps];
ABBLs // TableForm
```

$$\begin{array}{l} -1 + e^{i\theta} \\ \frac{2e^{i\theta}(-1 + e^{i\theta})}{-1 + 3e^{i\theta}} \\ \frac{12e^{2i\theta}(-1 + e^{i\theta})}{-16e^{i\theta} + 23e^{2i\theta} + 5} \\ \frac{24e^{3i\theta}(-1 + e^{i\theta})}{37e^{i\theta} - 59e^{2i\theta} + 55e^{3i\theta} - 9} \\ \frac{720e^{4i\theta}(-1 + e^{i\theta})}{-1274e^{i\theta} + 2616e^{2i\theta} - 2774e^{3i\theta} + 1901e^{4i\theta} + 251} \end{array}$$

```
In[16]:= AMBLs = Map[BLocus[#]&, AMCPs];
AMBLs // TableForm
```

$$\frac{e^{-i\theta}(-1+e^{i\theta})}{2(-1+e^{i\theta})} \frac{1}{1+e^{i\theta}}$$

$$\frac{12e^{i\theta}(-1+e^{i\theta})}{8e^{i\theta}+5e^{2i\theta}-1}$$

$$\frac{24e^{2i\theta}(-1+e^{i\theta})}{-5e^{i\theta}+19e^{2i\theta}+9e^{3i\theta}+1}$$

$$\frac{720e^{3i\theta}(-1+e^{i\theta})}{106e^{i\theta}-264e^{2i\theta}+646e^{3i\theta}+251e^{4i\theta}-19}$$

Define a function to plot a family of boundary locii, and apply it to Adams-Bashforth and Adams-Moulton schemes

```
In[17]:= BLocusPlot[bl_,blname_] :=
  ParametricPlot[Evaluate[Map[{Re[#],Im[#]}&,bl]],{theta,0,2Pi},Axes->True,Frame->True,
  FrameLabel->{"Re(z)","Im(z)"},GridLines->Automatic,AspectRatio->Automatic,
  PlotLabel->blname,PlotLegends->Automatic,PlotRange->{{-3,3},{-3,3}}];
ABBLplots = BLocusPlot[ABBLs,"Adams-Bashforth boundary locii"];
Export["/home/student/courses/MATH761/AdamsBashforthBoundaryLocii.pdf",ABBLplots]

/home/student/courses/MATH761/AdamsBashforthBoundaryLocii.pdf

In[18]:= AMBLplots = BLocusPlot[AMBLs,"Adams-Moulton boundary locii"];
Export["/home/student/courses/MATH761/AdamsMoultonBoundaryLocii.pdf",AMBLplots]

/home/student/courses/MATH761/AdamsMoultonBoundaryLocii.pdf

In[19]:=
```

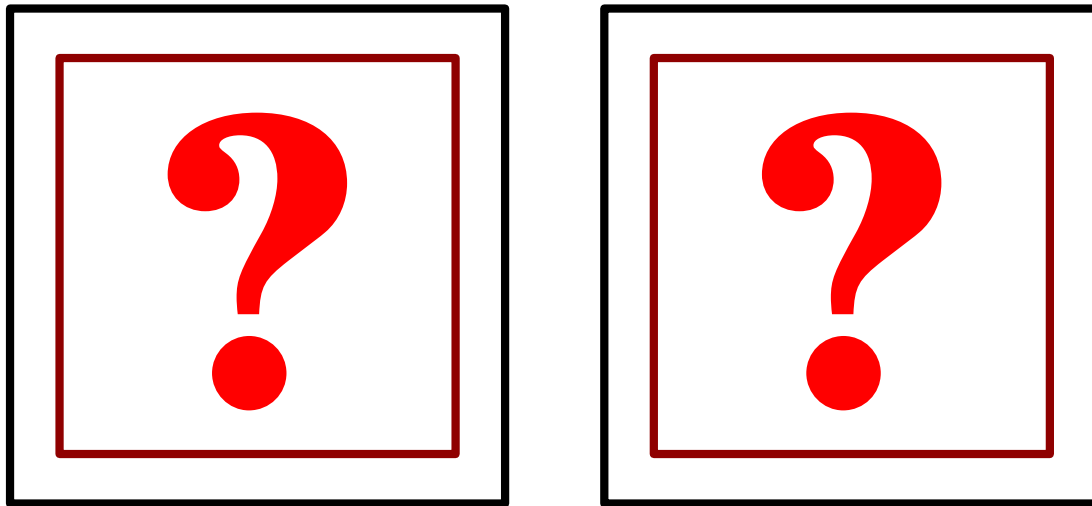


Figure 1. Boundary locii for LMMs