

Chapter 6 lab
lecture

David M.
Rosenberg

Admin

Backward Euler

Solving the implicit
equation

Eigenval-
ues/eigenvectors

Predicting long-term
behavior

Spectral
decomposition

Systematic
calculation

Complex
functions

Argument branching

Sanity checks

Chapter 6 lab lecture

David M. Rosenberg

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November 18, 2009

Outline

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- Homework
- Office hours
- \LaTeX and \TeX interest

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Remember

There is no “generalized” formula for running backward-Euler. Each model will require a different function to be applied iteratively. Finding this function is *solving the implicit equation*.

- This differs from the *forward* Euler method.
- Typically solved analytically.
- The example in the text *only works for that model* ($\dot{x} = at$)
- The computational / cerebral costs of solving the implicit equation first should be considered when choosing a numerical method.

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Example

Consider the model $\dot{x} = 5x - 3$

$$f(x, t) = \dot{x} = 5x - 3$$

$$x_{n+1} = x_n + \Delta t f(x_{n+1})$$

$$x_{n+1} = x_n + \Delta t(5x_{n+1} - 3)$$

$$x_{n+1}(1 - 5\Delta t) = x_n - 3\Delta t$$

$$x_{n+1} = \left(\frac{x_n - 3\Delta t}{1 - 5\Delta t} \right)$$

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Example

Consider the model $\dot{x} = 5x - 3$

```
>bEulerStepFun <- function(xn, dt) {  
  return( (xn - 3 * dt) / (1 - 5 * dt) );  
}  
>dt <- 5;  
>tRange <- c(0, 40);  
>x0 <- 2  
>x <- t <- seq(tRange[1], tRange[2], by=dt);  
>x[1] <- x0;  
>for (ii in 1:(length(t) - 1)) {  
  x[ii + 1] <- bEulerStepFun(x[ii], dt);  
}
```

```
>data.frame(t=t, x=x);  
   t    x  
1  0 2.0000000  
2  5 0.5416667  
3 10 0.6024306  
4 15 0.5998987  
5 20 0.6000042  
6 25 0.5999998  
7 30 0.6000000  
8 35 0.6000000  
9 40 0.6000000
```

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Stability:	$Re(\lambda_1, \lambda_2) > 0$	$Re(\lambda_1, \lambda_2) < 0$
------------	--------------------------------	--------------------------------

real:	unstable node	stable node
-------	---------------	-------------

complex:	unstable spiral	stable spiral
----------	-----------------	---------------

Stability:	$Re(\lambda_1) < 0, Re(\lambda_2) > 0$	$Re(\lambda_1 \text{ or } \lambda_2) = 0$
------------	--	---

real:	saddle point	degenerate node
-------	--------------	-----------------

complex:	N/A	center point
----------	-----	--------------

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**Spectral
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$$A = Q\Lambda Q^{-1}$$

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- Exponential matrix operations
- Matrix inversion
- Functional calculus

$$\begin{aligned}A^2 &= A \cdot A \\&= Q\Lambda Q^{-1} \cdot Q\Lambda Q^{-1} \\&= Q\Lambda^2 Q^{-1}\end{aligned}$$

By similar argument:

$$A^k = Q\Lambda^k Q^{-1}$$

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Consider $\hat{A} = Q\Lambda^{-1}Q^{-1}$

$$\begin{aligned} A \cdot \hat{A} &= Q\Lambda Q^{-1} \cdot Q\Lambda^{-1}Q^{-1} \\ &= I \end{aligned}$$

■ Exponential matrix operations

■ Matrix inversion

■ Functional calculus

Thus we have:

$$A^{-1} = Q\Lambda^{-1}Q^{-1} \quad (1)$$

Furthermore if $\Lambda = \begin{bmatrix} \lambda_1 & 0 \\ 0 & \lambda_2 \end{bmatrix}$,

$$\text{then } \Lambda^{-1} = \begin{bmatrix} \frac{1}{\lambda_1} & 0 \\ 0 & \frac{1}{\lambda_2} \end{bmatrix}.$$

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- Exponential matrix operations
- Matrix inversion
- **Functional calculus**

$$f(x) = a + bx + cx^2 + \dots$$

$$f(A) = f(Q\Lambda Q^{-1})$$

$$= Qf(\Lambda)Q^{-1}$$

$$\Lambda = \begin{bmatrix} \lambda_1 & 0 \\ 0 & \lambda_2 \end{bmatrix}$$

$$f(\Lambda) = \begin{bmatrix} f(\lambda_1) & 0 \\ 0 & f(\lambda_2) \end{bmatrix}$$

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```
>pointCurve <- function(expr, from=0, to=1, xList=NULL, ...) {  
  sexpr <- substitute(expr);          ## Don't worry about this  
  curve(expr, from=from, to=to, ...)  ## This is KEY -  
    Identifying whether                ## or not to do the  
                                       ## optional  
                                       ## 'thing'  
  y <- numeric(length=length(xList));  
  for (ii in 1:length(xList)) {  
    y[ii] <- eval(call(eval(as.character(sexpr)), xList[ii]));  
  }  
  points(xList, y, col=rainbow(n=length(xList)), pch=19);  
}  
>layout(matrix(c(1, 2), nrow=1));  
>par(mar=c(2,2,2,2));  
>pointCurve(sin, 0, pi);              ## One behavior without  
    the arg.  
>pointCurve(sin, 0, pi, xList=runif(n=10, ## And one with it.  
    min=0, max=pi));
```

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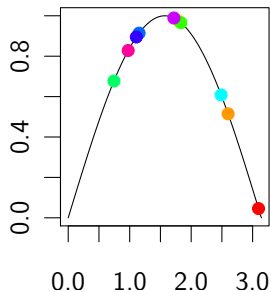
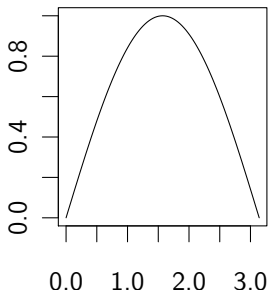
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>layout(matrix(c(1, 2), nrow=1));  
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>pointCurve(sin, 0, pi, xList=runif(n=10, ## And one with it.  
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■ TODO: Example needed