# Math 541 －Numerical Analysis <br> Lecture Notes－Introduction to Numerical Analysis 

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## Outline

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Contact Information, Office Hours Text \& Topics
Other Numerical Analysis Courses Grading
Expectations and Procedures

## Contact Information



## Professor Joseph Mahaffy

| Office | GMCS-593 |
| :--- | :--- |
| Email | jmahaffy@mail.sdsu.edu |
| Web | http://jmahaffy.sdsu.edu |
| Phone | $(619) 594-3743$ |
| Office Hours | MW: 12:00-13:50 in MLC <br> and by appointment |

## Basic Information: Text/Topics

Text:
Cleve Moler: Numerical Computing in Matlab
(1) Mathematical Preliminaries - Taylor's series
(2) MatLab Basics
(3) Error Analysis
(4) Zeros of Functions
(6) Numerical Integration - Quadrature
( Numerical Linear Algebra
(1) Interpolation - Splines
(8) Least Squares

## Other Numerical Analysis Courses

- Math 542: Numerical Solutions of Differential Equations
- Initial-Value Problems for ODEs
- Boundary Value Problems for ODEs
- Math 543: Numerical Matrix Analysis
- Iterative Techniques in Matrix Algebra
- Approximating Eigenvalues
- Math 693A: Advanced Numerical Analysis (Numerical Optimization)
- Numerical Solution of Nonlinear Systems of Equations
- Math 693B: Advanced Numerical Analysis (Numerics for PDEs)
- Numerical Solution of PDEs

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## Basic Information: Grading

## Approximate Grading

$$
\begin{array}{lr}
\hline \text { Homework, including WeBWorK* } & 45 \% \\
\text { Lab Report }^{+} & 5 \% \\
\text { Exams and Final }
\end{array}
$$

* Both theoretical and implementation (programming) MatLab will be the primary programming language.
+ Formal Lab Reports will be written on several applied problems.
$\times$ Likely to be 2 Midterms and Final with part being Takehome. Final: Monday, May 7, 10:30-12:30.


## Expectations and Procedures, I

- Most class attendance is OPTIONAL - Homework and announcements will be posted on the class web page. If/when you attend class:
- Please be on time.
- Please pay attention.
- Please turn off mobile phones.
- Please be courteous to other students and the instructor.
- Abide by university statutes, and all applicable local, state, and federal laws.

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## Expectations and Procedures, II

- Please, turn in assignments on time. (The instructor reserves the right not to accept late assignments.)
- The instructor will make special arrangements for students with documented learning disabilities and will try to make accommodations for other unforeseen circumstances, e.g. illness, personal/family crises, etc. in a way that is fair to all students enrolled in the class. Please contact the instructor EARLY regarding special circumstances.
- Students are expected and encouraged to ask questions in class!
- Students are expected and encouraged to to make use of office hours! If you cannot make it to the scheduled office hours: contact the instructor to schedule an appointment! SOSO

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## Expectations and Procedures, III

- Missed midterm exams: Don't miss exams! The instructor reserves the right to schedule make-up exams, make such exams oral presentation, and/or base the grade solely on other work (including the final exam).
- Missed final exam: Don't miss the final! Contact the instructor ASAP or a grade of incomplete or F will be assigned.
- Academic honesty: Submit your own work. Any cheating will be reported to University authorities and a ZERO will be given for that HW assignment or Exam.


## MatLab

- Students can obtain MatLab from ROHAN Academic Computing.
- Google SDSU MatLab or access http://wwwrohan.sdsu.edu/~download/matlab.html.
- MatLab and Maple can also be accessed in the Computer Labs GMCS 421, 422, and 425.
- You may also want to consider buying the student version of MatLab: http://www.mathworks.com/


## Math 541: Formal Prerequisites

Math 254 or Math 342A or AE 280

- These courses all have sections on basic Linear Algebra and assume knowledge of Calculus (especially Taylor's Theorem)

CS 107 or Math 242

- These courses introduce basic Computer Programming


## Math 541: Introduction - What we will learn

(1) Numerical tools for problem solving
(2) How to translate mathematical problems into MatLab code
(3) Error and convergence analysis

- Computational mathematics has errors
- Must understand sources of errors and improvement of algorithms
(4) How to implement Calculus on computers: Solve $f(x)=0$, Integration, ...
(5) Use MatLab to solve problems in Linear Algebra
(6) Work with data: Fitting with splines and least squares best fits


## Math 541: Introduction - Why???

Q: Why are numerical methods needed?

A: To accurately approximate the solutions of problems that cannot be solved exactly.

Q: What kind of applications can benefit from numerical studies?
A: Engineering, physics, chemistry, computer, biological and social sciences.

Image processing / computer vision, computer graphics (rendering, animation), climate modeling, weather predictions, "virtual" crash-testing of cars, medical imaging ( $\mathrm{CT}=$ Computed Tomography), AIDS research (virus decay vs. medication), financial math...

## Math 541: Introduction - Computing Efficiency

Numerical tools for problem solving:

- Computers are getting faster, but the computer's speed is only one (a big one for sure!) part of the overall performance for a computation...
- Computing speed depends on FLOPS (floating-point operations or number of additions and multiplications) and memory accesses. These are largely questions of computer architecture and won't be examined in this course much.
- Numerical Algorithms are the center of this course, and their efficiency affects performance.


## Research Problem from my Work

## Genetic Control by Repression

## Structure of the trp Operon



## Model for Conrol by Repression

- $x_{1}(t)$ is the concentration of mRNA
- $x_{2}(t)$ is the concentration of the tryptophan (endproduct)
- Endproduct inhibition or a negative feedback system can result in oscillatory behavior
- System of first order delay differential equations (DDE):

$$
\begin{aligned}
\frac{d x_{1}(t)}{d t} & =\frac{a_{1}}{1+k x_{2}^{n}(t-R)}-b_{1} x_{1}(t) \\
\frac{d x_{2}(t)}{d t} & =a_{2} x_{1}(t)-b_{2} x_{2}(t)
\end{aligned}
$$

- Solve numerically, such as MatLab's dde23.m delay differential equation solver


## Simulation of Repression Model

With $a_{1}=2, a_{2}=b_{1}=b_{2}=1, n=4$, and $R=2$, the model is simulated using MatLab's dde23.m


Math 542 studies the Runge-Kutta-Felberg method for numerically integrating ordinary differential equations, a related method

MatLab code available from Website.

## Equilibrium Analysis

- Qualitative analysis of a differential equation begins by finding all equilibria
- Equilibria solve the derivatives equal to zero

$$
\begin{array}{r}
\frac{a_{1}}{1+k \bar{x}_{2}^{n}}-b_{1} \bar{x}_{1}=0 \\
a_{2} \bar{x}_{1}-b_{2} \bar{x}_{2}=0
\end{array}
$$

- This is a system of nonlinear equations equal to zero
- This easily reduces to a nonlinear scalar equation,

$$
\frac{a_{1}}{1+k \bar{x}_{2}^{n}}-\frac{b_{1} b_{2}}{a_{2}} \bar{x}_{2}=0 \quad \text { with } \quad \bar{x}_{1}=\frac{b_{2}}{a_{2}} \bar{x}_{2}
$$

- This course numerically solves $f(x)=0$


## Characteristic Equation

- The characteristic equation is used to study the local (linear) behavior near an equilibrium.
- The characteristic equation for a DDE is found like ODEs (Math 537), but the result is an exponential polynomial with an infinite number of solutions:

$$
\left|\begin{array}{cc}
-b_{1}-\lambda & f^{\prime}\left(\bar{x}_{2}\right) e^{-\lambda R} \\
a_{2} & -b_{2}-\lambda
\end{array}\right|=0
$$

- This produces:

$$
\left(\lambda+b_{1}\right)\left(\lambda+b_{2}\right)-a_{2} f^{\prime}\left(\bar{x}_{2}\right) e^{-\lambda R}=0
$$

- Need to find complex solutions to this equation


## Characteristic Equation-Finding Eigenvalues

- The numerical simulation showed damped oscillations, which suggests that all eigenvalues have negative real part.
- The characteristic equation is studied by letting $\lambda=\mu+i \nu$, which gives

$$
\left(\mu+i \nu+b_{1}\right)\left(\mu+i \nu+b_{2}\right)-a_{2} f^{\prime}\left(\bar{x}_{2}\right) e^{-\mu R}(\cos (\nu R)-i \sin (\nu R))=0
$$

- This is solved numerically by simultaneously finding the real and imaginary parts equal to zero
- Solving two nonlinear equations in two unknowns uses vector and matrix methods to extend our technique for solving $f(x)=0$
- We may get to these algorithms in this class, but they certainly appear in Math 693A


## Characteristic Equation-Numerical Eigenvalues

- This course examines some of the basics behind the packages for solving these problems
- MatLab allows users to examine the coding algorithm, so knowledge from this course helps you better choose among different packages.
- We employed Maple's fsolve routine, and the first three pairs of eigenvalues with the largest imaginary parts are found:

$$
\begin{aligned}
& \lambda_{1,2}=-0.19423 \pm 0.98036 i \\
& \lambda_{3,4}=-0.55573 \pm 3.9550 i \\
& \lambda_{5,6}=-0.68084 \pm 7.07985 i
\end{aligned}
$$

- These eigenvalues show the damped oscillatory behavior and indicate the intervals between maxima are about $2 \pi$ time units.

Maple code available from Website.

