## Introduction

## Algebra and MATLAB review

Mathematical Tools for ITS (11MAI)
Mathematical tools, 2021

Jan Přikryl
11MAI, lecture 1
Monday September 20, 2021
version: 2021-09-23 17:34
Department of Applied Mathematics, CTU FTS

Introduction
Course Content
Topics to Review
Factoring Polynomials
Taylor Series
MATLAB project

Instructor: Dr.techn. Ing. Jan Prikryl
Contact: room F407 (Florenc building), e-mail prikryl@fd.cvut.cz
Office hours: only by previous appointment on Tuesday at Florenc bldg.
Website: http://zolotarev.fd.cvut.cz/mni/

Lectures and labs take part in all the weeks of the semester, meaning that there is not fixed programme for the last 2-3 weeks.

Course materials only in English, lectures in English as well as in Czech.

## Distance learning

See the website for actual distance learning info.

Total of $30(+5)$ points:

- 7 assignments (homeworks) $\times 3$ points each $\ldots 21$ points total
- individual semestral project ... 14 points

Minima: 9 points from homeworks, 4 from the project, 16 total

Assigned at the end of most of the labs:

- solved individually
- uploaded as PDF to the webserver
- solutions will be typeset, graphs will be vectors, not bitmaps, code will be documented
- a set of solutions that are identical will be graded as a single solution, and a corresponding fraction of points will be awarded to every submission in the set


## Project

Demonstrates the ability to use knowledge gained during the course. Consists of collected dataset, written report and corresponding MATLAB code.

The report will be typeset, graphs will be vectors, code will be documented.
Project topic has to be approved by the instructor by November 30. After that date you will be assigned a topic at the discretion of the instructor.

Evaluation criteria:

- $40 \%$ formal quality of the written report (structuring, citations, etc.)
- $60 \%$ clarity of the presentation
- scaled by the completeness factor $f \in[0,1]$

Introduction
Course Content
Topics to Review
Factoring Polynomials
Taylor Series
MATLAB project
a) Polynomials, Taylor polynomials, vector spaces, signals, and images
b) Series and Fourier series, Discrete Fourier Transform
c) Stationary and non-stationary signals, windowing and localization
d) Short Time Fourier Transform, analysis of a aon-stationary signal
e) Data processing review: linear and logistic regression, PCA, clustering
f) Introduction to numerical computing
g) Approximation and interpolation, numerical integration of ODEs
h) Numerical solution to traffic flow PDEs

## Course Prerequisites

Knowledge of the following is expected. Use the first lecture and lab to refresh your knowledge.

- Linear algebra, matrix and vector operations
- Derivatives and integration of functions
- Solution of ordinary differential equations
- Series, convergence, Taylor series
- Fundamentals of data processing: linear and logistic regression, regressor selection, regularization, logistic classification, discriminant analysis, principal component analysis, clustering
- Good command of Matlab


## Course Prerequisites

In the second lab, an obligatory review test takes place. I need you to know what shape you are in before we approach some trickier parts of the syllabus.

- Consists of theoretical (algebra, calculus) part and practical (MATLAB) part
- No minimum, only indicatory
- Does not contribute to the grading


## Further Reading - Signals \& Statistics

ב゙VUT

- Howell K.B.: Principles of Fourier Analysis, Chapman \& Hall/CRC, 2001
- Smith S.W.: The Scientist and Engineer's Guide to Digital Signal Processing, California Technical Publishing
- Broughton S.A., Bryan K.: Discrete Fourier Analysis and Wavelets, John Wiley \& Sons, 2009
- James G., Witten D., Hastie T., Tibshirani R.: An introduction to statistical learning. Springer, 2013.
- Friedman J., Hastie T., Tibshirani, R.: The elements of statistical learning. 2nd ed., Springer, 2009.


## Further Reading - Matlab \& Computing

ceske wysokf CESKE YYSOKE
UCENITECHINIGK vpraze

- MATLAB $\circledR$ The Language of Technical Computing, Getting Started with MATLAB, MathWorks, Inc.
- MATLAB ® Signal Processing Toolbox User's Guide, MathWorks, Inc.
- Heath M.T.: Scientific Computing: An Introductory Survey. SIAM, 2018.


# Introduction 

Course Content
Topics to Review
Factoring Polynomials
Taylor Series
MATLAB project

Algebra:

- vectors and matrices, vector and matrix calculus
- linear independence, basis, normality, orthonormality
- linear spaces and subspaces

Calculus:

- derivatives and antiderivatives of $x^{n}, \mathrm{e}^{a x}, \sin x, \cos x$
- calculus of composite functions (per-partes, l'Hospital rule, etc.)
- calculus of complex numbers
- solving ODE of up to second order


## Matlab

Matlab requirements:

- working with (normal and cell) vectors and matrices
- basic matrix and vector generating functions
- boolean indexing, find(), mean(),...
- plotting, subplots, annotating and saving figures
- reading and saving .mat, CSV and sound files
- M-files, and
- loops (i.e. for, while)
- conditionals (i.e. if, else)


## Introduction

Course Content
Topics to Review
Factoring Polynomials
Taylor Series
MATLAB project

## Fundamental Theorem of Algebra

## Theorem (Fundamental Theorem of Algebra)

Every nth-order polynomial possesses exactly $n$ complex roots
This is a very powerful algebraic tool. It says that given any polynomial

$$
\begin{aligned}
P_{n}(x) & =a_{n} x^{n}+a_{n-1} x^{n-1}+\cdots+a_{2} x^{2}+a_{1} x+a_{0} \\
& \equiv \sum_{i=0}^{n} a_{i} x^{i}
\end{aligned}
$$

## Fundamental Theorem of Algebra

we can always rewrite it as

$$
\begin{aligned}
P_{n}(x) & =a_{n}\left(x-x_{n}\right)\left(x-x_{n-1}\right) \cdots\left(x-x_{2}\right)\left(x-x_{1}\right) \\
& \equiv a_{n} \prod_{i=1}^{n}\left(x-x_{i}\right)
\end{aligned}
$$

where the points $x_{i}$ are the polynomial roots and they may be real or complex.

## Example (Roots)

Consider the second-order polynomial

$$
P_{2}(x)=x^{2}+7 x+12
$$

The polynomial is second-order because the highest power of $x$ is 2 and is also monic because its leading coefficient of $x^{2}$, is $a_{2}=1$.

By the fundamental theorem of algebra there are exactly two roots $x_{1}$ and $x_{2}$, and we can write

$$
P_{2}(x)=\left(x-x_{1}\right)\left(x-x_{2}\right) .
$$

Show that the roots are $x_{1}=-3$ and $x_{2}=-4$.

## Factoring Polynomials

The factored form of this simple example is

$$
P_{2}(x)=x^{2}+7 x+12=\left(x-x_{1}\right)\left(x-x_{2}\right)=(x+3)(x+4) .
$$

## Note

Polynomial factorization rewrites a monic $n$-th order polynomial as the product of $n$ first-order monic polynomials, each of which contributes one root (zero) to the product.

This factoring process is often used when working in digital signal processing (DSP).

Factoring can be also performed by MATLAB commands
p2 = $\left[\begin{array}{lll}1 & 7 & 12\end{array}\right]$; \% Polynomial given by its coefficients
roots(p2) \% Print out the roots

## Example

Find the factors of following polynomials:

- $P_{3}(x)=x^{3}+2 x^{2}+2 x+1$
- $P_{2}(x)=9 x^{2}+a^{2}$
- $P_{4}(x)=x^{4}-1$


## Factoring Polynomials

In order to study the roots of $P_{4}(x)=x^{4}-1$ using MATLAB, you can write a command creating the polynomial
$\mathrm{p} 4=\left[\begin{array}{lllll}1 & 0 & 0 & 0 & -1\end{array}\right]$;
followed by commands

```
roots(p4)
```

to list the roots, or

```
zplane(p4)
```

which gives you a plot of the roots in the
 complex domain.

Introduction
Course Content
Topics to Review
Factoring Polynomials
Taylor Series
MATLAB project

A Taylor series is a series expansion of a function about a point.

## Definition (Taylor series)

A one-dimensional Taylor series is an expansion of a real function $f(x)$, which is $(n+1)$-times differentiable, about a point $x=a$ is given by

$$
f(x)=f(a)+f^{\prime}(a)(x-a)+\frac{f^{\prime \prime}(a)}{2!}(x-a)^{2}+\frac{f^{\prime \prime \prime}(a)}{3!}(x-a)^{3}+\cdots+R_{n}(x)
$$

where

$$
R_{n}(x)=\frac{1}{(n+1)!} \int_{a}^{x} f^{(n+1)}(a)(x-a)^{n+1} .
$$

The last term $R_{n}(x)$ is called the remainder, or error term.

## Definition (Taylor polynomial of order $n$ )

A Taylor polynomial of order $n$ is a partial sum of a Taylor series (no reminder!):

$$
f(x) \approx f(a)+f^{\prime}(a)(x-a)+\frac{f^{\prime \prime}(a)}{2!}(x-a)^{2}+\frac{f^{\prime \prime \prime}(a)}{3!}(x-a)^{3} .
$$

Taylor polynomials are local approximations of a function, which become generally better as $n$ increases.

If $a=0$, the expansion is also known as a Maclaurin series

$$
f(x) \approx f(0)+f^{\prime}(0) x+\frac{f^{\prime \prime}(0)}{2!} x^{2}+\frac{f^{\prime \prime \prime}(0)}{3!} x^{3} .
$$

## Example (Terms of Taylor series)

Evaluate the first five Taylor series terms of $f(x)=1 /(1-x)$.

$$
\begin{aligned}
f(x) & =\frac{1}{1-x} & f(0) & =1 \\
f^{\prime}(x) & =\frac{1}{(1-x)^{2}} & f^{\prime}(0) & =1 \\
f^{\prime \prime}(x) & =\frac{2}{(1-x)^{3}} & f^{\prime \prime}(0) & =2 \\
f^{\prime \prime \prime}(x) & =\frac{2 \times 3}{(1-x)^{4}} & f^{\prime \prime \prime}(0) & =6 \\
f^{(4)}(x) & =\frac{6 \times 4}{(1-x)^{5}} & f^{(4)}(0) & =24
\end{aligned}
$$

## Example (Terms of Taylor series continued)

And as

$$
f(x) \approx f(0)+f^{\prime}(0) x+\frac{f^{\prime \prime}(0)}{2!} x^{2}+\frac{f^{\prime \prime \prime}(0)}{3!} x^{3}+\frac{f^{(4)}(0)}{4!} x^{4}
$$

we have

$$
\frac{1}{1-x} \approx 1+x+x^{2}+x^{3}+x^{4}
$$

Do you remember the formula for the sum of geometric series?
$\ldots$ e (Euler's number) and $\sqrt{-1}$.

$$
\begin{aligned}
\mathrm{i} & \equiv \sqrt{-1} \\
\mathrm{e} & \equiv \lim _{n \rightarrow \infty}\left(1+\frac{1}{n}\right)^{n}=2.71828182845905 \ldots
\end{aligned}
$$

The first, $\mathrm{i}=\sqrt{-1}$, is the basis for complex numbers, called imaginary unit.
The second, $e=2.718 \ldots$, is a transcendental real number defined by the above limit. It is the base of the natural logarithm.

## Back to Taylor Polynomials

Let us work a bit futher on polynomial expansion.

## Example (Harmonic and exponential approximations)

Use Taylor expansion to find approximations of the following functions up to 3 terms:

- $f(x)=\mathrm{e}^{x}$
- $f(x)=\sin x$
- $f(x)=\cos x$


## Taylor Polynomials

## Example (Harmonic and exponential approximations)

$$
\begin{gathered}
\mathrm{e}^{x}=1+\frac{x}{1!}+\frac{x^{2}}{2!}+\frac{x^{3}}{3!}+\cdots=\sum_{k=0}^{\infty} \frac{x^{k}}{k!} \\
\sin x=x-\frac{x^{3}}{3!}+\frac{x^{5}}{5!}-\cdots=\sum_{k=0}^{\infty}(-1)^{k} \frac{x^{2 k+1}}{(2 k+1)!} \\
\cos x=1-\frac{x^{2}}{2!}+\frac{x^{4}}{4!}-\cdots=\sum_{k=0}^{\infty}(-1)^{k} \frac{x^{2 k}}{(2 k)!}
\end{gathered}
$$

If we introduce imaginary unit ix in the exponential approximation above we obtain

$$
e^{i x}=1+\frac{i x}{1!}+\frac{(i x)^{2}}{2!}+\frac{(i x)^{3}}{3!}+\frac{(i x)^{4}}{4!}+\ldots
$$

## Role of imaginary exponent

For imaginary unit we have

$$
\begin{aligned}
& i^{1}=\sqrt{-1} \\
& i^{2}=-1 \\
& i^{3}=-i \\
& i^{4}=1
\end{aligned}
$$

so the exponential approximation takes the form

$$
e^{\mathrm{i} x}=1+\mathrm{i} \frac{x}{1!}-\frac{x^{2}}{2!}-\mathrm{i} \frac{x^{3}}{3!}+\frac{x^{4}}{4!}+\ldots
$$

## Euler identity

It can be regrouped and easily identified with

$$
e^{\mathrm{ix}}=1-\frac{x^{2}}{2!}+\frac{x^{4}}{4!}+\cdots++i \frac{x}{1!}-i \frac{x^{3}}{3!}+\cdots \equiv \cos x+i \sin x
$$

Definition (Euler's formula)
The result is the famous Euler's formula (1743 Opera Omnia, vol. 14, p. 142)

$$
e^{i x}=\cos x+i \sin x
$$

## Euler's identity

Euler's identity is the key to understanding the meaning of expressions like

$$
f\left(\omega_{k} T\right) \equiv \mathrm{e}^{\mathrm{i} \omega_{k} T}=\cos \left(\omega_{k} T\right)+\mathrm{i} \sin \left(\omega_{k} T\right)
$$

We will see later that such an expression defines a sampled complex sinusoid.

(150


# Introduction 

Course Content
Topics to Review
Factoring Polynomials
Taylor Series
MATLAB project

## MATLAB project

a) Using MATLAB plot the graphs of the sine and cosine functions, $\sin (\pi u)$ and $\cos (\pi u)$ within the interval $-2 \leq u \leq 2$.
b) Plot graphs of the functions $\sin (\pi u+\pi / 2)$ and $\cos (\pi u+\pi / 4)$ within the interval $-2 \leq u \leq 2$.
c) Plot graphs of the functions $\sin (3 \pi u)$ and $\sin (5 \pi u)$ within the interval $-2 \leq u \leq 2$.
d) Display axes, add legends to all graphs.
e) Save every output as a PNG, EPS, and Windows EMF file.




## Homework 1 - Factoring polynomials

a) Derive the formulae for factoring the following polynomials for arbitrary $n \in \mathbb{N}$ :

$$
\begin{aligned}
P_{2 n}(x) & =x^{2 n} \pm 1 \\
P_{2 n+1}(x) & =x^{2 n+1} \pm 1
\end{aligned}
$$

b) Check your results using MATLAB library function roots () for finding the roots of a polynomial.
c) Plot the roots of polynomials of degree $2 n=16$ and $2 n=32$ using MATLAB library function zplane().
d) Follow the symmetrical properties of the roots. Report on what do you observe.
e) Deliver your results by Friday, Ocober 82021 to the web page http://zolotarev.fd.cvut.cz/mni.

## Homework rules

Solution report should be formally correct (structuring, grammar).
Only .pdf files are acceptable. Handwritten solutions and .doc and .docx files will not be accepted.

Solutions written in $T_{E X}$ (using LyX, Overleaf, whatever) may receive small bonification.

