

# Analysis of 3D Shapes (IN2238)

Frank R. Schmidt  
Matthias Vestner

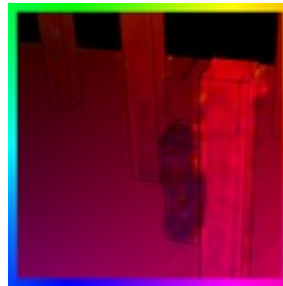
Summer Semester 2016



**We are always looking for master and bachelor students!**



3D Reconstruction



Optical Flow



Shape Analysis



Robot Vision



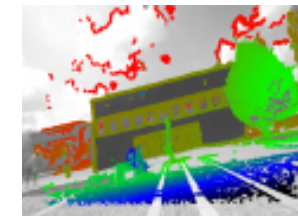
RGB-D Vision



Image Segmentation



Convex Relaxation



Visual SLAM

Please talk to the appointed contact person directly.



Schedule

Course Material

Shape



# 1. Introduction



Schedule

Course Material

Shape



# Schedule

The lecture **Analysis of Three-Dimensional Shapes** will be organized as following:

- **Monday Lecture:** 10-11 and 11-12 in Room 02.09.023
- **Tuesday Lecture:** 10-11 and 11-12 in Room 02.09.023
- **Wednesday Tutorial:** 14-16 in Room 02.09.023

The tutorial combines theoretical and programming assignments:

- **Assignment Distribution:** Tuesday 11:00-11:15 in Room 02.09.023
- **Theoretical Assignment Due:** Tuesday 23:59 per email
- **Assignment Presentation:** Wednesday 14-16 in Room 02.09.023



## April 2016

Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Sunday
				1	2	3
4	5	6	7	8	9	10
11	12	13	14	15	16	17
18 Lecture 1	19 Lecture 2	20 Matlab	21	22	23	24
25 Lecture 3	26 Lecture 4	27 Tutorial 1	28	29	30	



May 2016						
Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Sunday
						1
2 Lecture 5	3 Lecture 6	4 Tutorial 2	5	6	7	8
9 Lecture 7	10 SVV	11 Tutorial 3	12	13	14	15
16	17	18	19	20	21	22
23 Lecture 8	24 Lecture 9	25 Tutorial 4	26	27	28	29
30 Lecture 10	31 Lecture 11					



June 2016						
Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Sunday
		1 Tutorial 5	2	3	4	5
6 Lecture 12	7 Lecture 13	8 Tutorial 6	9	10	11	12
13 Lecture 14	14 Lecture 15	15 Tutorial 7	16	17	18	19
20 Lecture 16	21 Lecture 17	22 Tutorial 8	23	24	25	26
27 Lecture 18	28 Lecture 19	29 Tutorial 9	30			





## July 2016

Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Sunday
				1	2	3
4 Lecture 20	5 Lecture 21	6	7	8	9	10
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	31

Requirements for being admitted to the exam:

- **Registration:** Students need to be registered prior to the exam: via TUM online.
- **Exam:** In the week of July, 11<sup>th</sup> – 15<sup>th</sup>.

Participation at the tutorial:

- **Not mandatory, but highly recommended:**  
Theoretical assignments will help to understand the topics of the lecture.  
Programming assignments will help to apply the theory to practical problems.
- **Bonus:** Active students who solve 60% of the assignments earn a bonus.
- **Exam:** If one receives a mark between 1.3 and 4.0 in the exam, the mark will be improved by 0.3 resp. 0.4. Marks of 1.0 or 5.0 cannot be improved.

To achieve the bonus, the following requirements have to be fulfilled:

## Theory

- 60% of all theoretical assignments have to be solved.  
(PDF-Submissions (using  $\text{\LaTeX}$ ) happen only online via email)
- At least one theoretical exercise has to be presented in front of the class.

## Programming

- 60% of all programming assignments have to be presented during the tutorial.

To promote team work, we advocate to form groups of **two** or **three** students in order to solve and submit the assignments.

## Lecturers



Dr. Frank R. Schmidt



Matthias Vestner

## Teaching Assistant



Zorah Lähler

Please do not hesitate to contact us in order to set up an appointment:

- `f.schmidt@in.tum.de`
- `matthias.vestner@in.tum.de`
- `laehner@in.tum.de`



Schedule

Course Material

Shape



# Course Material

On the internal site of the course page you have access to extra course material:  
[https://vision.in.tum.de/teaching/ss2016/shape\\_2238](https://vision.in.tum.de/teaching/ss2016/shape_2238)

**Password** Sh4p3

- Printer friendly slides for each lecture (Available prior to the lecture)
- Assignment Sheets (Available after the Tuesday lecture)
- Solution Sheets (Available after the Wednesday tutorial)

**The course page will also be used for extra announcements.**



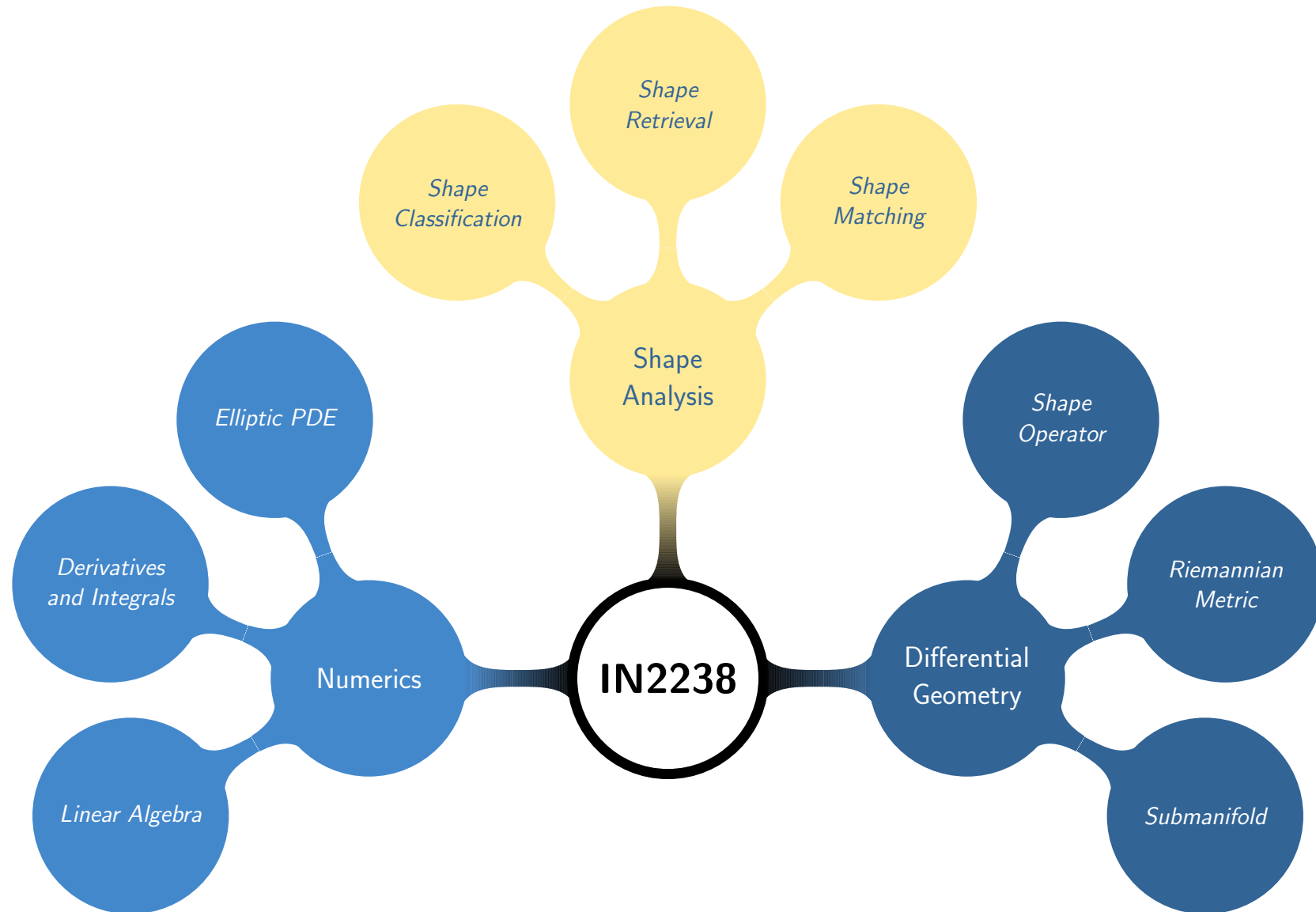
# Topics of the Lecture



Schedule

Course Material

Shape





Schedule

Course Material

Shape



# Shape



# What is a Shape?



Cave Painting



Paper Cutting

- A **shape** describes the geometry of an object without relying on a specific location or orientation of this object, *i.e.*,  
*An egg remains an egg, no matter where we put it on a table.*
- A shape should reflect the human perception of objects:  
*The whole is more than the sum of its parts.*



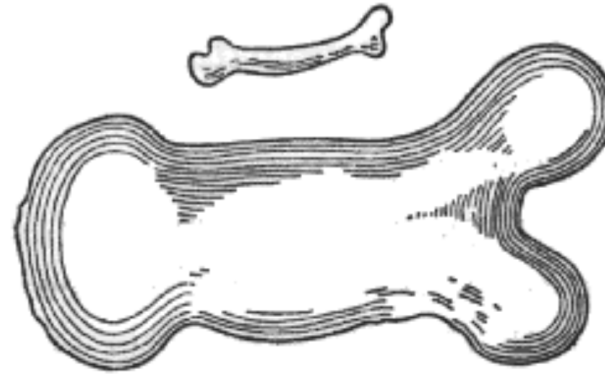
# What is a Shape?



Schedule

Course Material

Shape



Source: Galileo, 1638

**Definition 1** (Kendall, 1977). **Shape** is all the *geometrical information* that remains when *location, scale and rotational effects* are filtered out.

In other words two 3D-objects  $O_1, O_2 \subset \mathbb{R}^3$  are of the same shape if we can find a rotation  $R \in \text{SO}(3)$ , a translation  $T \in \mathbb{R}^3$  and a scaling factor  $\sigma \in \mathbb{R}_+$  such that

$$x \in O_1 \quad \Leftrightarrow \quad R \cdot (\sigma x) + T \in O_2$$



Note that the above mentioned relation between objects defines an **equivalence relation**:

$$O_1 \sim O_2 \quad :\Leftrightarrow \quad [\exists(R, T, \sigma) \in \text{SO}(3) \times \mathbb{R}^3 \times \mathbb{R}_+ : x \in O_1 \Leftrightarrow R \cdot (\sigma x) + T \in O_2]$$

One can easily show that the following holds:

$O_1 \sim O_1$			(Reflexivity)
$O_1 \sim O_2$	$\Leftrightarrow$	$O_2 \sim O_1$	(Symmetry)
$O_1 \sim O_2, O_2 \sim O_3$	$\Rightarrow$	$O_1 \sim O_3$	(Transitivity)

Every equivalence relation defines an equivalence class of equivalent objects. The equivalence class  $[O] := \{O' \subset \mathbb{R}^3 \mid O \sim O'\}$  of an object  $O \subset \mathbb{R}^3$  is the **shape** of this object.

In some applications, we like to differentiate between objects of different sizes. Analogously, we can define the **Shape-and-Scale equivalence relation**:

$$O_1 \sim O_2 \quad :\Leftrightarrow \quad [\exists (R, T) \in \text{SO}(3) \times \mathbb{R}^3 : x \in O_1 \Leftrightarrow R \cdot x + T \in O_2]$$

The equivalence class  $[O] := \{O' \subset \mathbb{R}^3 \mid O \sim O'\}$  of an object  $O \subset \mathbb{R}^3$  is the **shape-and-scale** of this object.

Some authors call also the shape-and-scale of an object their shape.

In some applications, we also like to extend the shape equivalence relation in order to be invariant with respect to different “poses”, *i.e.*:

*A horse is a horse, no matter whether it is standing or galloping.*

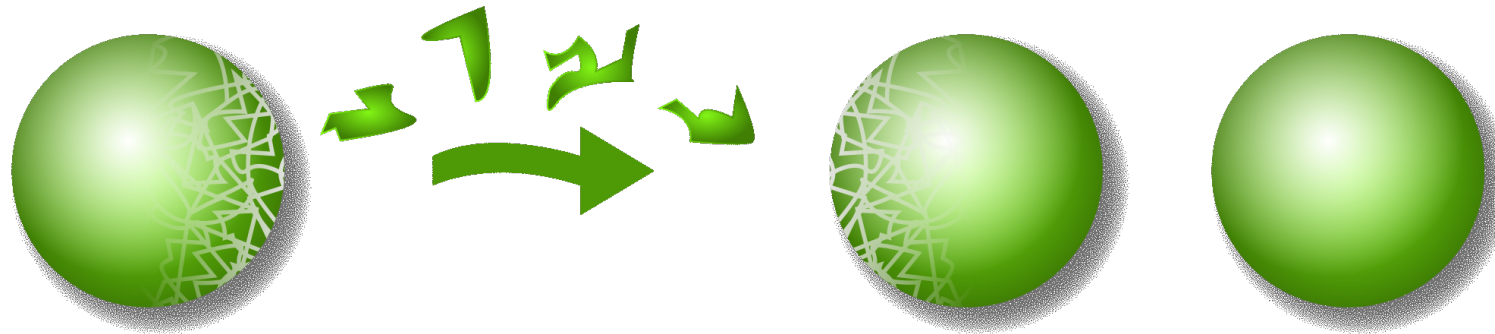
# Banach-Tarski Paradox



Schedule

Course Material

Shape



Source: Wikimedia.org

**Theorem 1** (Banach and Tarski, 1924). *The 3D ball  $B = \{x \in \mathbb{R}^3 \mid \langle x, x \rangle \leq 1\}$  can be partitioned into finite many sets  $A_i$ , i.e.,  $B = \bigsqcup_{i=1}^k A_i$ , which can be rotated to form two copies of  $B$ .*

The proof of this paradox uses a heavy machinery based on set theory. In particular the so called *Axiom of Choice* is used to create the sets  $A_i$ .

Interestingly, we cannot measure the volume of any of the sets  $A_i$ . To avoid any similar problem, we are only interested in objects  $O \subset \mathbb{R}^n$  that are open.

**Definition 2** (Open Set). A set  $O \subset \mathbb{R}^n$  is called **open** iff

$$x \in O \quad \Rightarrow \quad \exists \varepsilon > 0 : B_\varepsilon(x) \subset O,$$

where  $B_\varepsilon(x) := \{y \in \mathbb{R}^n \mid \|x - y\| < \varepsilon\}$  is a ball of radius  $\varepsilon$  centered at  $x \in \mathbb{R}^n$ .

**Definition 3** (Relatively Open Set). Given  $X \subset \mathbb{R}^n$ , we call  $O \subset X$  **relatively open with respect to  $X$**  iff there exists an open set  $\hat{O} \subset \mathbb{R}^n$  such that

$$O = \hat{O} \cap X$$

**Definition 4** (Topology). Given a subset  $X \subset \mathbb{R}^n$ , we call  $\mathcal{T}(X) := \{O \subset X \mid O \text{ is open with respect to } X\}$  its **topology**.

**Definition 5** (Boundary). Given a set  $X \subset \mathbb{R}^n$ , we call

$$\partial X := \{x \in \mathbb{R}^n \mid \forall O \in \mathcal{T}(\mathbb{R}^n) : O \cap X \neq \emptyset \wedge O \setminus X \neq \emptyset\}$$

its **boundary**.

- The boundary of  $\mathbb{R}^n$  is  $\partial\mathbb{R}^n = \emptyset$ .
- The boundary of the closed interval  $[0, 1]$  is  $\partial[0, 1] = \{0, 1\}$ .
- The boundary of  $[0, 1[$  is  $\partial[0, 1[ = \{0, 1\}$ .
- The boundary of  $]0, 1[$  is  $\partial]0, 1[ = \{0, 1\}$ .
- The boundary of the ball  $B^n = \{x \in \mathbb{R}^n \mid \langle x, x \rangle \leq 1\}$  is  $\partial B = \mathbb{S}^{n-1} = \{x \in \mathbb{R}^n \mid \langle x, x \rangle = 1\}$ .

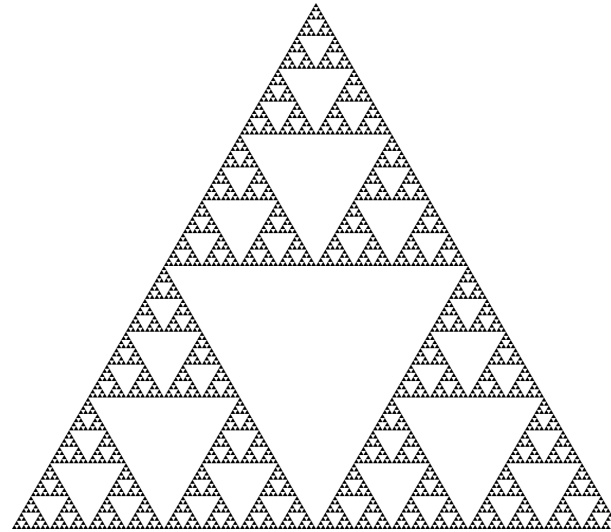
# What is an Object?



Schedule

Course Material

Shape



Source: Wikimedia.org

To define what a shape is, we first need to define an **object**.

**Definition 6** (Informal Definition). An **object** of dimension  $d$  is an open subset  $X \subset \mathbb{R}^d$  such that  $\dim \partial X = d - 1$ .

Note that we exclude sets whose boundaries are **fractals**. Instead, we want to have a boundary with the well-defined dimension  $d - 1$ .



## Shapes

- Galileo, *Discorsi e dimostrazioni matematiche, informo a due nuove scienze attenti alla meccanica i movimenti locali*, 1638, appresso gli Elsvirii; Opere VIII. (2)
- Kendall, *The diffusion of shape*, 1977, *Advances in Applied Probabilities* (9), 428–430.
- Dryden and Mardia, *Statistical Shape Analysis*, 1998, Wiley, 376 pages.

## Set Theoretical Results

- Banach and Tarski, *Sur la décomposition des ensembles de points en parties respectivement congruentes*, 1924, *Fundamenta Mathematica* (6), 244–277.
- Carathéodory, *Vorlesungen über reelle Funktionen*, 1918, B. G. Teubner, 704 pages.