# Introduction to Curved Spaces (Manifolds) Lecture 1: Smooth manifolds, curves and tangent spaces

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Numerical Calculus class (2018)





### Outline

- 1 Smooth manifolds
- 2 Smooth curves on manifolds
- 3 Tangent vectors, tangent spaces

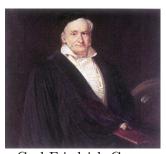




## History



Bernhard Riemann



Carl Friedrich Gauss



Albert Einstein

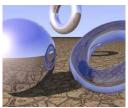
And Ricci-Curbastro, Levi-Civita, Bianchi, Codazzi, Calabi, Chen, Yau, Nash, Perelman, ...



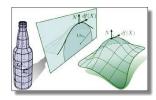


## Smooth manifolds Examples

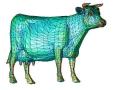
#### The basic ingredients are $smooth\ manifolds$



Sphere, Torus



Abstract manifold



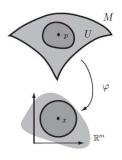
Data manifold



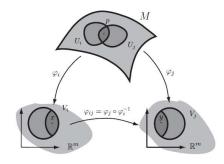


## Smooth manifolds Intuitive definition

The prominent feature of *smooth manifolds* is that it is a dense collection of *abstract objects* to which we can attach labels (real coordinates).



Coordinate chart



Coordinate patches

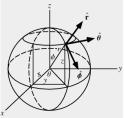




Example: 3D sphere

A point on the 3-dimensional (ordinary) sphere may be parameterized as follows:

$$x = \begin{bmatrix} \cos \theta \sin \varphi \\ \sin \theta \sin \varphi \\ \cos \varphi \end{bmatrix}$$



for 
$$0 \le \theta < 2\pi$$
 and  $0 \le \varphi \le \pi$ .

**Note:** This parameterization breaks down at the *north pole* and *south pole* where the azimuth angle  $\theta$  is not determined uniquely.



Extrinsic coordinates

The coordinates  $\theta$  and  $\varphi$  are termed extrinsic coordinates as they make reference to a subset of an external coordinate space (namely,  $\mathbb{R}^2$ )





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Extrinsic coordinates seem natural and are useful to accomplish general/theoretical calculations, to prove theorems and to illustrate general features of manifolds. The minimum number of extrinsic coordinates needed to individuate points on a manifold is called dimension of the manifold





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Extrinsic coordinates are certainly useful to perform practical calculations on 2- or 3- or 4-dimensional manifolds (e.g., ordinary curves and surfaces, space-time theory)





Extrinsic coordinates

Once a local coordinate system is established, all is possible on a manifold, for example, define a real-valued function on a manifold  ${\cal M}$ 

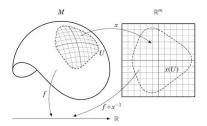




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 $p \in M$  and  $f: M \to \mathbb{R}^m$ How do we define f(p)?  $f(p) \stackrel{\text{def}}{=} f(x^{-1}(y)) = (f \circ x^{-1})(y)$  $y \in \mathbb{R}^m$  $f \circ x^{-1}$  is f expressed in local coordinates



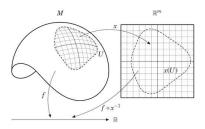




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Message: There follows the extrinsic calculus on manifolds





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For example, the sphere  $S^{24}$  embeds easily into  $\mathbb{R}^{25}$  and each point  $x \in S^{25}$  may be represented as a 25-components vector  $x \in \mathbb{R}^{25}$  such that  $\sum_{i=1}^{25} x_i^2 = x^T x = 1$ 





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Clearly, one of the 25 coordinates is redundant. The  $x_i$ 's are termed intrinsic coordinates induced by the embedding





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• Hyper-rotation group:

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• Symmetric, positive-definite matrices:

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The size n ranges from some units to some hundreds, depending on the application





Intrinsic coordinates are redundant compared with extrinsic coordinates

For example, a  $n \times n$  symmetric, positive-definite matrix has  $n^2$  entries (intrinsic coordinates) but only  $\frac{n(n+1)}{2}$  independent entries (extrinsic coordinates)





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Message: As long as computer-based representation/implementation is concerned, redundancy is not a problem

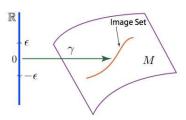




## Smooth manifolds Smooth curves on manifolds

What is a *smooth curve* on a smooth manifold?

A smooth curve on a manifold M is a regular map  $\gamma: [-\epsilon, \ \epsilon] \to M$ 



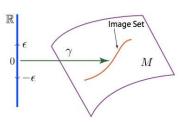




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Message: Curves are fairly simple objects, nevertheless, they are overly important! Curves even allow measuring distances on curved spaces!





Examples of smooth curves on manifolds

Examples of curves on the real hypersphere  $S^{n-1}$ :





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### Examples of curves on the real hypersphere $S^{n-1}$ :

 $\gamma(t) = \frac{x+tv}{\sqrt{(x+tv)^T(x+tv)}}$  is a curve on  $S^{n-1}$  for  $t \in [-\epsilon, \epsilon], x, v \in \mathbb{R}^n$  arbitrary. It holds  $\gamma(0) = x/\|x\|$ .

Hint: To verify it, try computing  $\gamma^T(t)\gamma(t)$  and show that it equals 1 for every t.





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 $\gamma(t) = x \cos(\sqrt{v^T v}t) + \frac{v}{\sqrt{v^T v}} \sin(\sqrt{v^T v}t)$  is a curve on  $S^{n-1}$  for  $t \in [-\epsilon, \ \epsilon]$  as long as we choose  $x \in S^{n-1}$  and  $v^T x = 0$ . It holds  $\gamma(0) = x$ .

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Did we use extrinsic or intrinsic coordinates?



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$$\gamma(t) = \begin{bmatrix} \cos(bt) & \sin(bt) \\ -\sin(bt) & \cos(bt) \end{bmatrix} \text{ is a curve on } SO(2) \text{ for } t \in [-\epsilon, \ \epsilon],$$

$$b \in \mathbb{R} \text{ arbitrary. It holds } \gamma(0) = I_2.$$

Hint: To verify it, try computing  $\gamma^T(t)\gamma(t)$  and show that it equals the identity matrix  $I_2$  for every t and that  $\det(\gamma(t)) = 1$ .





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$$\gamma(t) = X(I + tH)(I - tH)^{-1}$$
 is a curve on  $SO(n)$  for  $t \in [-\epsilon, \epsilon]$  as long as we choose  $X \in SO(n)$  and  $H^T = -H$ .





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 and  $ac - b^2 > 0$ . It holds  $\gamma(0) = 0_2$ .

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$$\gamma(t) = X + t^2 H$$
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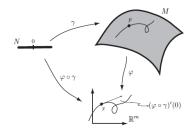




# Smooth manifolds Tangent vectors

Tangent vectors: Definition by extrinsic coordinates

Tangent to a curve  $\gamma$  on a manifold M at a point p (in extrinsic coordinates)



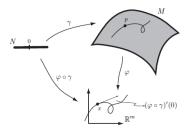




Tangent vectors

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Let  $\gamma: [-\varepsilon, \varepsilon] \to M$  and  $\varphi: U \to \mathbb{R}^m$ . Note that  $U \supset \gamma([-\varepsilon, \varepsilon])$  and that  $\gamma(0) = p$  and  $\varphi(p) = x$ . Tangent vector at  $p: v = \frac{d\varphi(\gamma(t))}{dt}$ 

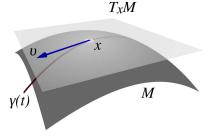




# Smooth manifolds Tangent vectors

Tangent vectors in intrinsic coordinates

Tangent to a curve  $\gamma$  on a manifold M at a point x (in intrinsic coordinates)



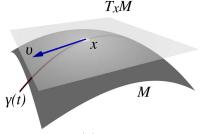




#### Tangent vectors

Tangent vectors in intrinsic coordinates

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Let 
$$\gamma: [-\varepsilon, \varepsilon] \to M$$
 embedded. Note that  $\gamma(0) = x$   
Tangent vector at  $x: v = \frac{d\gamma(t)}{dt}\Big|_{t=0}$ 

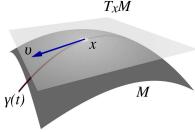




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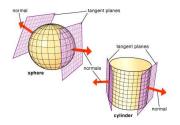
The set of all tangent vectors at  $x \in M$  forms a linear space  $T_xM$  termed tangent space





#### Tangent spaces

To each point of a nonlinear manifold may be attached a linear structure termed tangent space



The disjoint union of all tangent spaces forms the tangent bundle  $TM = \{(x, v) \mid x \in M, v \in T_xM\}$ 

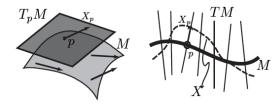




Generalization: Vector fields

Example: To a manifold may be attached a smooth vector field

A smooth vector field is denoted as  $X: M \to TM$ 







Examples of tangent spaces

Let us calculate the structure of tangent spaces to hyper-spheres  $S^{n-1}$  in intrinsic coordinates





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#### Basic ingredients:

A point  $x \in S^{n-1}$ 

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#### Main idea:

No need to choose any specific curve  $\gamma$ , just recall that for  $\gamma$  to belong entirely to the hyper-sphere, it is necessary that  $\gamma^T(t)\gamma(t)=1$  for any  $t\in [-\varepsilon,\ \varepsilon]$ 

Derive hand-by-hand with respect to the parameter t:

$$\dot{\gamma}^T(t)\gamma(t) + \gamma^{T}(t)\dot{\gamma}(t) = 0$$





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Let us calculate the structure of tangent spaces to hyper-spheres  $S^{n-1}$  in intrinsic coordinates

### Calculations continued:

$$2\dot{\gamma}^T(t)\gamma(t) = 0$$

Now set t = 0 (we want to know the tangent space at x)

Call 
$$v = \dot{\gamma}(0)$$

Gives 
$$v^T x = 0$$



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#### Conclusion:

The sought tangent space has structure:

$$T_x S^{n-1} = \{ v \in \mathbb{R}^n \mid v^T x = 0 \}$$

x is a radial vector, normal to the surface of the sphere v is any orthogonal vector to x



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Now set t = 0 (we want to know the tangent space at X)  $\dot{\gamma}^T(0)\gamma(0) + \gamma^T(0)\dot{\gamma}(0) = 0 \text{ Call } V = \dot{\gamma}(0)$ Gives  $V^TX + X^TV = 0$ 

Gives 
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$$T_X SO(n) = \{ V \in \mathbb{R}^{n \times n} \mid V^T X + X^T V = 0 \}$$

Example:  $T_ISO(n) = \{H \in \mathbb{R}^{n \times n} \mid H^T + H = 0\} = \text{set of skew-}$ 

symmetric matrices





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Derive hand-by-hand with respect to the parameter t:

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Gives  $\dot{\gamma}^T(0) = \dot{\gamma}(0)$ 

Call  $V = \dot{\gamma}(0)$ 

Gives  $V^T = V$ 

The positive-definiteness constraint does not reflect in any condition. Take the case  $\gamma(t) = \begin{bmatrix} x_{11}(t) & 0 \\ 0 & x_{22}(t) \end{bmatrix}$ : Although  $x_{11}(t), x_{22}(t) > 0$ , the signs of  $\dot{x}_{11}(t), \dot{x}_{22}(t)$  are undetermined





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#### Conclusion:

The sought tangent space has structure:

$$T_X S^+(n) = \{ V \in \mathbb{R}^{n \times n} \mid V^T - V = 0 \} = \text{set of symmetric matrices}$$



#### Thanks

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