# Machine learning based study of mirages

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#### In collaboration with:

Balázs Bámer<sup>3</sup> Gergely Gábor Barnaföldi<sup>2</sup>

#### **Institutes:**

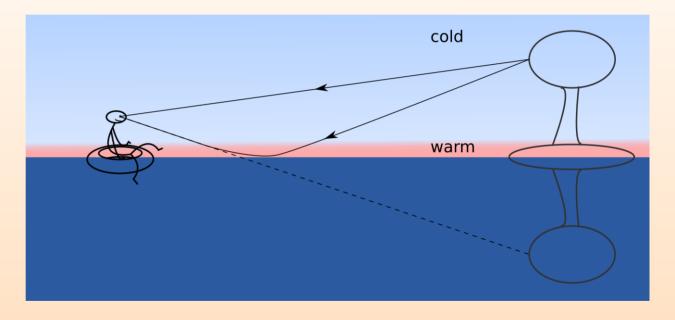
<sup>1</sup>HUN-REN Wigner Research Centre for Physics (Hungary) <sup>2</sup>Eötvös Loránd University (Hungary) <sup>3</sup>Vienna University of Technology (Austria)







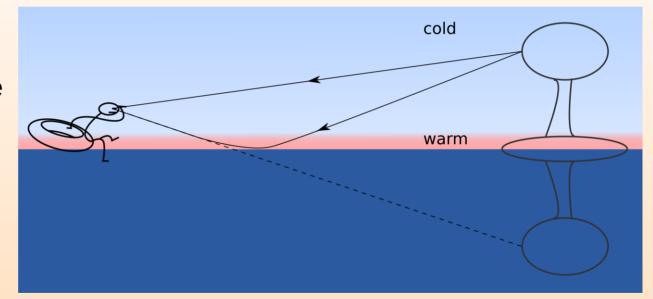
Light rays from an object arrive to your eyes on multiple paths.



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#### **Ingredients:**

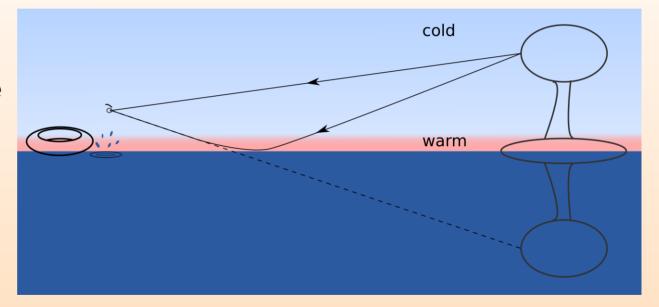
 Temperature difference between surface and air



Light rays from an object arrive to your eyes on multiple paths.

#### **Ingredients:**

- Temperature difference between surface and air
- Good visibility conditions



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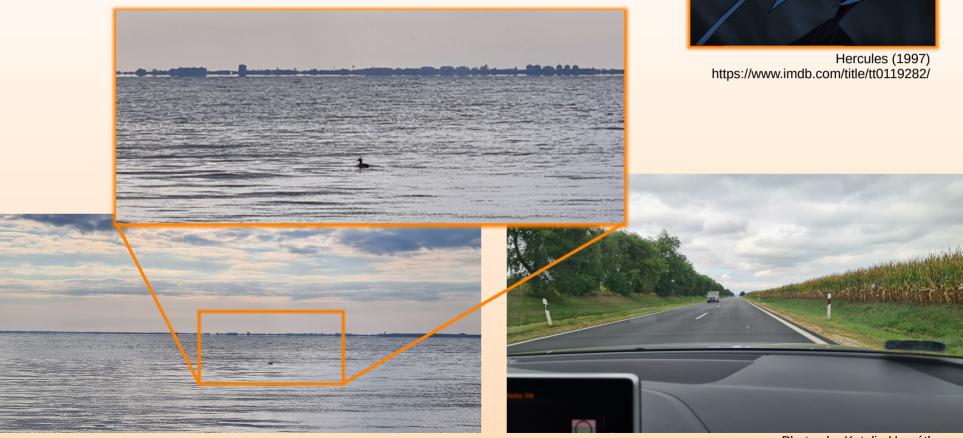
#### **Directions:**

Keep an eye out for it...

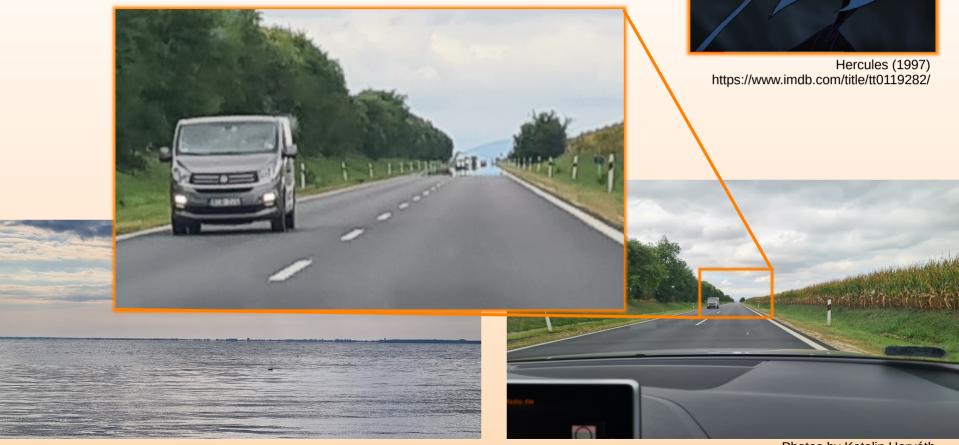


A. Horváth, B. Bámer, G. G. Barnaföldi: "Numerical simulation of mirages above water bodies", American Journal of Physics (December 2023) https://doi.org/10.1119/5.0111635 DOI: 10.1119/5.0111635

### Keep an eye out



### Keep an eye out



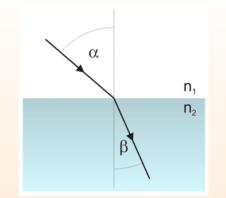
# Refraction of light

A mirage is caused by the refraction of light in a medium with a **changing refractive index**.

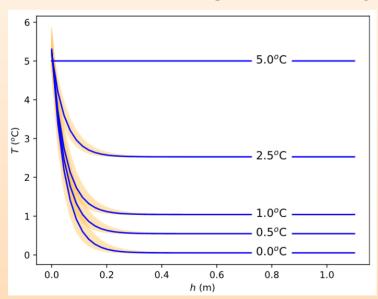
Snell's law:

$$\frac{\sin \alpha}{\sin \beta} = \frac{c_1}{c_2} = \frac{n_2}{n_1} = n_{21}$$

n refractive indexc speed of light in medium



The refractive index **depends** mainly **on temperature**.



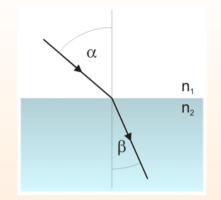
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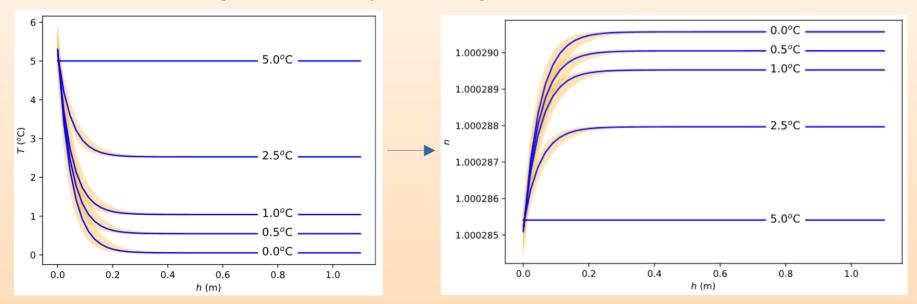
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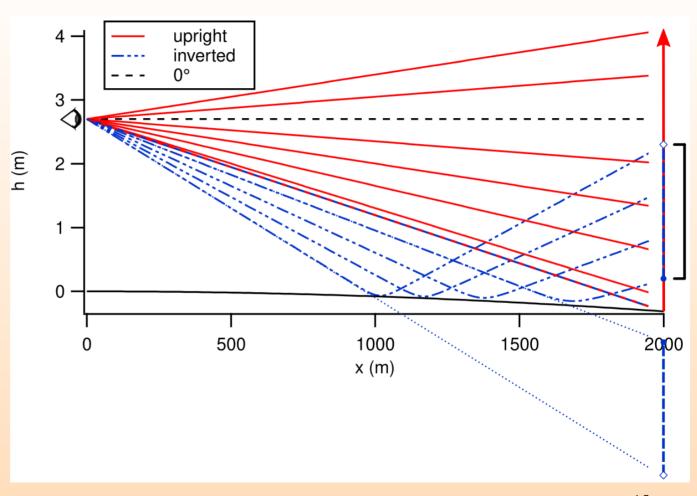
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### Ray tracing

EYE → OBJECT

Calculate **change in angle** at points along the path until the ray hits the object.

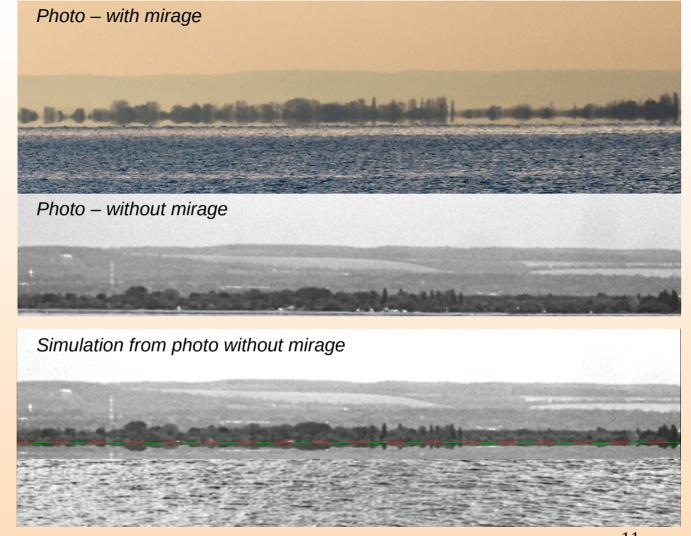


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- Set the temperature difference between air and surface
- Calculate what you would see

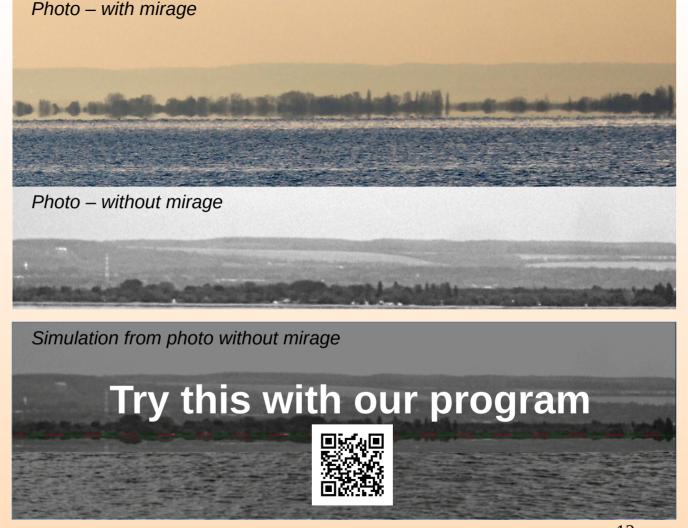


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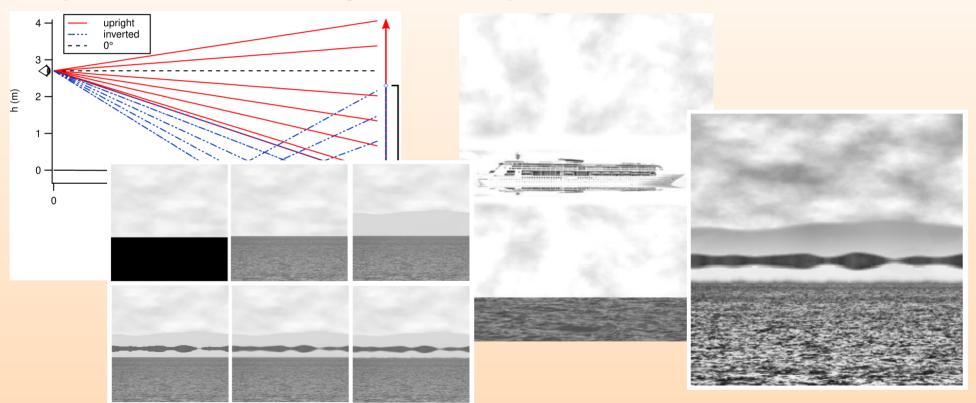
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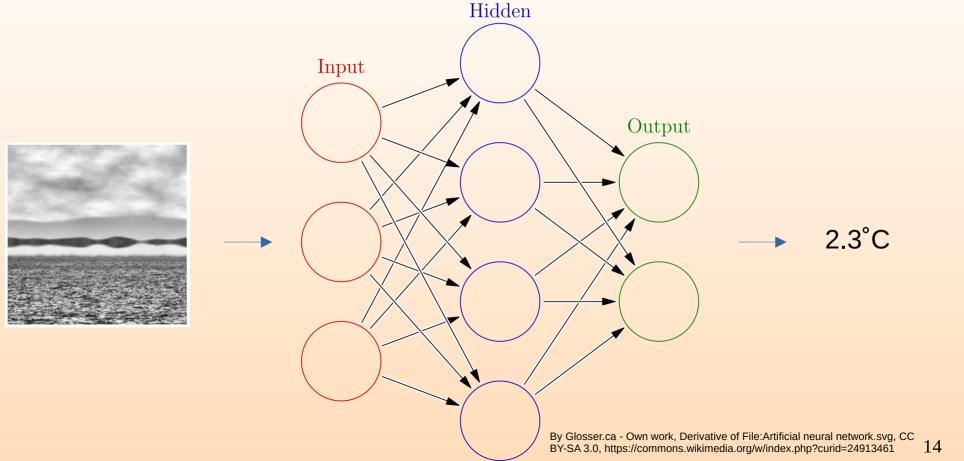
### For what can you use this?

We generated artificial images with mirages to teach a neural network.

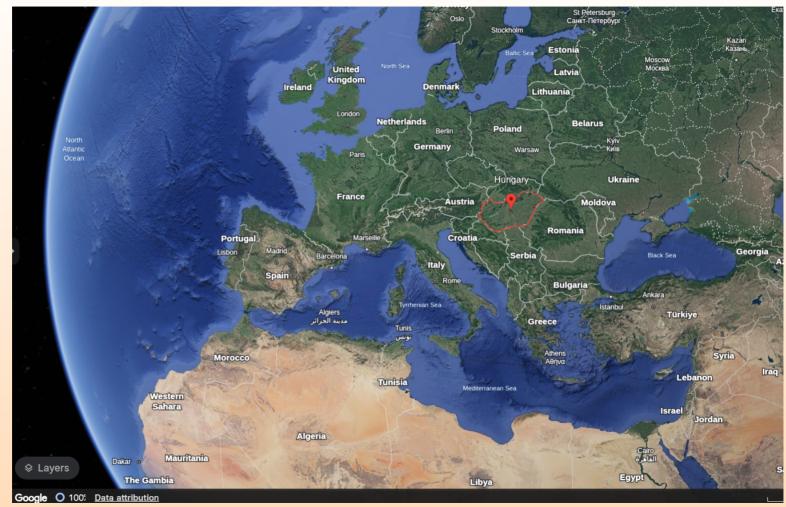


#### **Neural network**

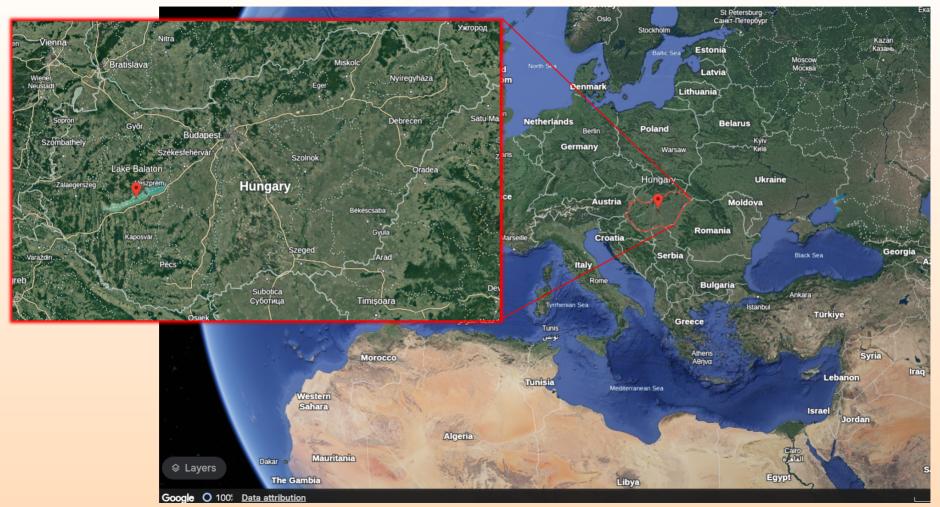
We used the model to **predict** the **temperature difference** between the water and air.



#### We tried if it works



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**Measured** temperature difference: 3.2°C = 37.7°F **Predicted:** 3.5°C = 38.3°F

#### In a nutshell

- Mirages are caused by a temperature difference between surface and air
- Refractive index of air is almost linearly proportional to temperature
- Due to the refraction of light, rays from a point reach our eyes on multiple paths
- Simulation of mirages utilizing ray tracing
- Generating artificial images with mirages
- Teaching a neural network to predict temperature difference between surface and air from real photos

#### To learn more, check out our article:

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