

Differentiable Ray Tracing for Telecommunications

Jérôme Eertmans - July 17th, Siegen

About the author

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Profile:

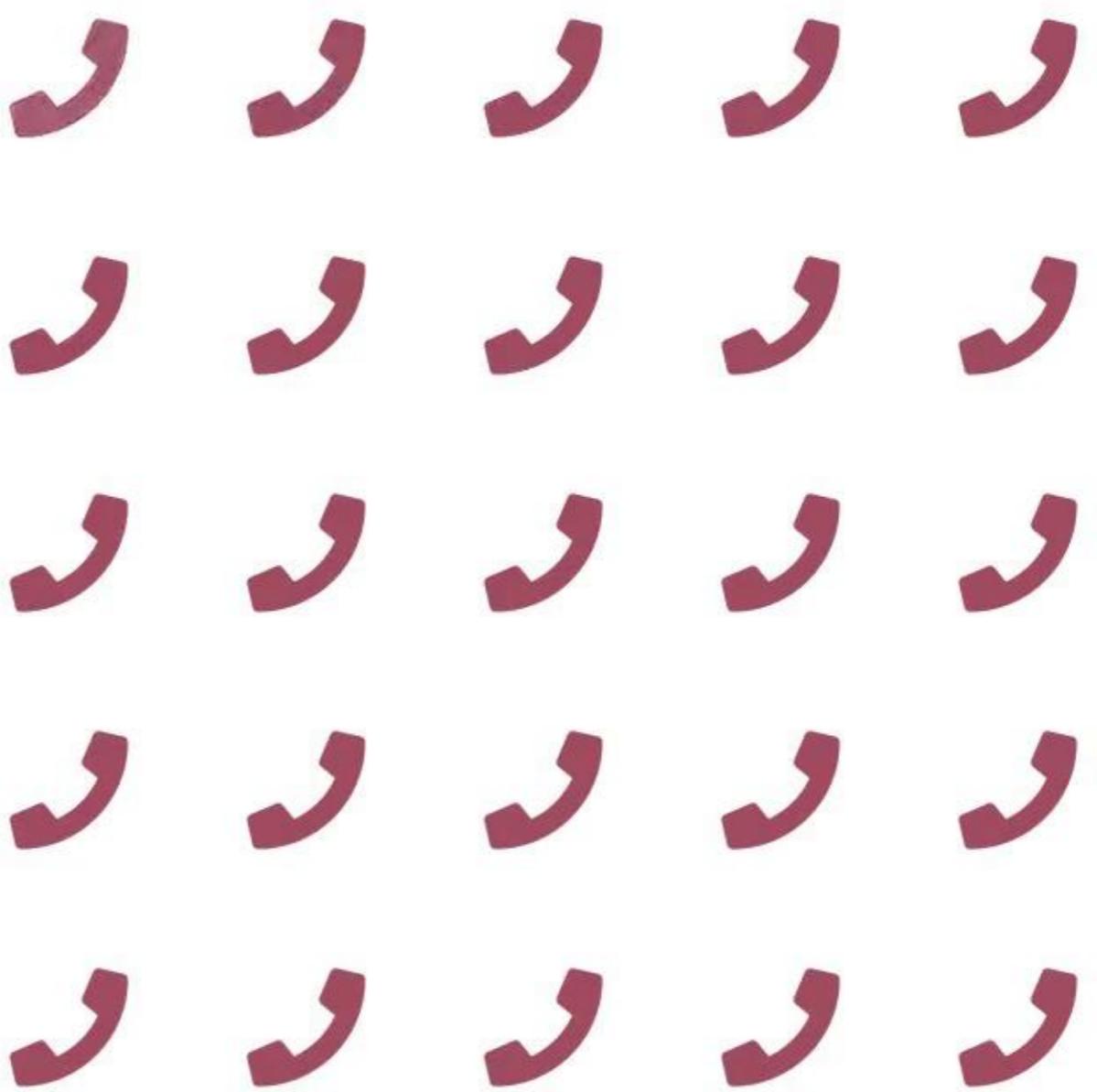
- PhD student at UCLouvain since 09/2021;
- Electromechanical Engineer in mechatronics;
- introduced to Ray Tracing (RT) during a student job.

Interests:

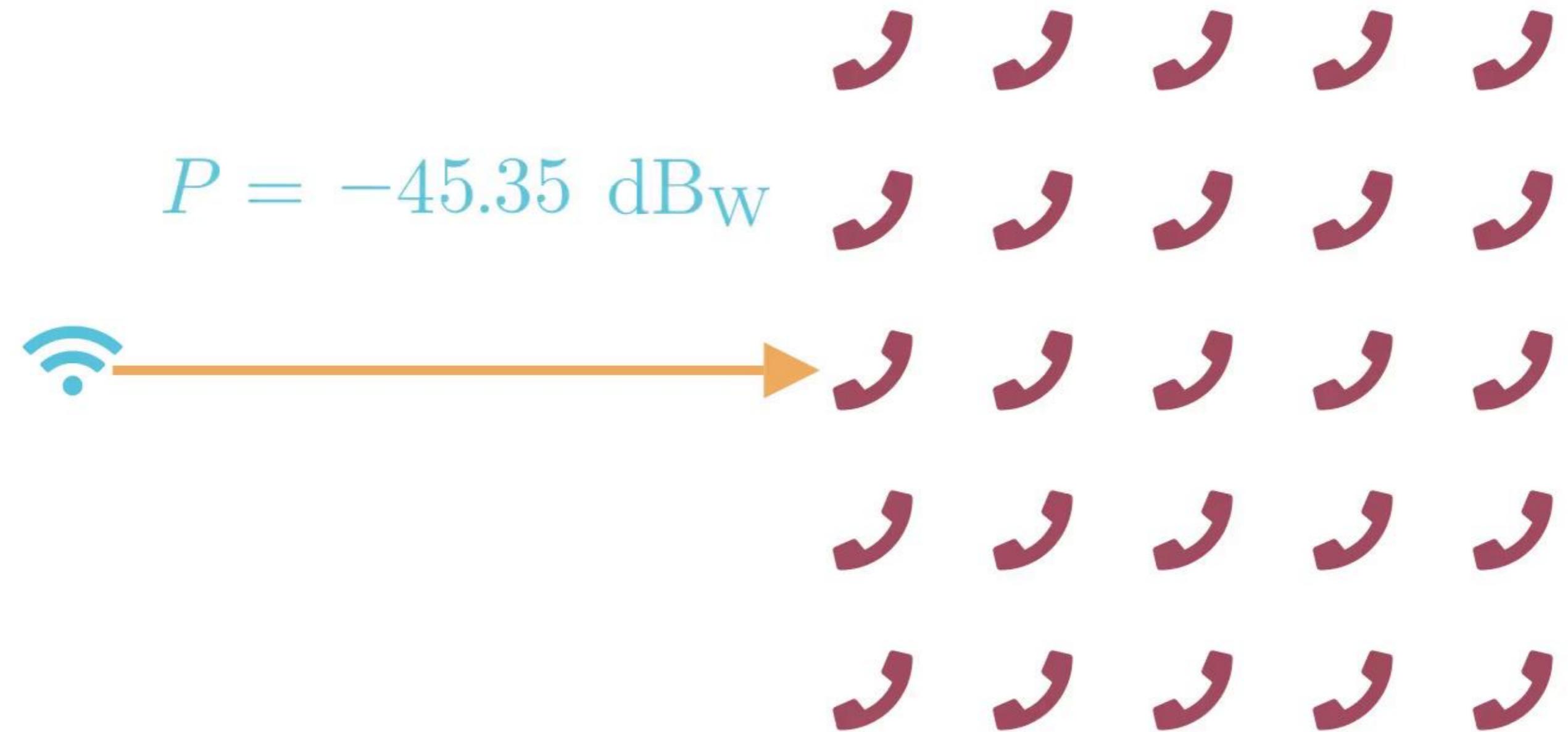
- Programming;
- Writing performant solutions;
- and open sourcing content (jeertmans on  or eertmans.be).

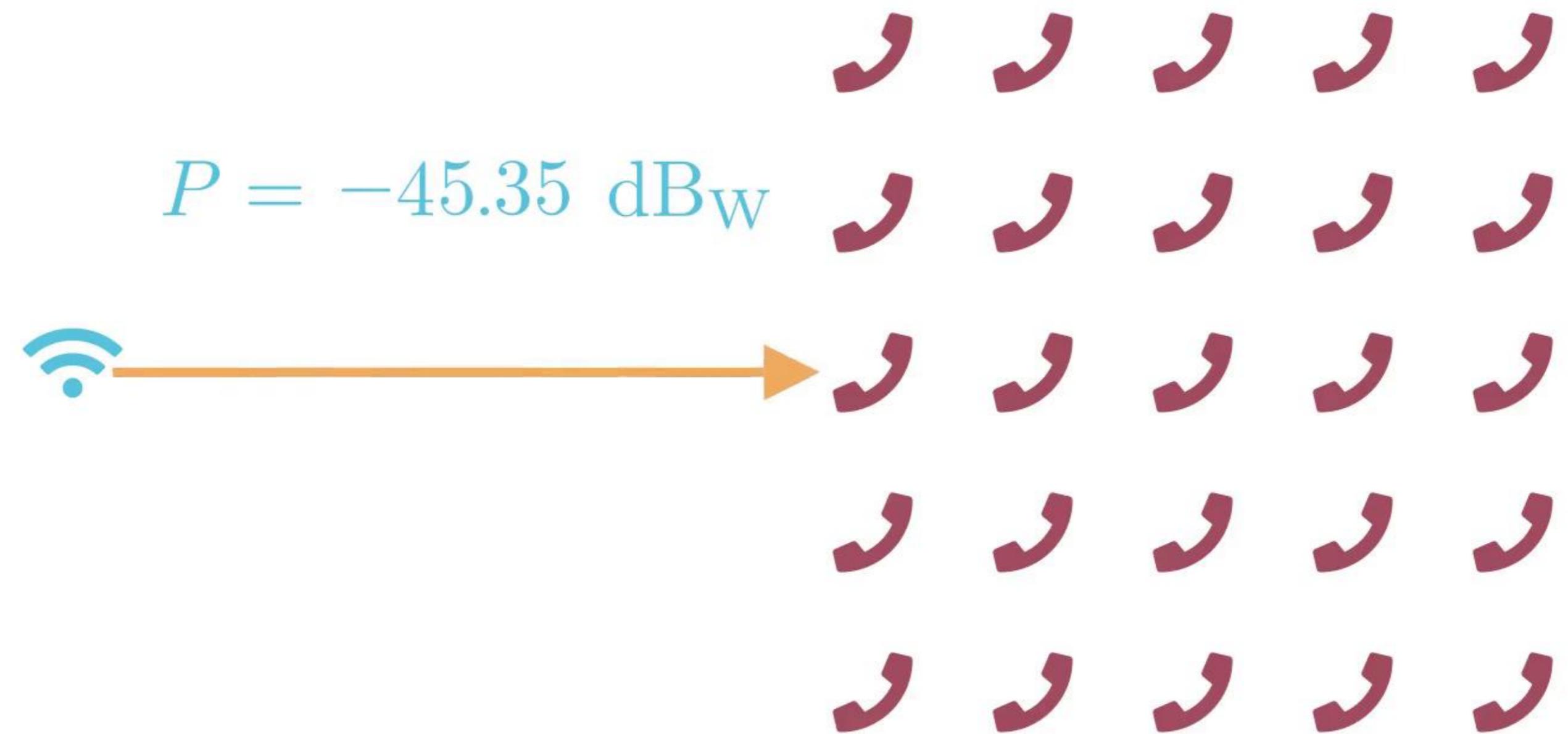
Claude Oestges Laurent Jacques

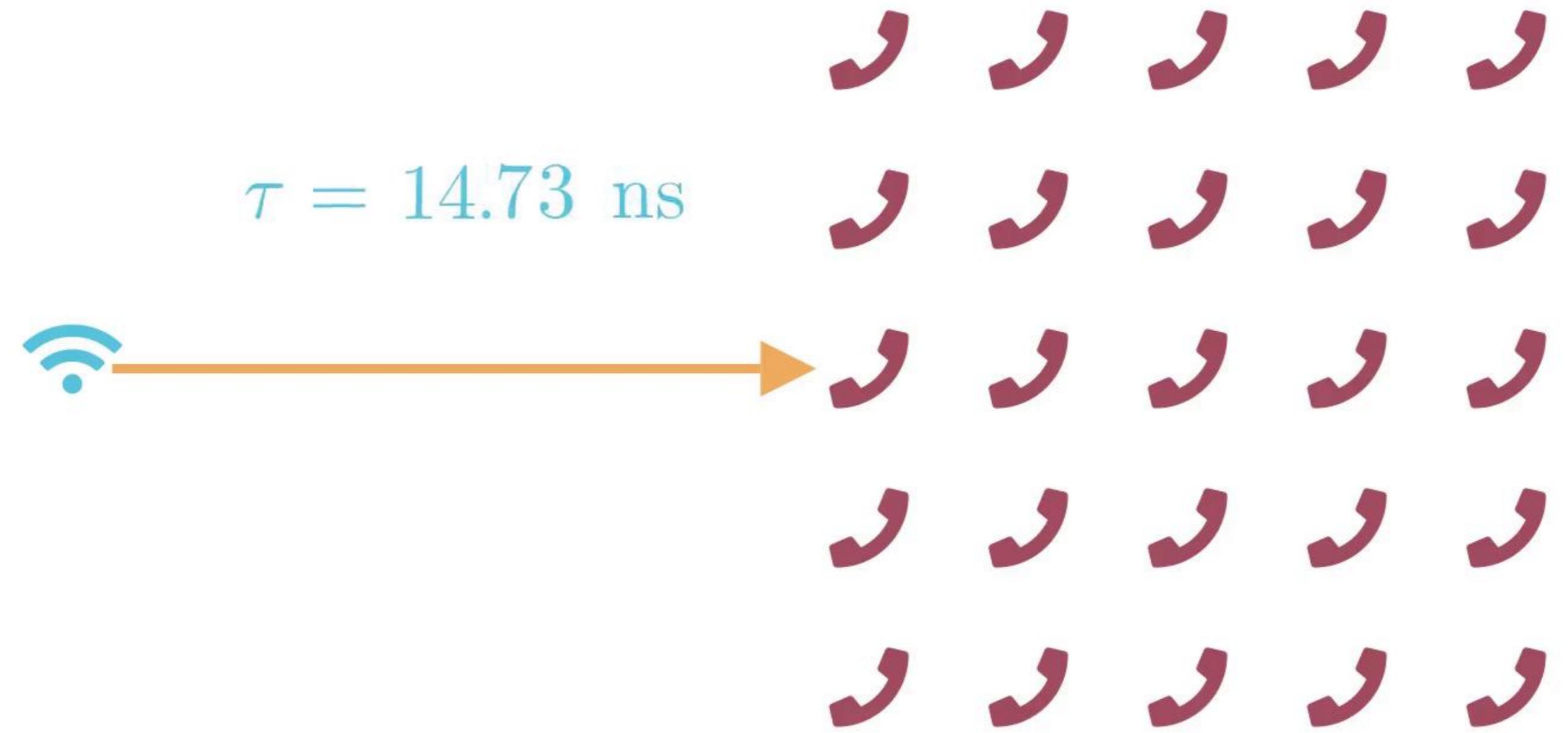


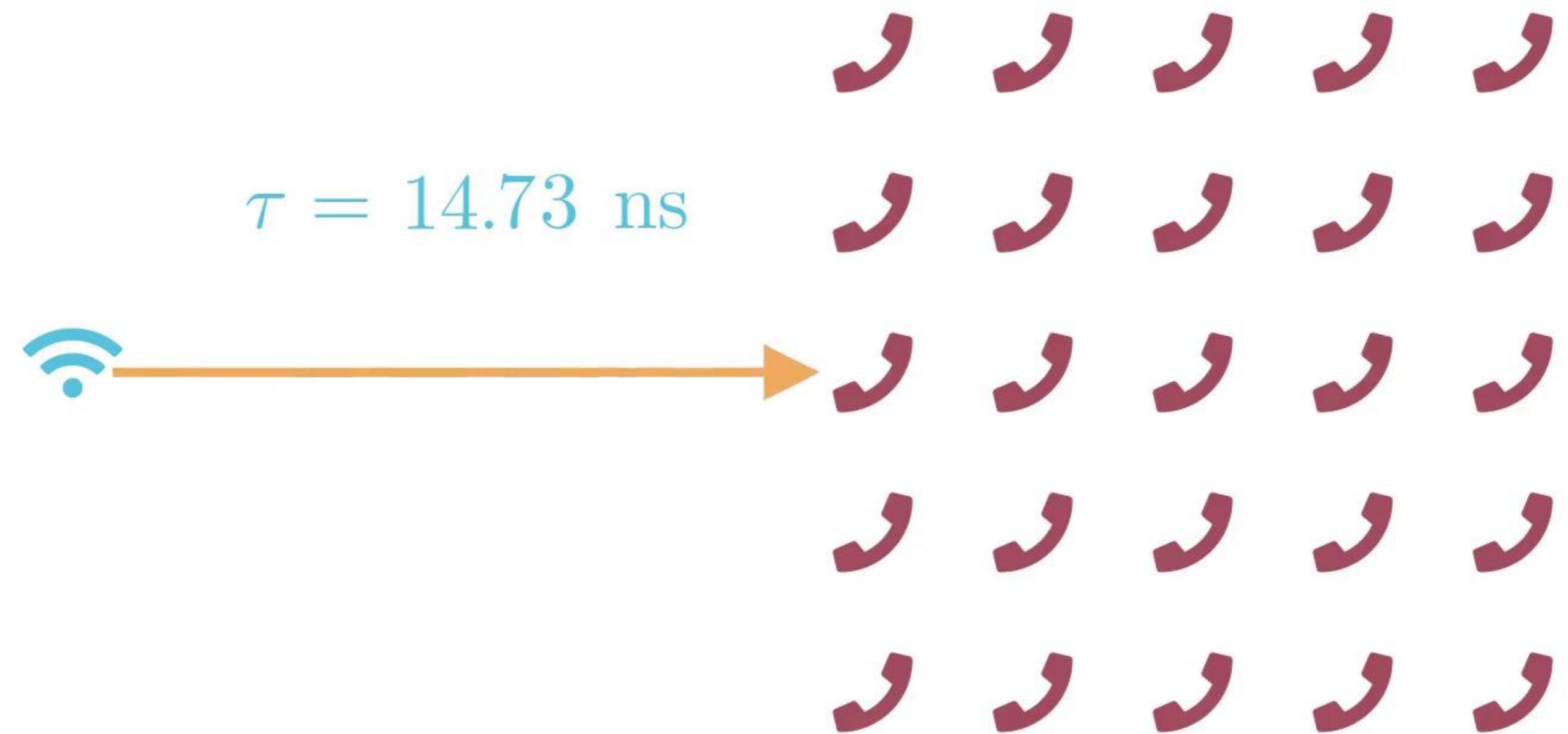








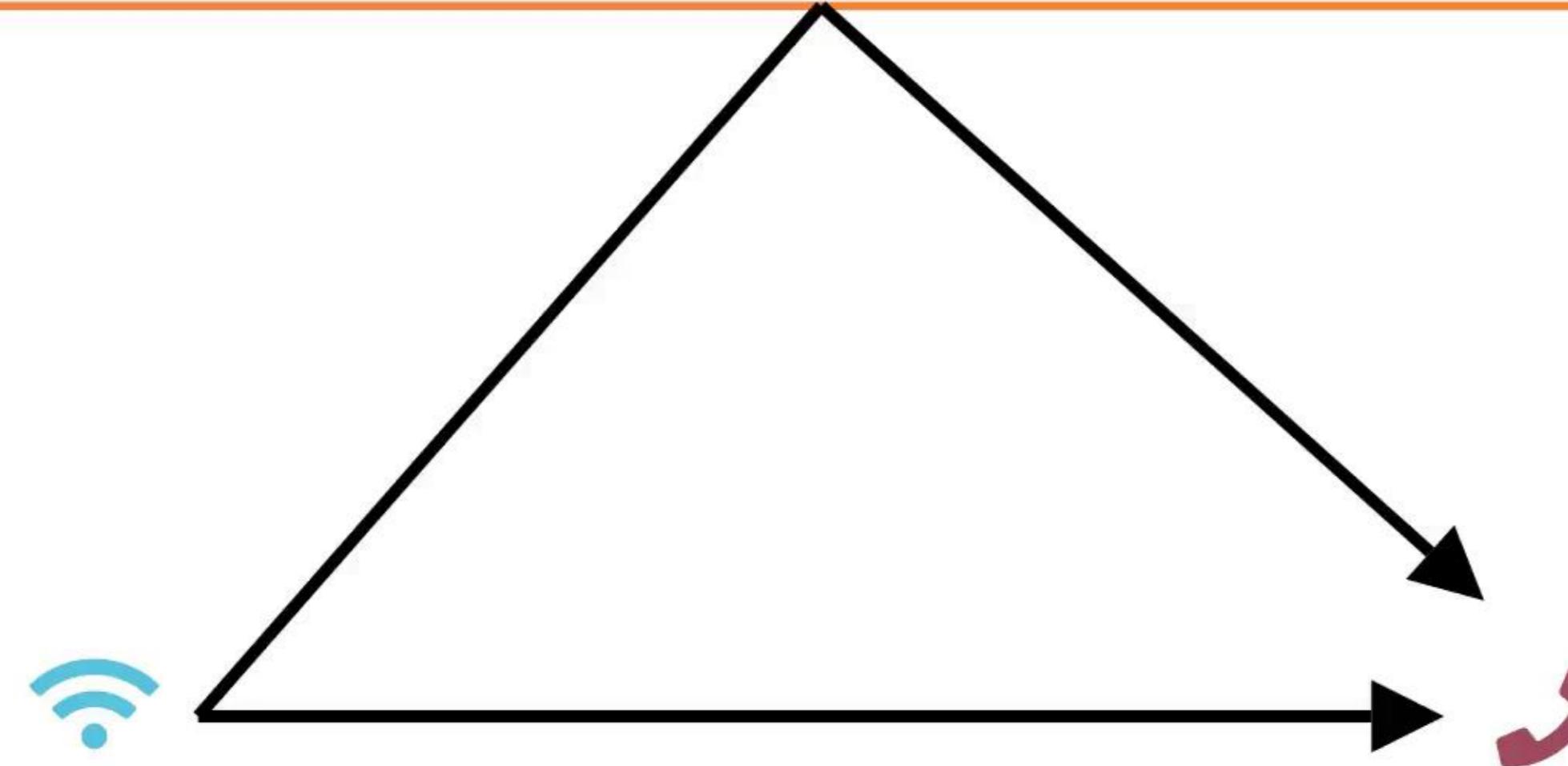


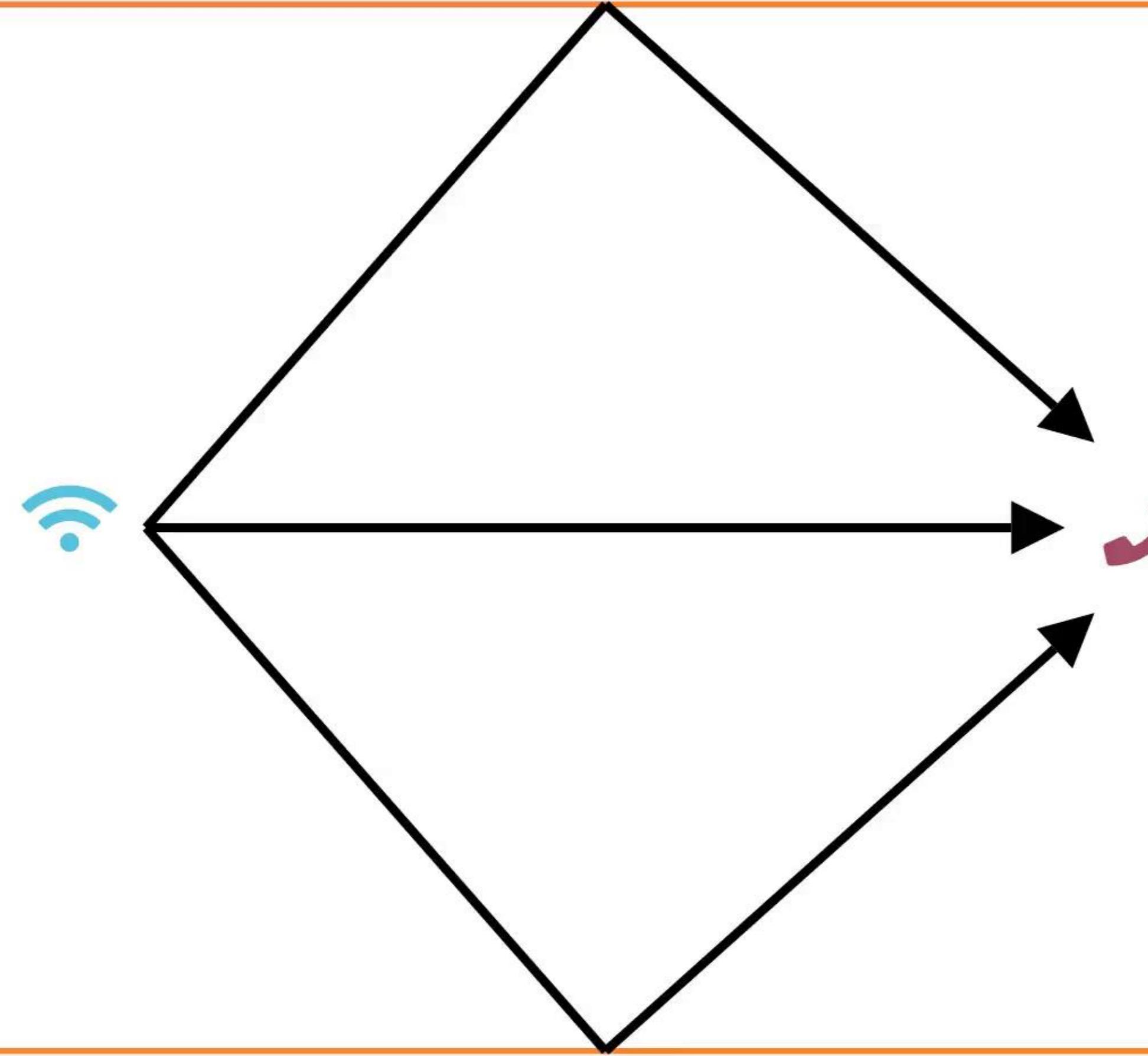


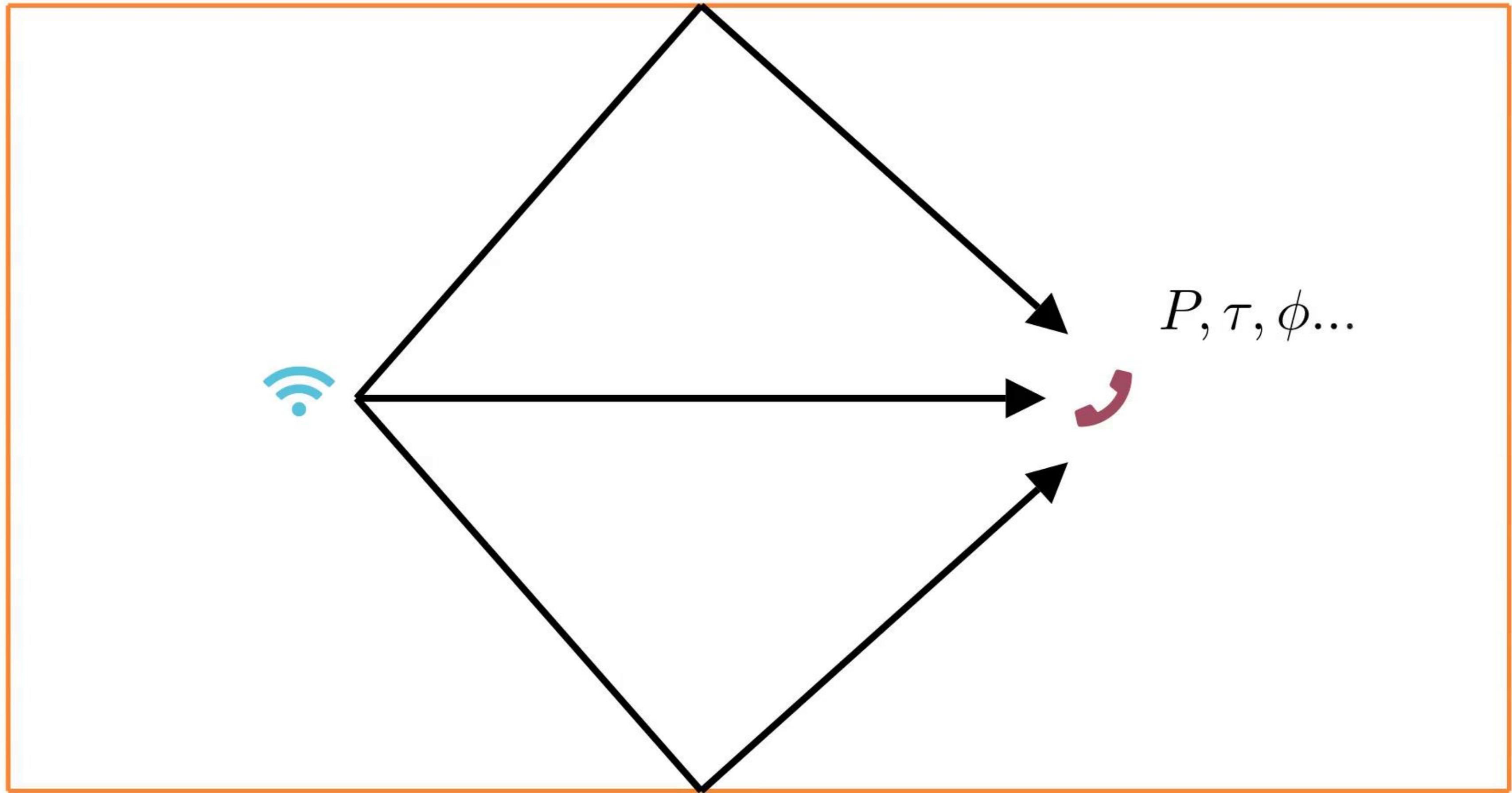
















How to find all paths?





How to find all paths?
Multiple methods exist!



Outline:



Outline:

1. RT for Telecom



Outline:

1. RT for Telecom
2. Image Method





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3. Min-Path-Tracing





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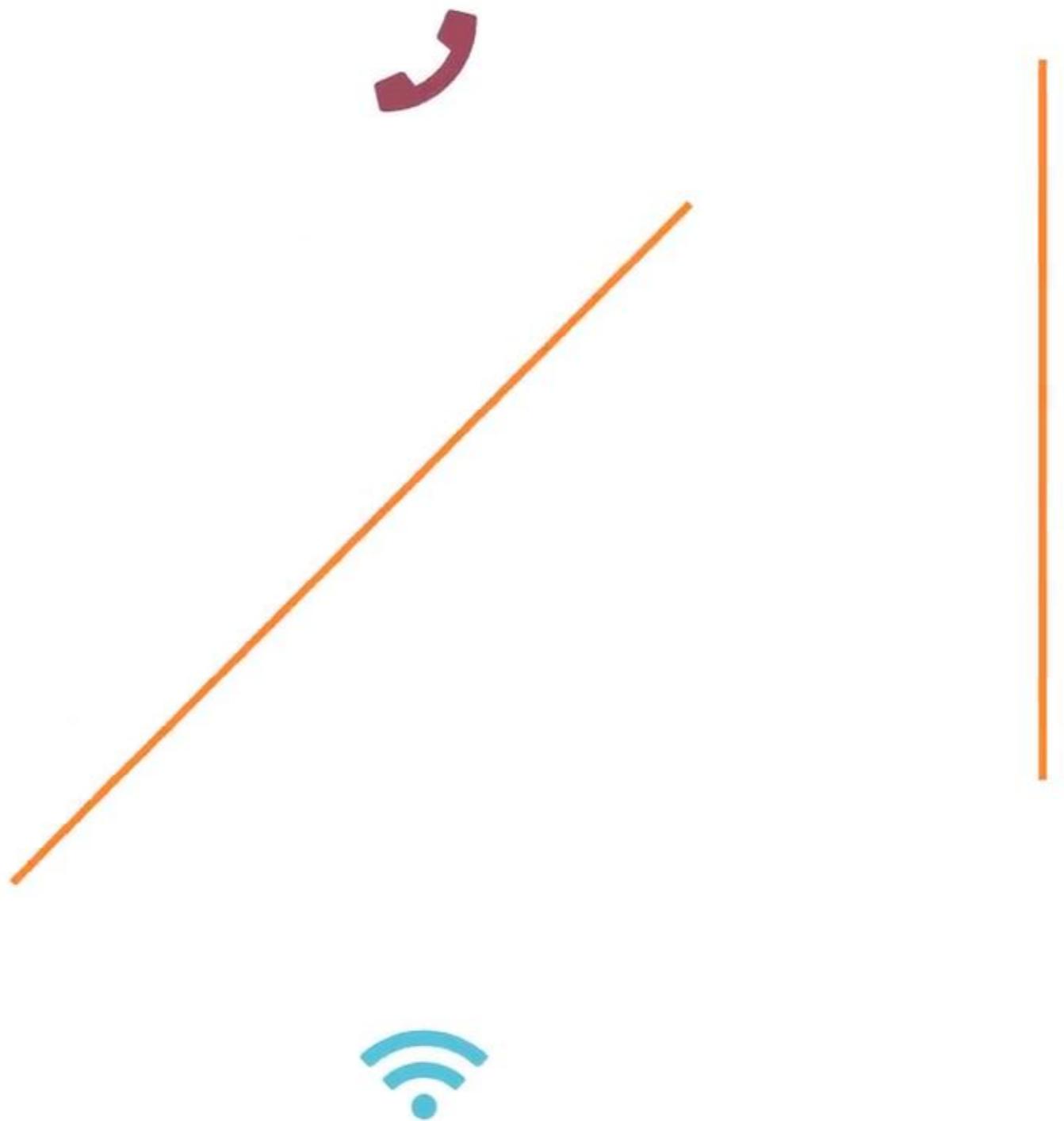
1. RT for Telecom
2. Image Method
3. Min-Path-Tracing 
4. About differentiability



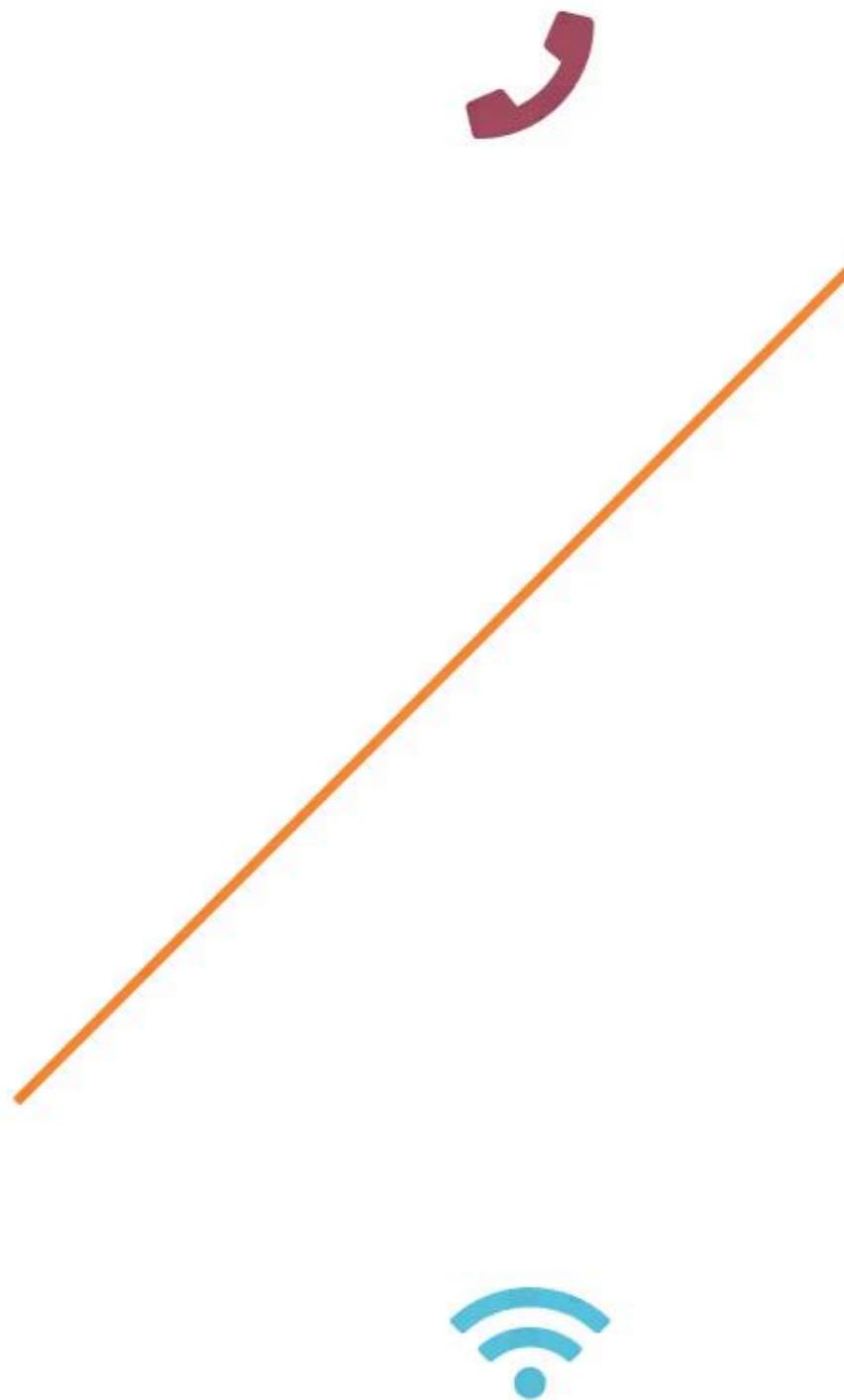
Outline:

1. RT for Telecom
2. Image Method
3. Min-Path-Tracing 
4. About differentiability
5. Current work

1. RT for Telecom



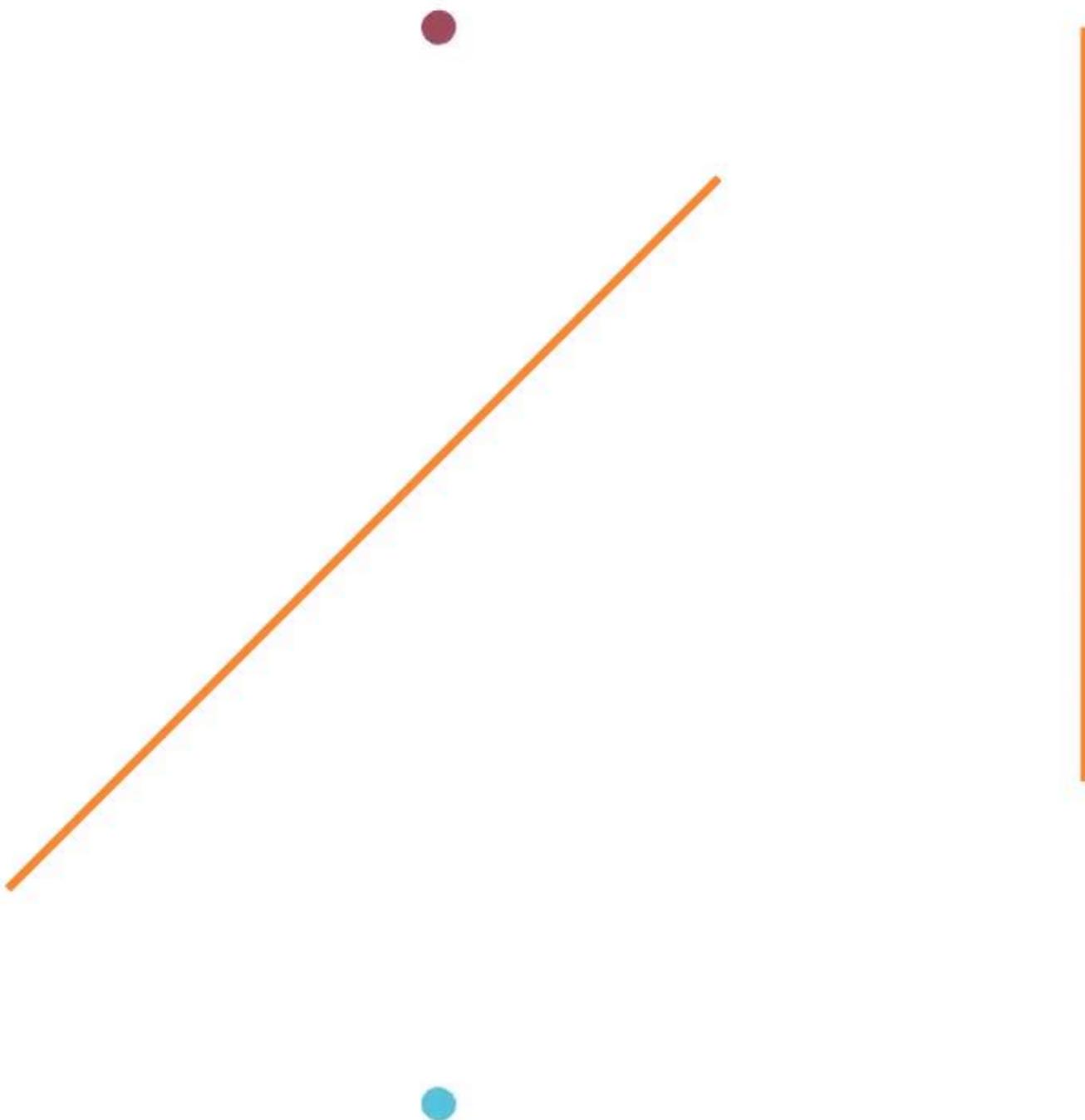
1. RT for Telecom



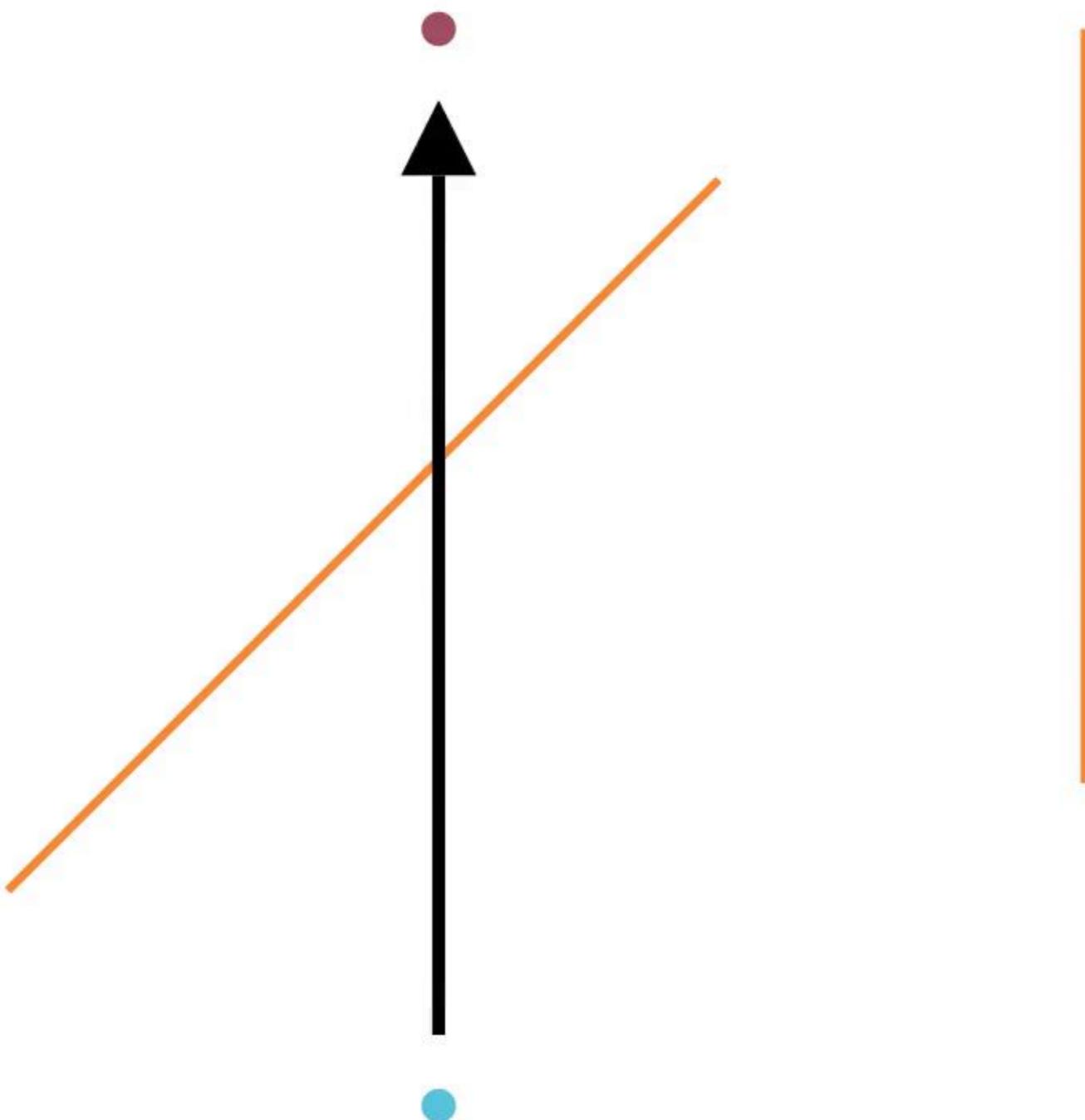
Core points:

- used by telecom operators;
- for coverage map;
- for antennas placement;
- using mix of Ray-Launching and Image RT.

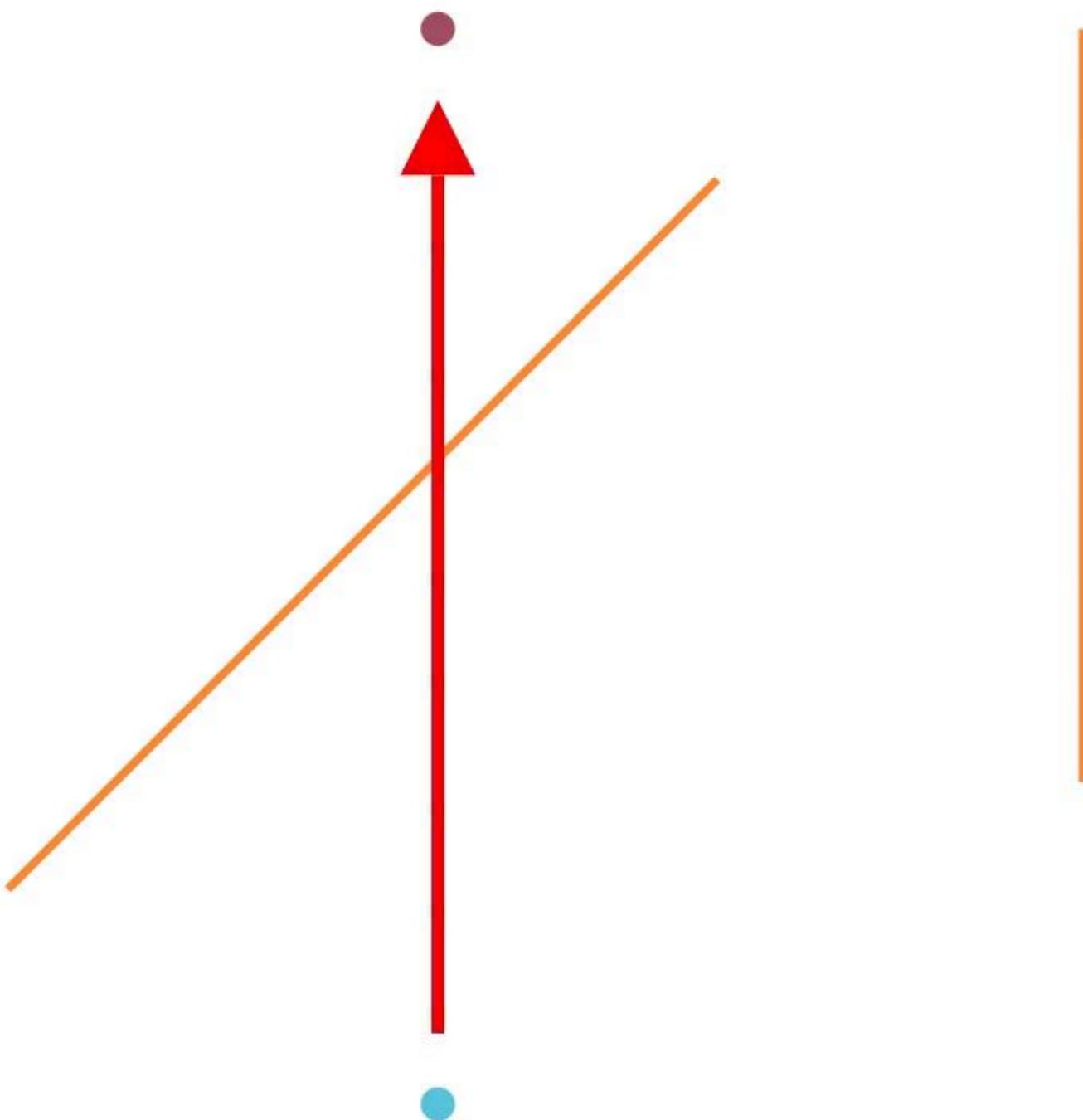
2. Image Method



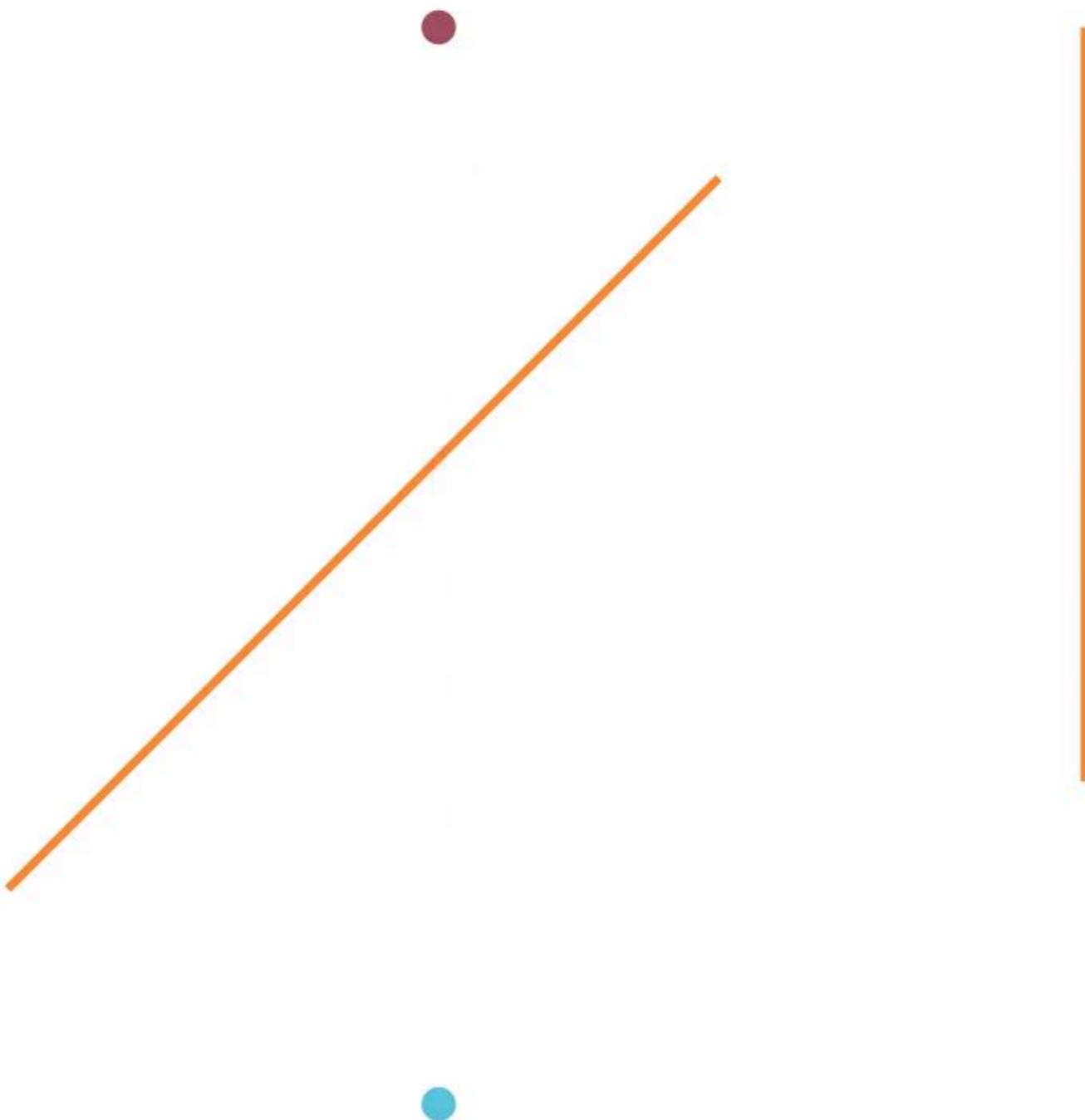
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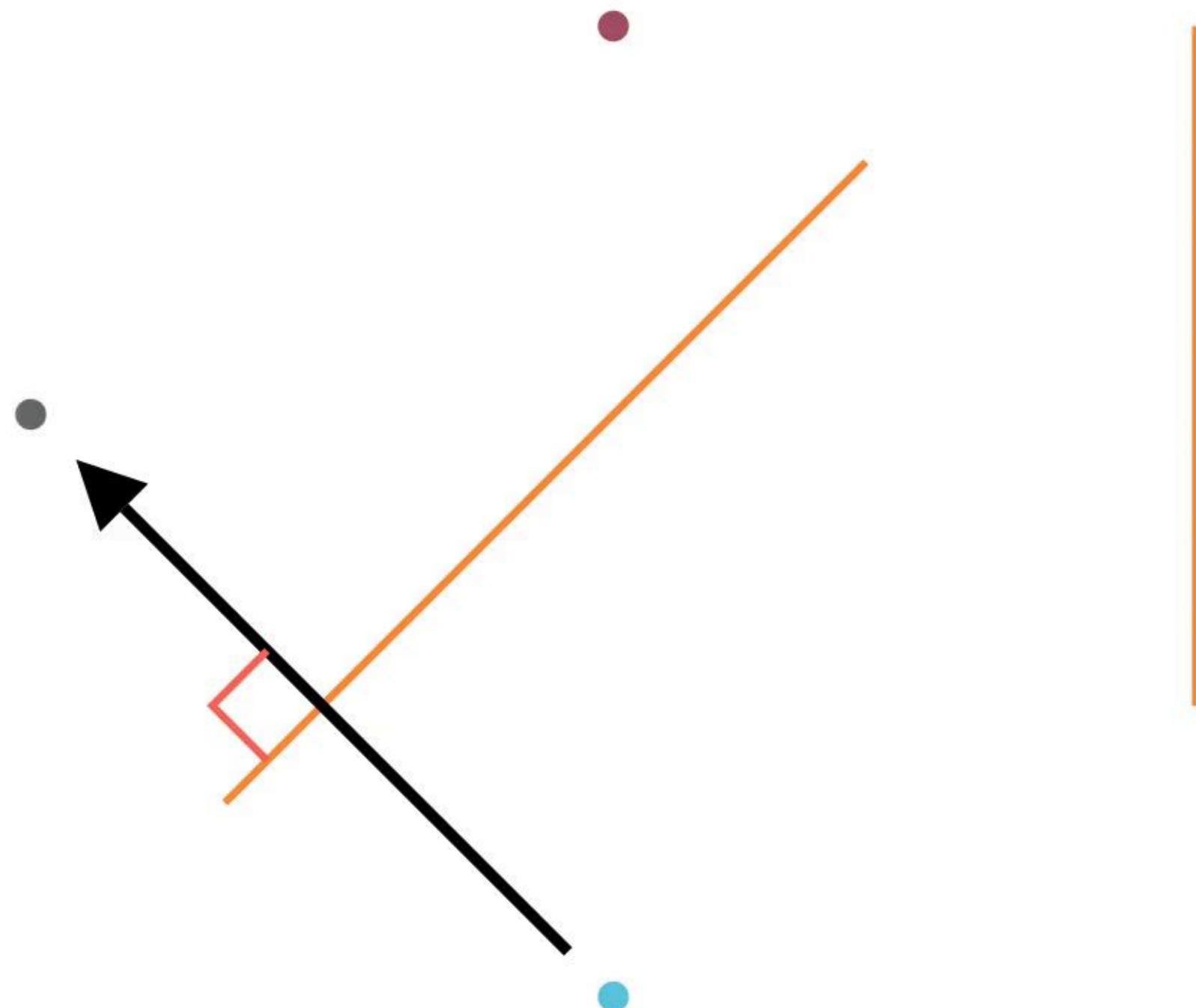
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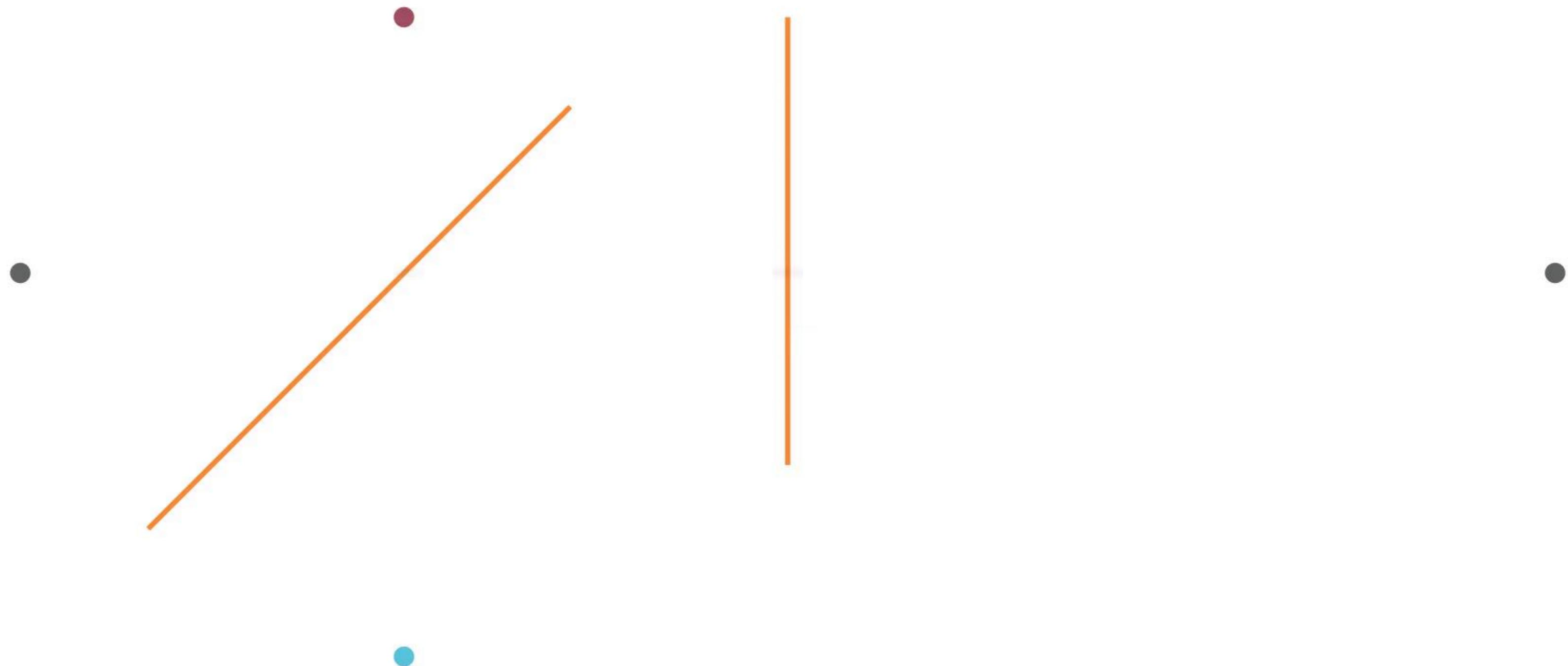
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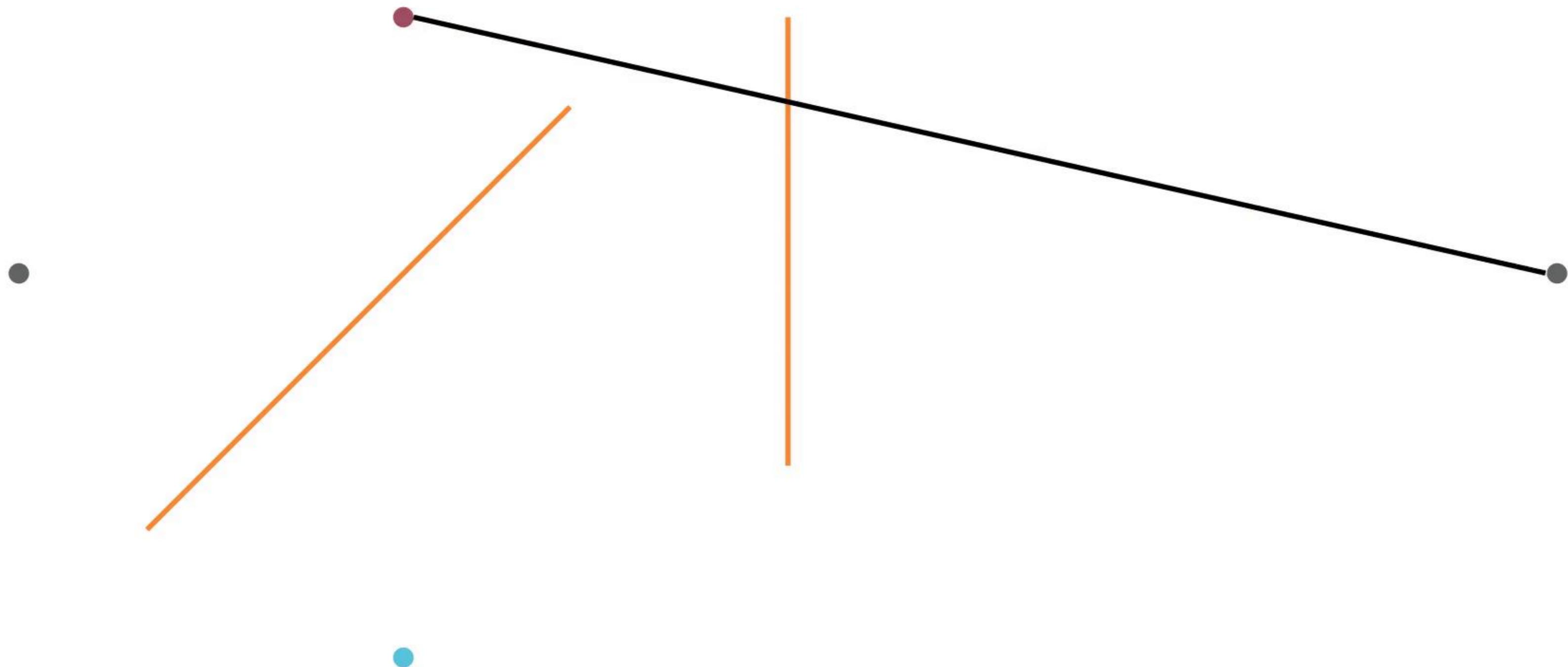
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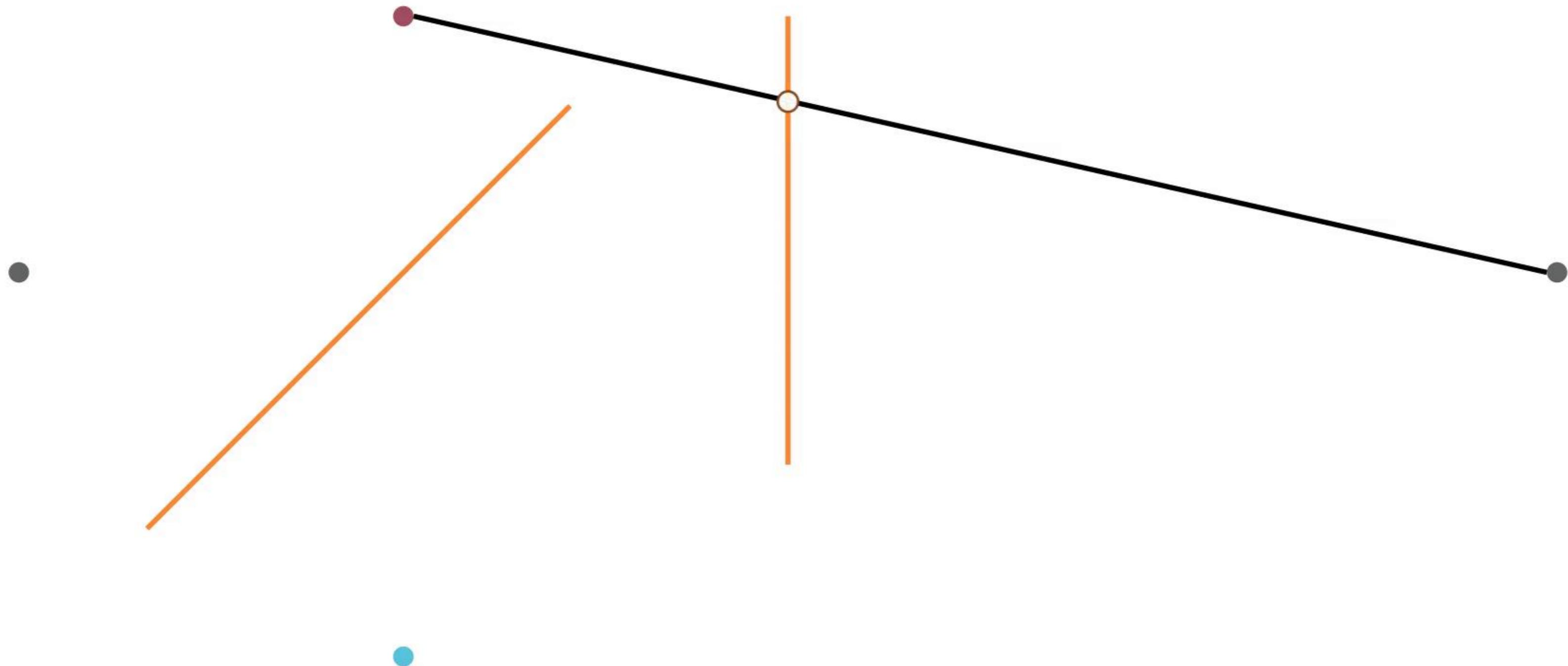
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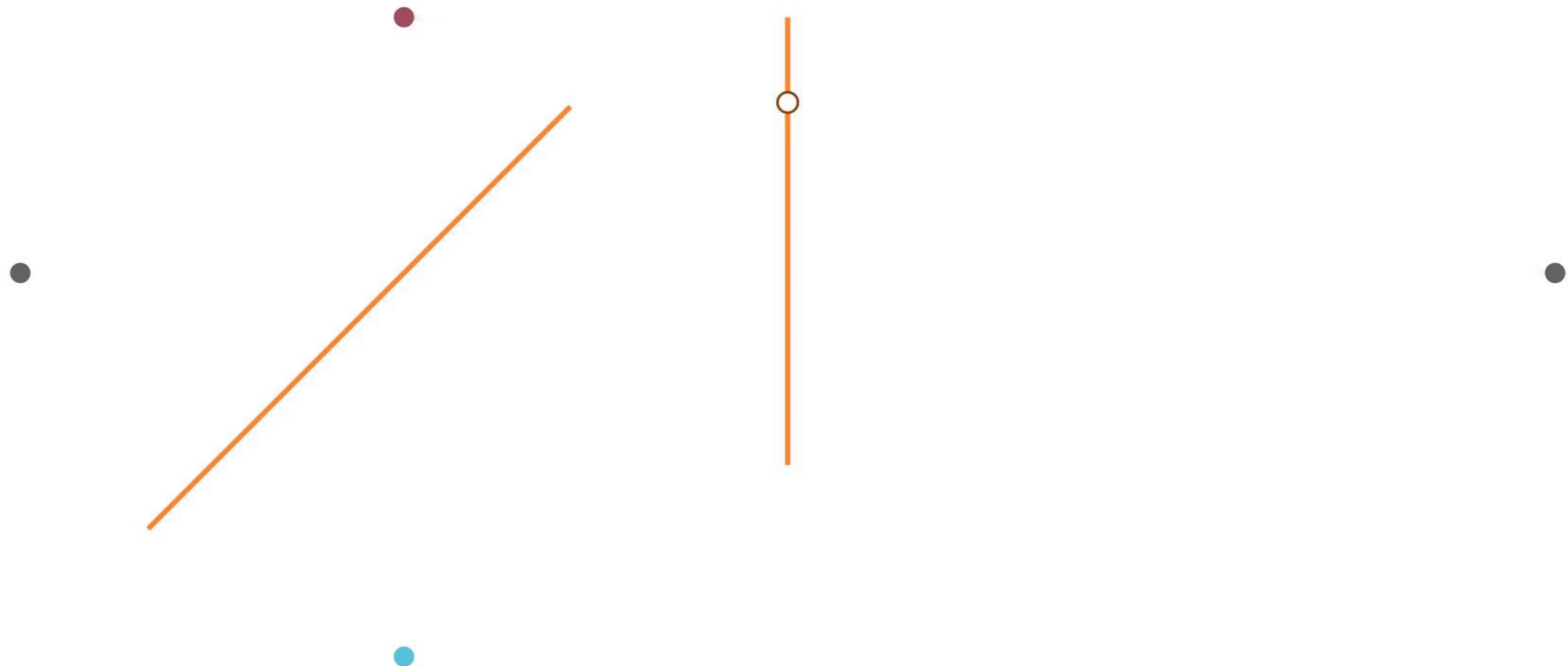
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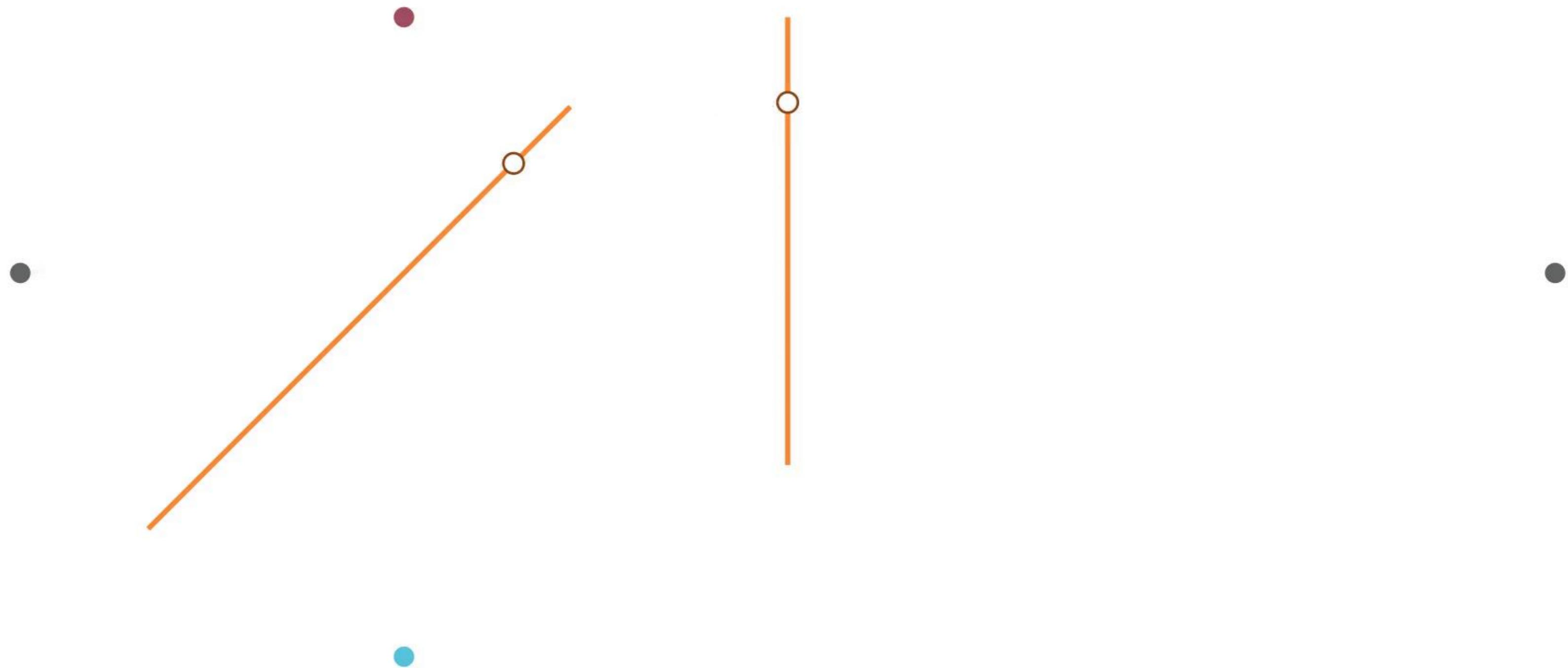
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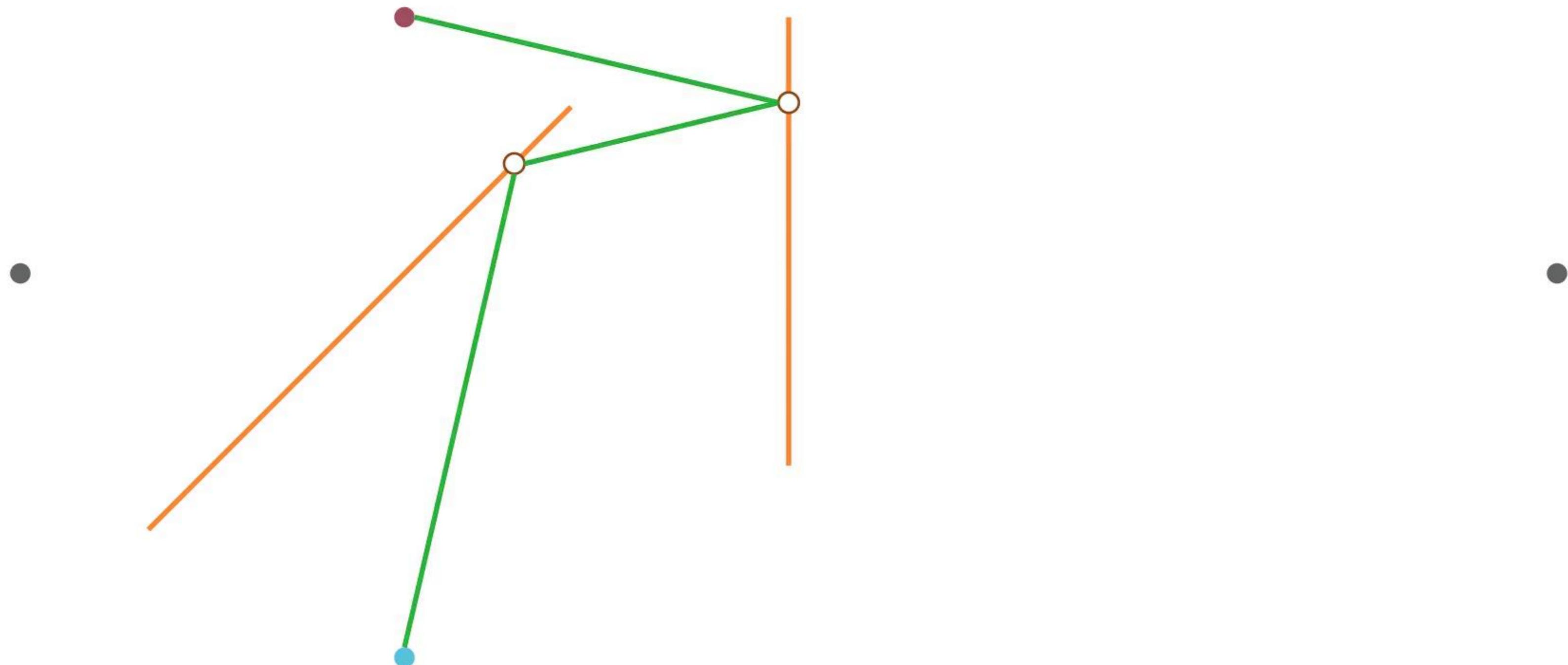
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Summary:

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Pros

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- Fast - $\mathcal{O}(n)$

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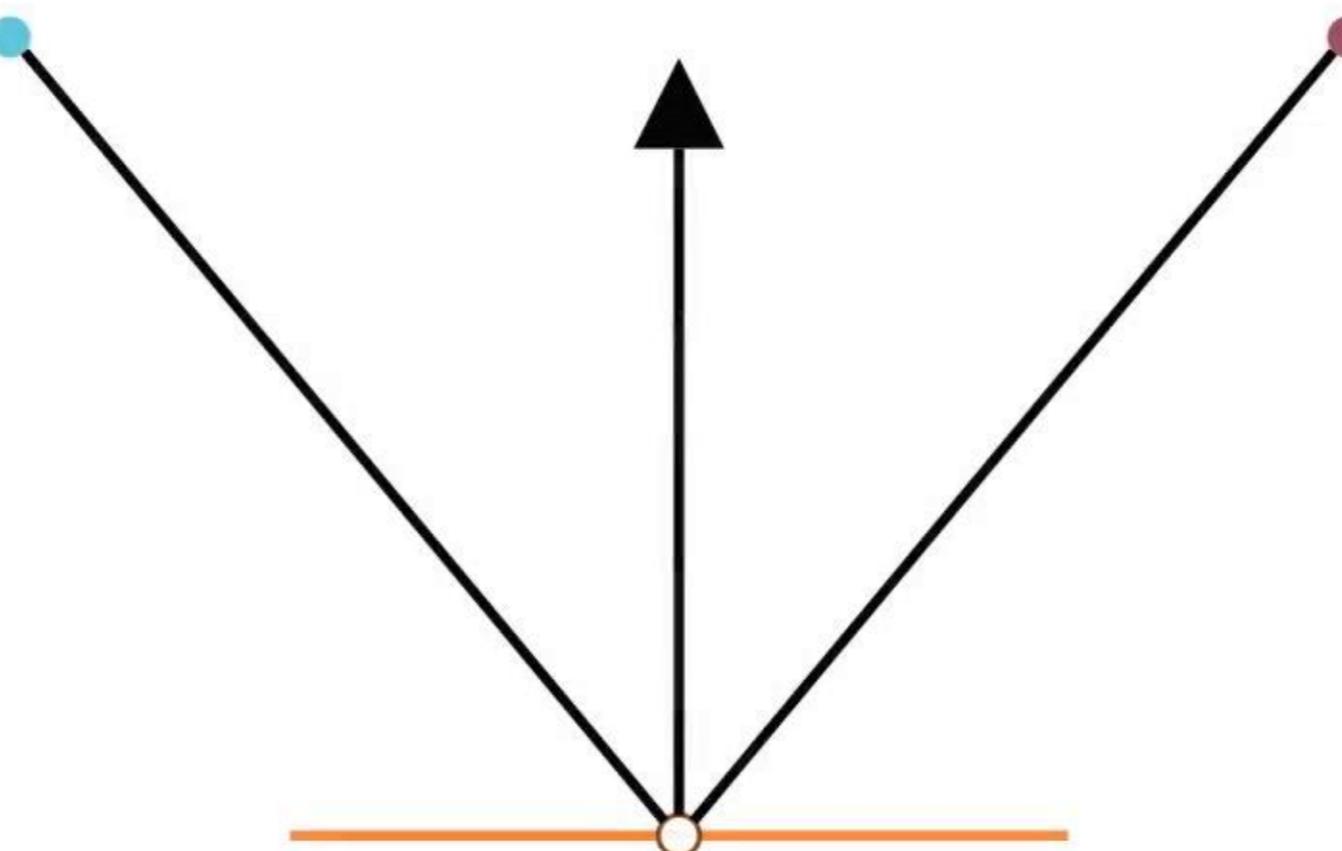
Pros

- Simple
- Fast - $\mathcal{O}(n)$

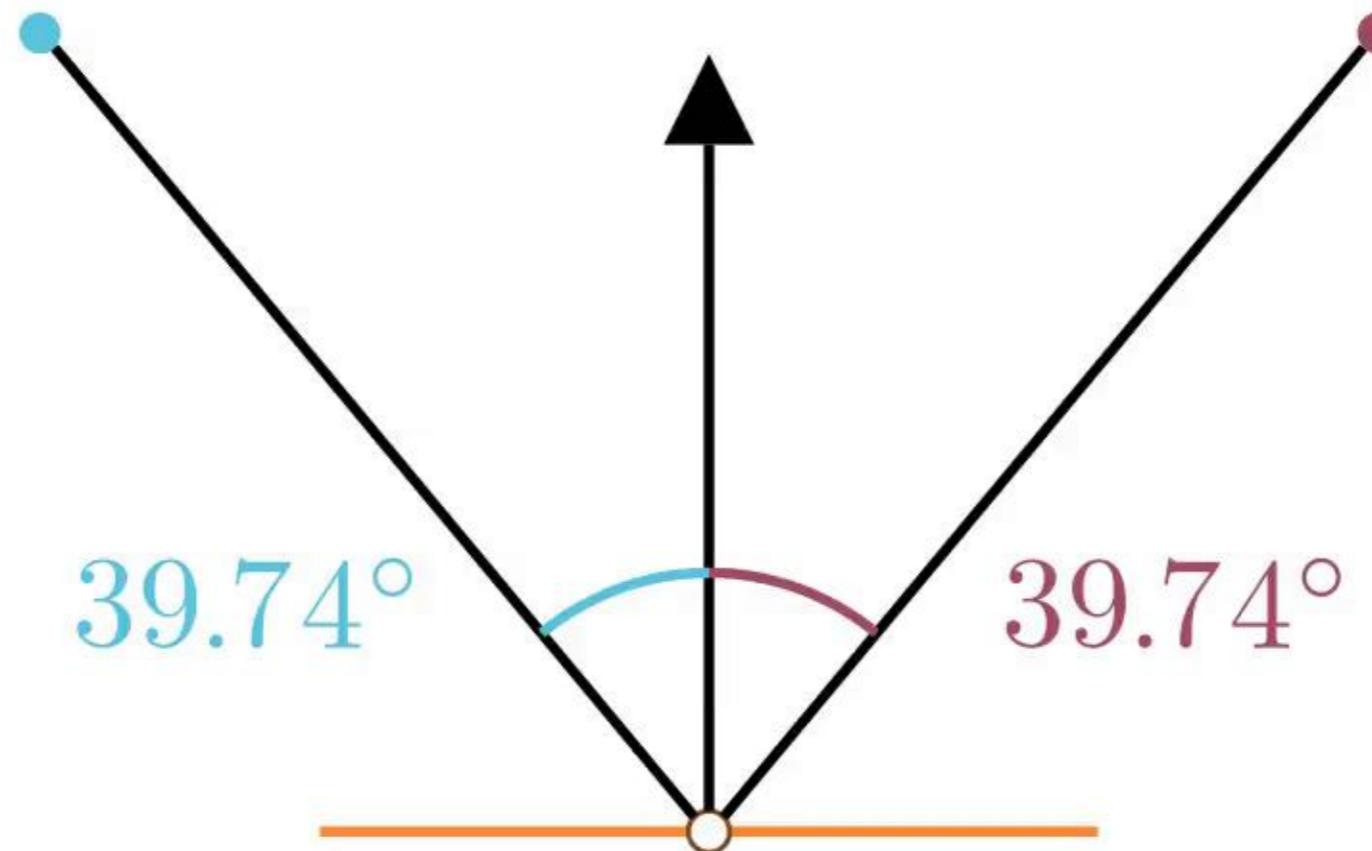
Cons

- Limited to planar surfaces
- Specular reflection only

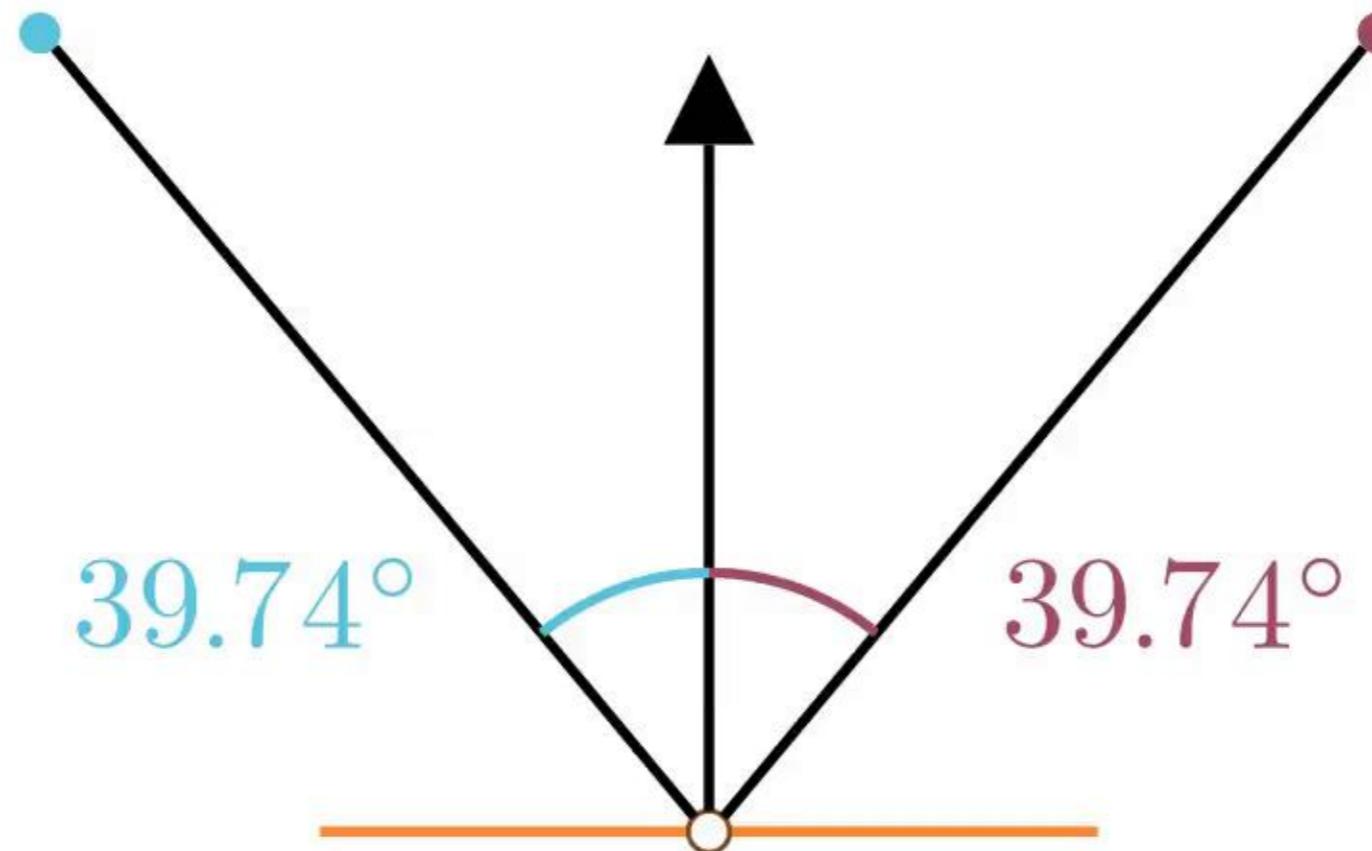
3. Min-Path-Tracing



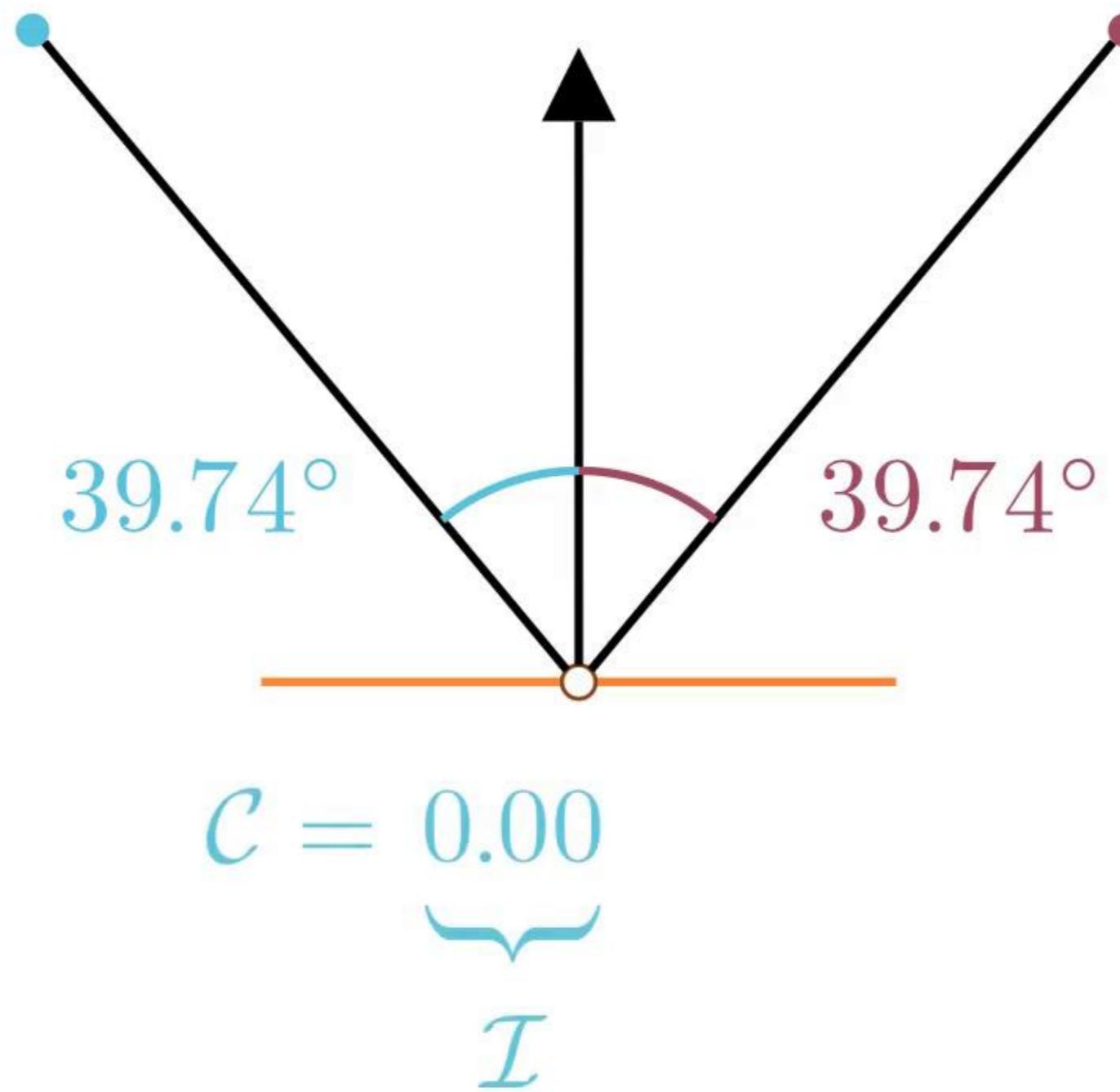
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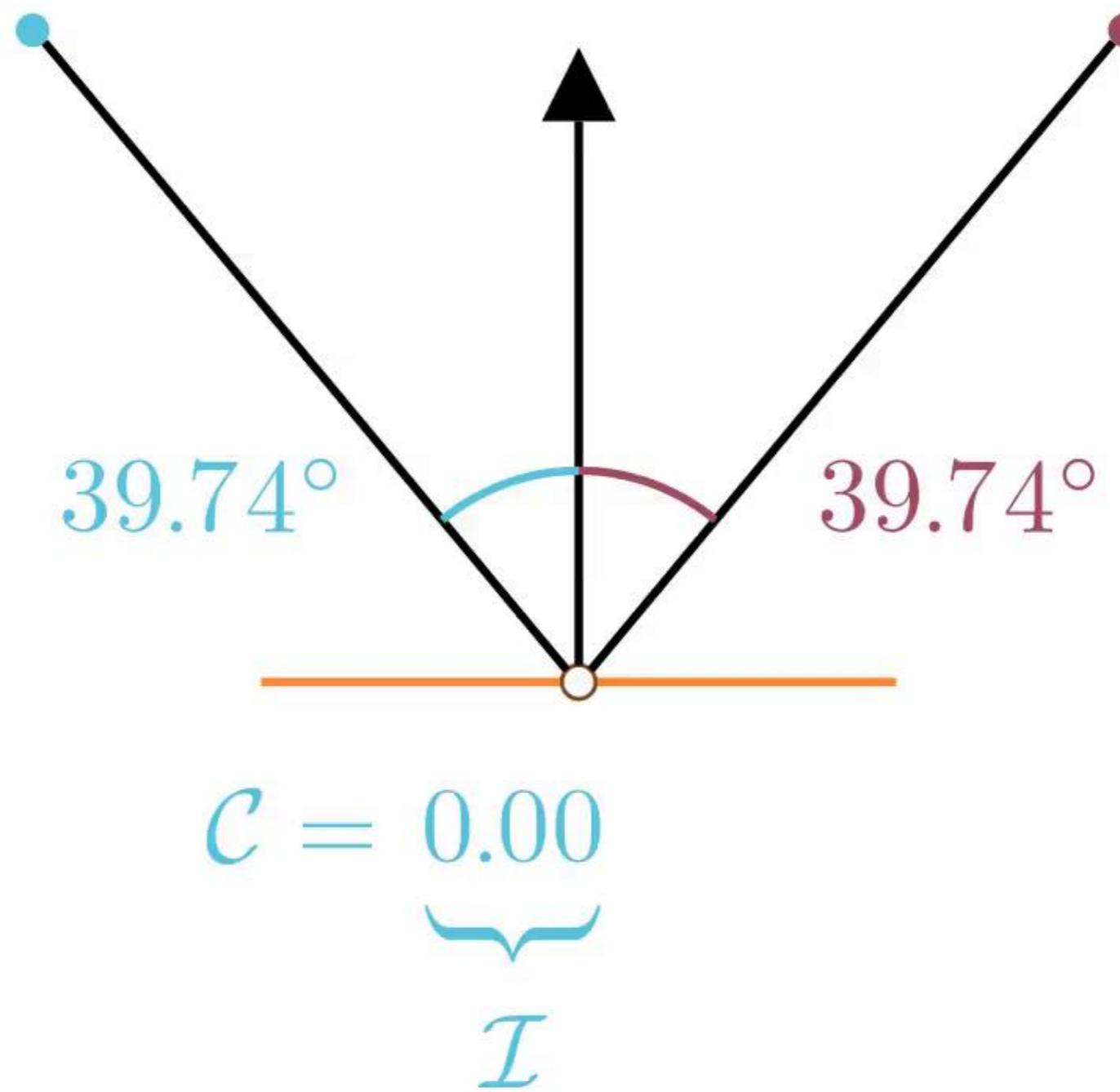
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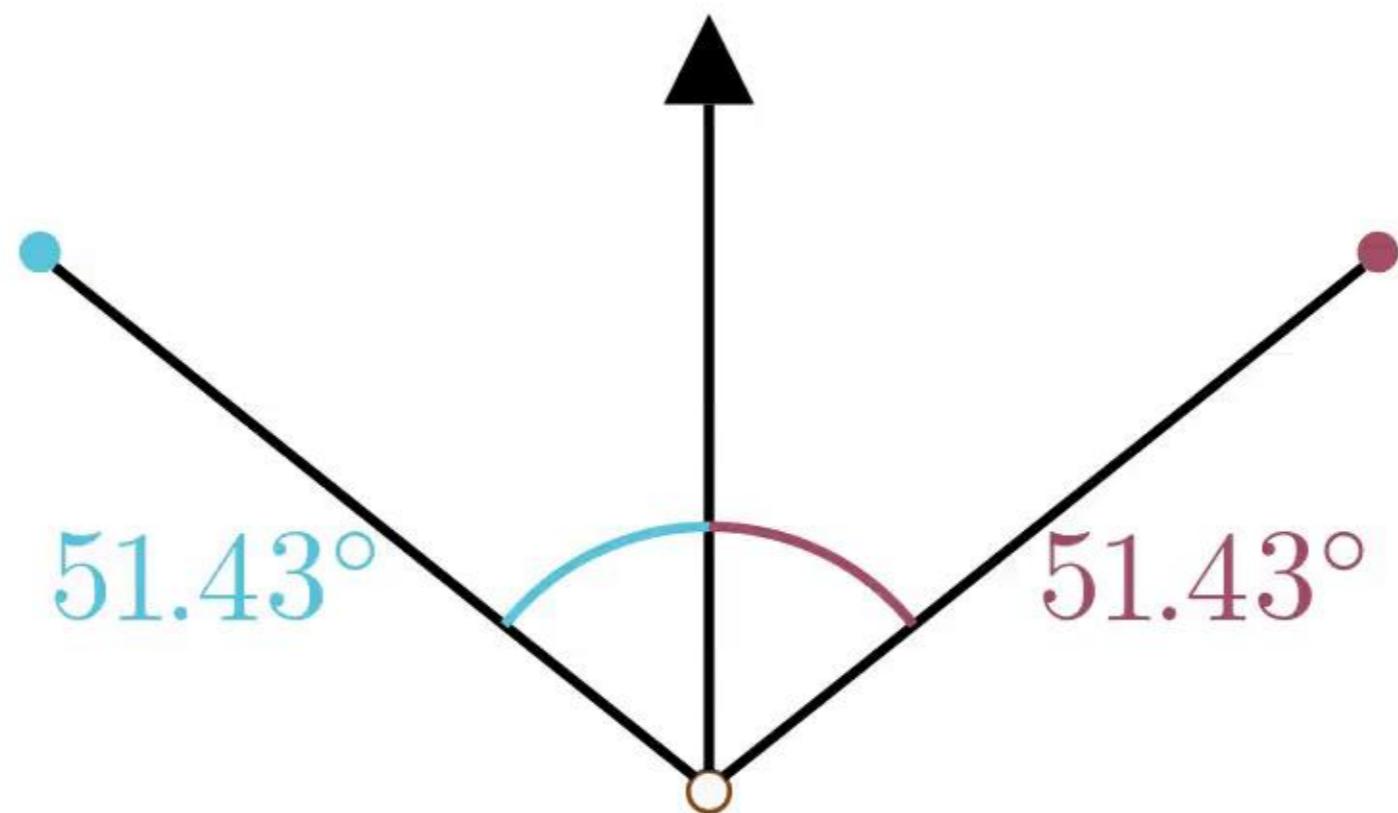
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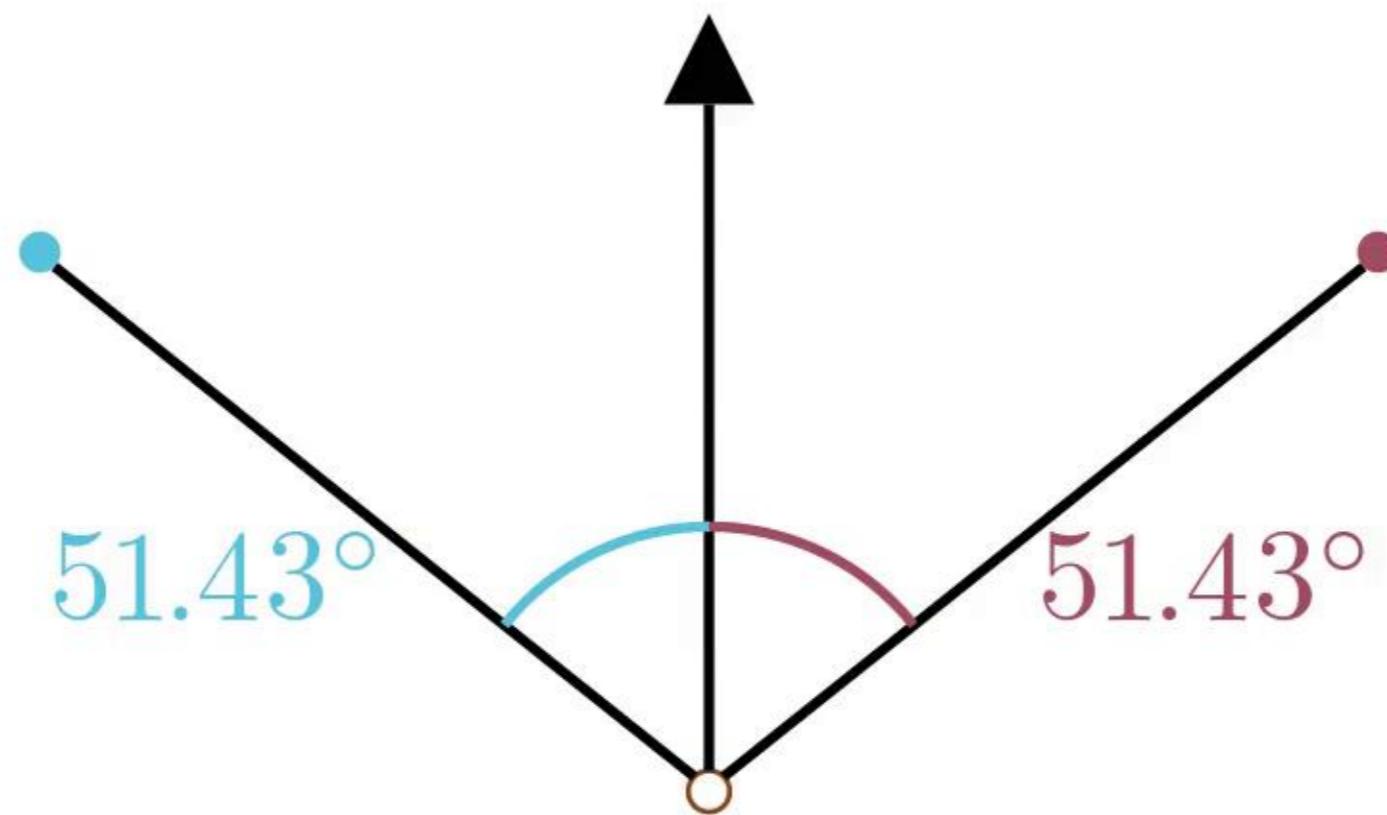


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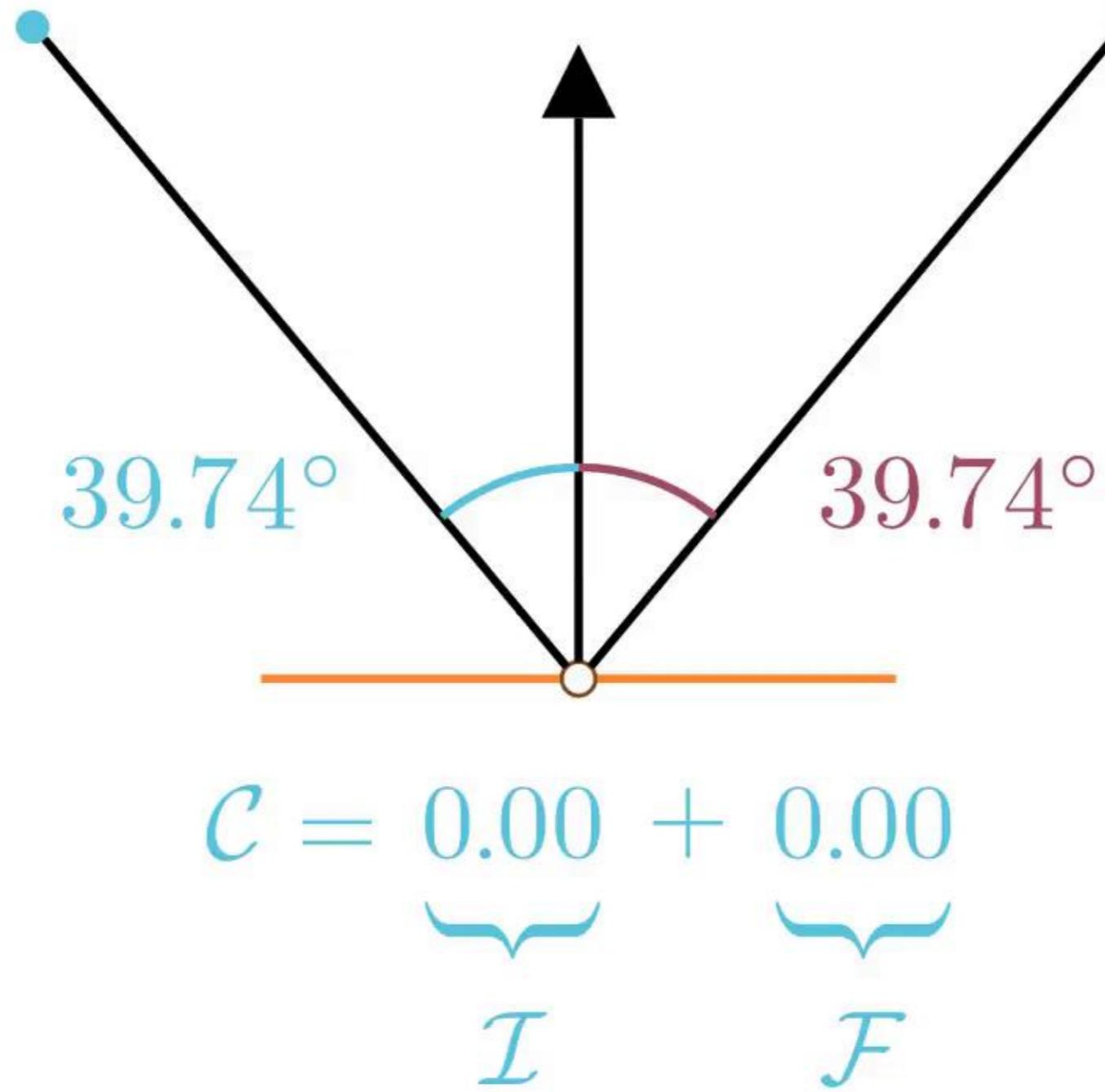
$$\mathcal{C} = \underbrace{0.00}_{\mathcal{I}}$$

3. Min-Path-Tracing



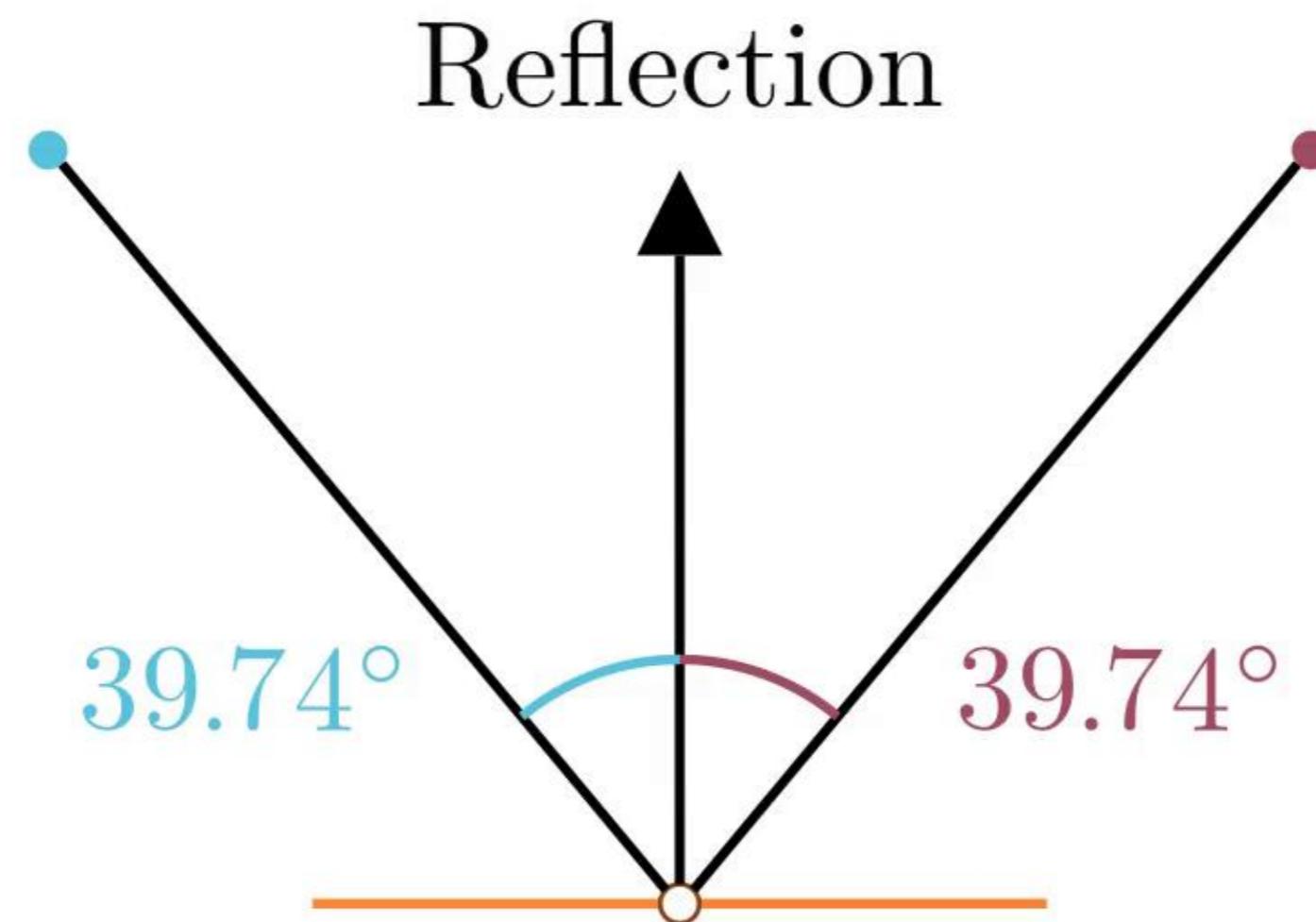
$$\mathcal{C} = \underbrace{0.00}_{\mathcal{I}} + \underbrace{1.00}_{\mathcal{F}}$$

3. Min-Path-Tracing



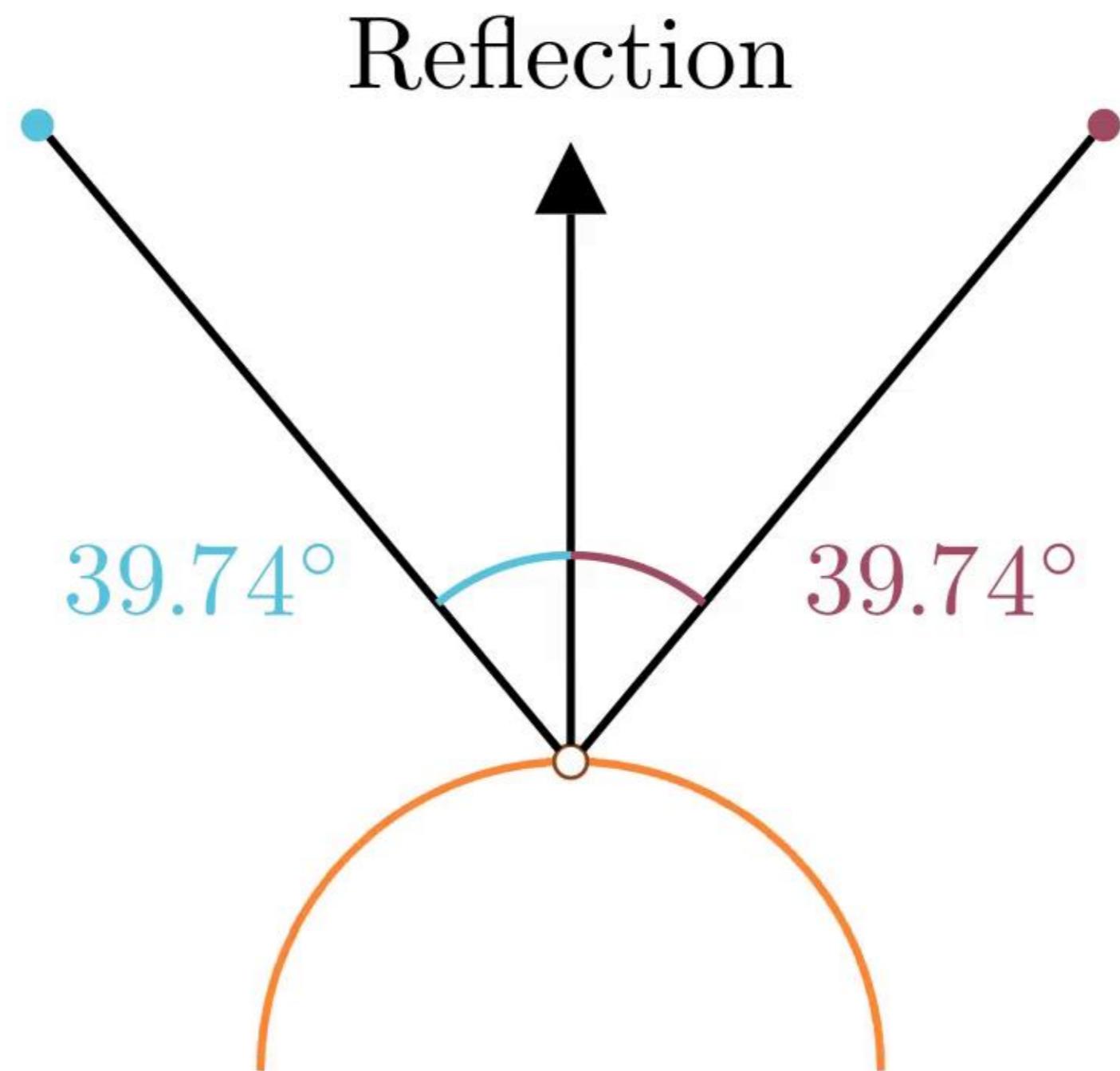
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$$\mathcal{I} \sim \hat{r} = \hat{i} - 2\langle \hat{i}, \hat{n} \rangle \hat{n}$$



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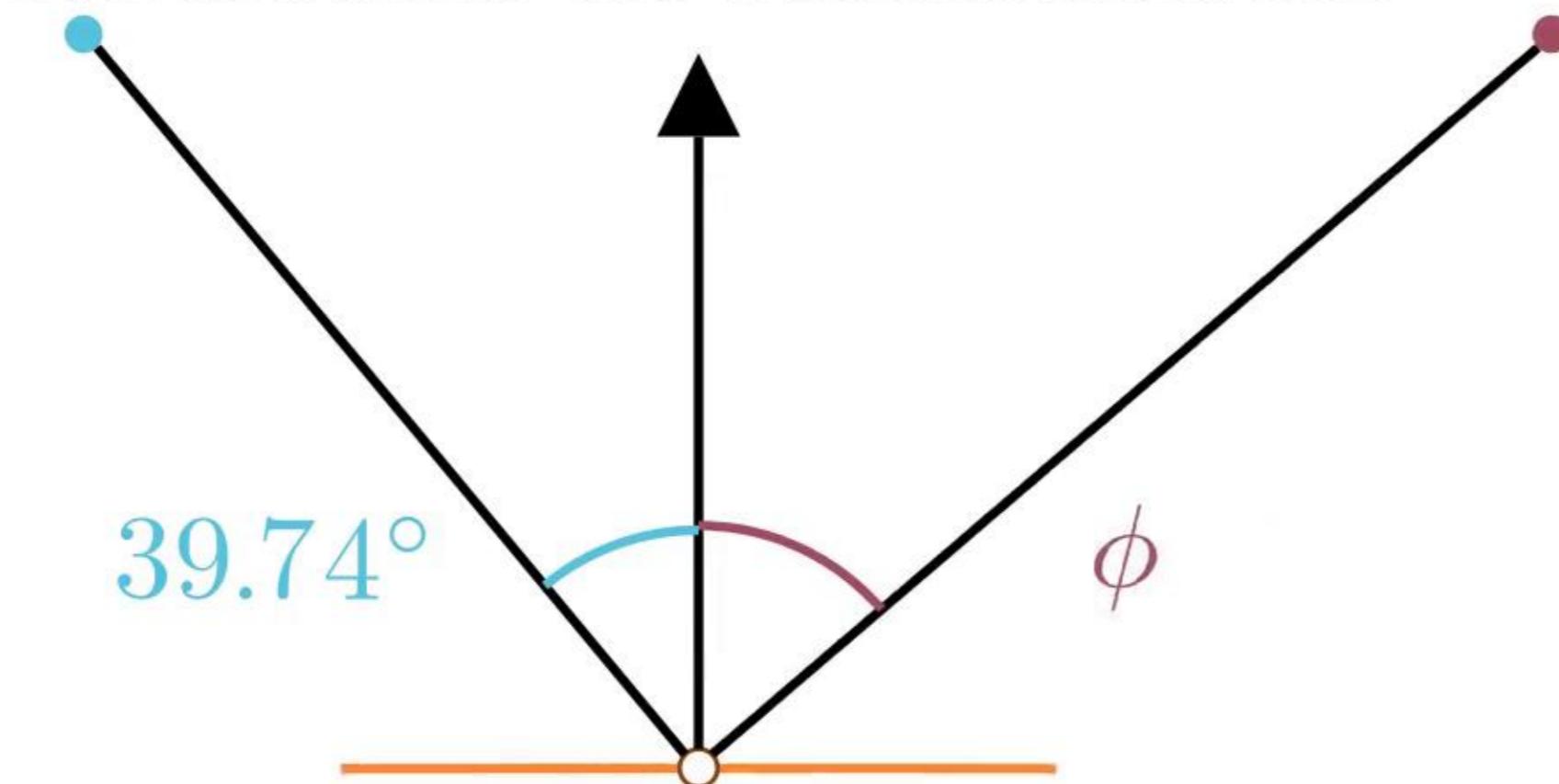
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3. Min-Path-Tracing

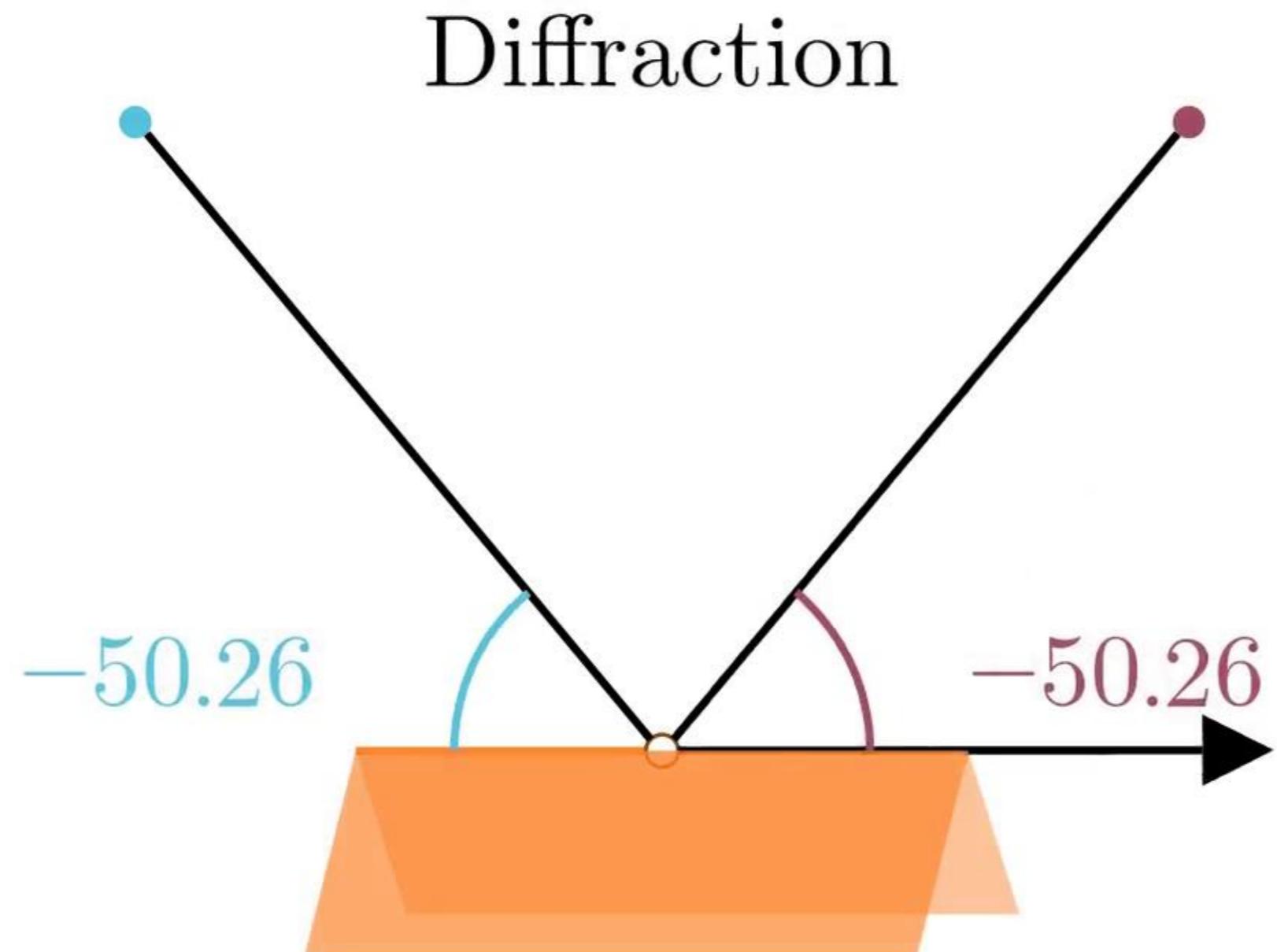
$$\mathcal{I} \sim \mathbf{r} = f(\hat{\mathbf{n}}, \phi)$$

Reflection on metasurfaces



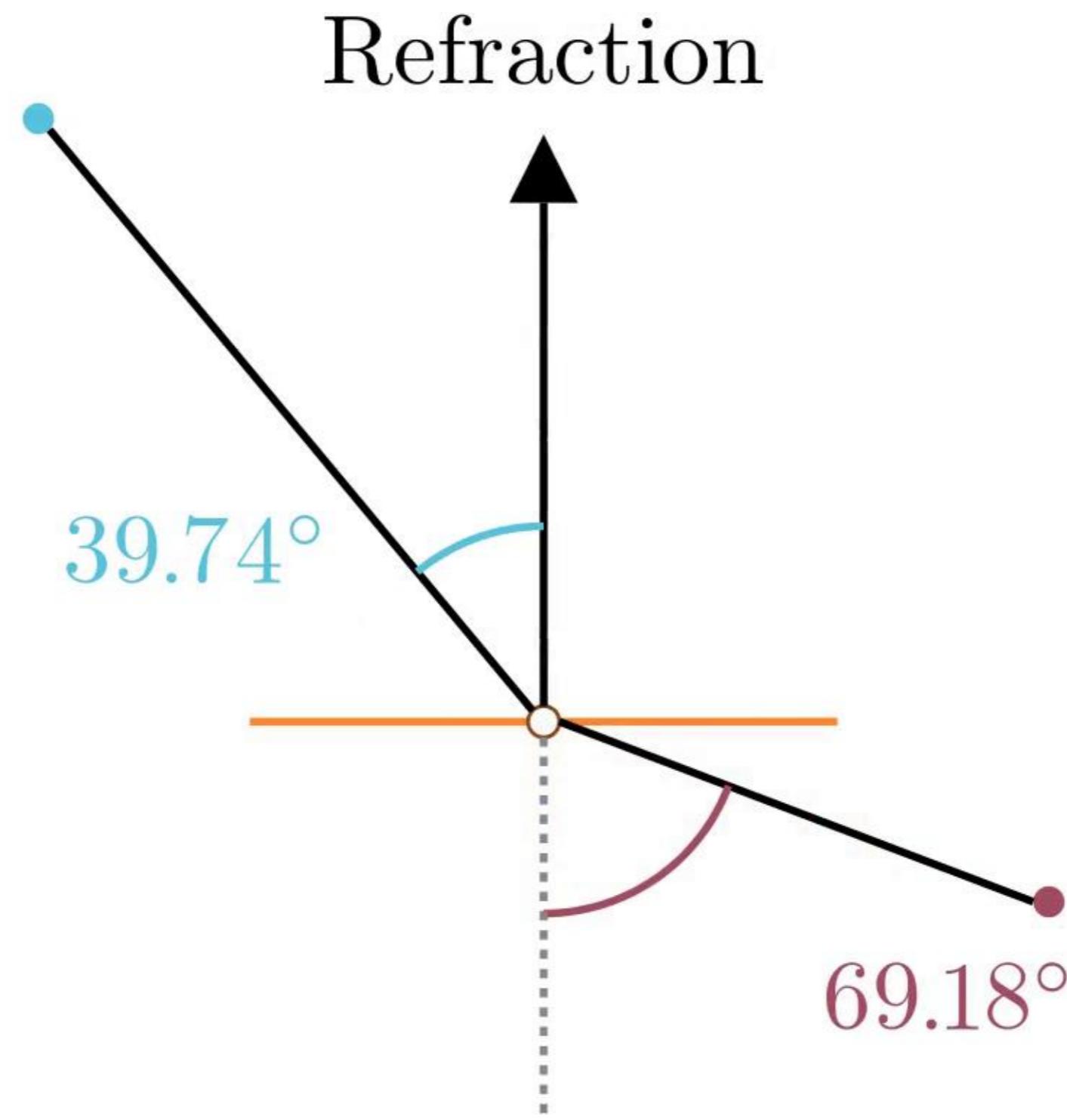
3. Min-Path-Tracing

$$\mathcal{I} \sim \frac{\langle \mathbf{i}, \hat{\mathbf{e}} \rangle}{\|\mathbf{i}\|} = \frac{\langle \mathbf{d}, \hat{\mathbf{e}} \rangle}{\|\mathbf{d}\|}$$



3. Min-Path-Tracing

$$\mathcal{I} \sim v_1 \sin(\theta_2) = v_2 \sin(\theta_1)$$



3. Min-Path-Tracing

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$$\underset{\boldsymbol{x} \in \mathbb{R}^{n_t}}{\text{minimize}} \quad \mathcal{C}(\boldsymbol{x}) := \|\mathcal{I}(\boldsymbol{x})\|^2 + \|\mathcal{F}(\boldsymbol{x})\|^2$$

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where n_t is the total number of unknowns

$$\mathcal{C}(\boldsymbol{x}) = 0$$

3. Min-Path-Tracing

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where n_t is the total number of unknowns

$$\mathcal{C}(\boldsymbol{x}) \leq \epsilon$$

3. Min-Path-Tracing

If we know a mapping s.t. $(x_k, y_k) \leftrightarrow t_k$

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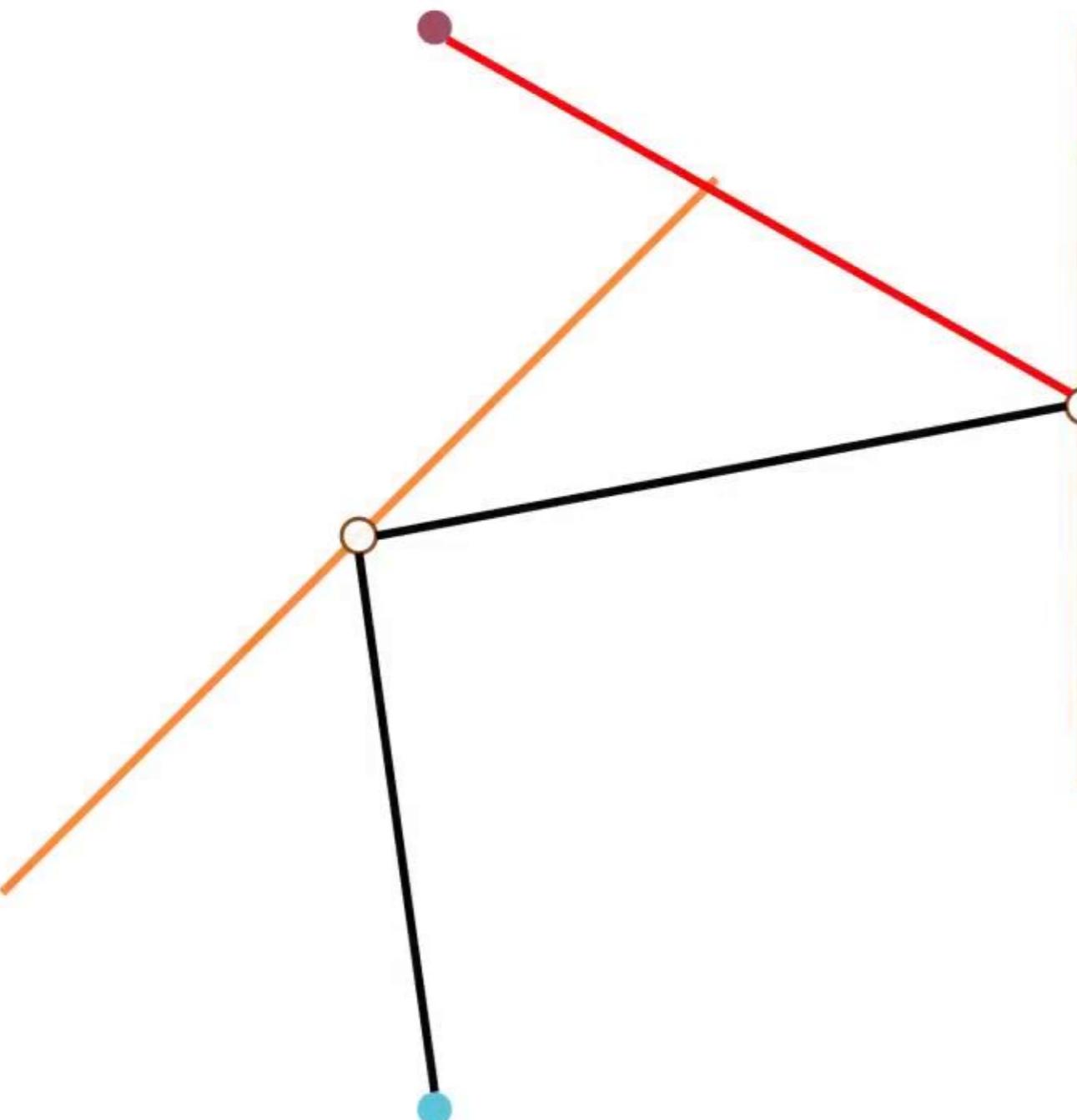
If we know a mapping s.t. $(x_k, y_k) \leftrightarrow t_k$

$$\underset{\mathcal{T} \in \mathbb{R}^{n_r}}{\text{minimize}} \mathcal{C}(\mathcal{X}(\mathcal{T})) := \|\mathcal{I}(\mathcal{X}(\mathcal{T}))\|^2$$

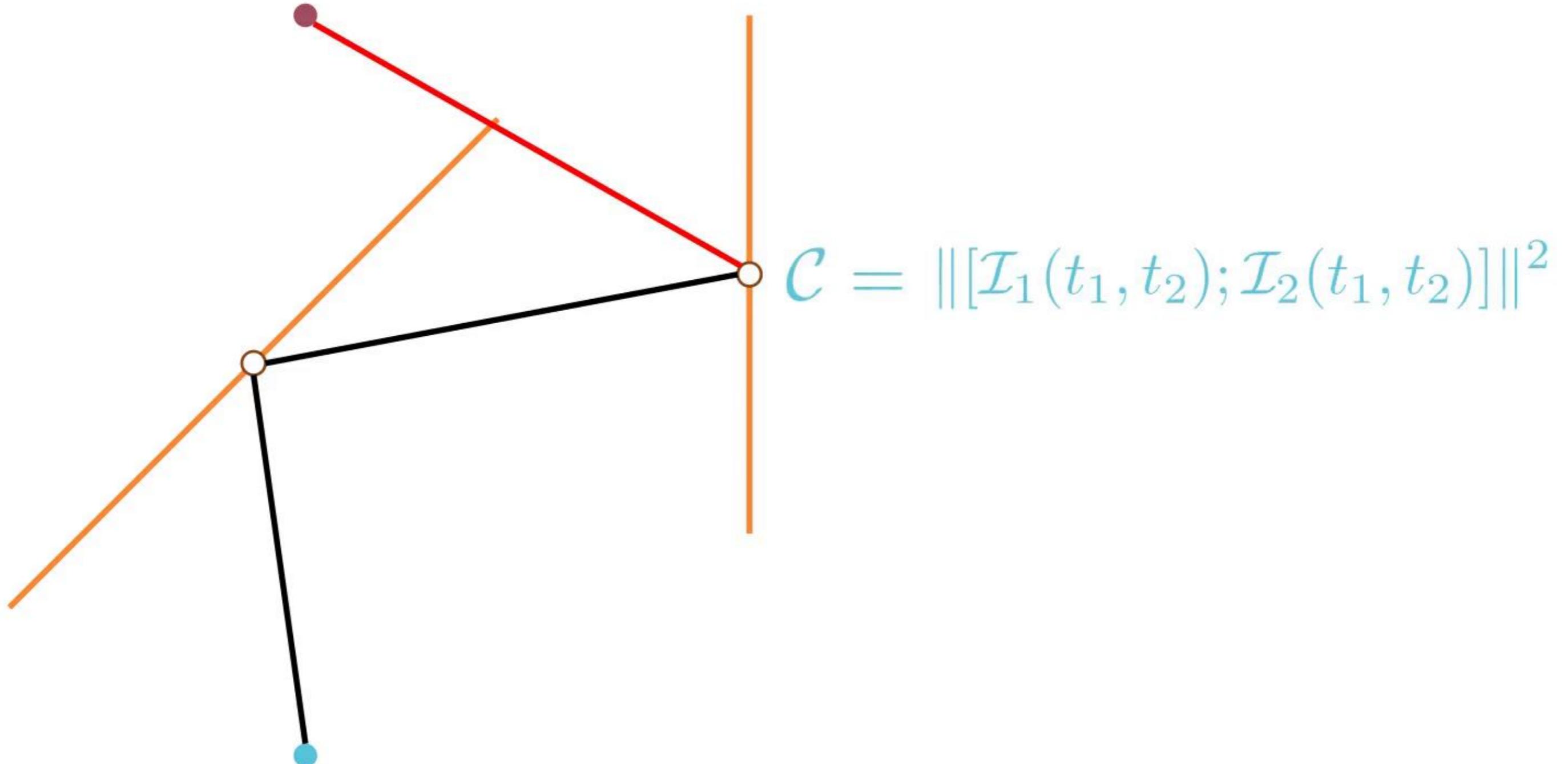
where n_r is the total number of (2d) reflections

$$\mathcal{C}(\mathcal{X}(\mathcal{T})) \leq \epsilon$$

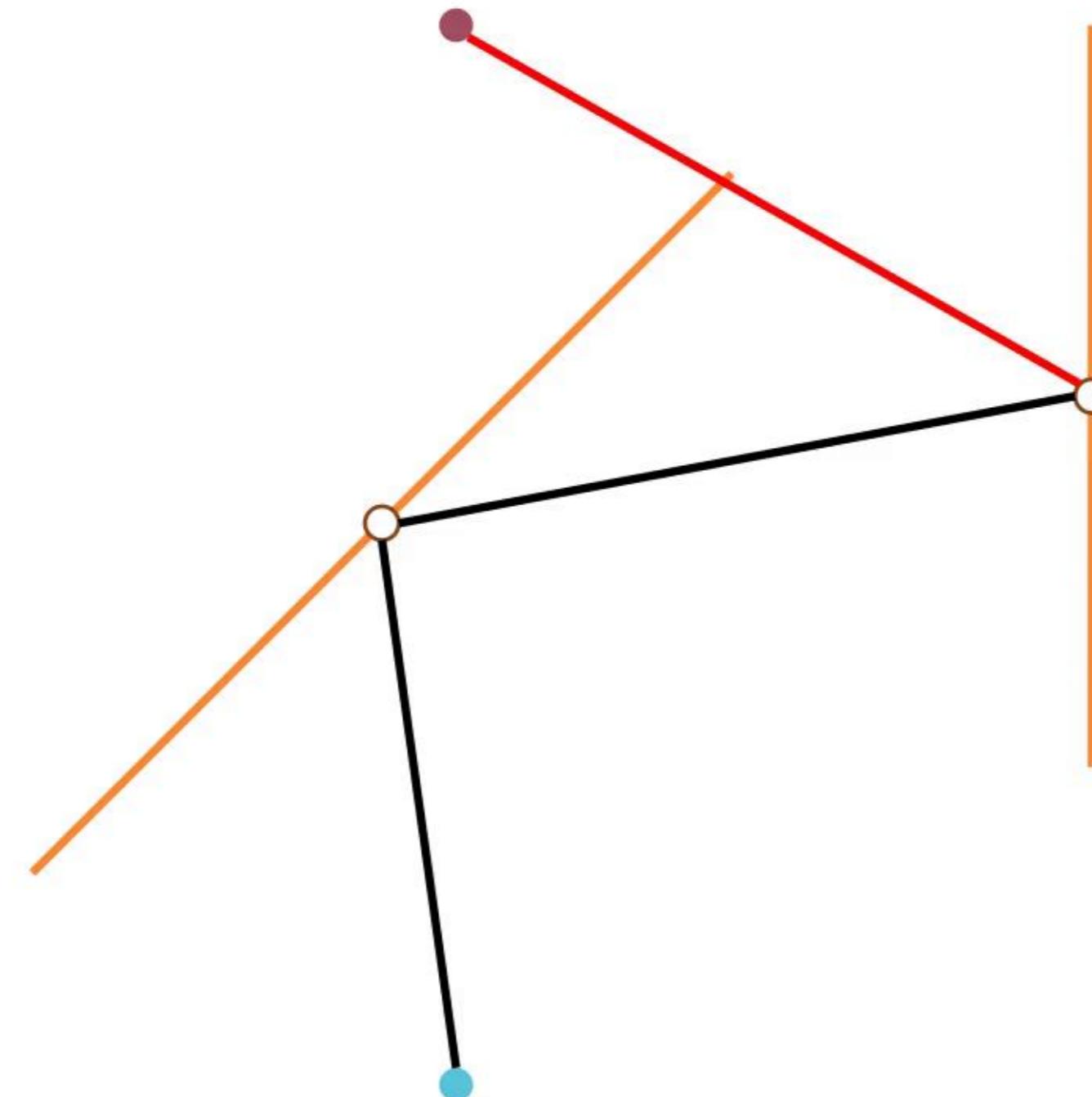
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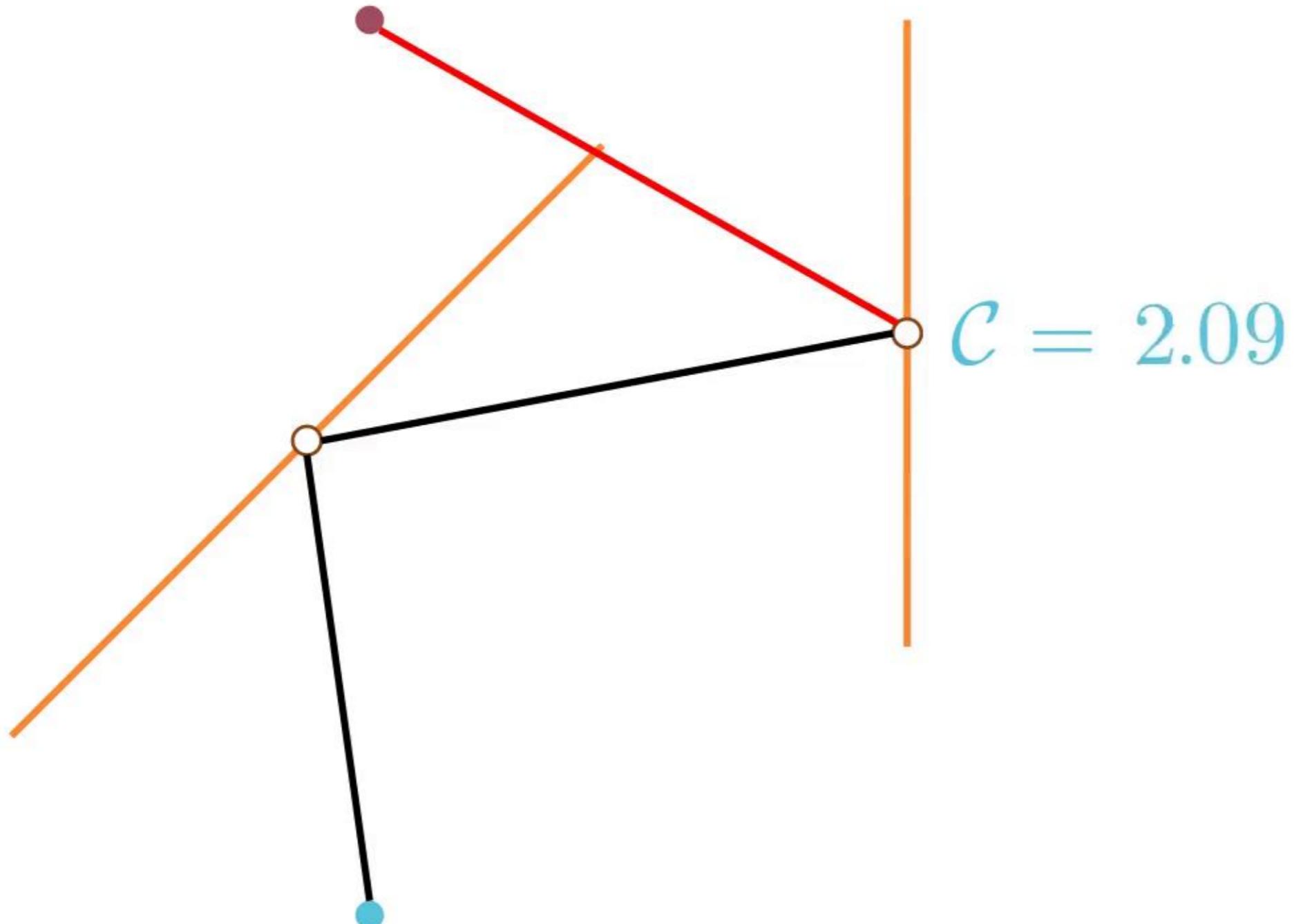


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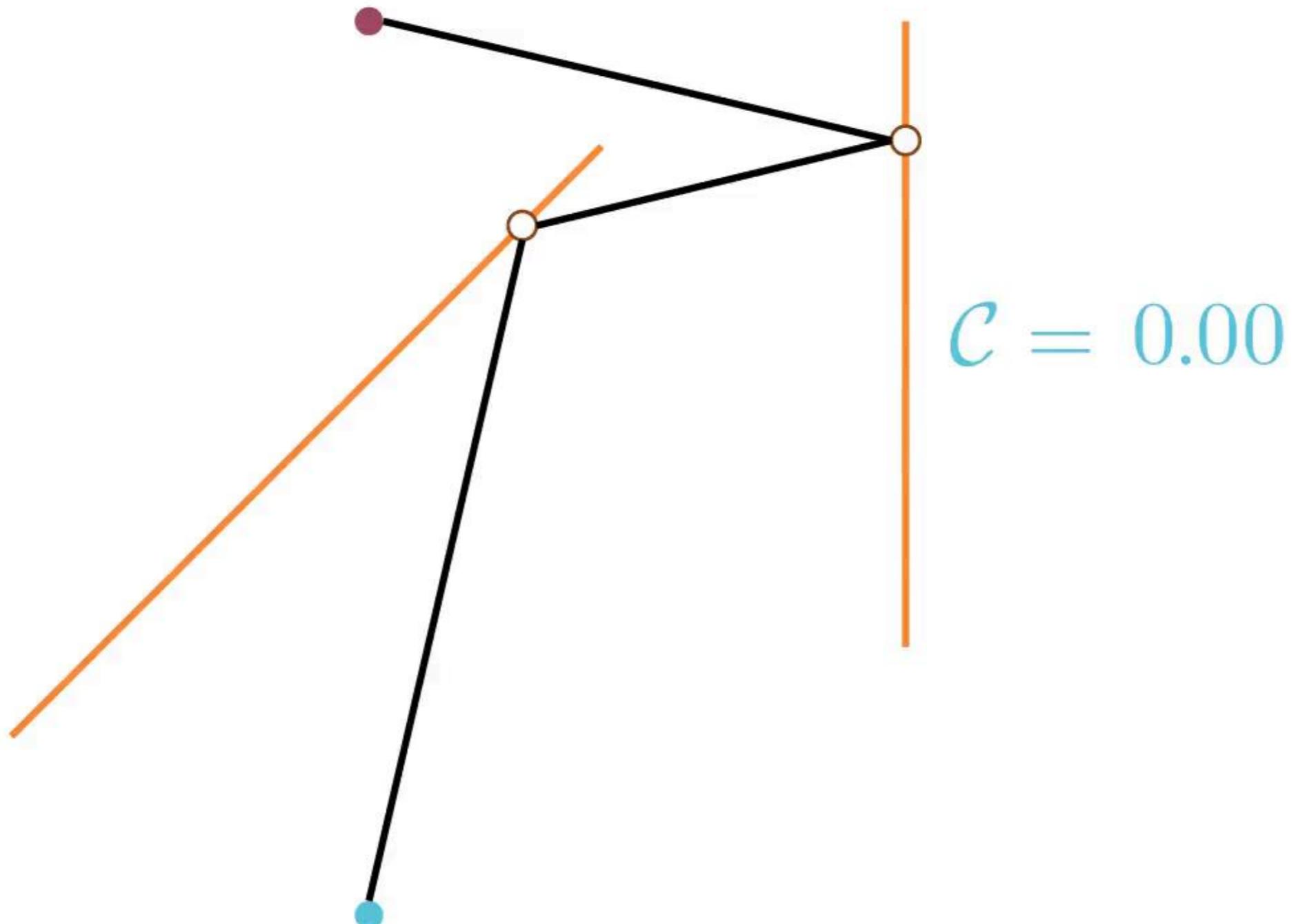


$$\mathcal{C} = \left| t_1 + \frac{(t_1 - 5) \sqrt{(t_1 - 2)^2 + (t_1 + 1)^2}}{\sqrt{(t_1 - 5)^2 + (t_1 - t_2)^2}} - \frac{\sqrt{2} (\sqrt{2}(t_1 - 2) - \sqrt{2}(t_1 + 1))}{2} - 2 \right|^2 + \left| t_1 + \frac{(t_1 - t_2) \sqrt{(t_1 - 2)^2 + (t_1 + 1)^2}}{\sqrt{(t_1 - 5)^2 + (t_1 - t_2)^2}} + \frac{\sqrt{2} (\sqrt{2}(t_1 - 2) - \sqrt{2}(t_1 + 1))}{2} + 1 \right|^2 + \left(-t_1 + t_2 + \frac{(t_2 - 4) \sqrt{(t_1 - 5)^2 + (t_1 - t_2)^2}}{\sqrt{(t_2 - 4)^2 + 9}} \right)^2 + \left(t_1 + \frac{3 \sqrt{(t_1 - 5)^2 + (t_1 - t_2)^2}}{\sqrt{(t_2 - 4)^2 + 9}} - 5 \right)^2$$

3. Min-Path-Tracing

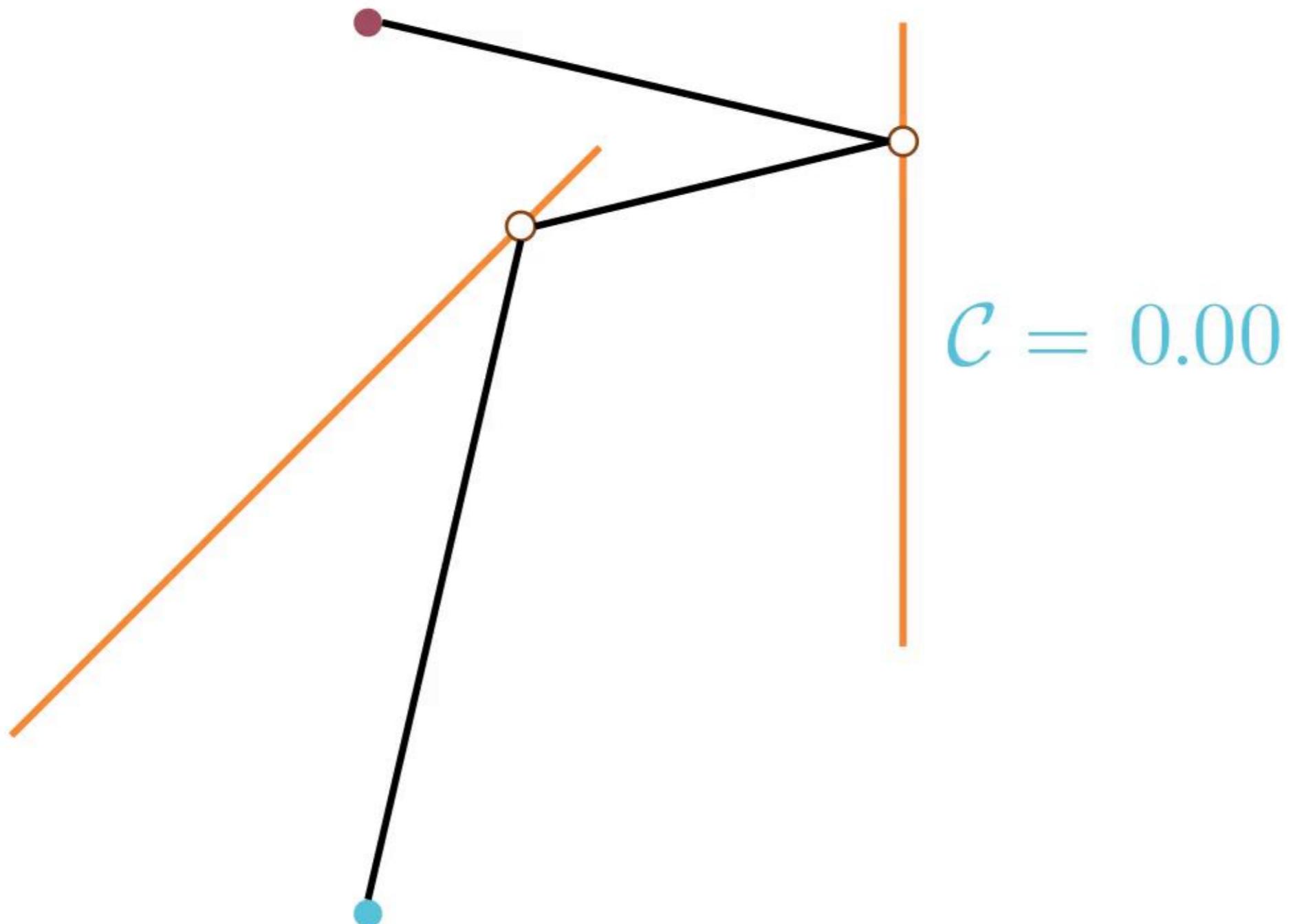


3. Min-Path-Tracing



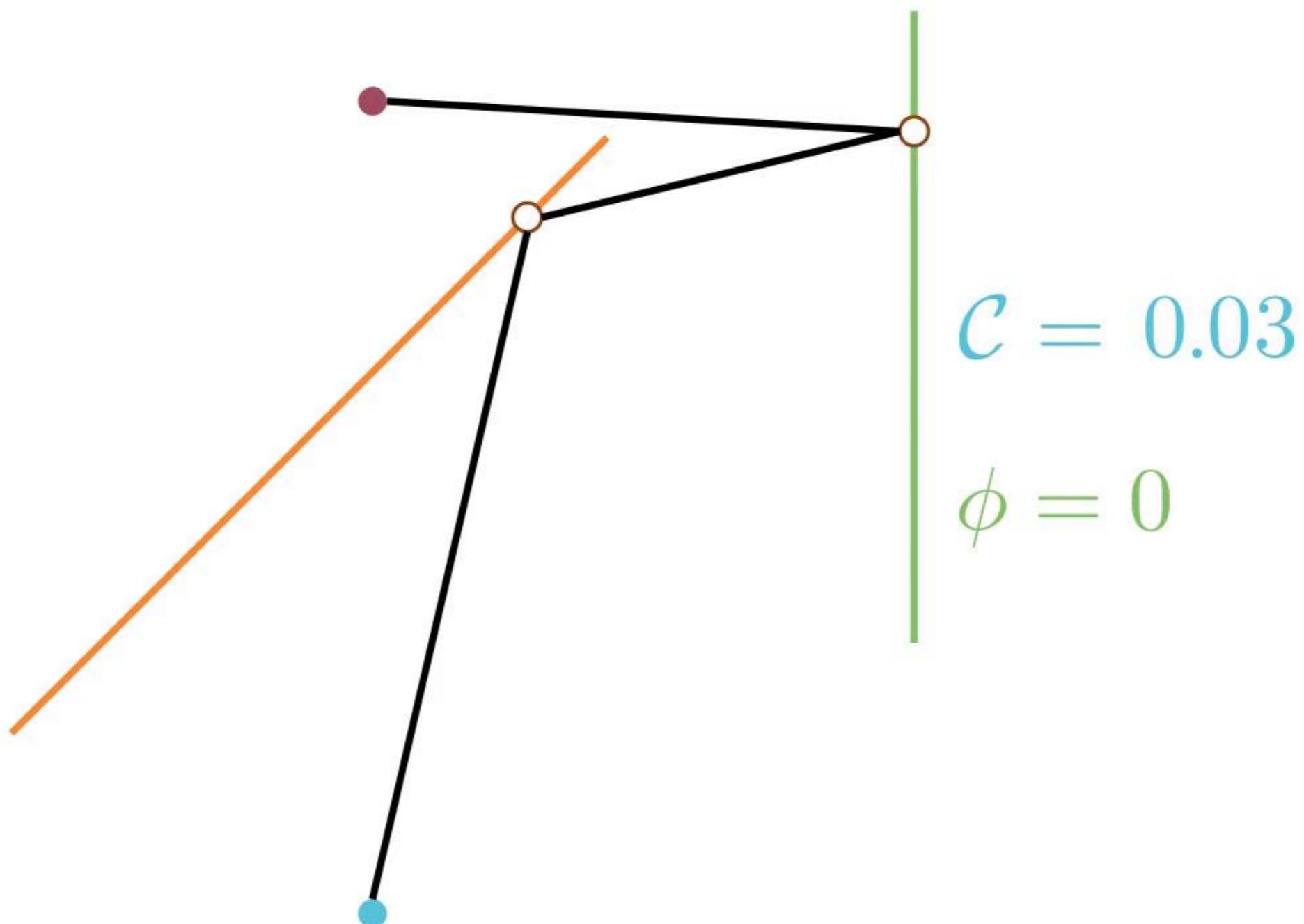
3. Min-Path-Tracing

What if we had a metasurface?



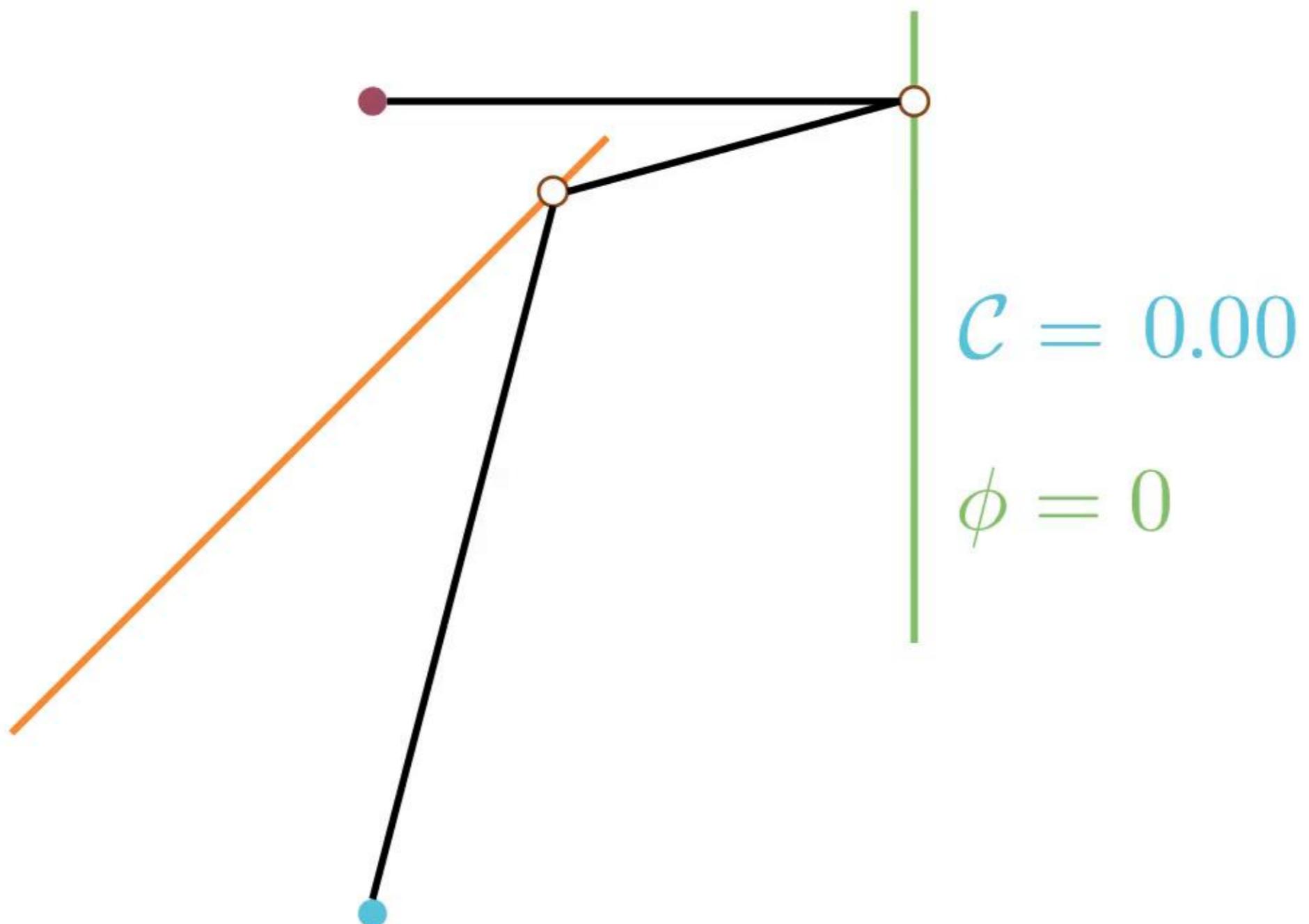
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What if we had a metasurface?



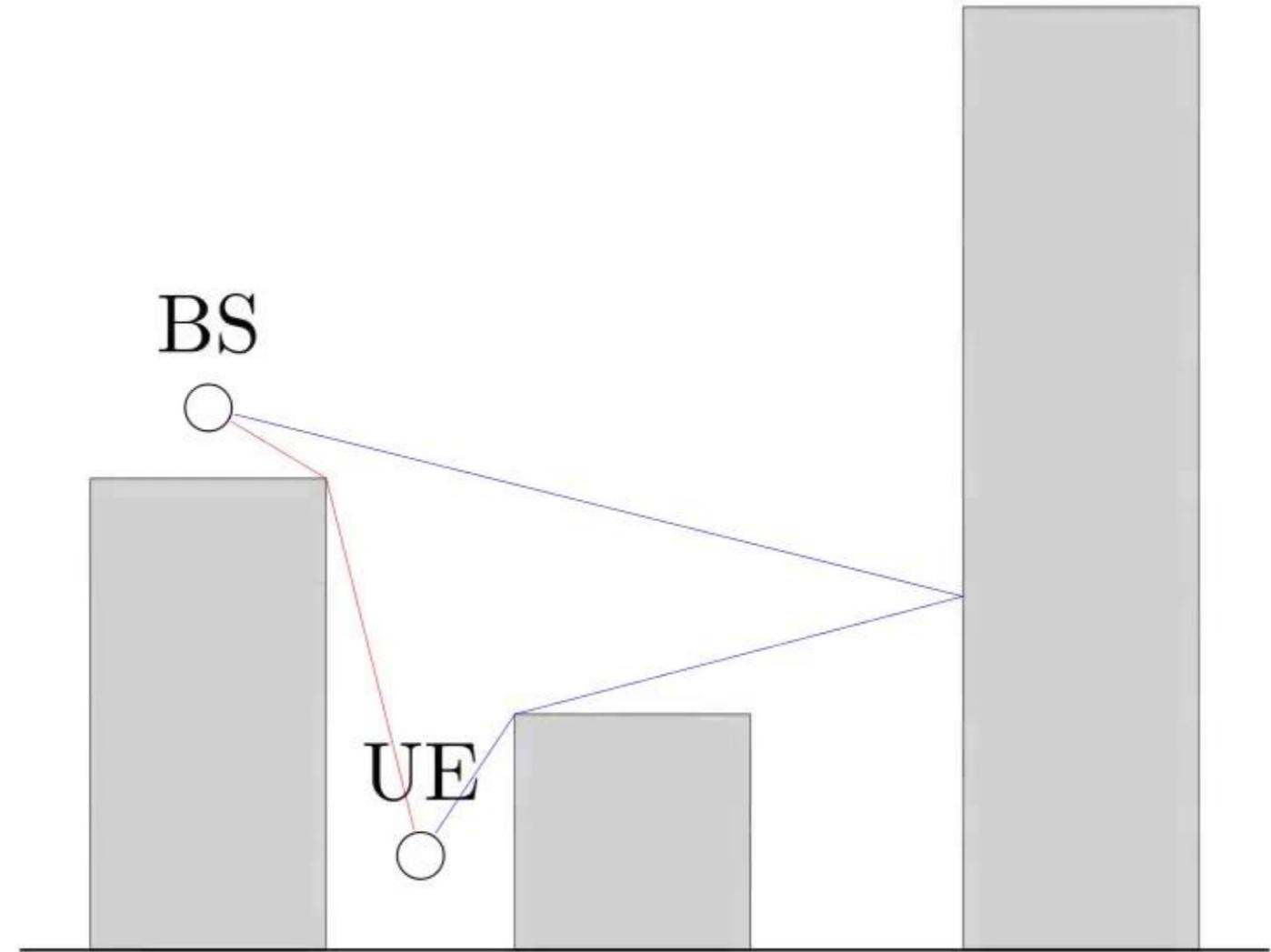
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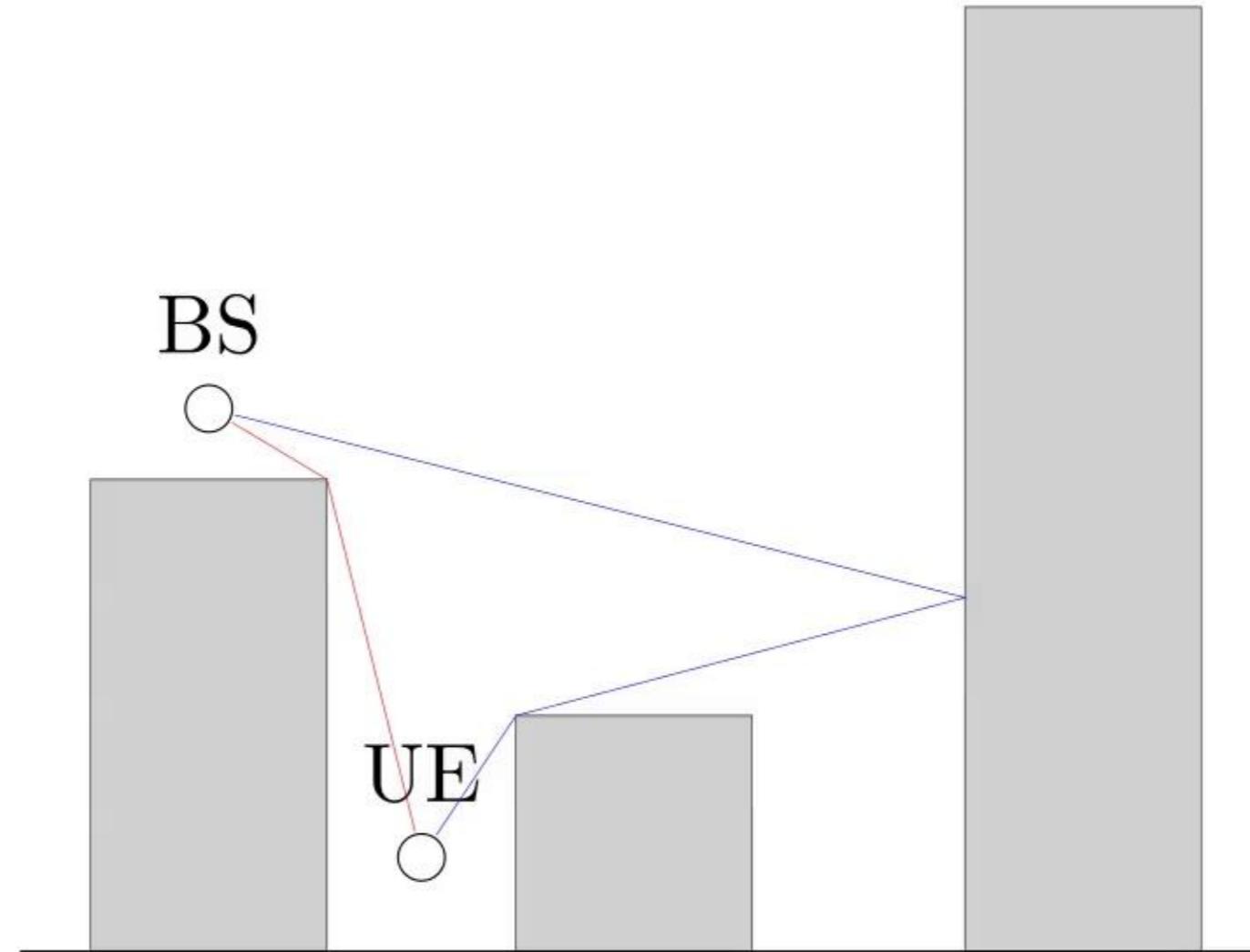


3. Min-Path-Tracing

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3. Min-Path-Tracing



| Number of interactions | 1 | 2 | 3 |
|-------------------------|------------|------|------|
| Interactions list | D | RD | DR |
| E/E_{LOS} (dB) | -32 | -236 | -242 |

| Number of interactions | 4 | 5 | 6 |
|-------------------------|------------|------|------|
| Interactions list | DD | RRD | RDR |
| E/E_{LOS} (dB) | -44 | -231 | -246 |

| Number of interactions | 7 | 8 | 9 |
|-------------------------|------------|------|-----|
| Interactions list | RDD | DRR | DRD |
| E/E_{LOS} (dB) | -69 | -212 | -72 |

| Number of interactions | 10 | 11 | 12 |
|-------------------------|-----|-----|----|
| Interactions list | DDR | DDD | |
| E/E_{LOS} (dB) | -81 | -60 | |

3. Min-Path-Tracing

Summary:

3. Min-Path-Tracing

Summary:

Pros

- Any geometry (but requires more info.)
- Any # of reflect., diff., and refract.
- Allows for multiple solutions
- Optimizer can be chosen

3. Min-Path-Tracing

Summary:

Pros

- Any geometry (but requires more info.)
- Any # of reflect., diff., and refract.
- Allows for multiple solutions
- Optimizer can be chosen

Cons

- In general, problem is not convex
- Slower - $\mathcal{O}(k \cdot n)$

3. Min-Path-Tracing

MPT \neq Fermat's path:

$$\underset{\boldsymbol{x} \in \mathbb{R}^{n_t}}{\text{minimize}} \quad \mathcal{L}(\boldsymbol{x}) := \sum_i \|\boldsymbol{x}_i - \boldsymbol{x}_{i-1}\|$$

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**A Novel Ray Tracing Algorithm for Scenarios Comprising
Pre-Ordered Multiple Planar Reflectors, Straight Wedges,
and Vertices**

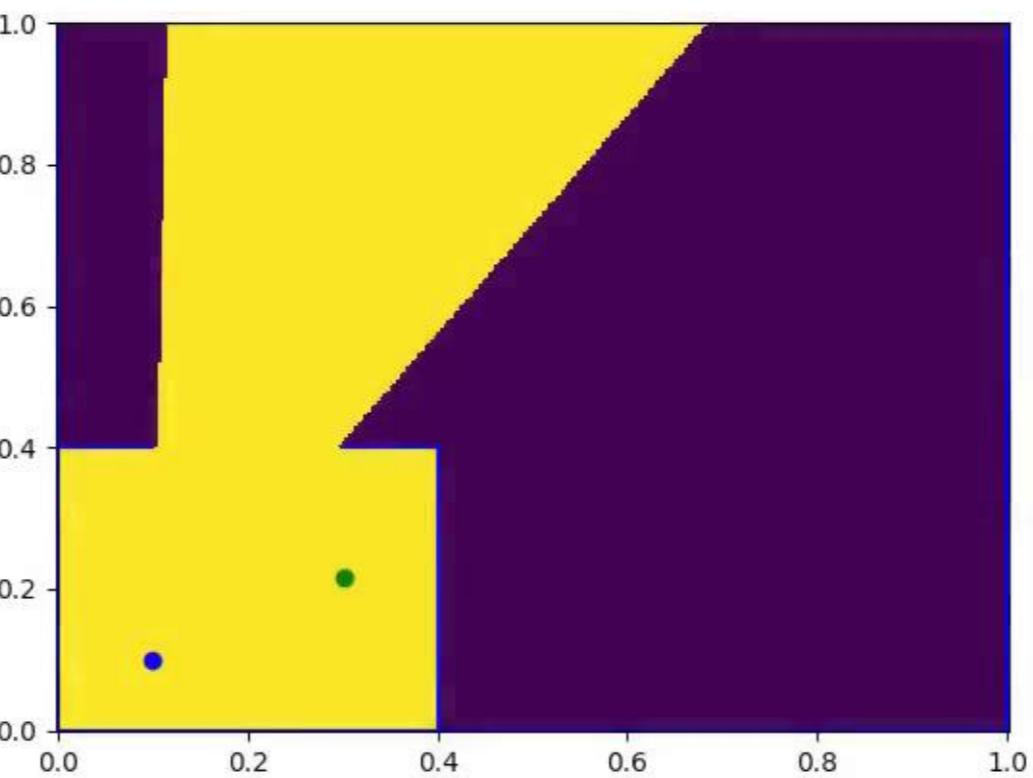
Federico Puggelli, Giorgio Carluccio, and Matteo Albani

4. About differentiability

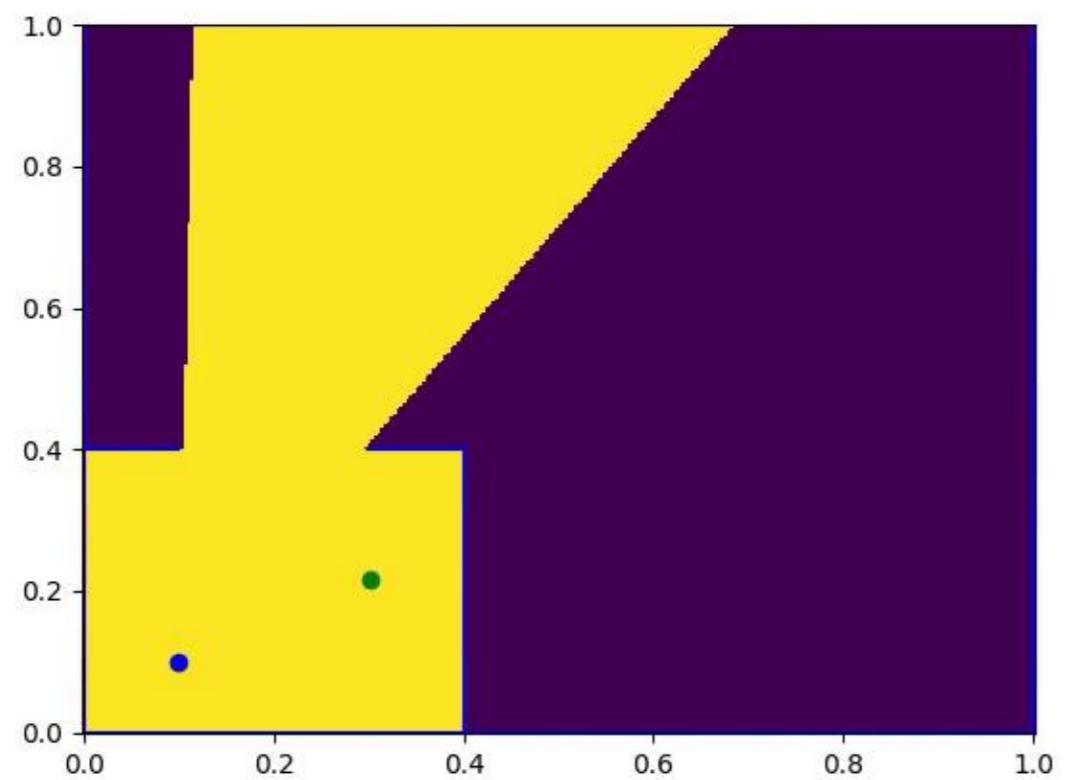
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$$I = \sum_p^{\text{paths}} f(p, \theta)$$

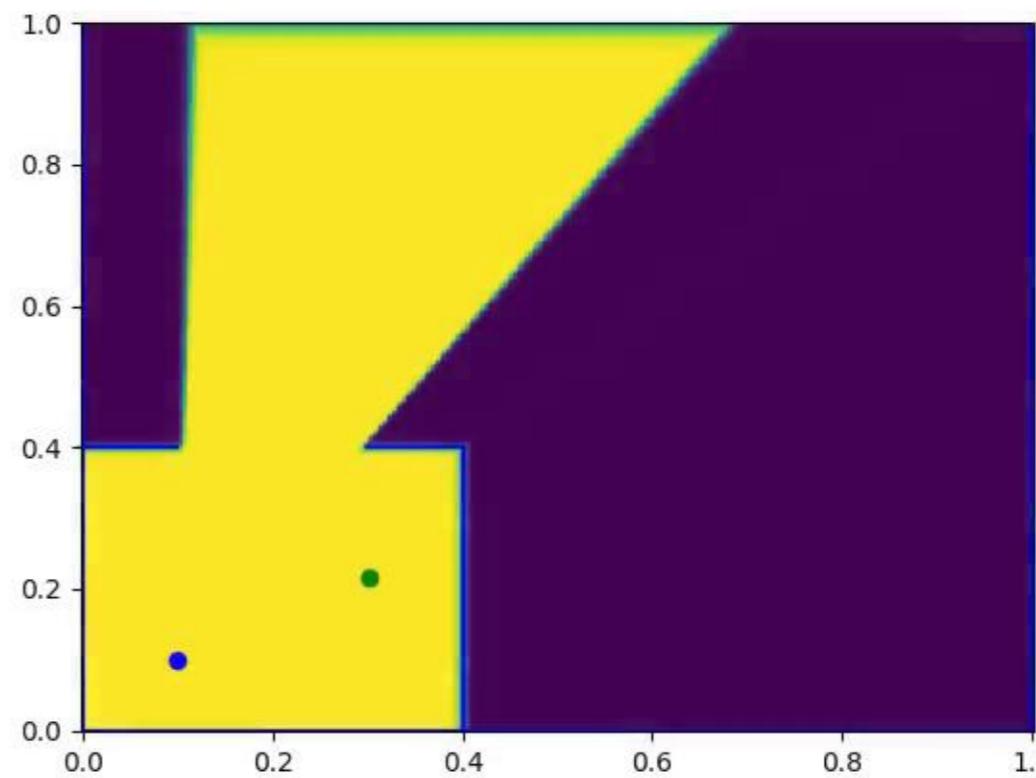
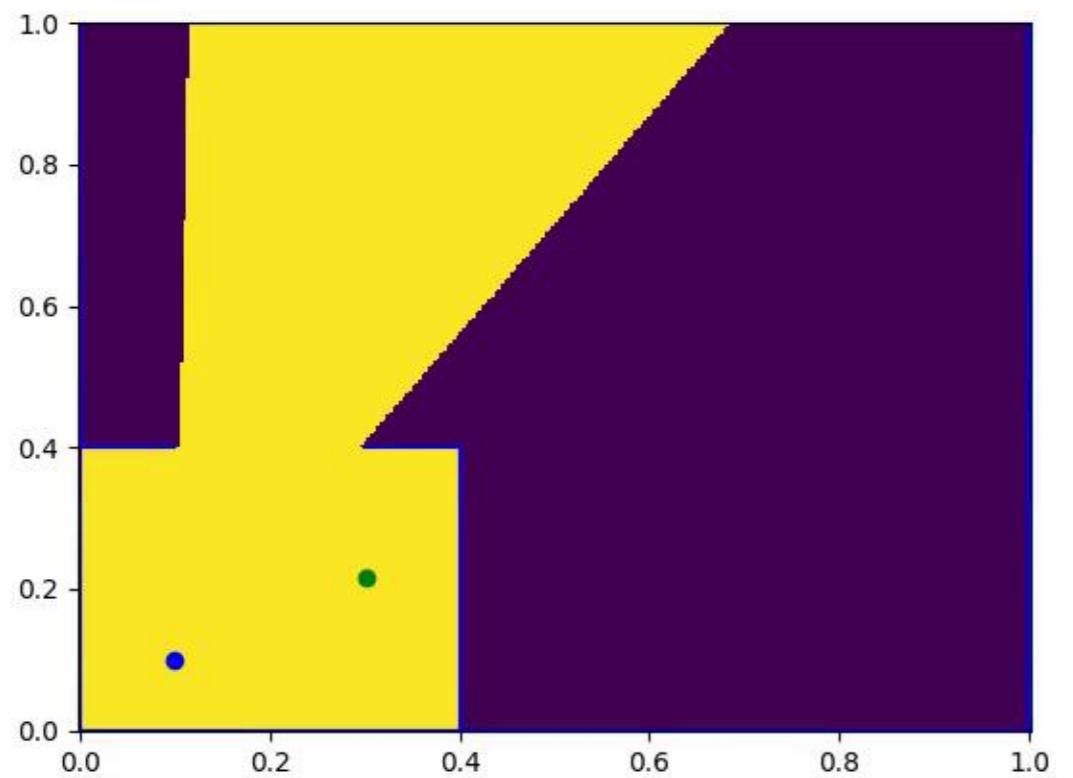
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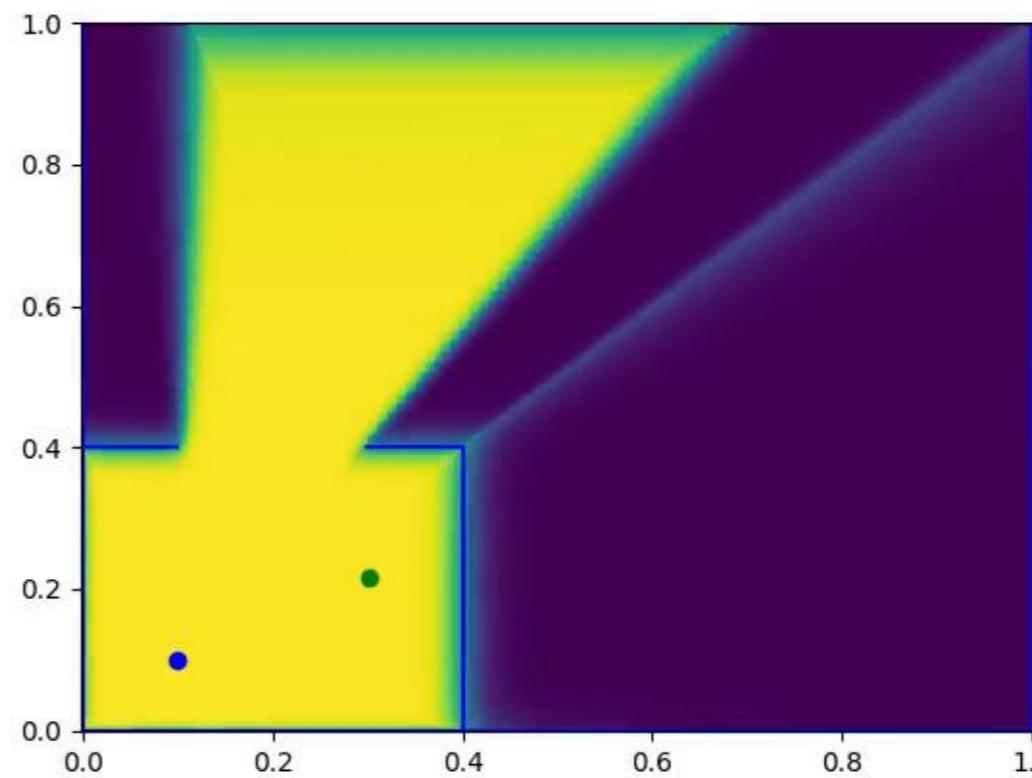
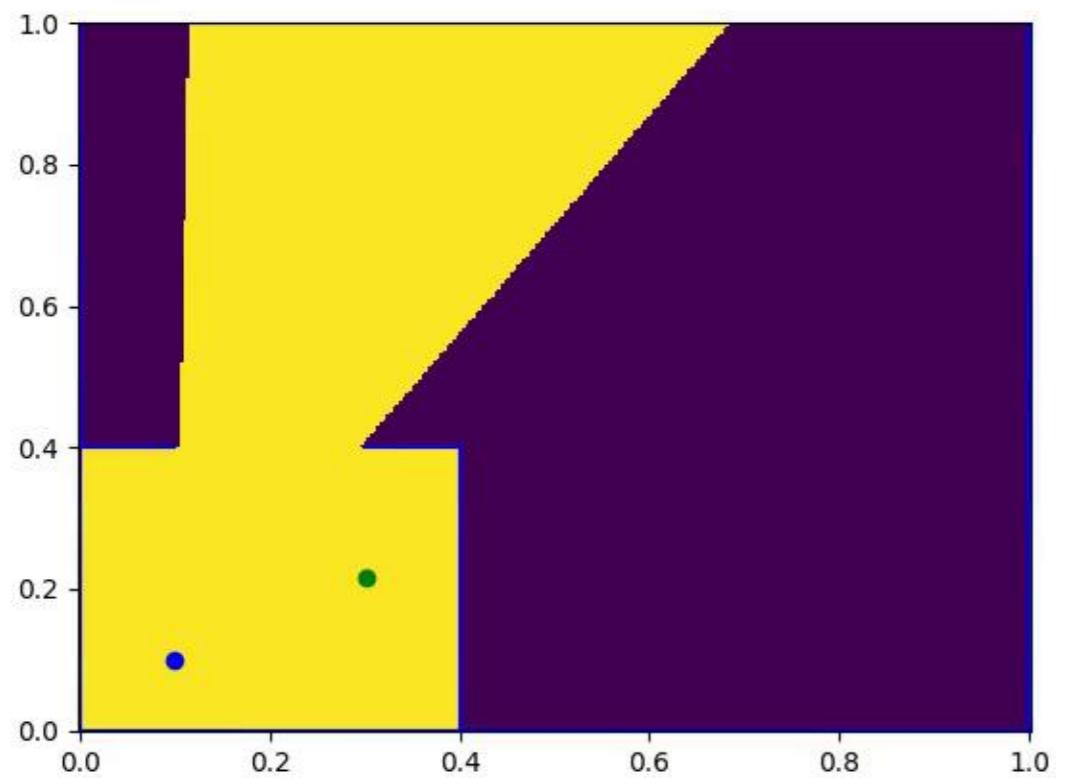
5. Current work



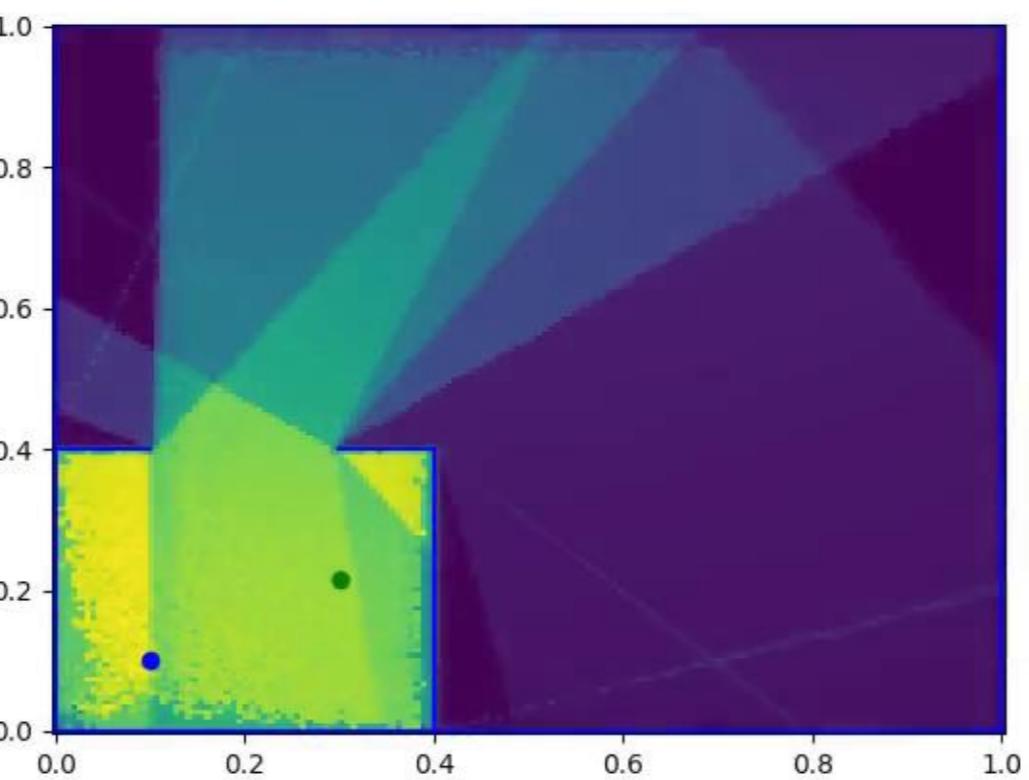
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Thanks for listening!