

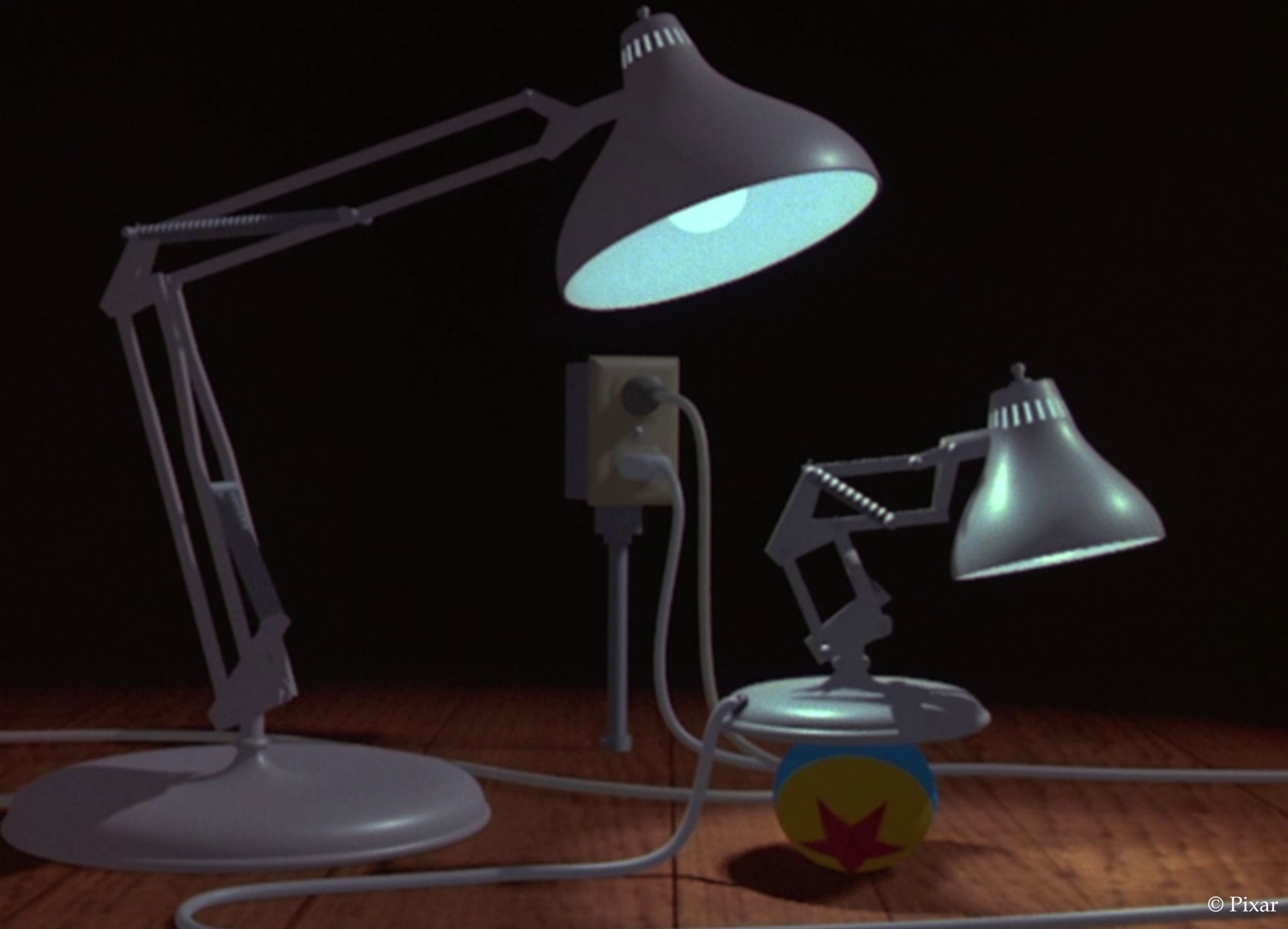
# Modern Foundations of Light Transport Simulation

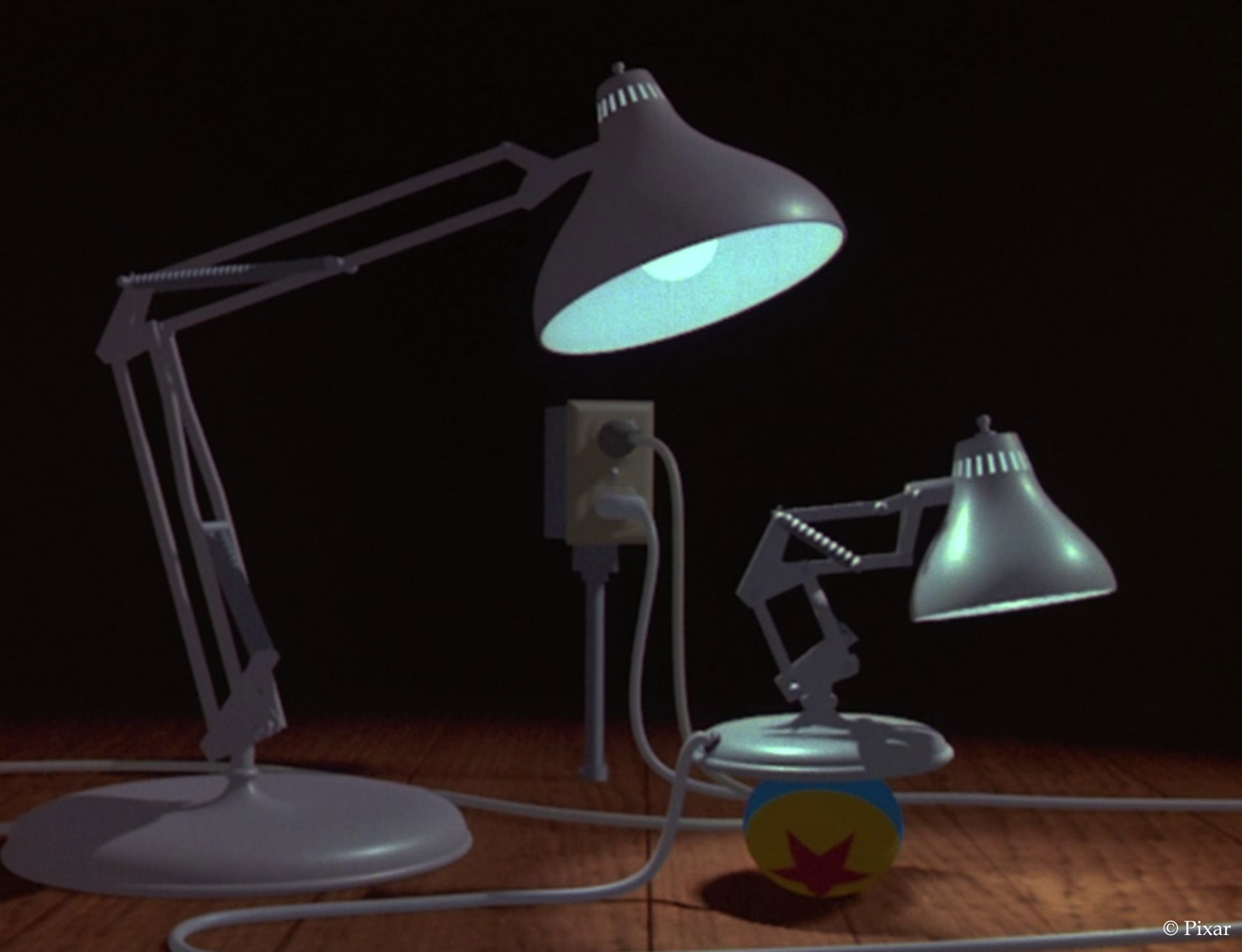
Christian Lessig

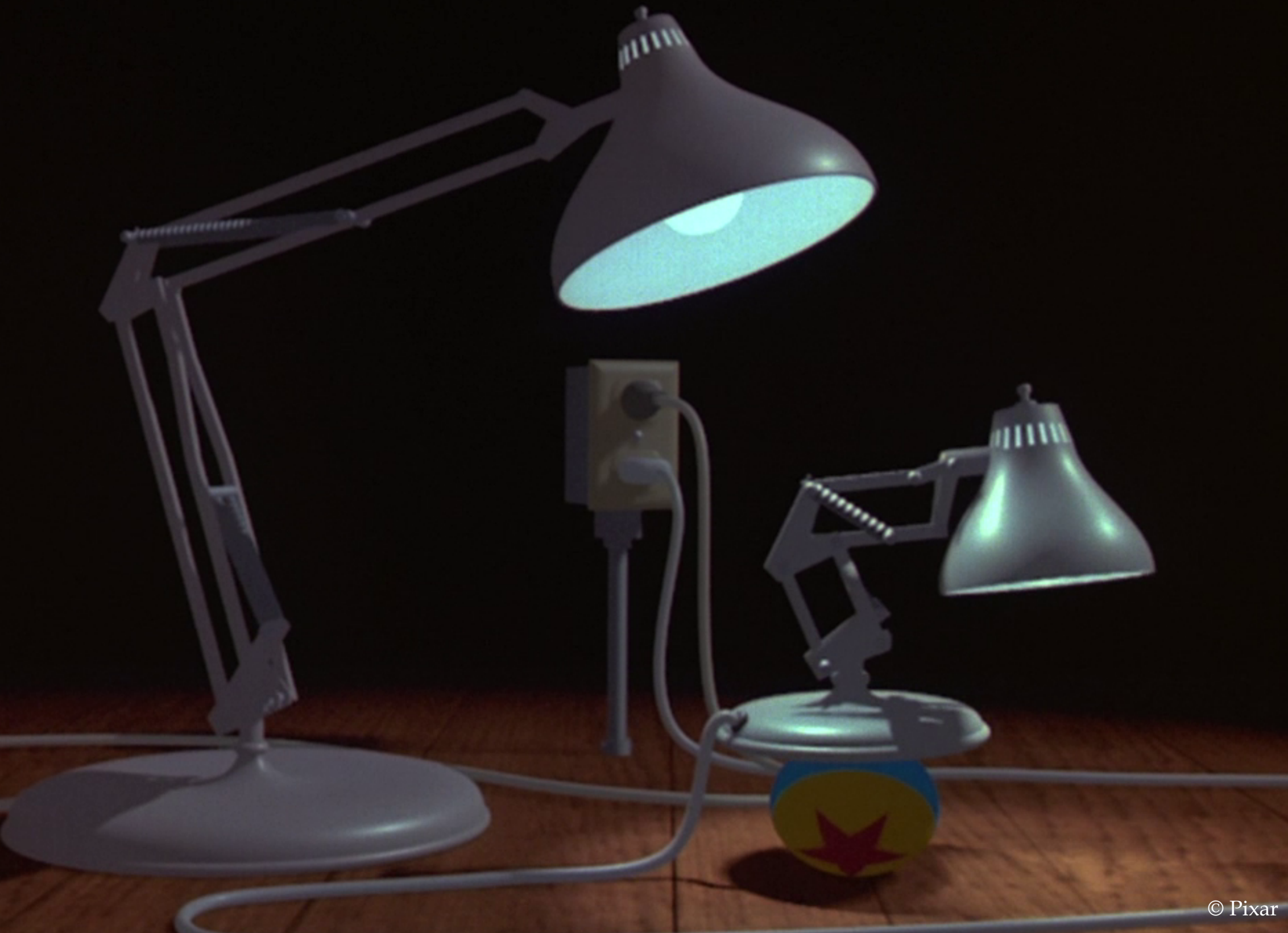
Computing + Mathematical Sciences, California Institute of Technology

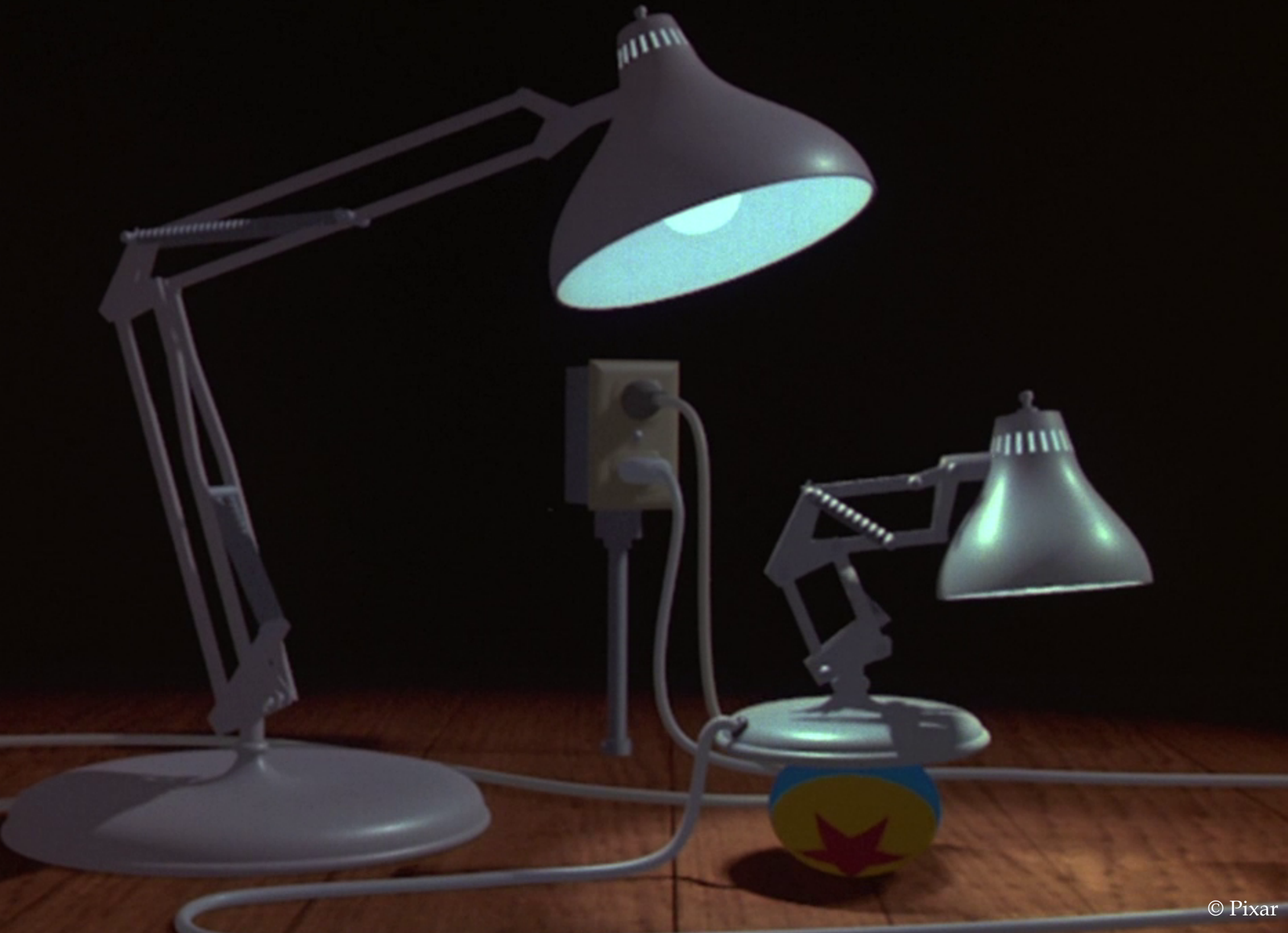
*“Theoretical photometry constitutes a case of ‘arrested development’, and has remained basically unchanged since 1760 while the rest of physics has swept triumphantly ahead. In recent years, however, the increasing needs [. . .] have made the absurdly antiquated concepts of traditional photometric theory more and more untenable.”<sup>1</sup>*

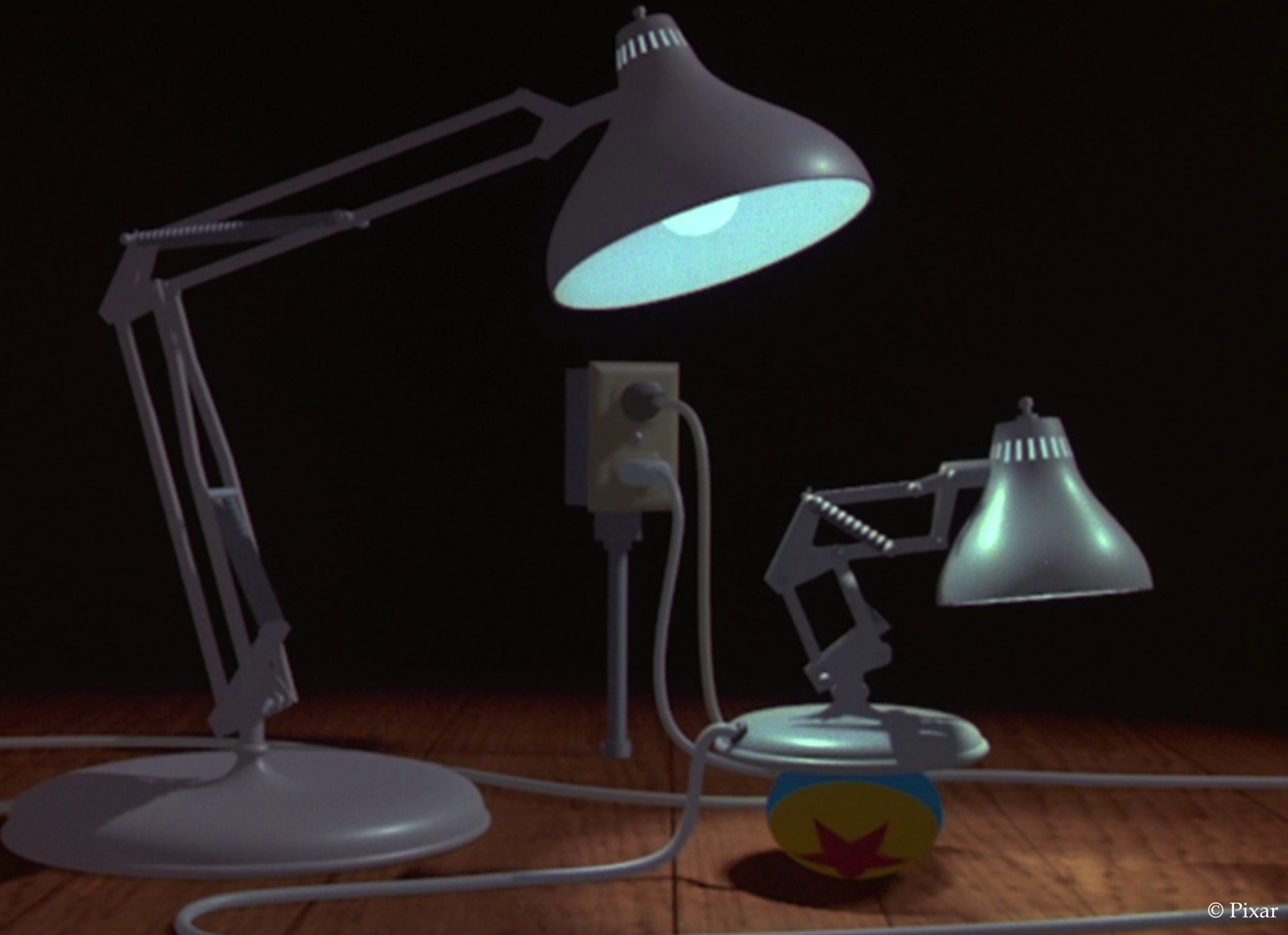
1. Gershun, A. *The Light Field*, Translated by P. Moon, G. Timoshenko, Originally published in Russian (Moscow 1936). *Journal of Mathematics and Physics* 18 (1939): 51-151, from the translators preface.

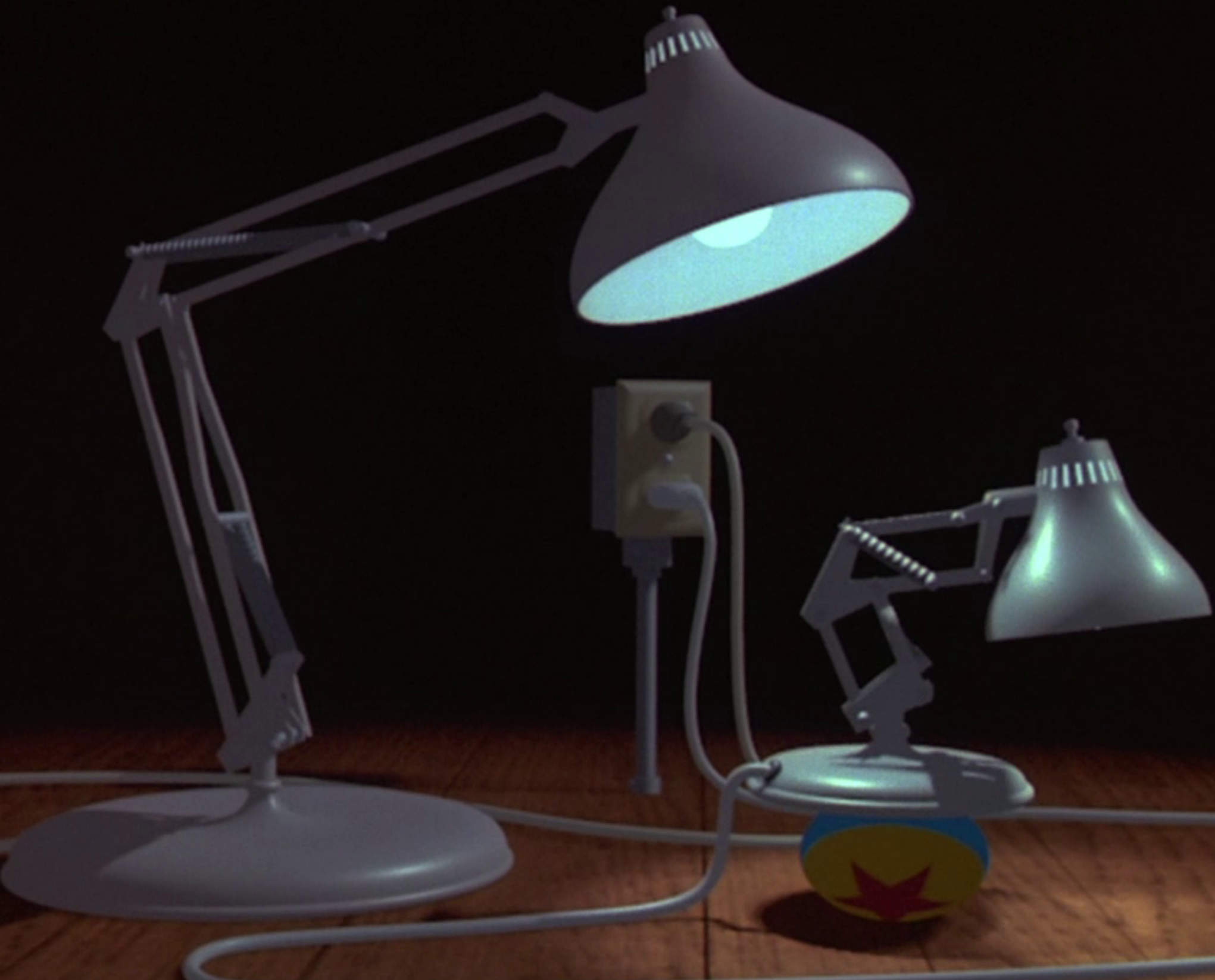




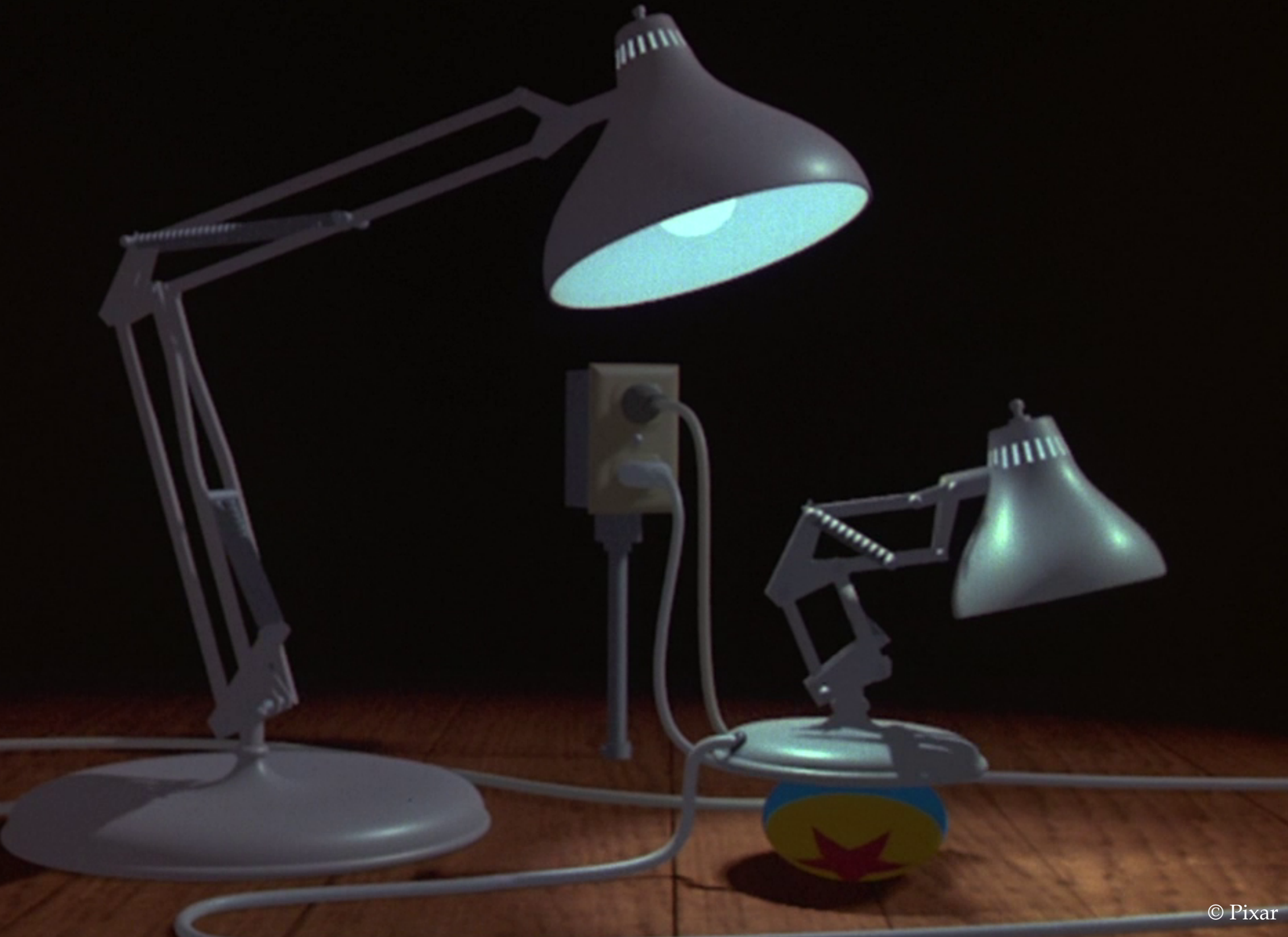


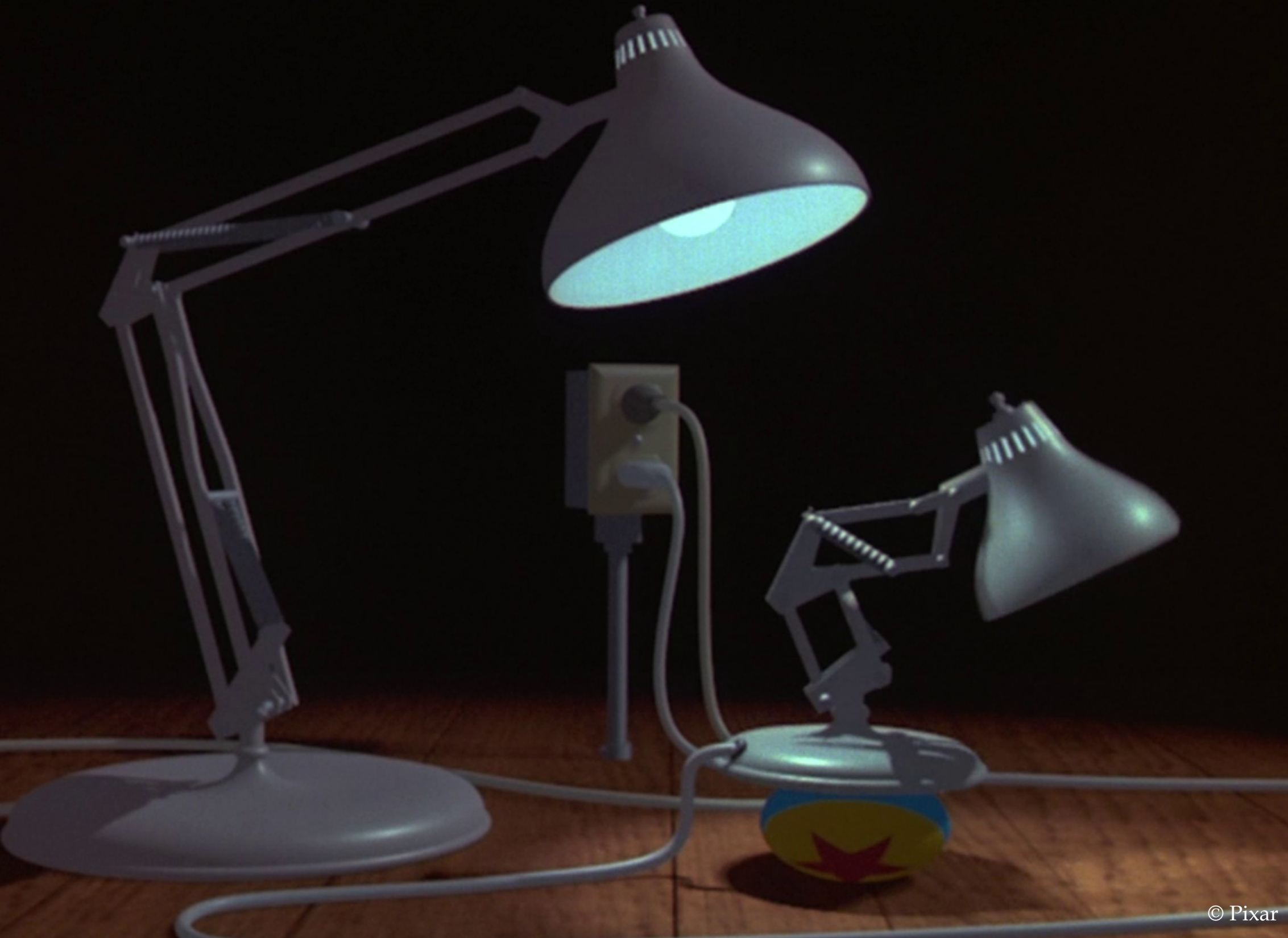


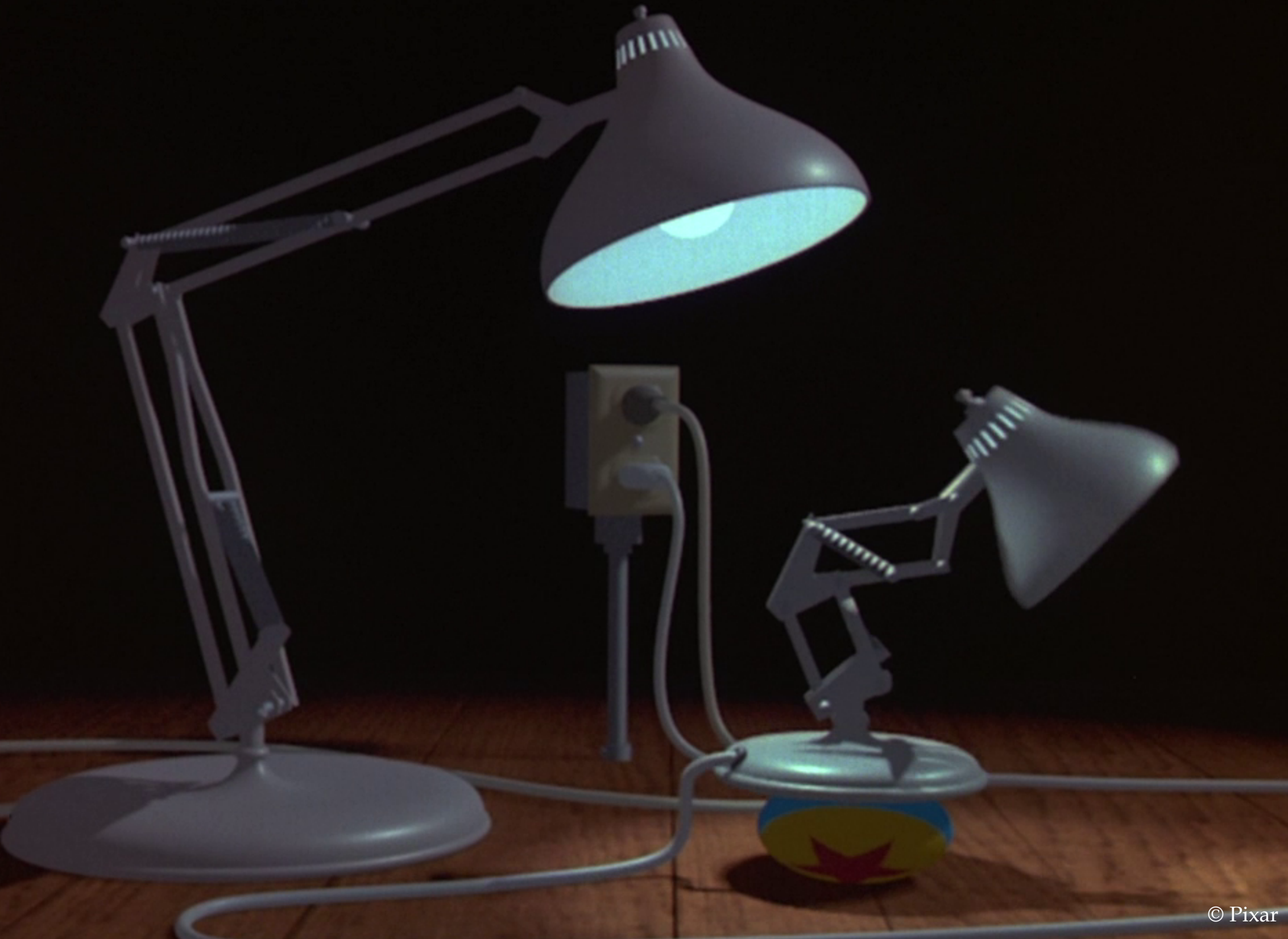


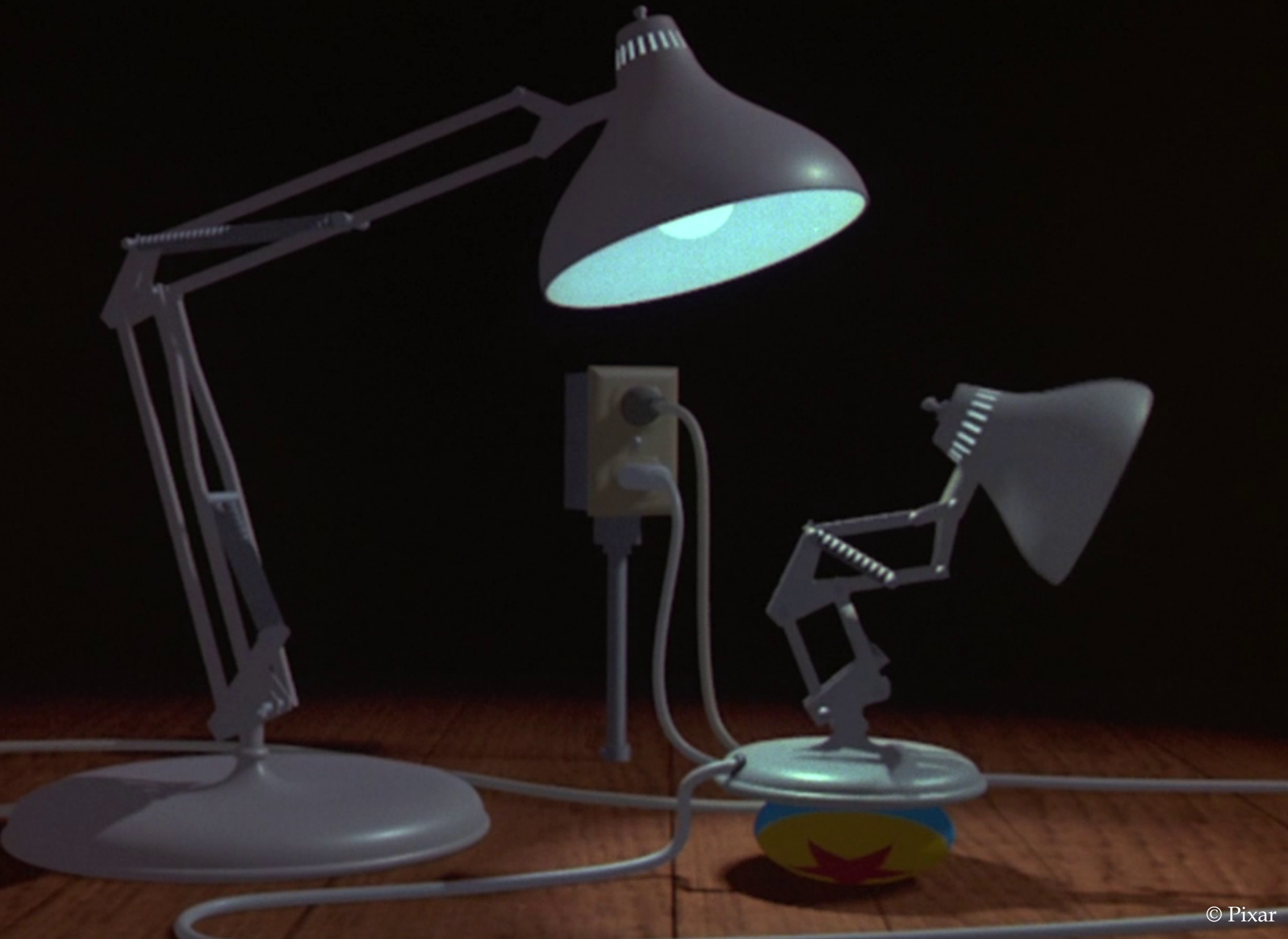












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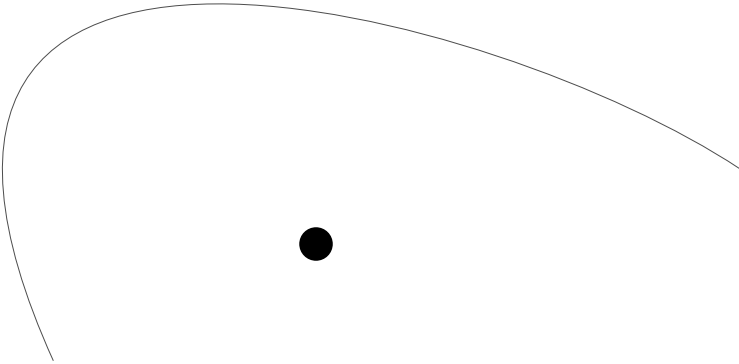
configuration space  $Q$ 

$$\frac{\partial}{\partial t} \begin{pmatrix} \vec{E} \\ \vec{H} \end{pmatrix} = \begin{pmatrix} 0 & -\frac{1}{\epsilon} \nabla \times \\ \frac{1}{\mu} \nabla \times & 0 \end{pmatrix} \begin{pmatrix} \vec{E} \\ \vec{H} \end{pmatrix}$$

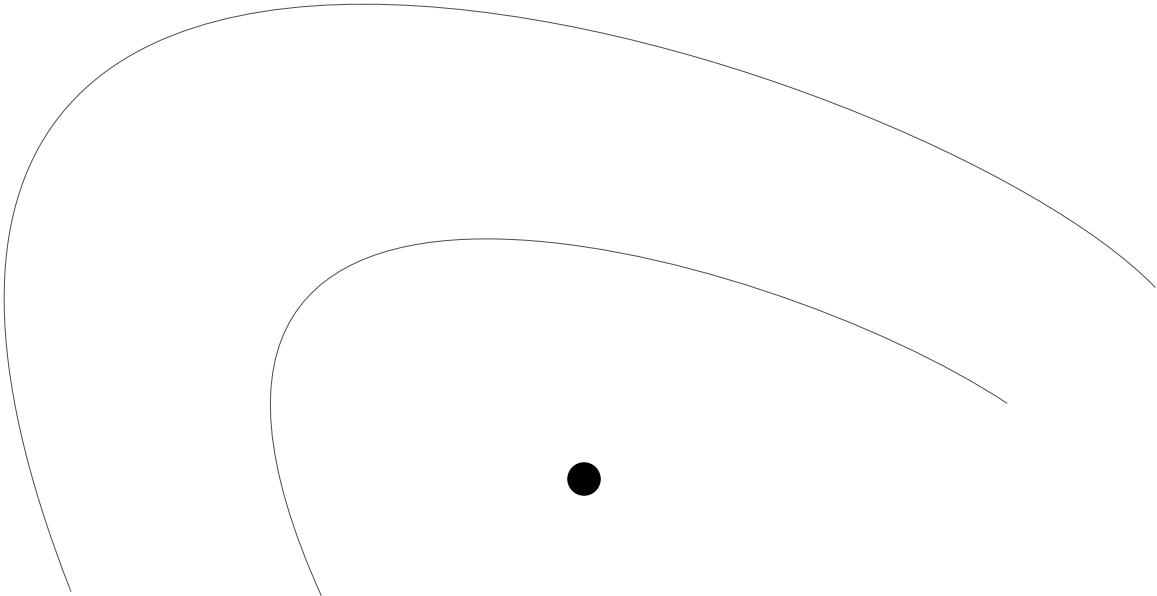
## electromagnetic theory

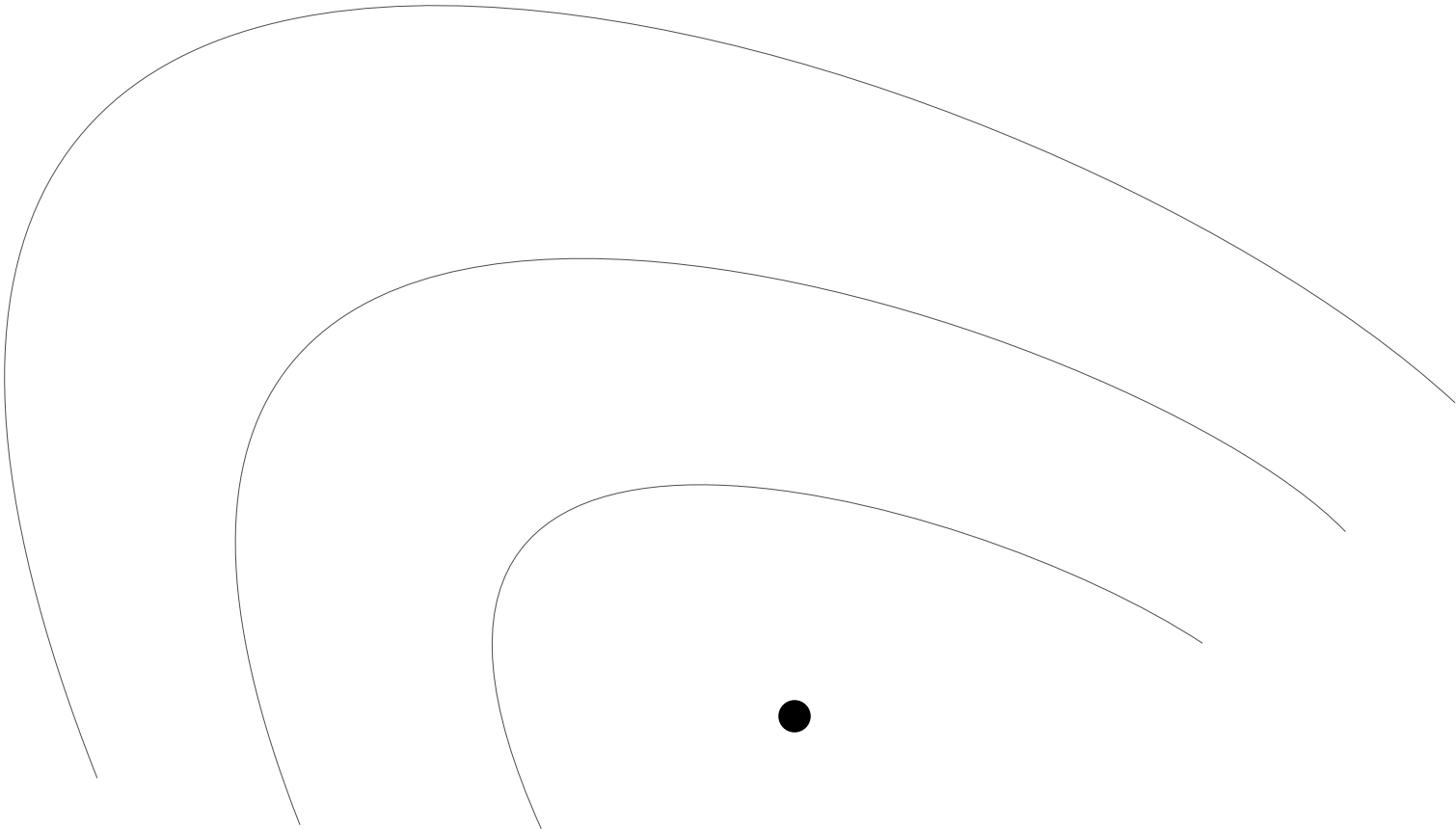
configuration space  $Q$ 

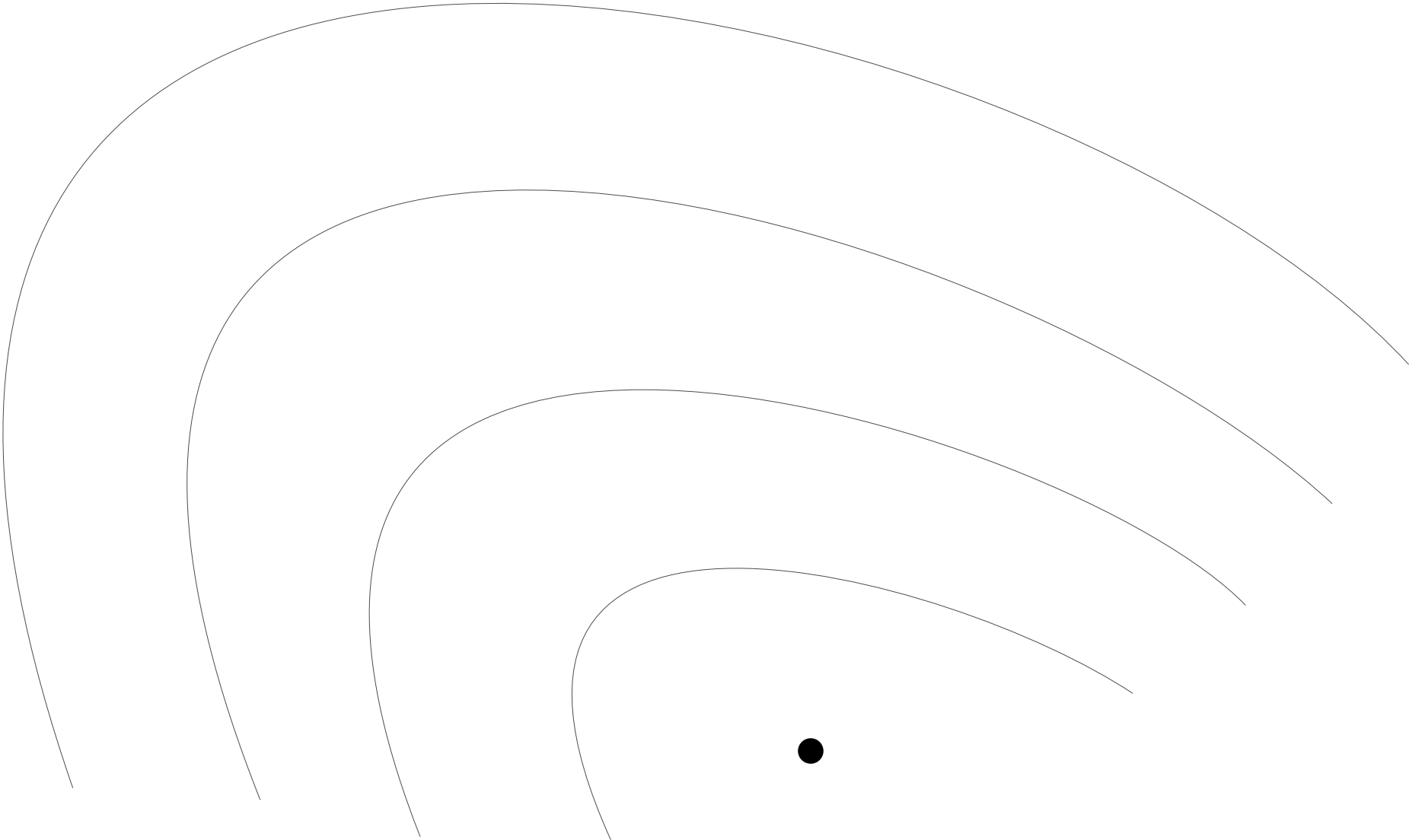
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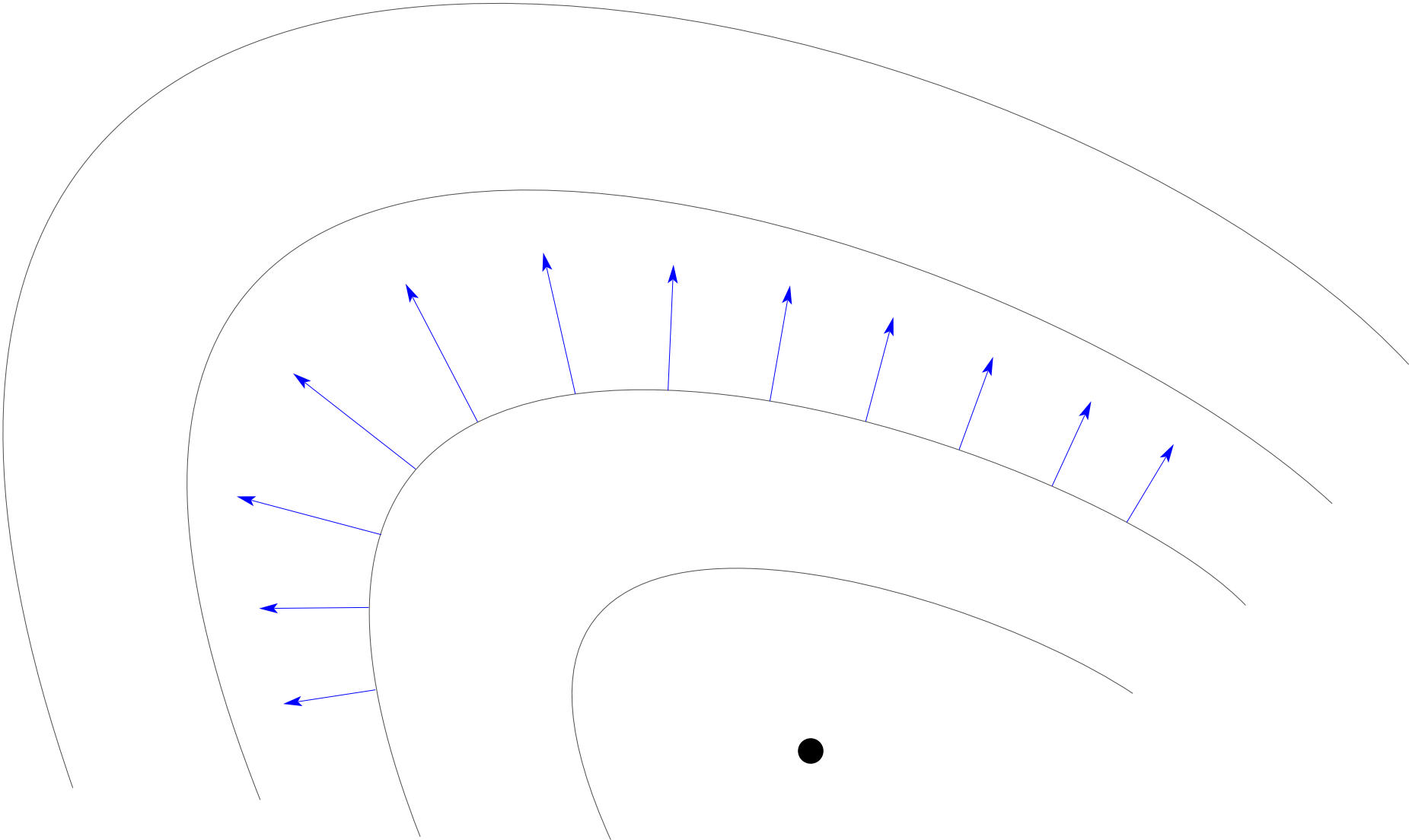


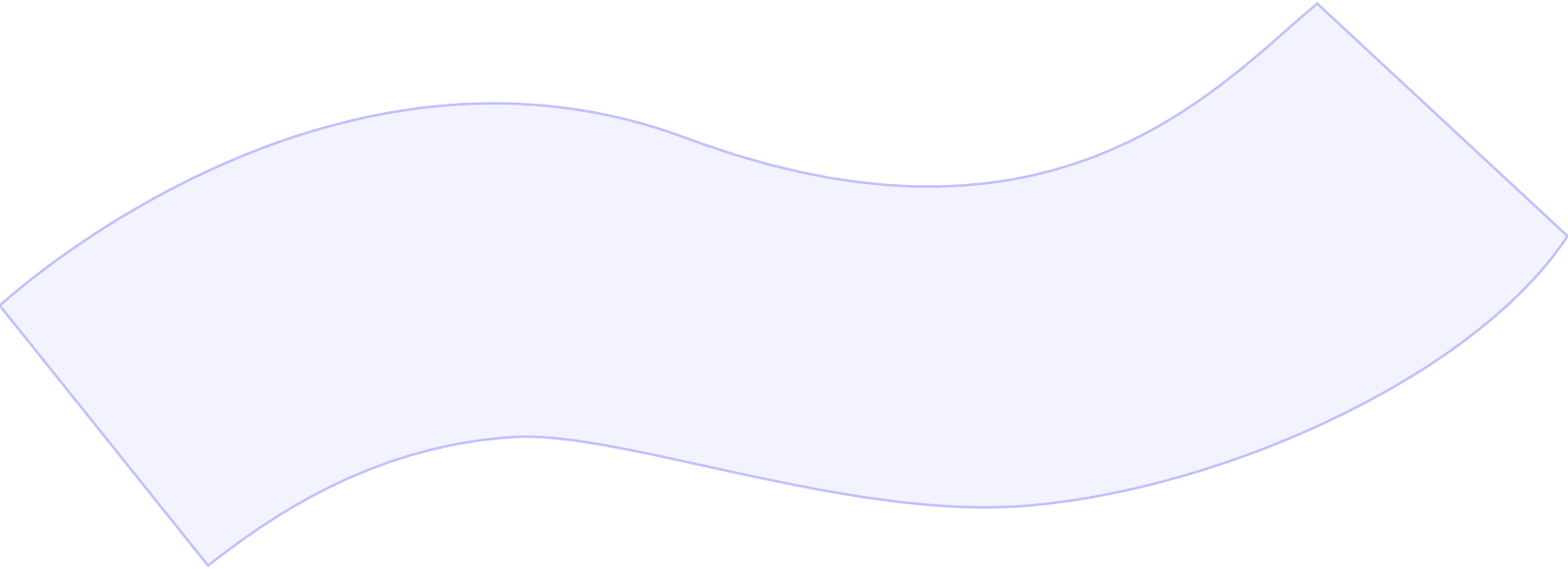


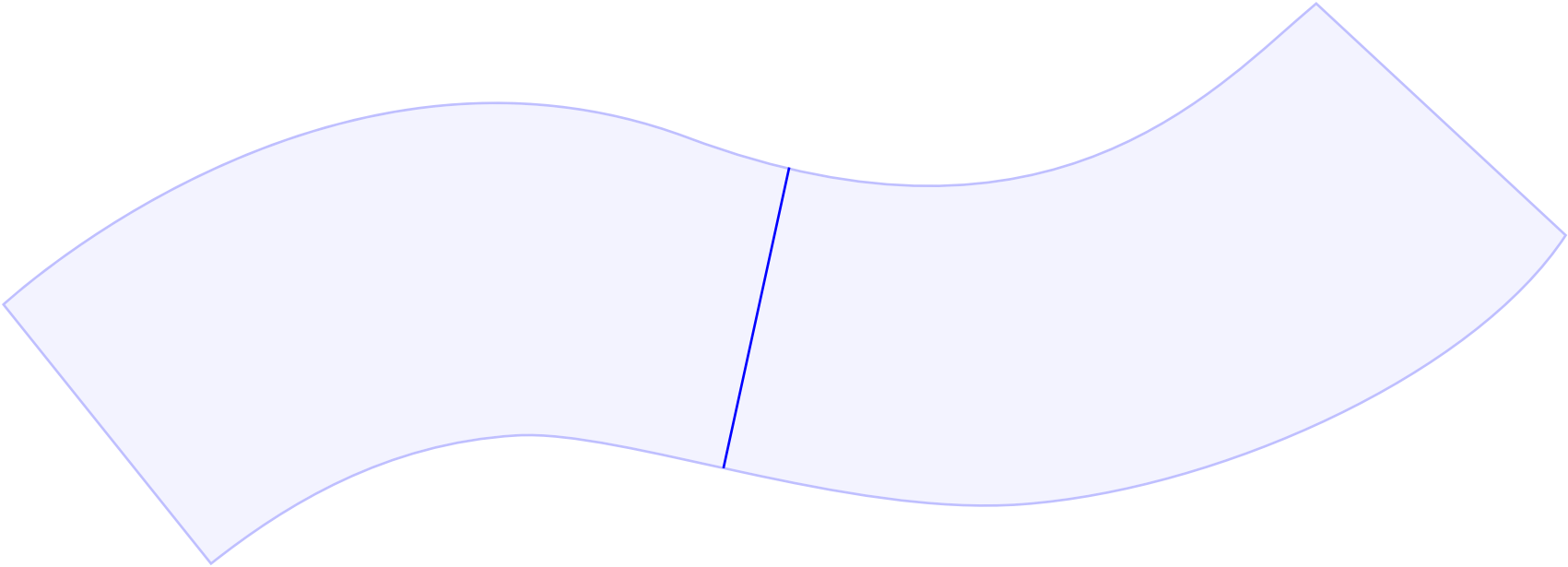


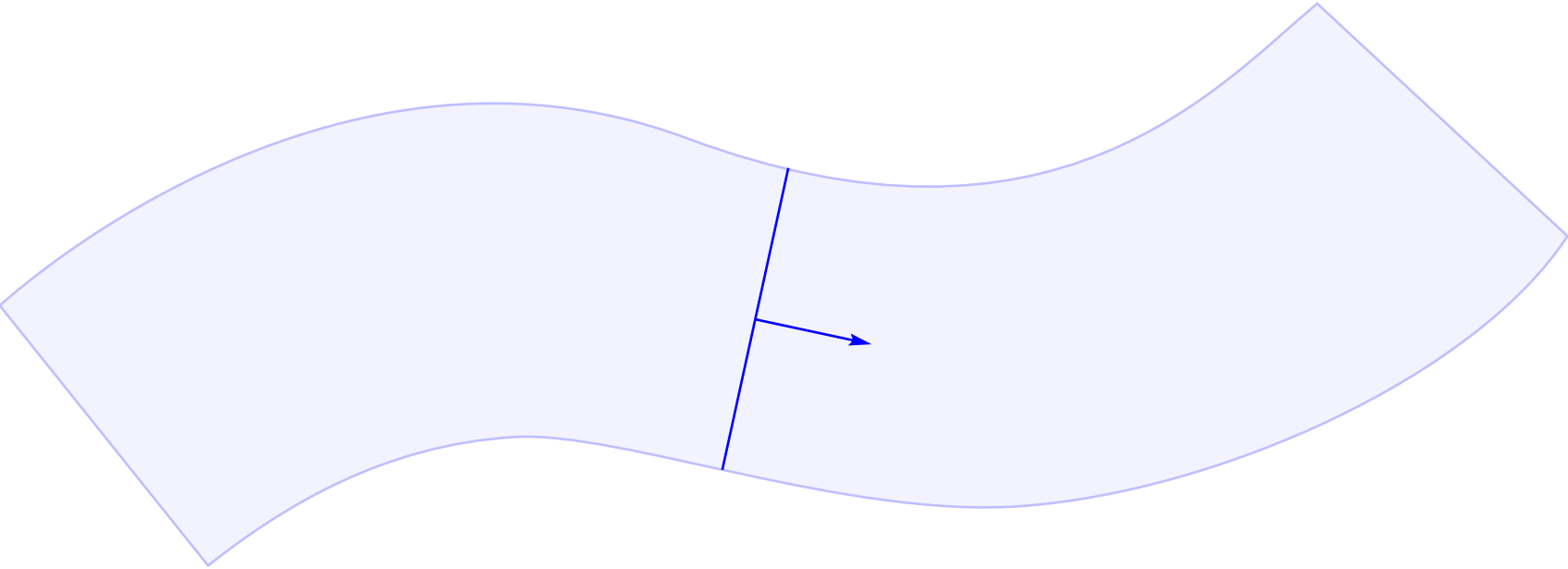


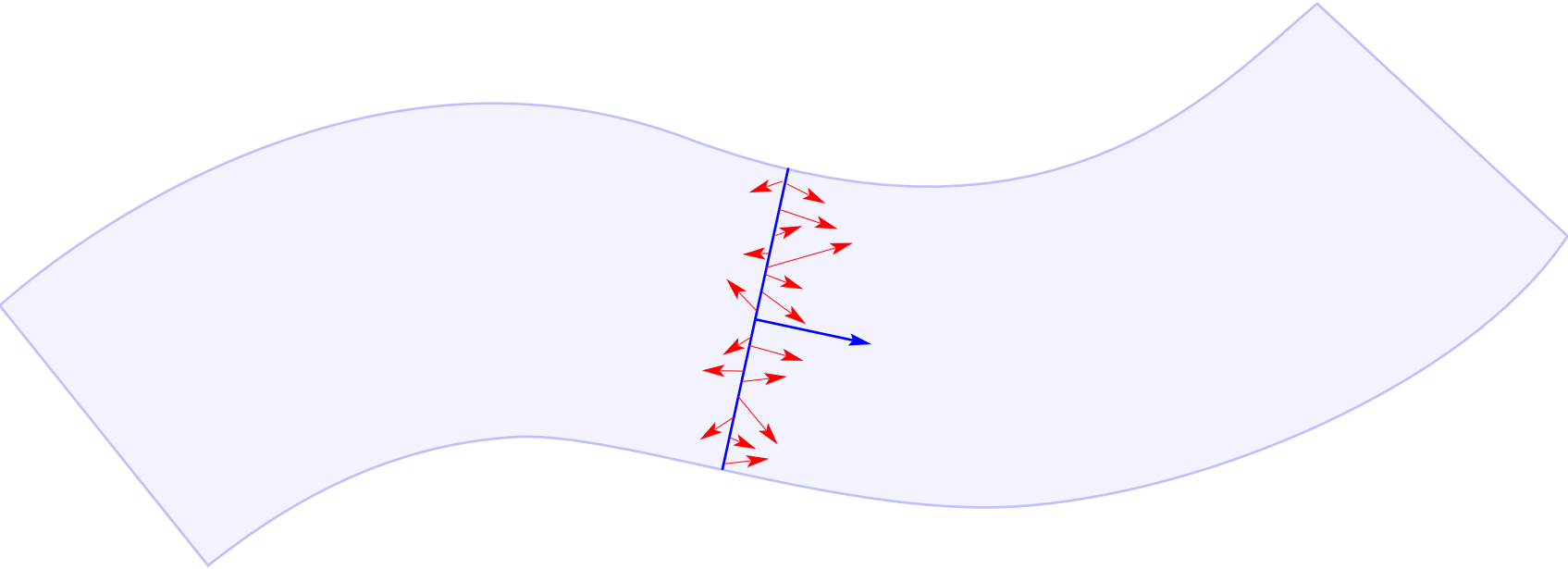




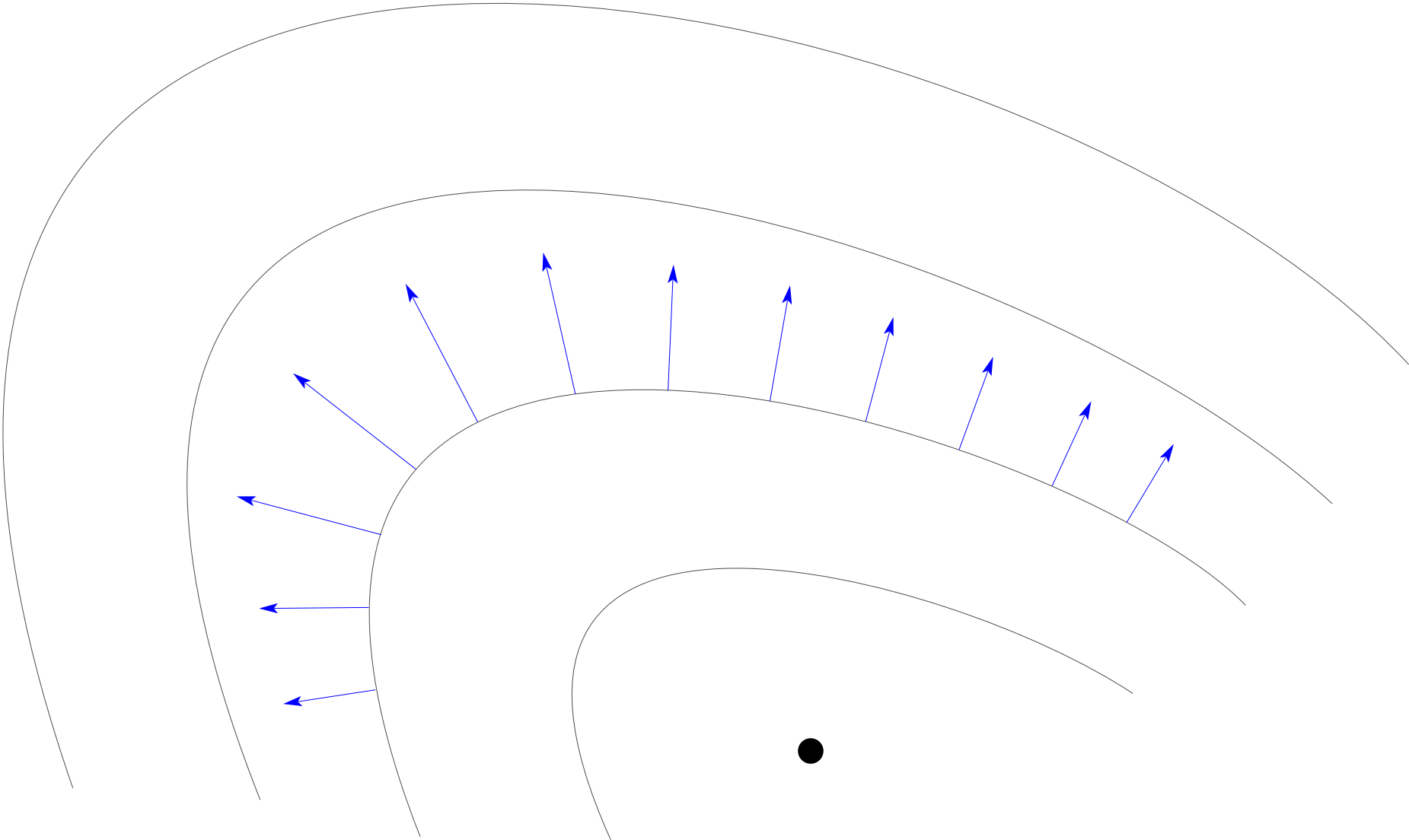


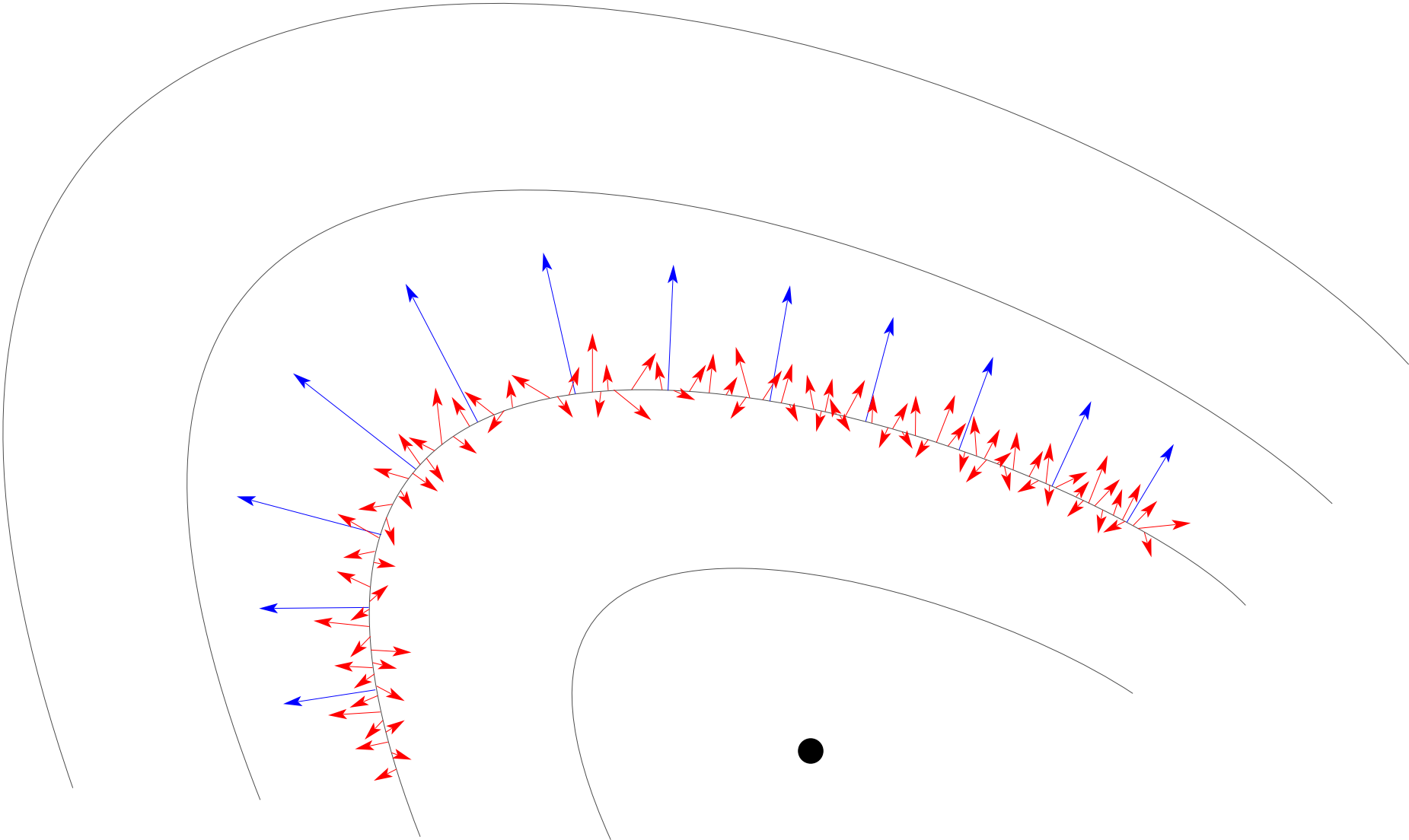


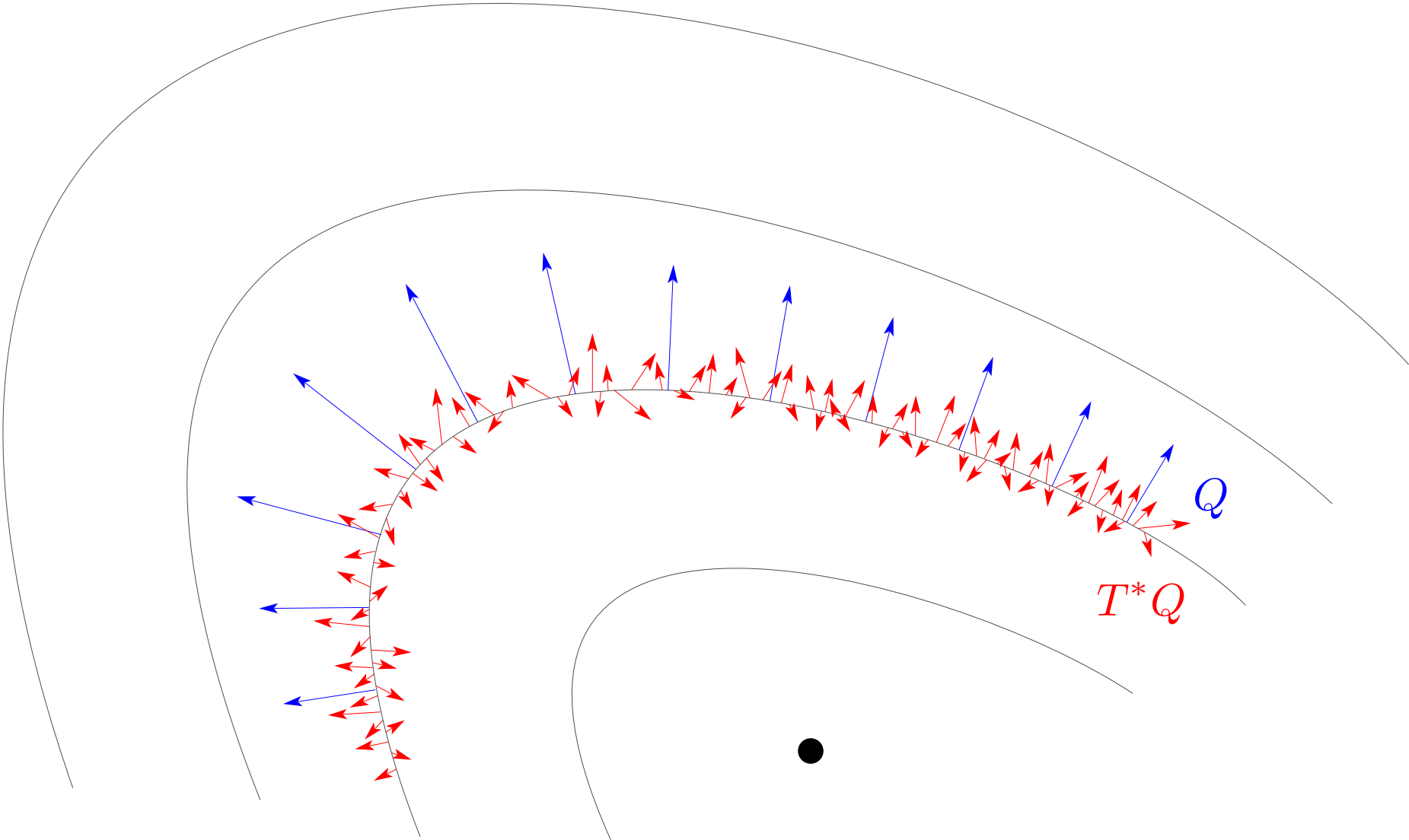


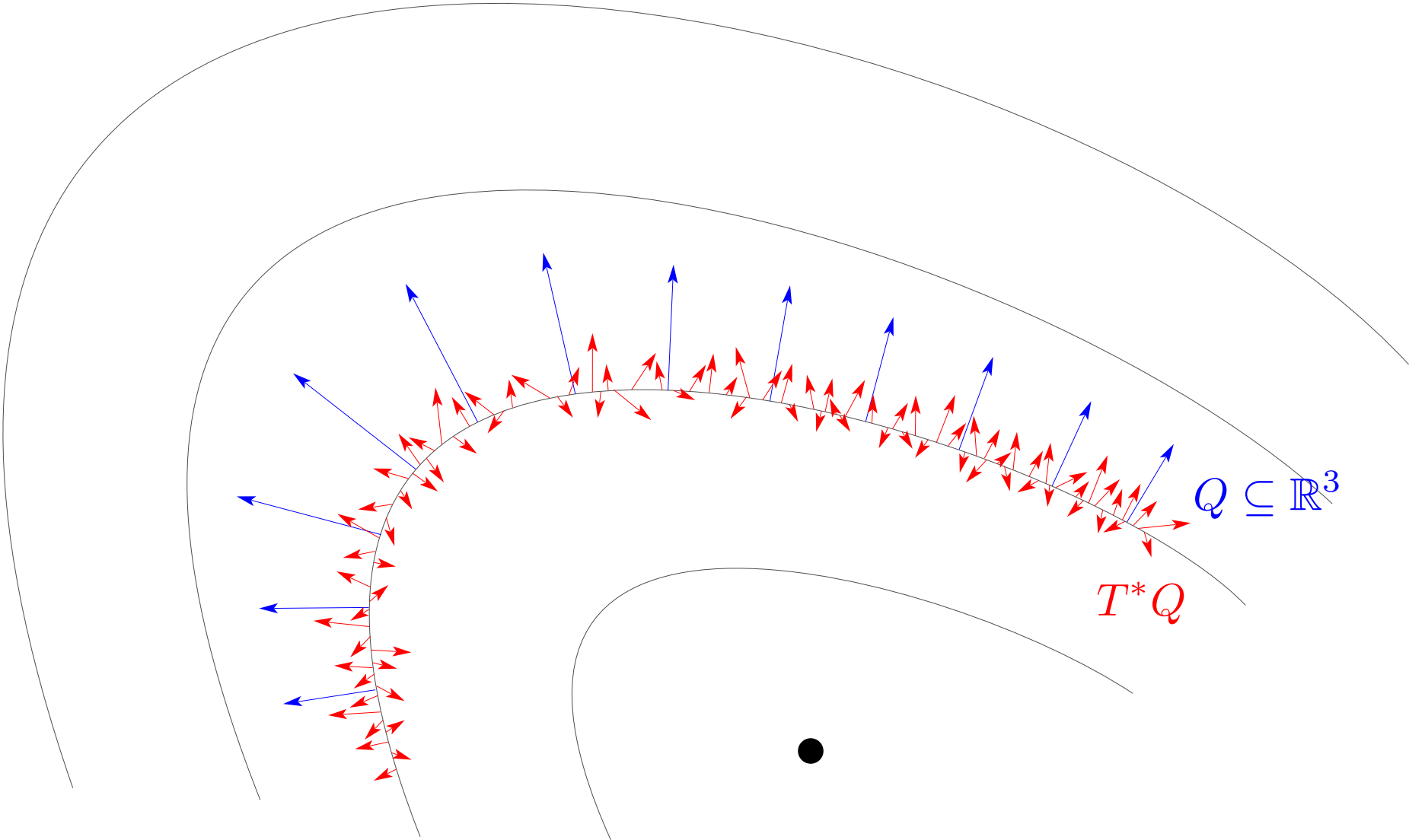


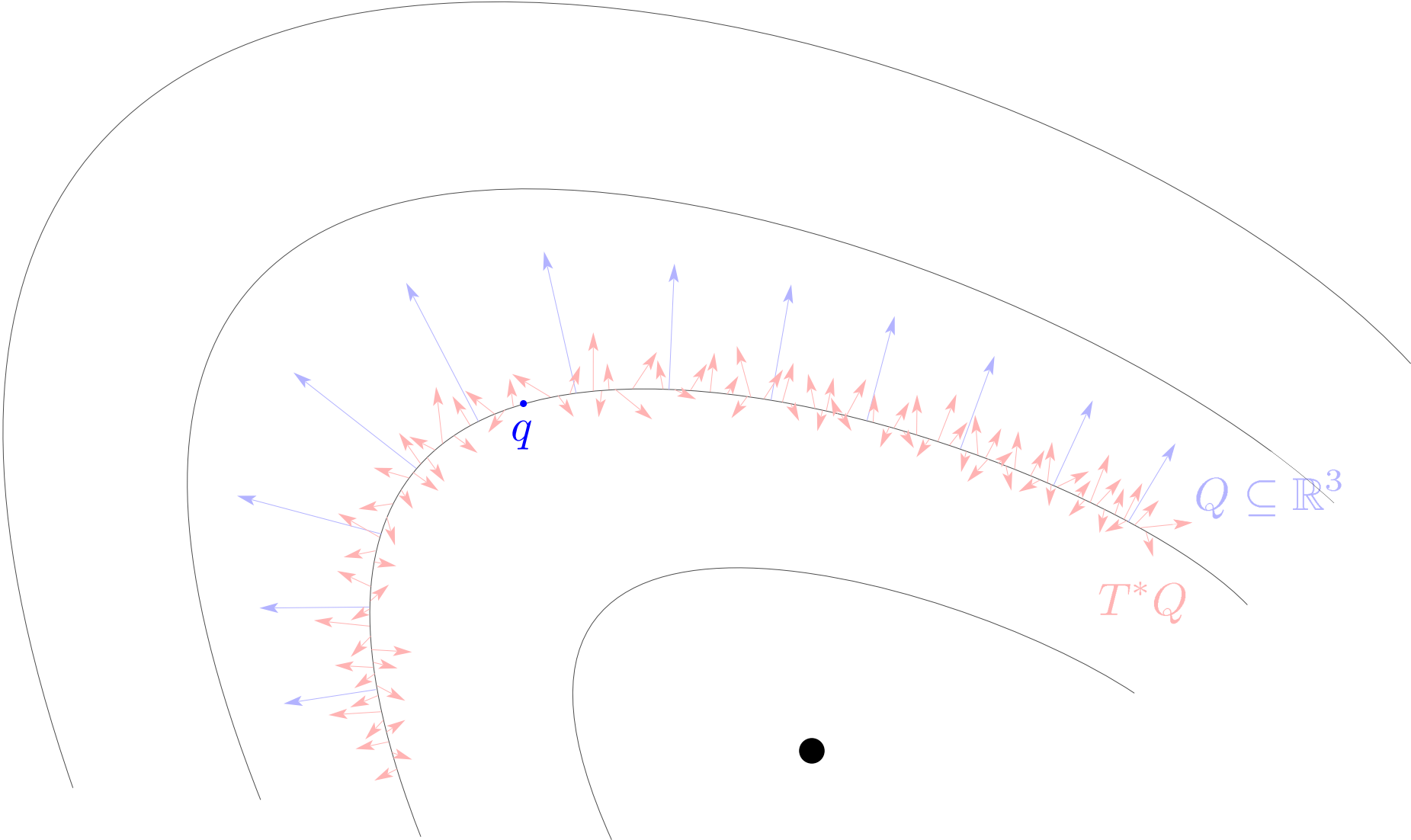


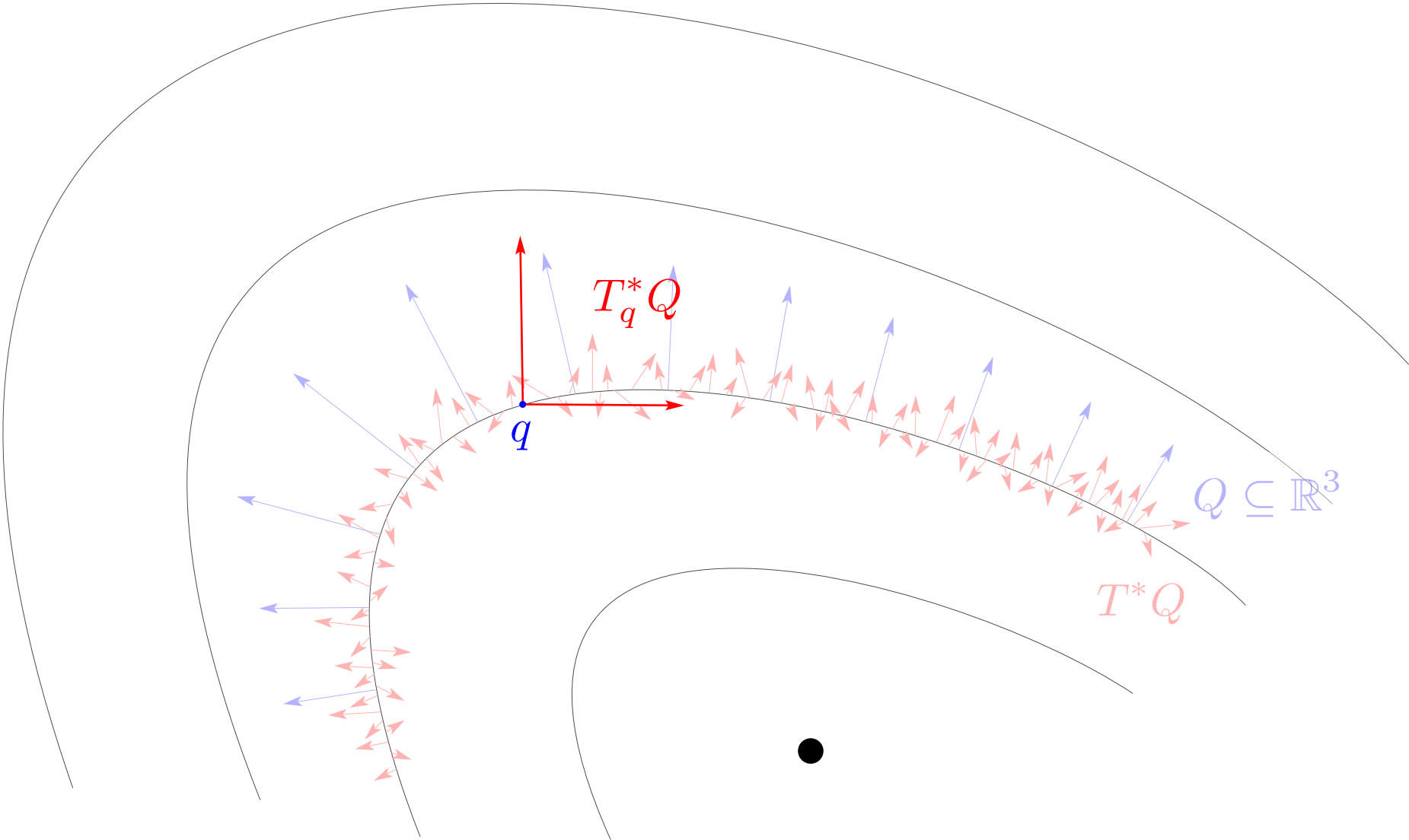


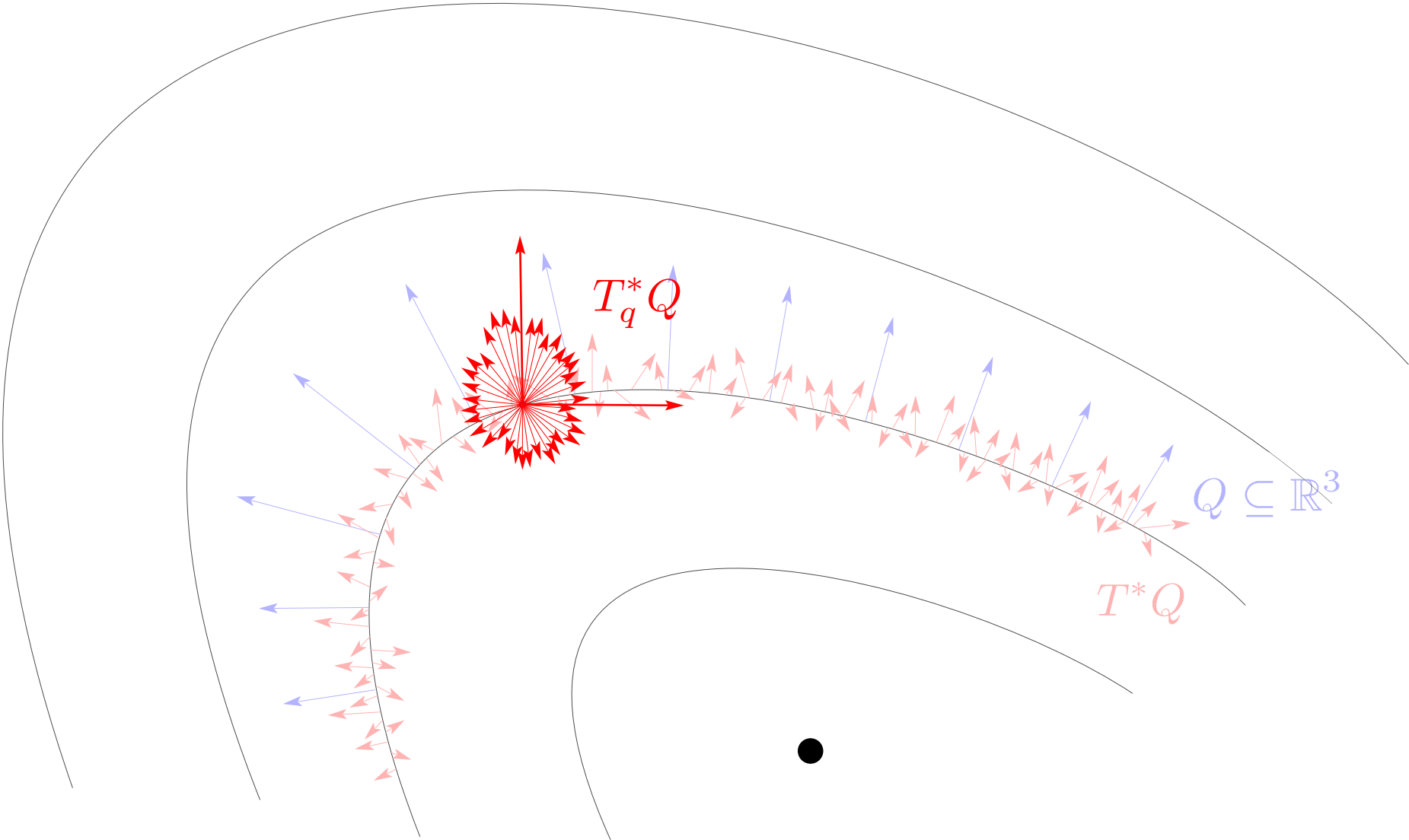


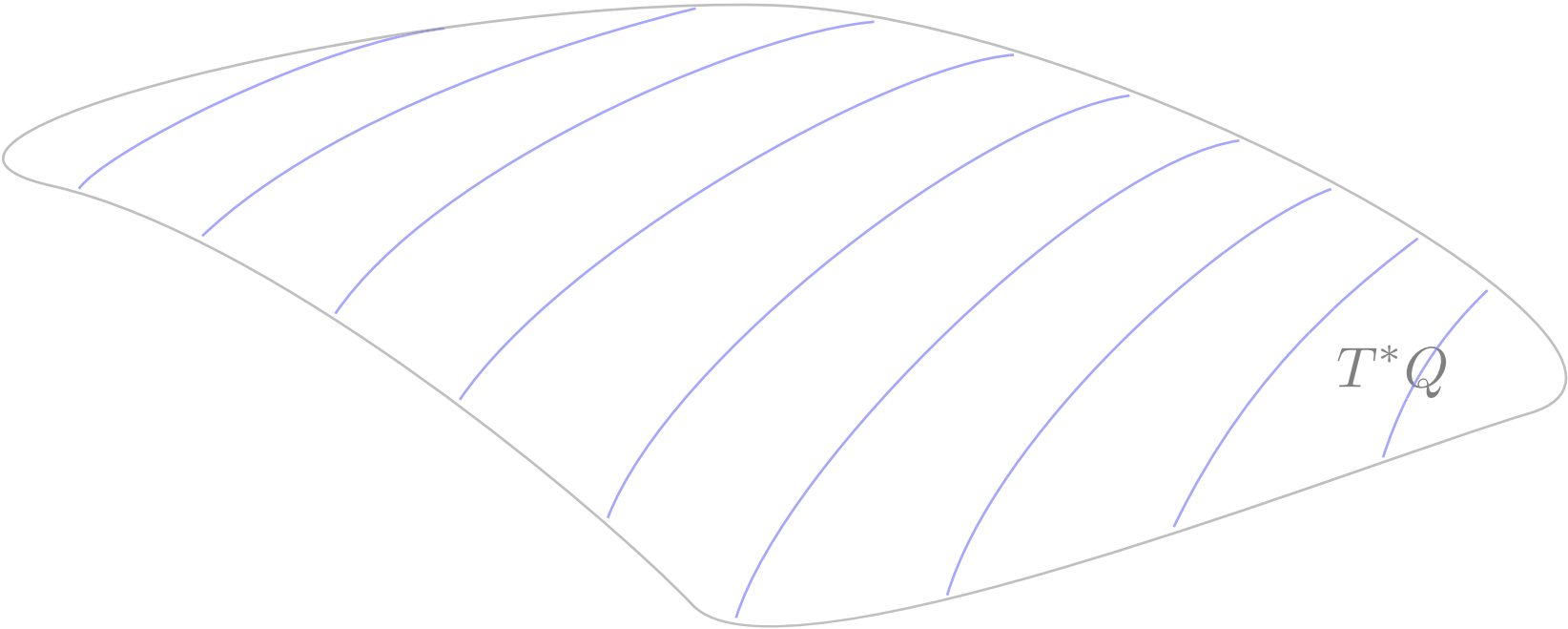














## electromagnetic theory

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---

↓ microlocal analysis  
(Wigner transform)

phase space  $T^*Q$

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$$W_a^0 = \frac{1}{2} \begin{bmatrix} I + Q & U + iV \\ U - iV & I - Q \end{bmatrix} dq \wedge dp$$

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radiation

light transport equation

$$\dot{\ell} = -\{\ell, H\}$$

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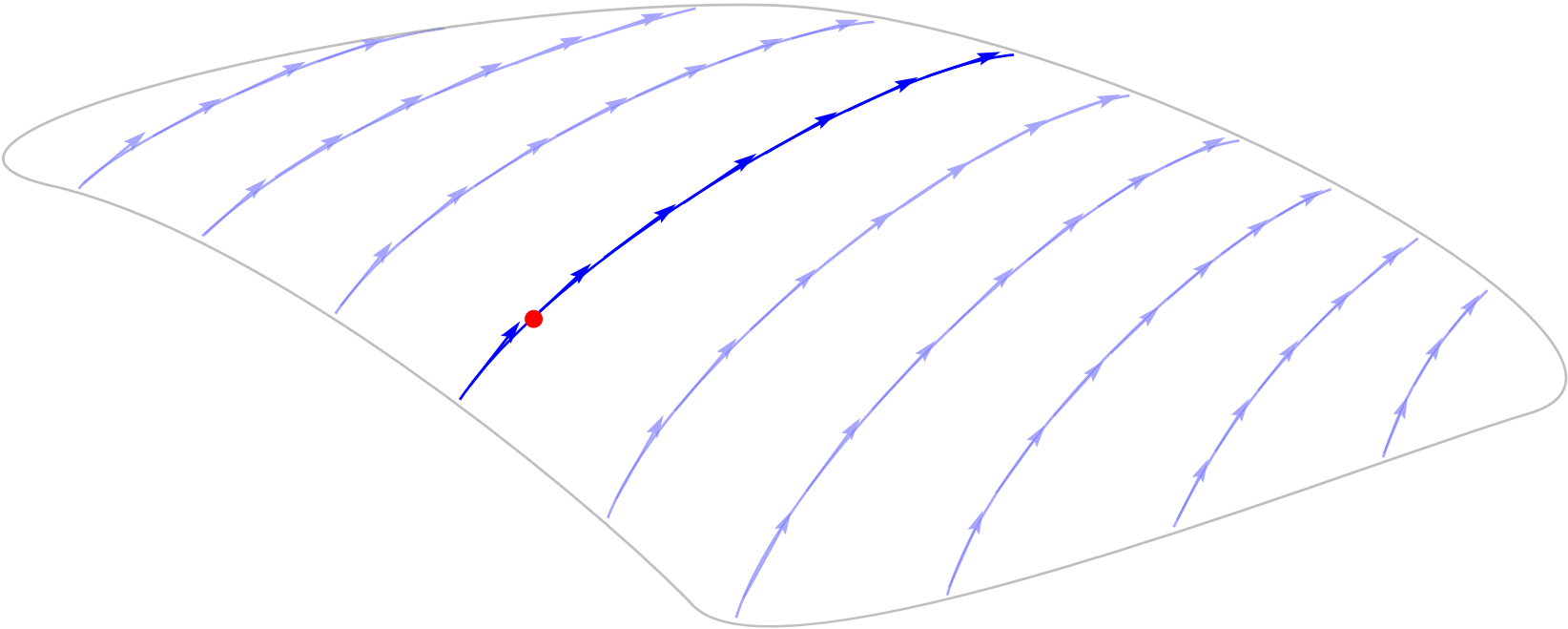
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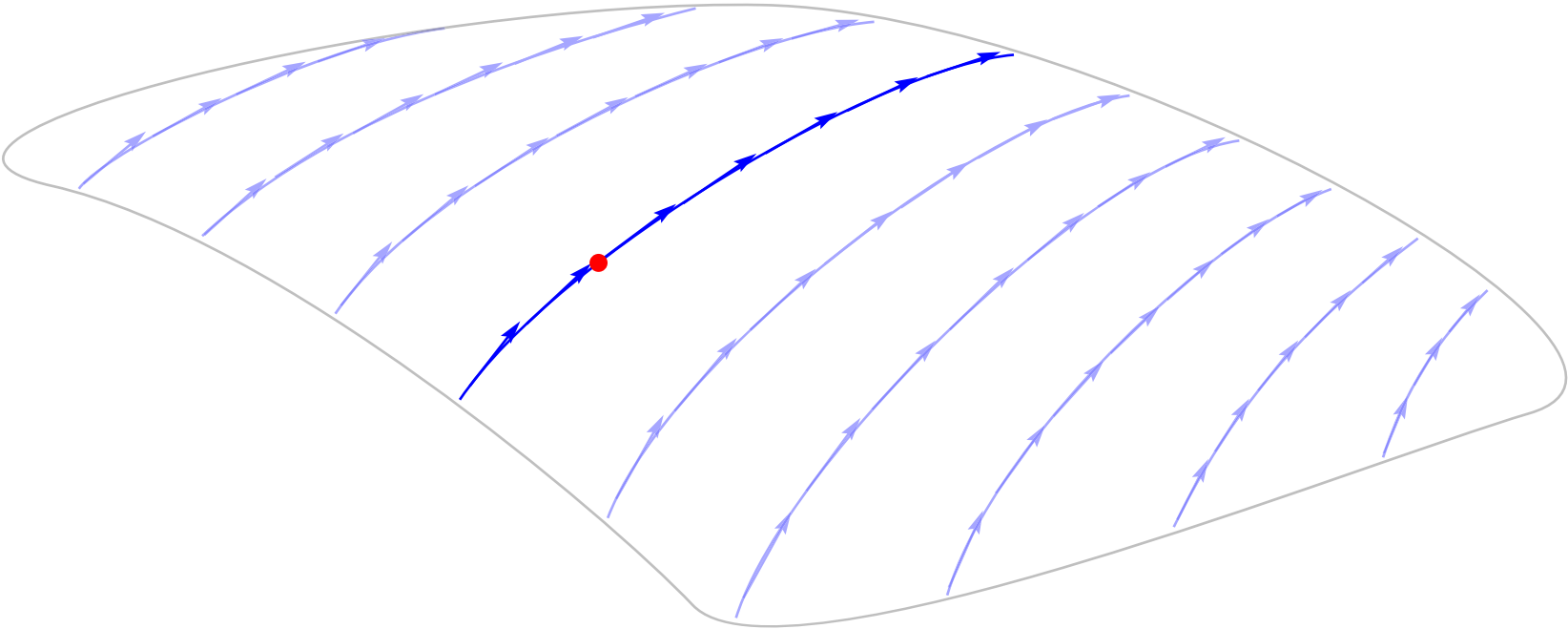
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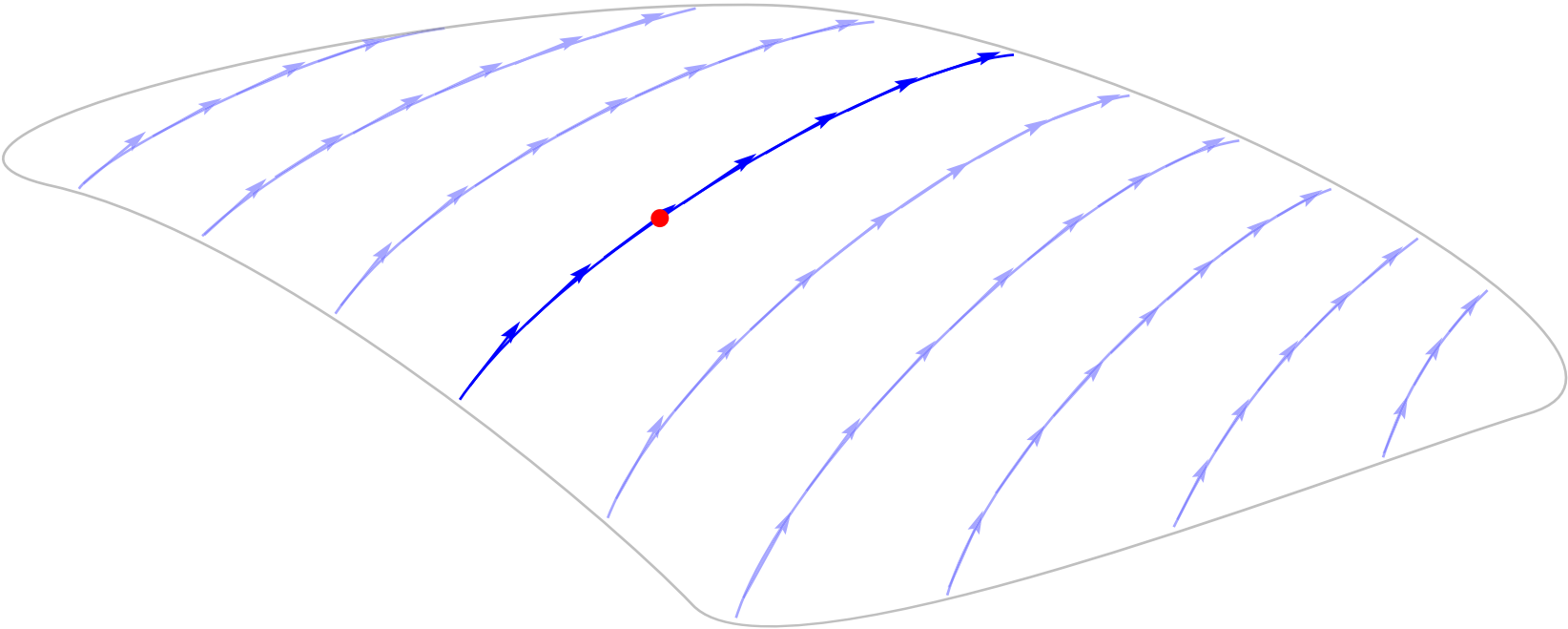
light transport equation

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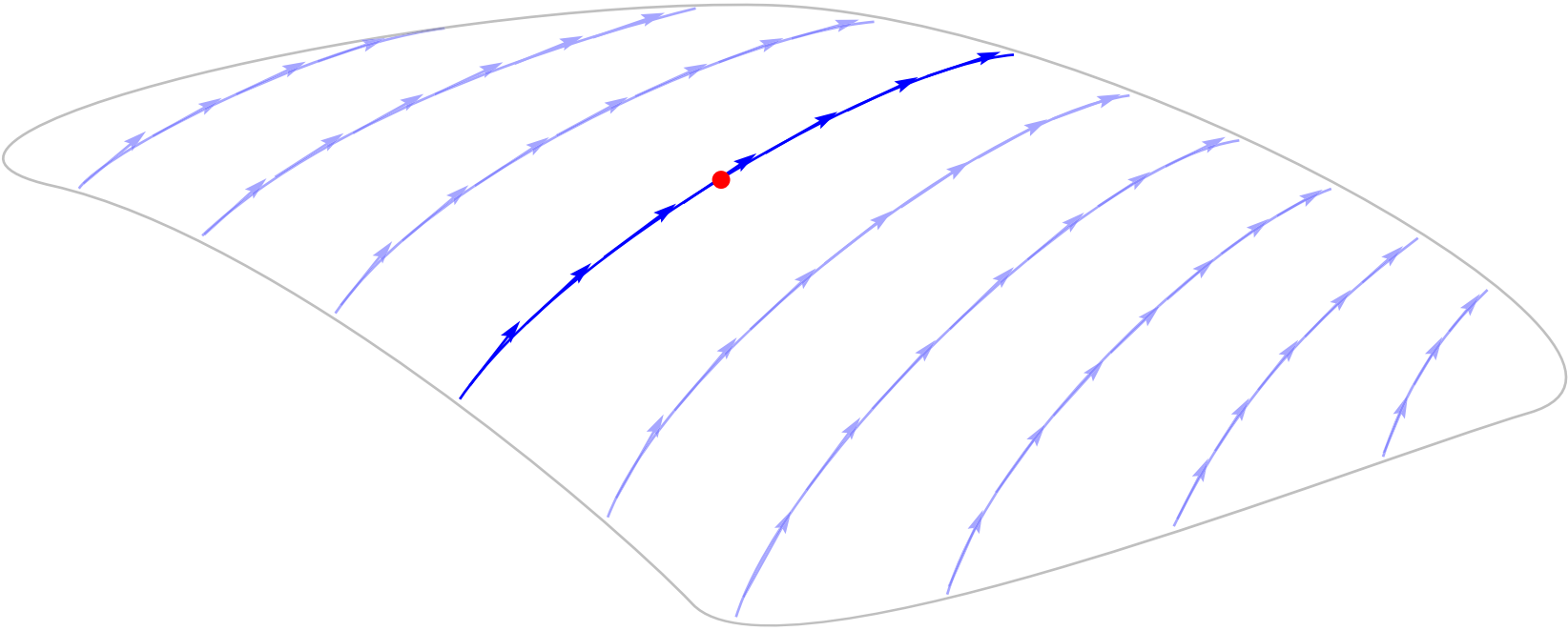
$$\ell = \mathcal{L}(q, p) dq \wedge dp$$

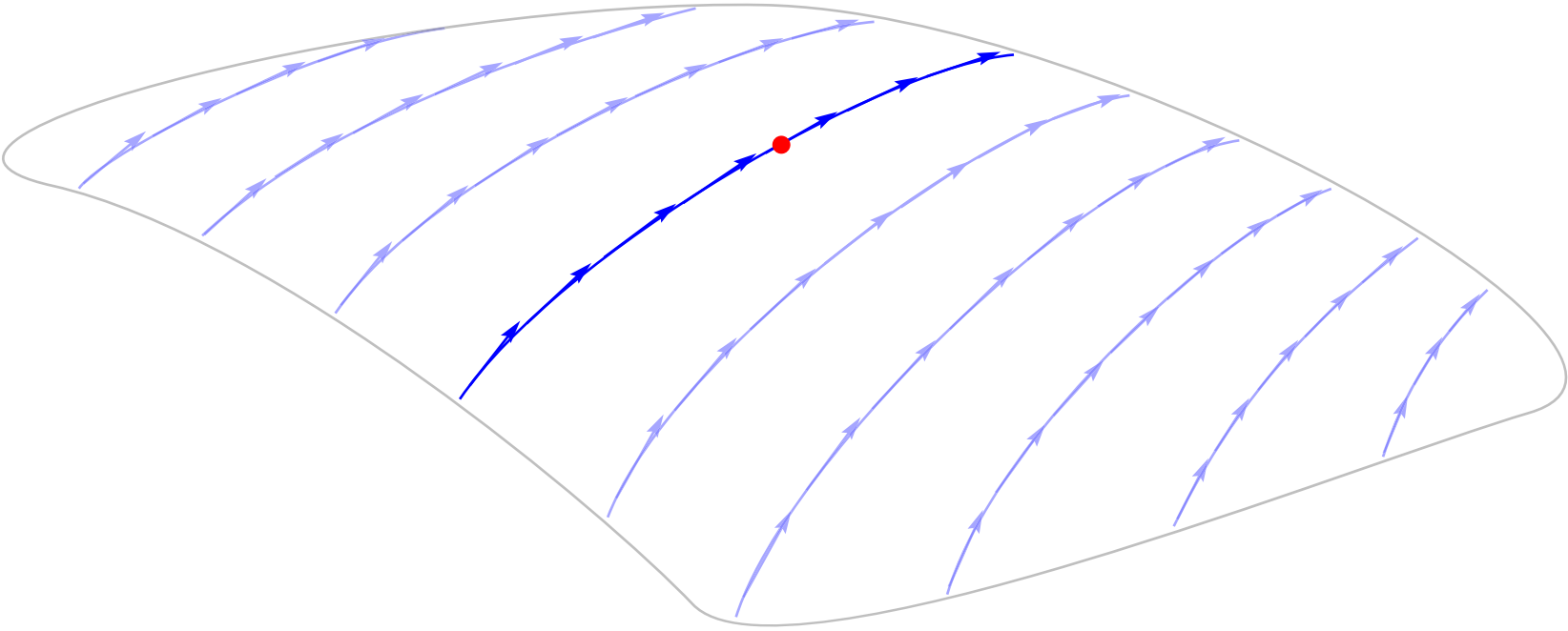


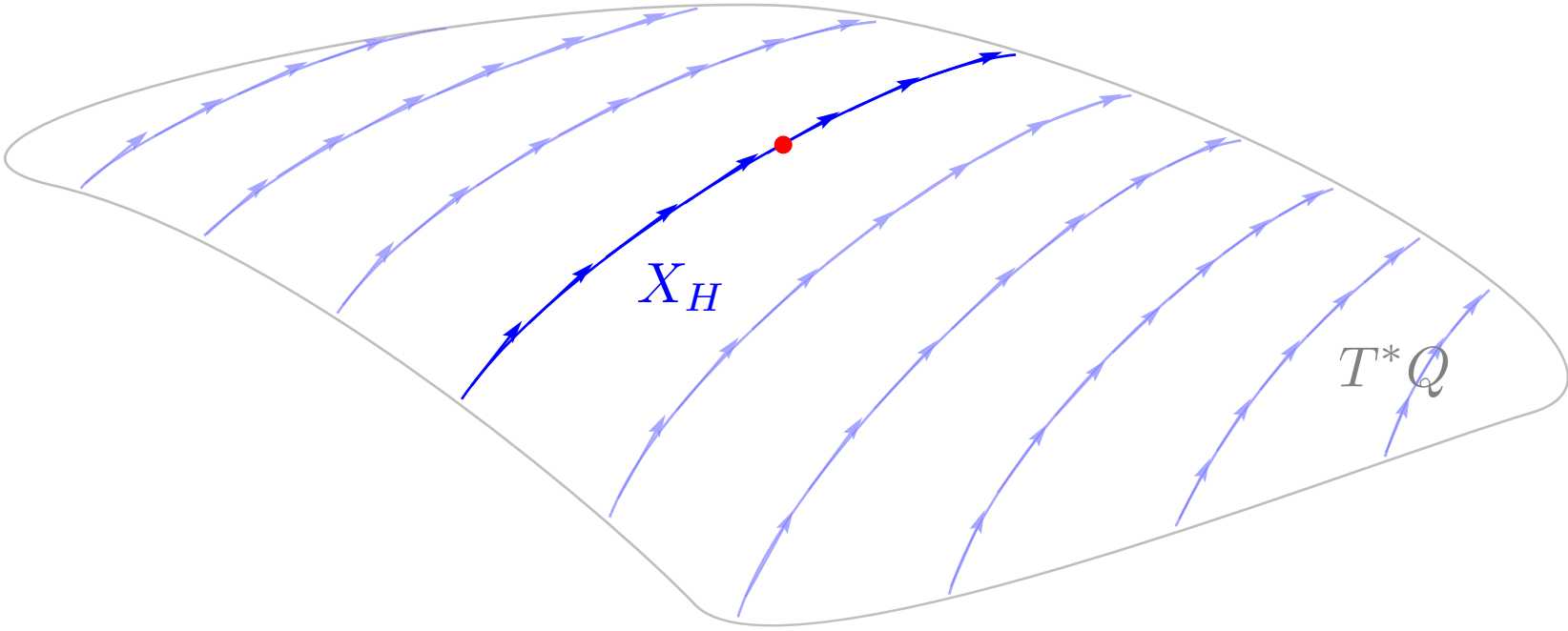


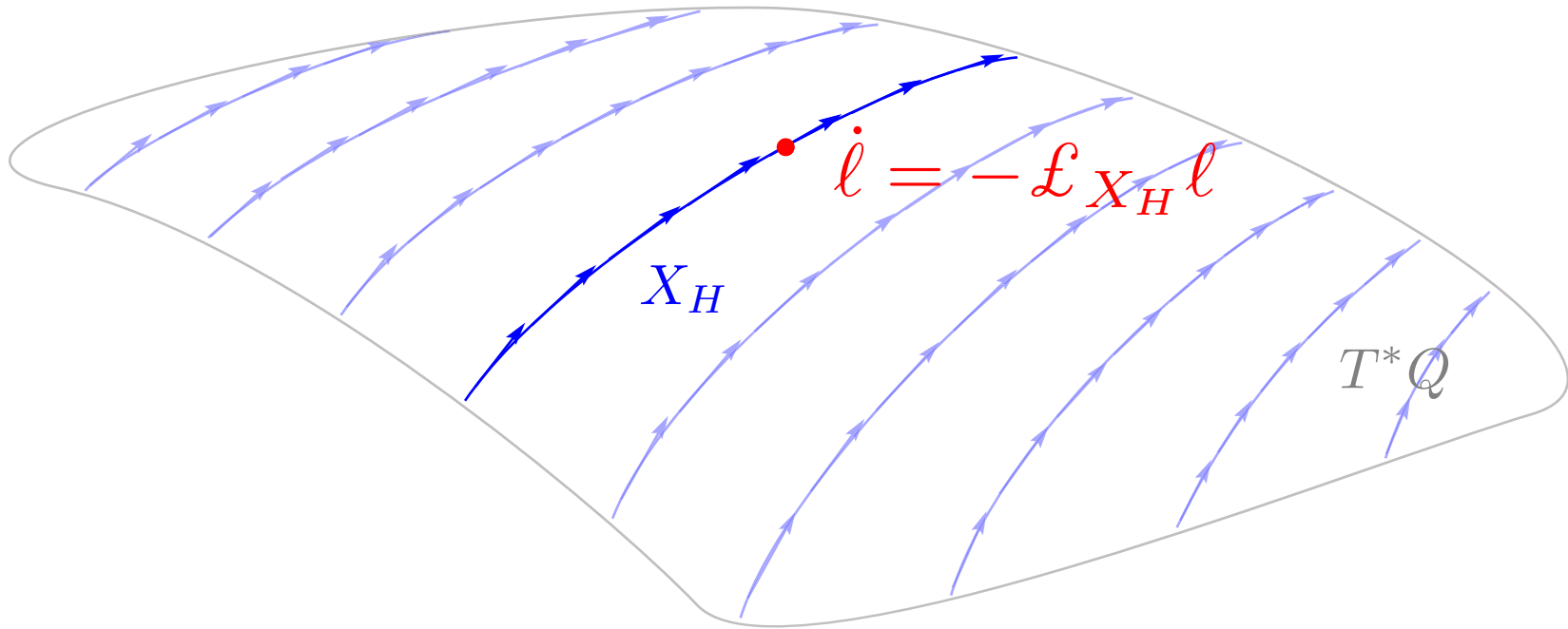


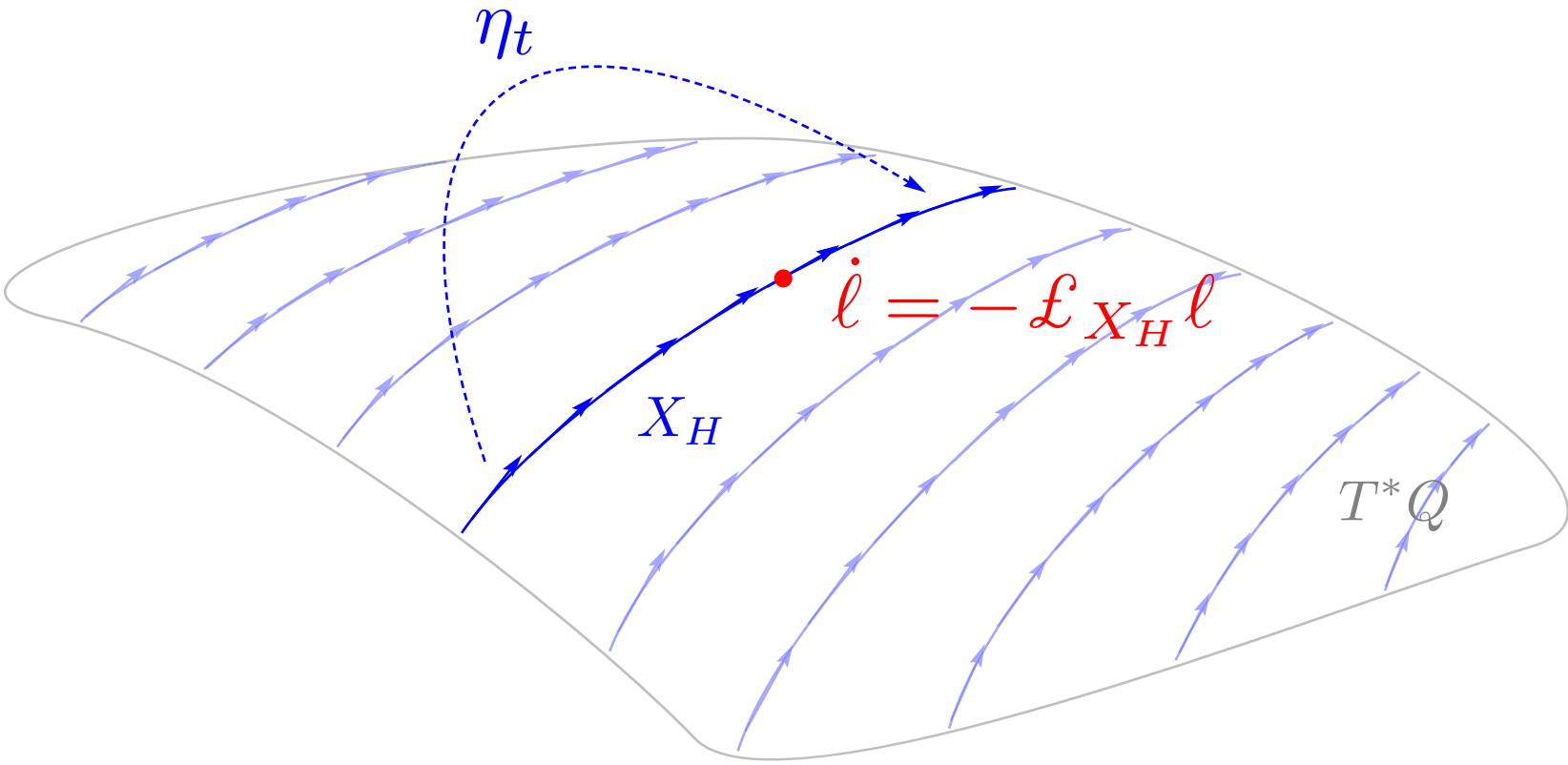


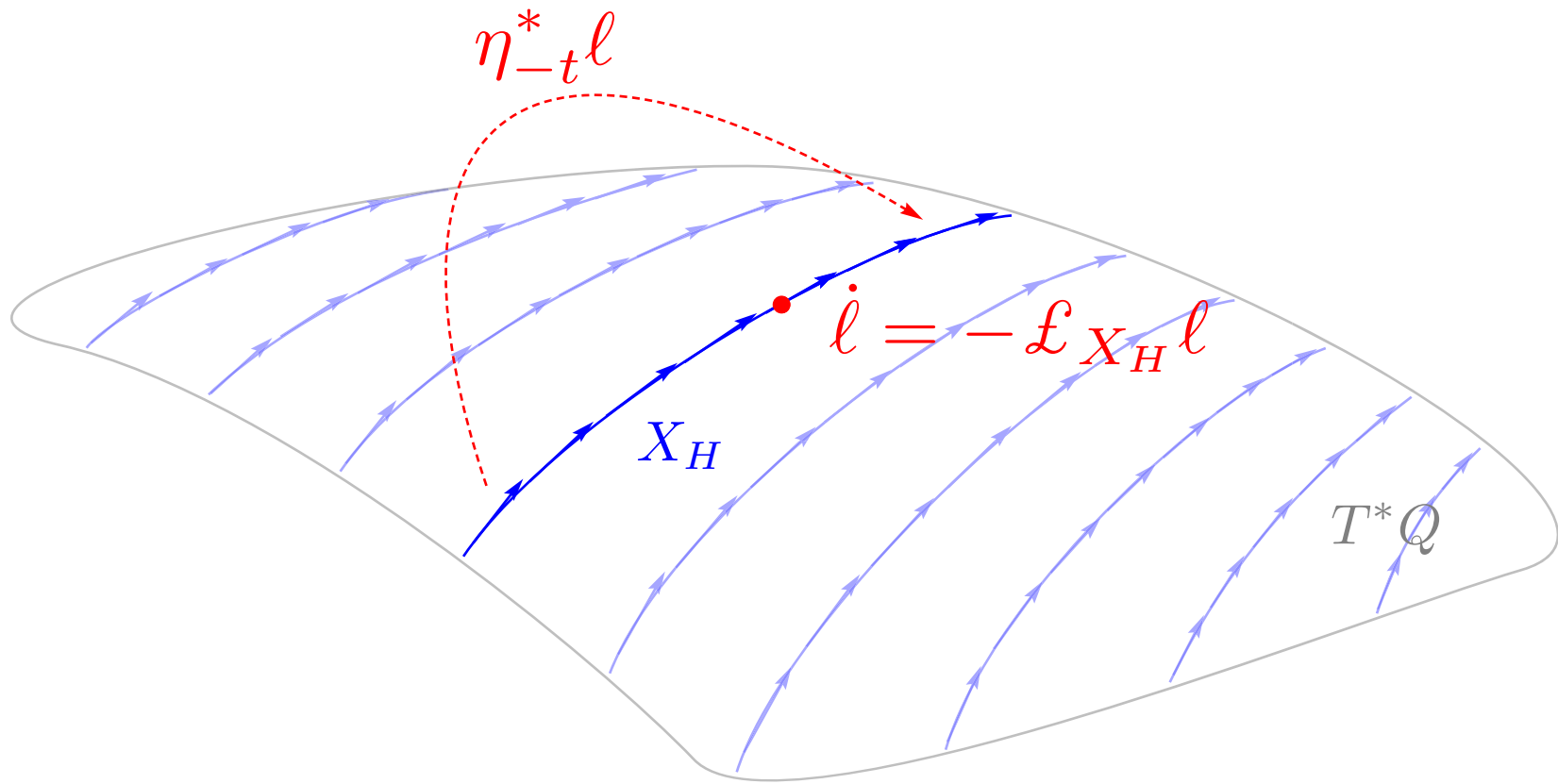












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bundle reduction

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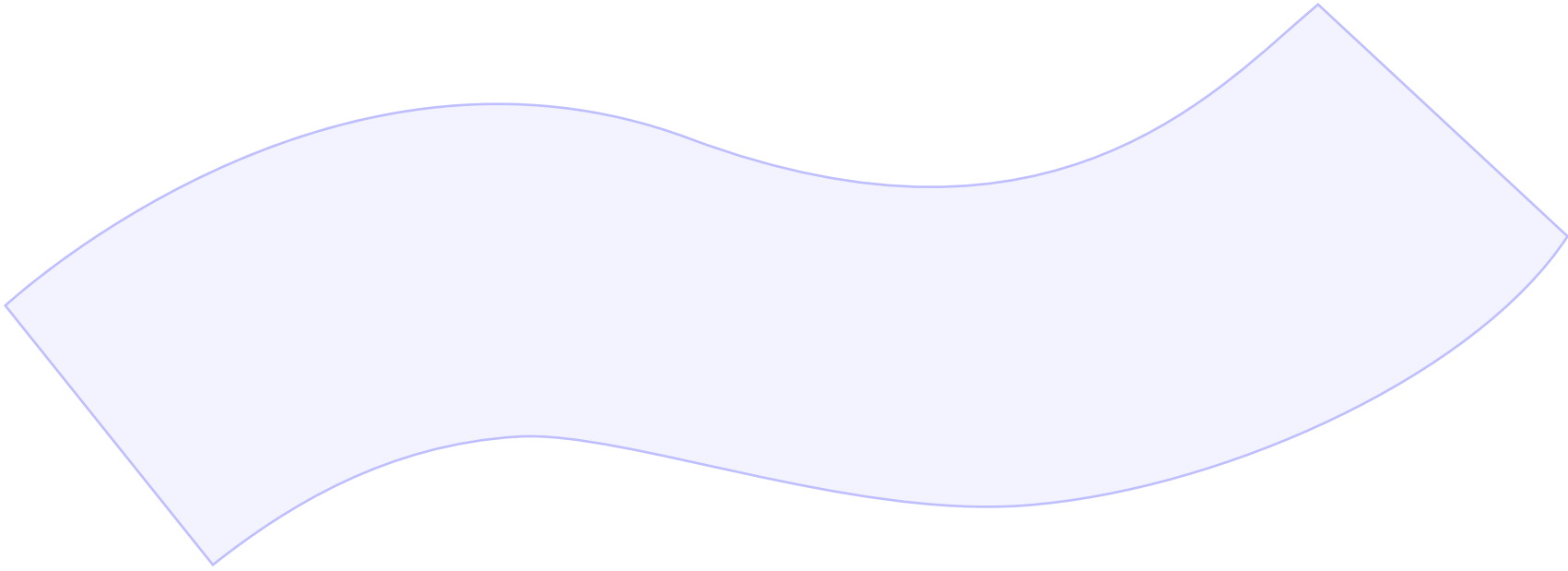
classical radiometry

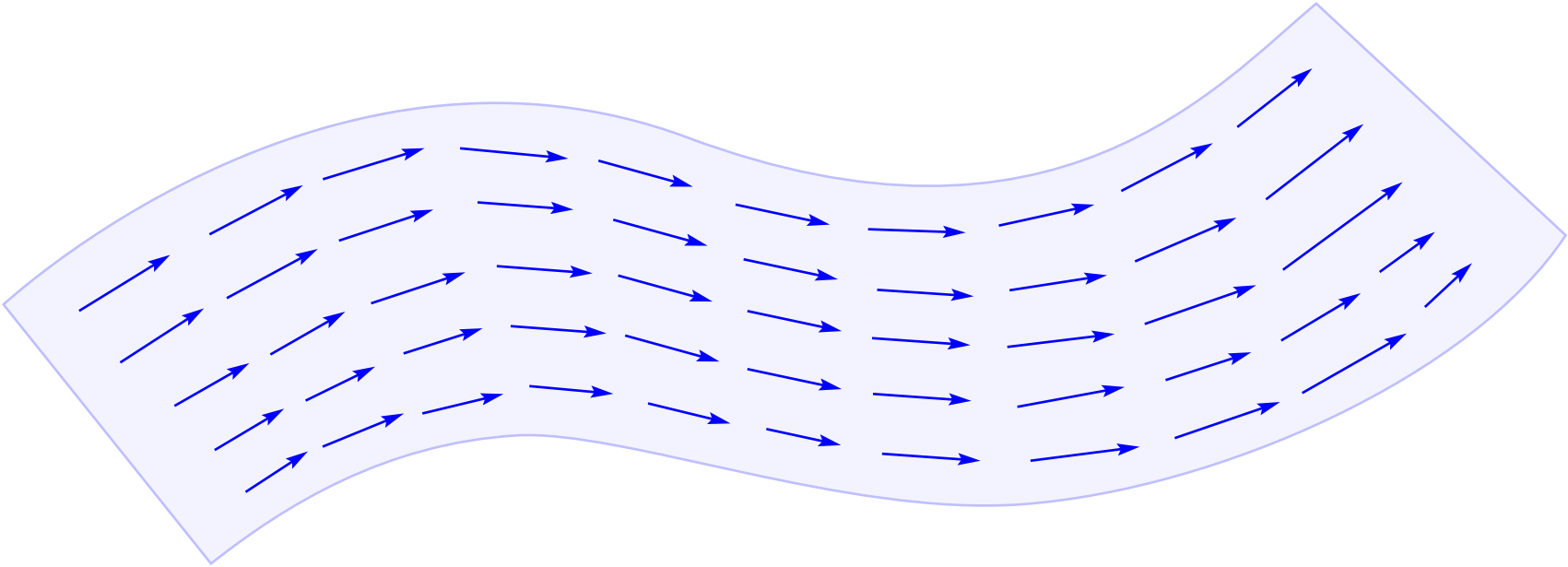
$$L(x, \omega) \cos \theta d\omega dA$$

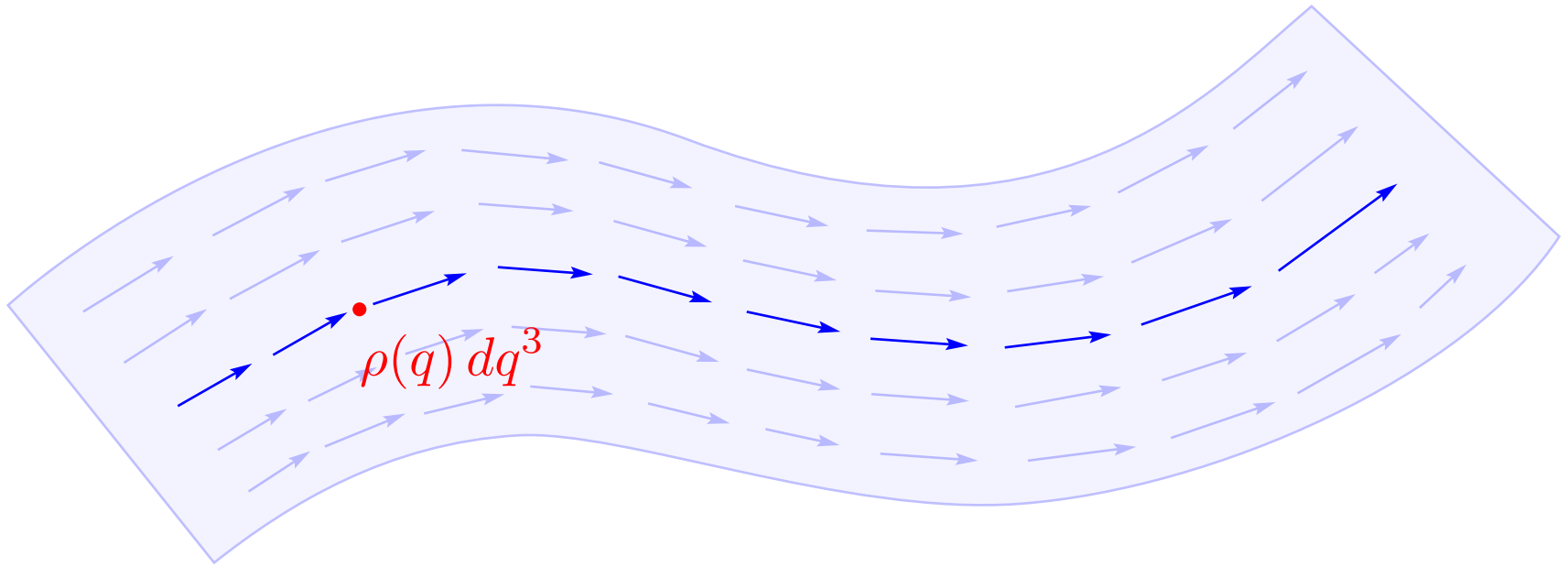
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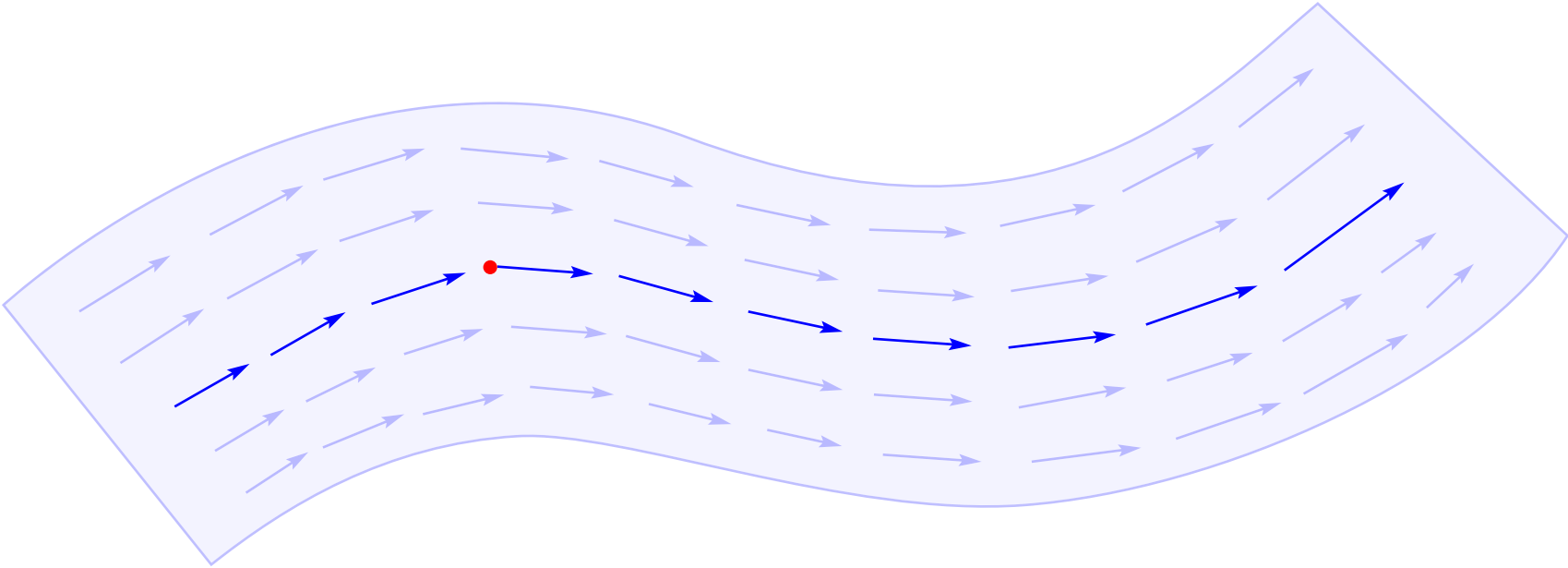


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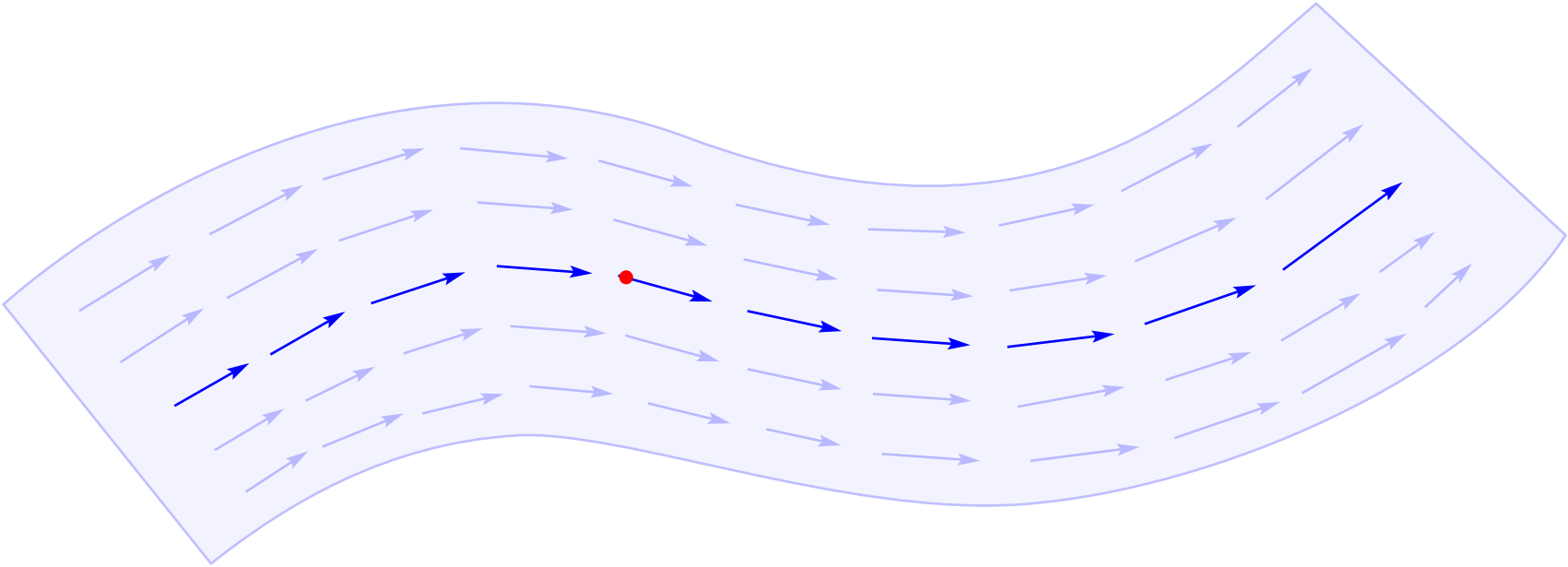


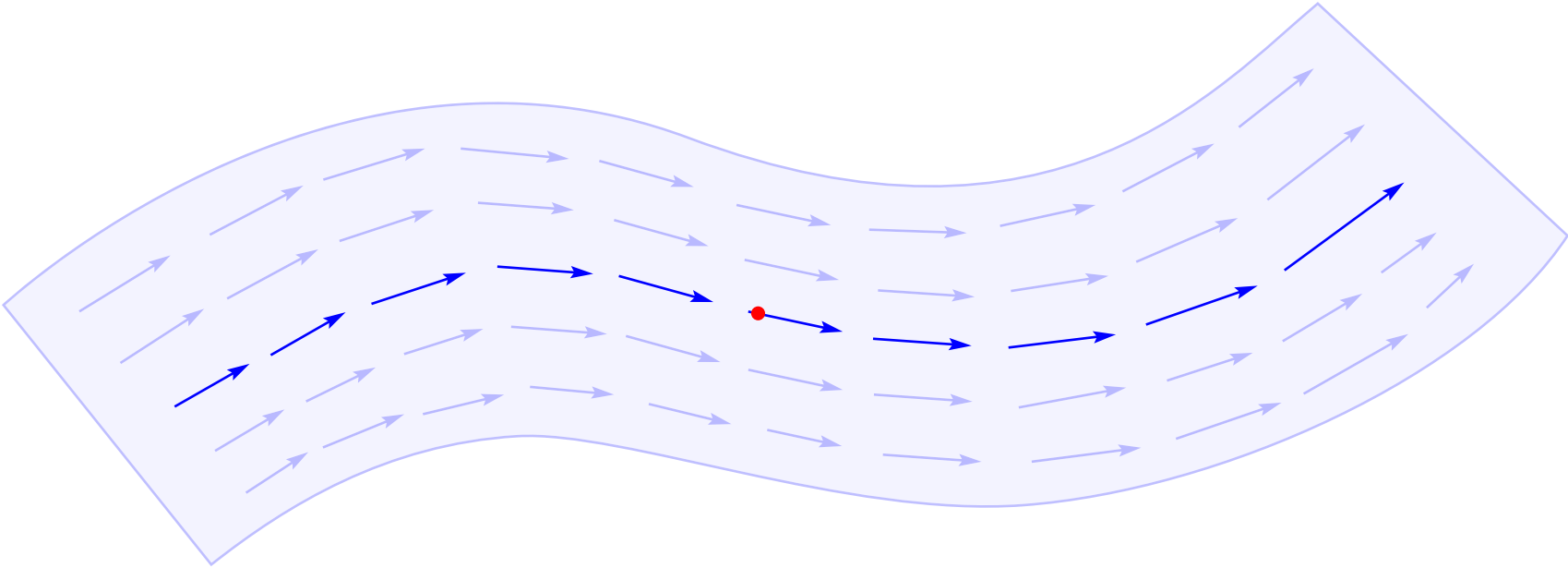


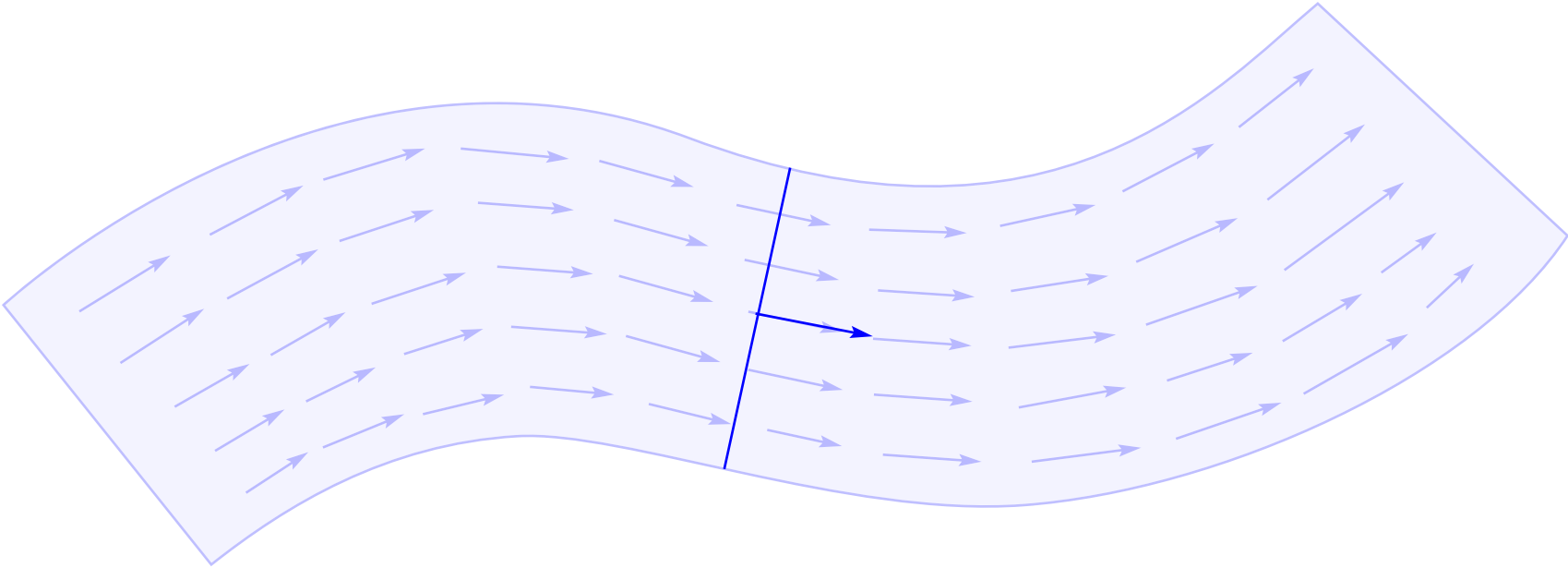


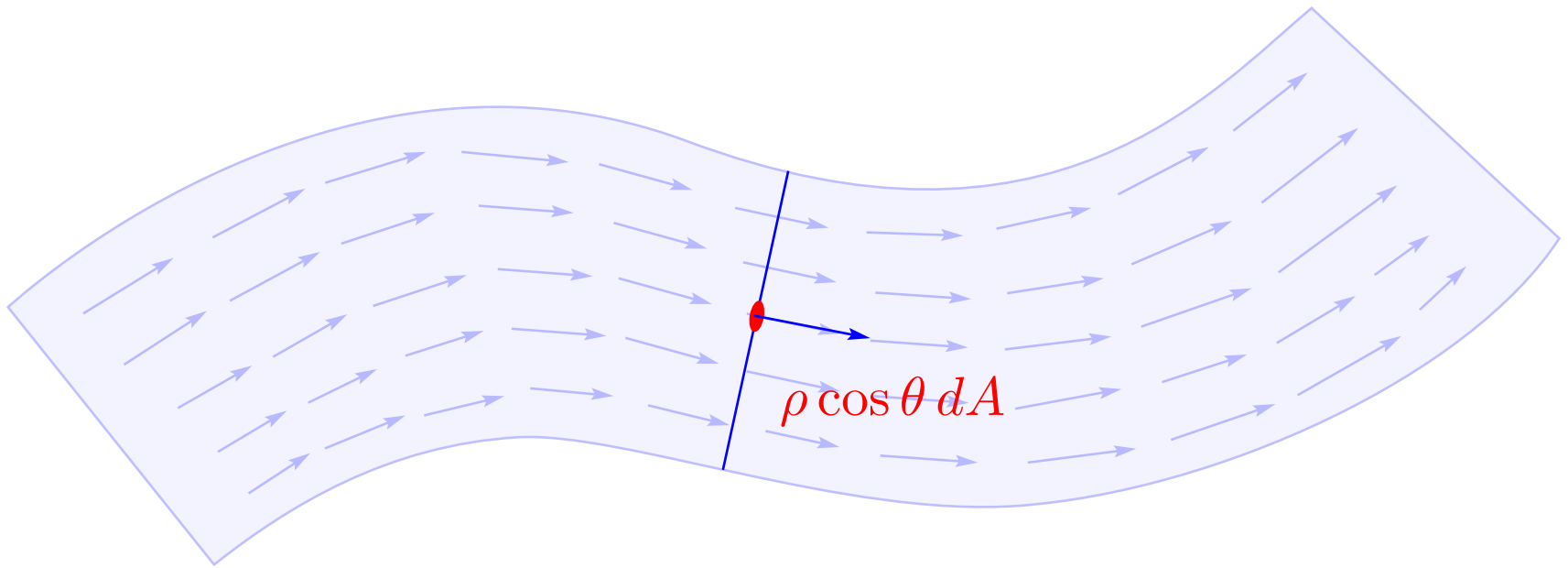


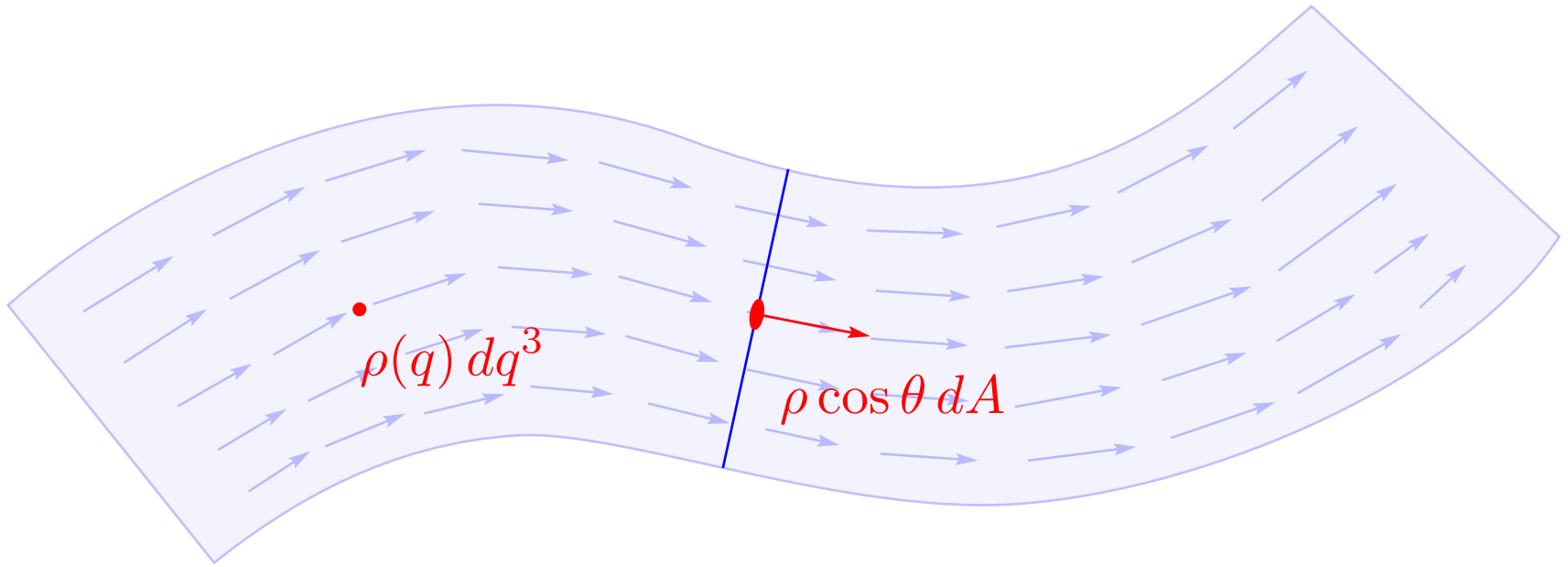












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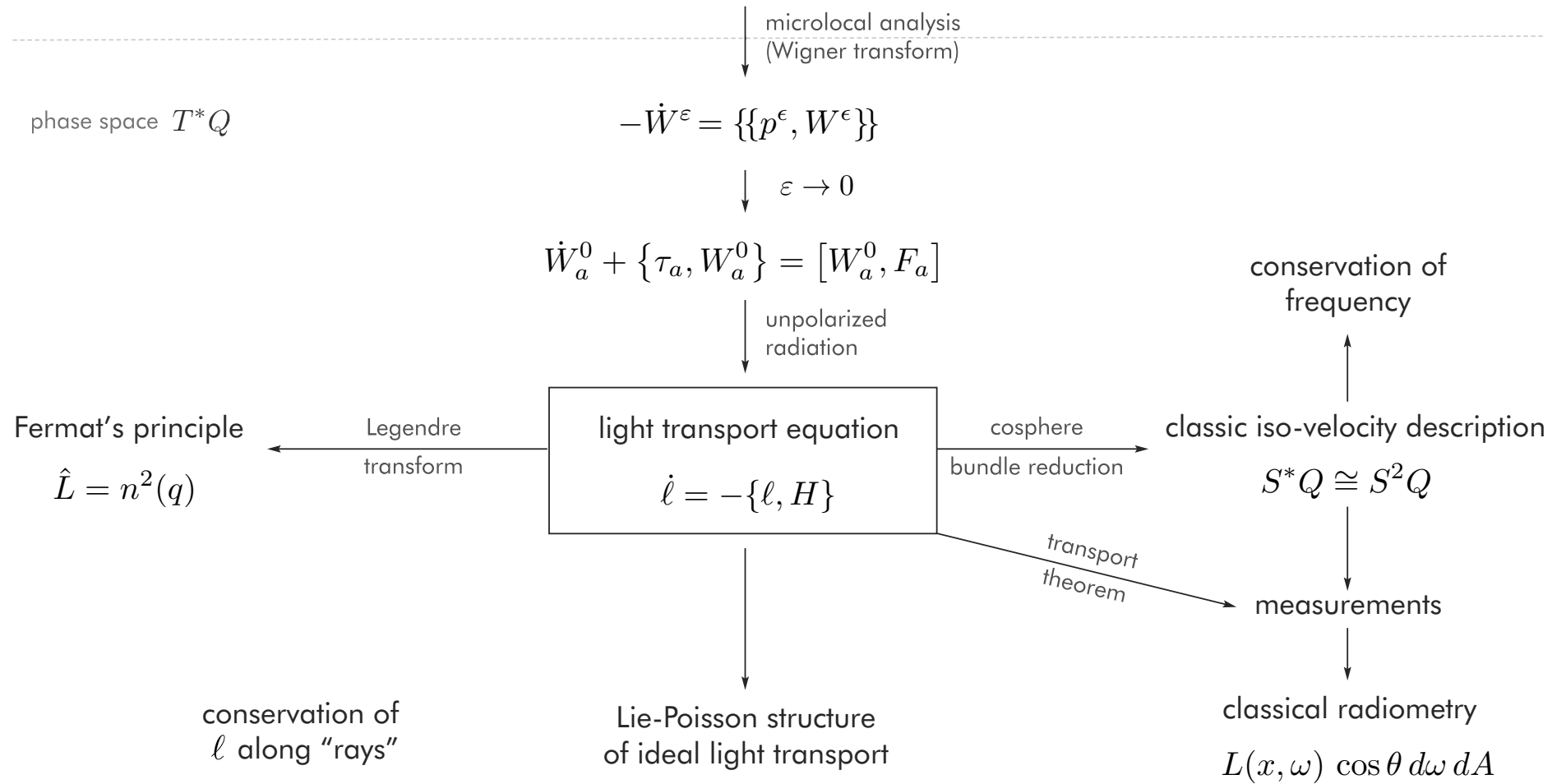
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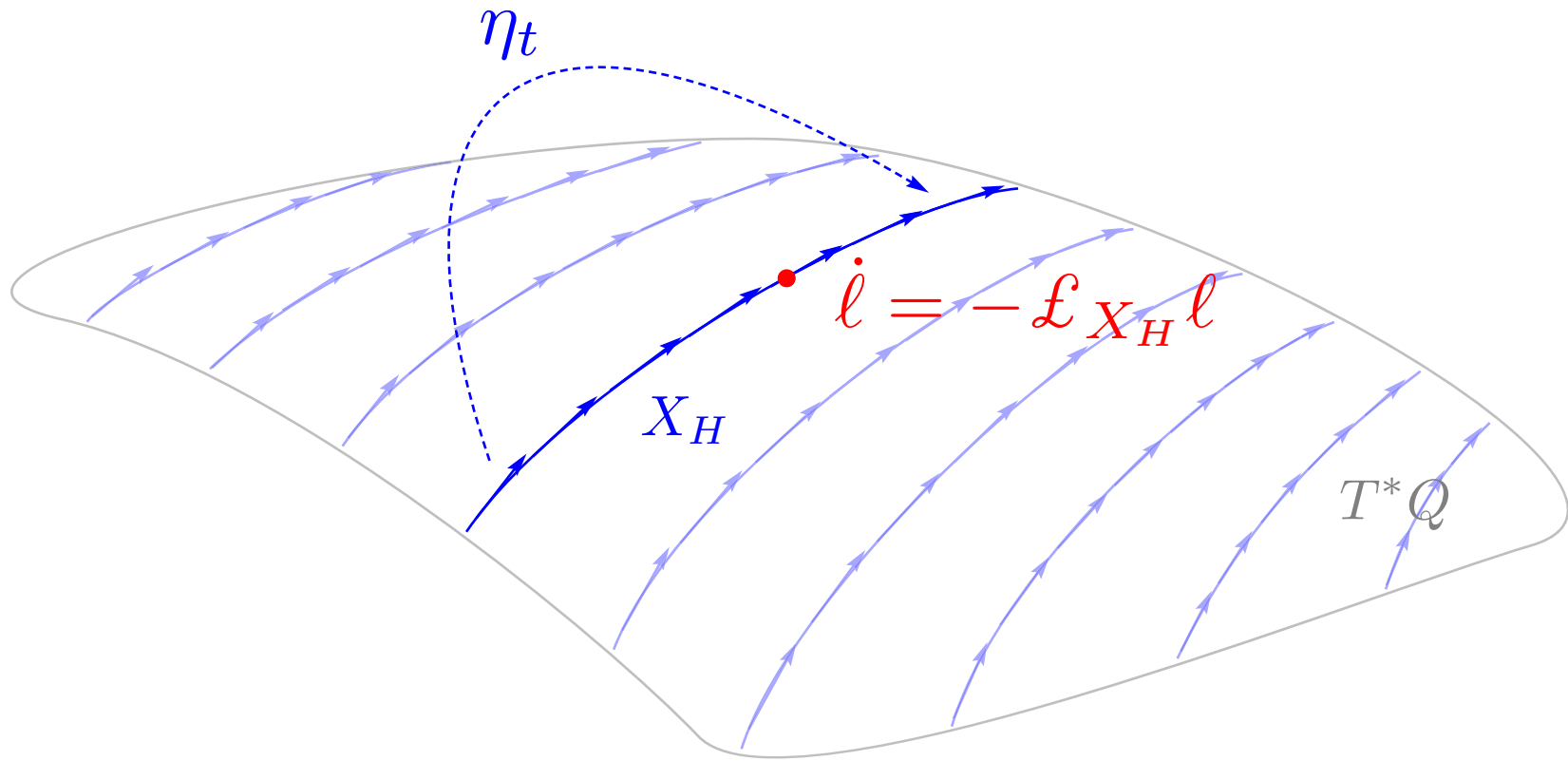
conservation of  
 $\ell$  along "rays"

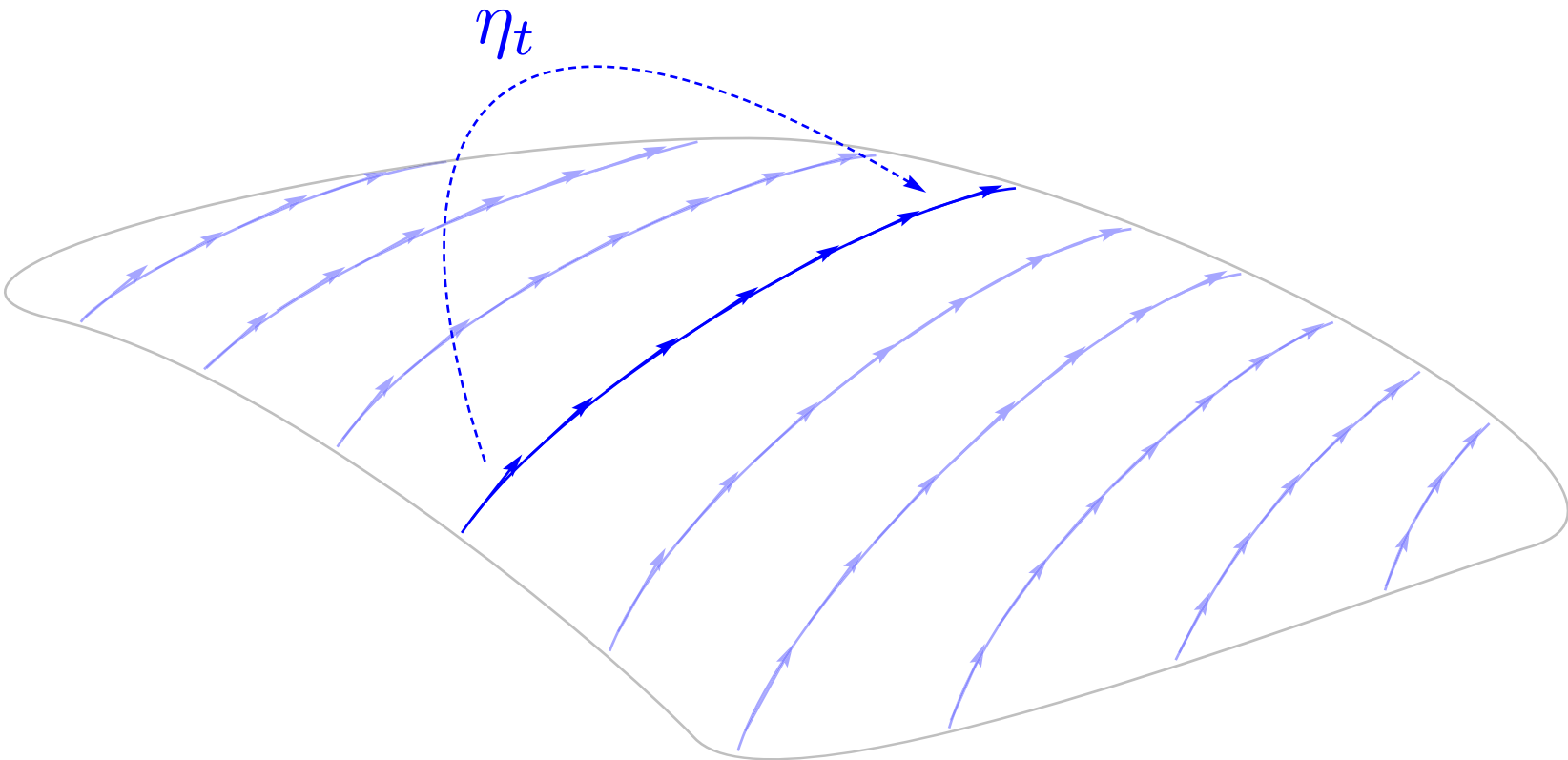
Lie-Poisson structure  
of ideal light transport

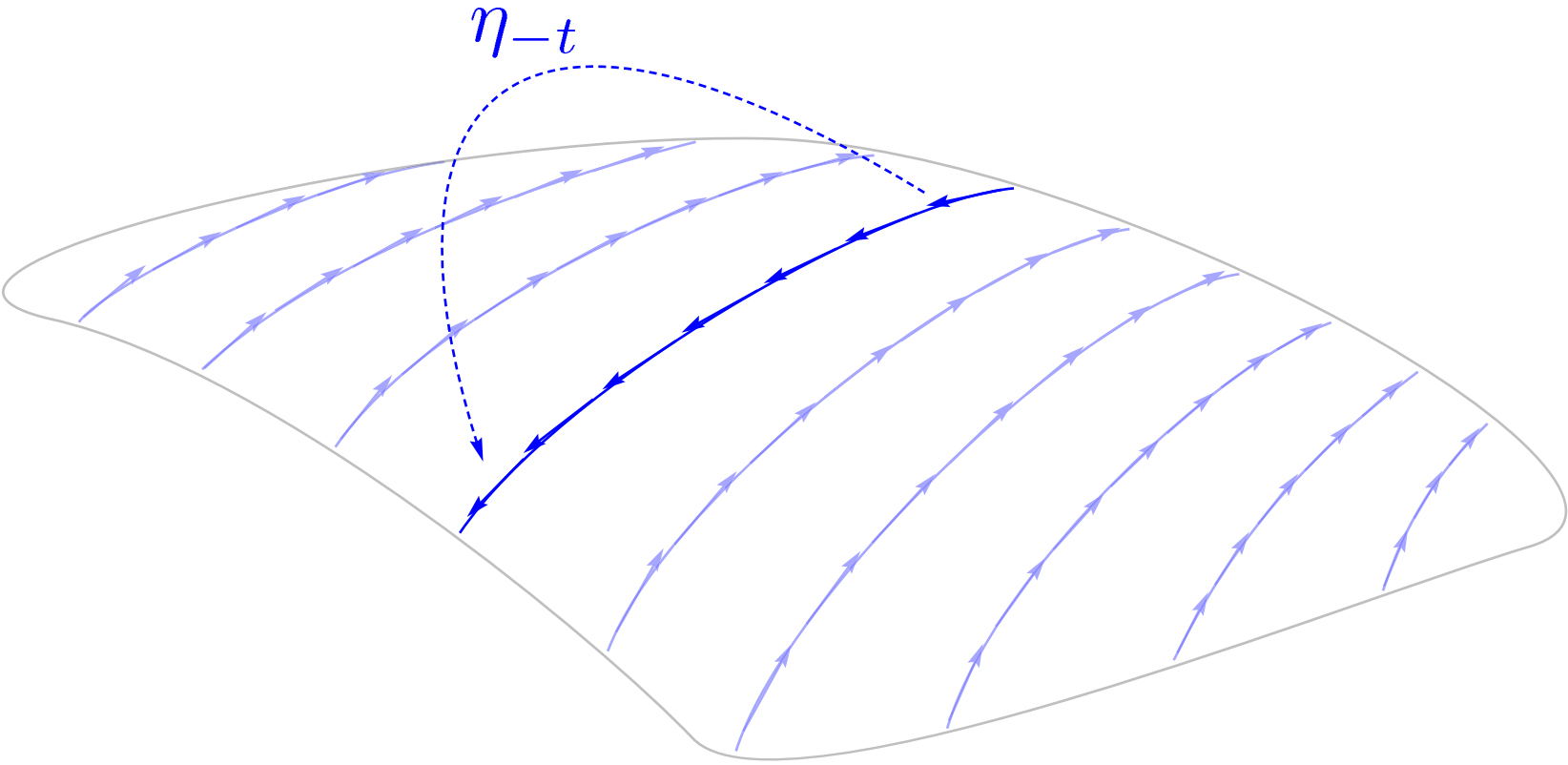
conservation of  
frequency

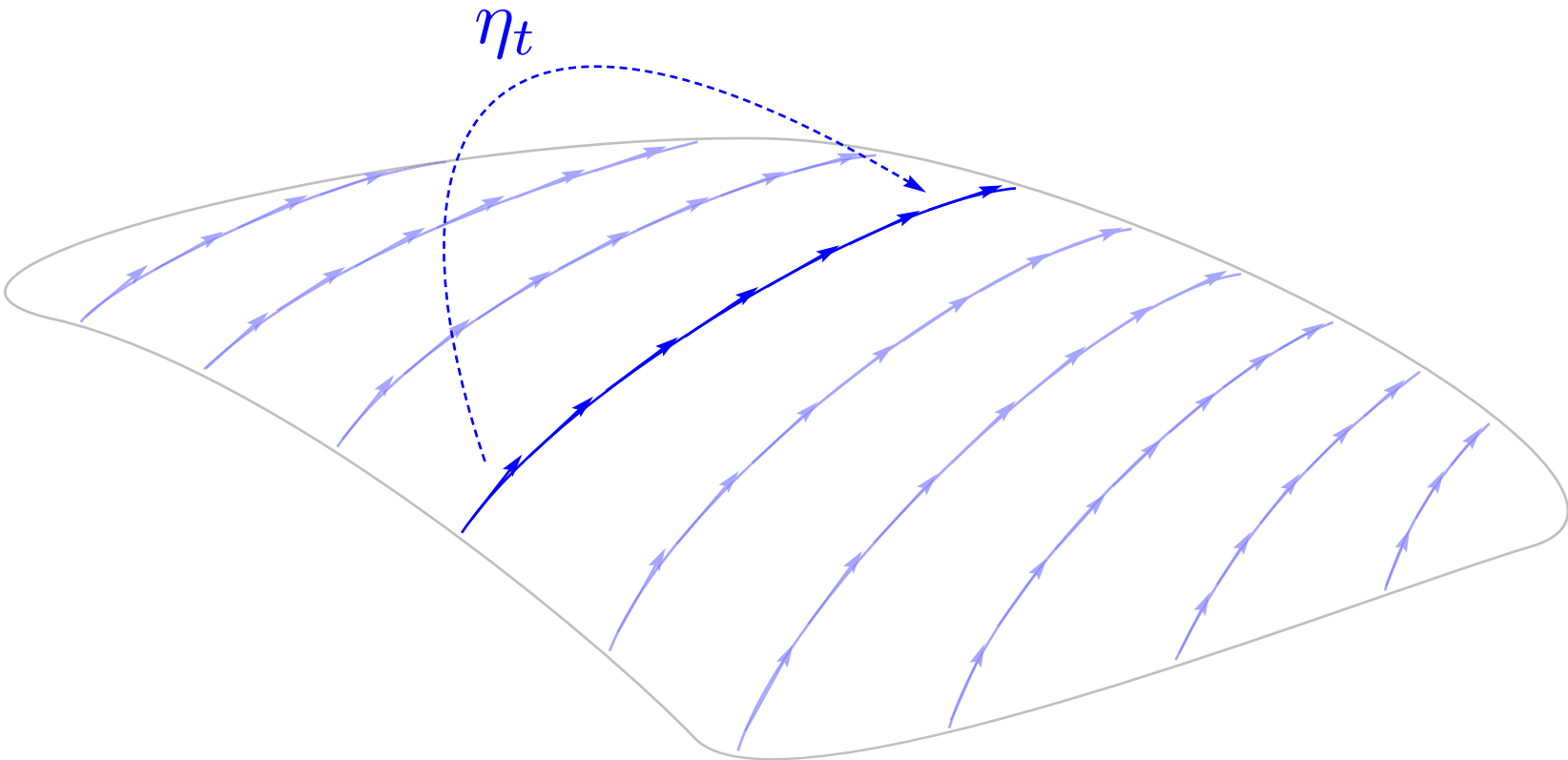


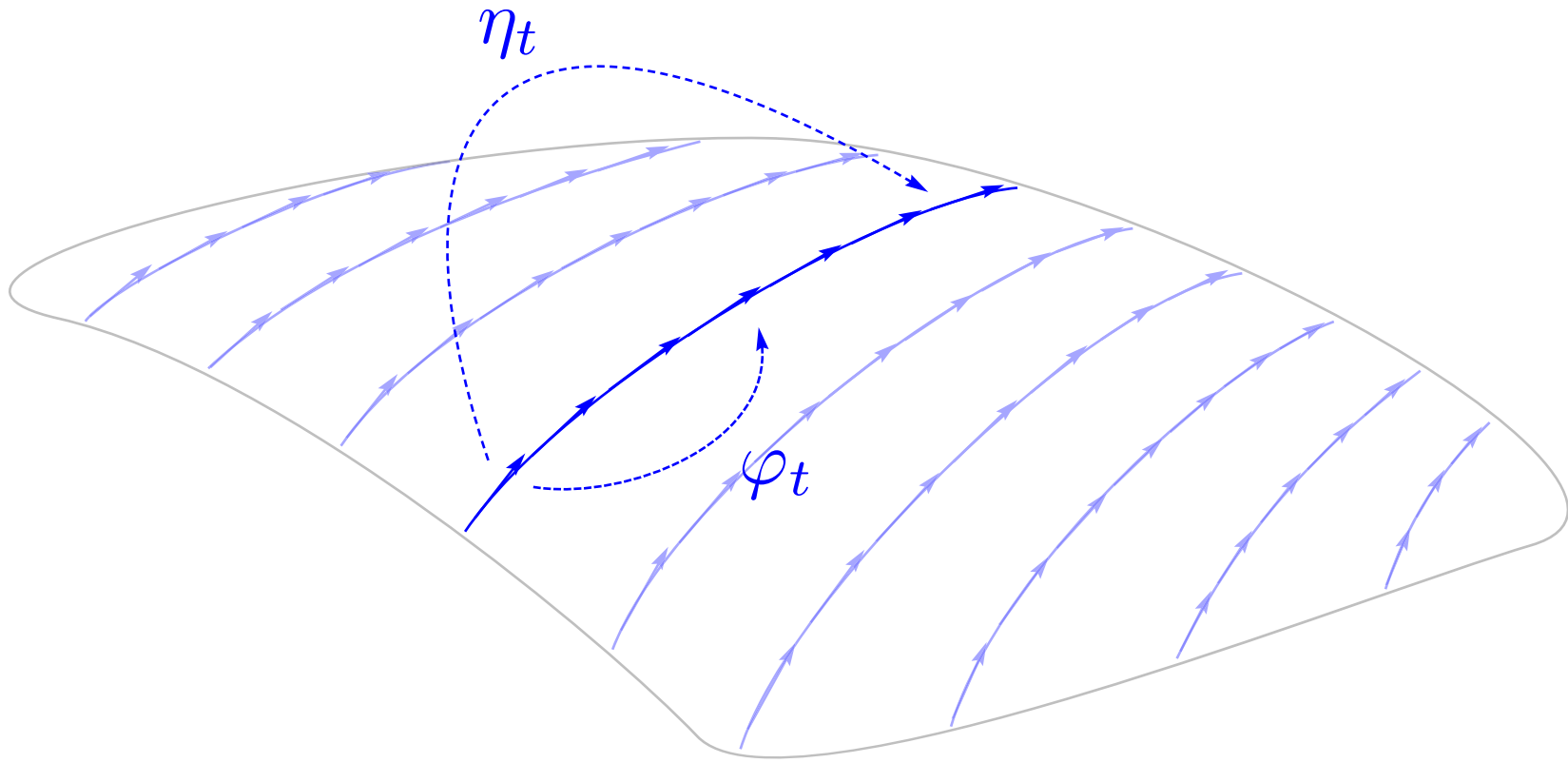


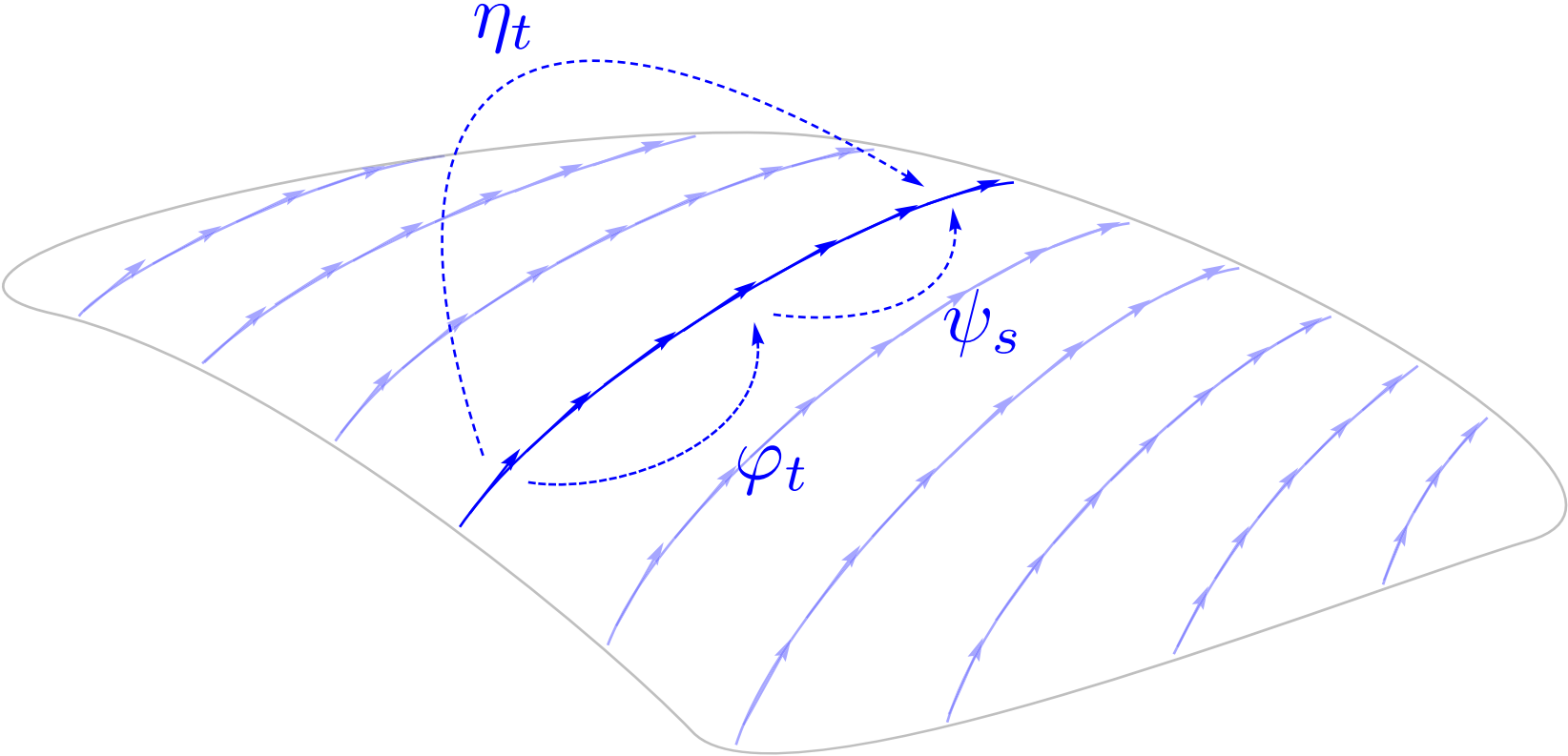


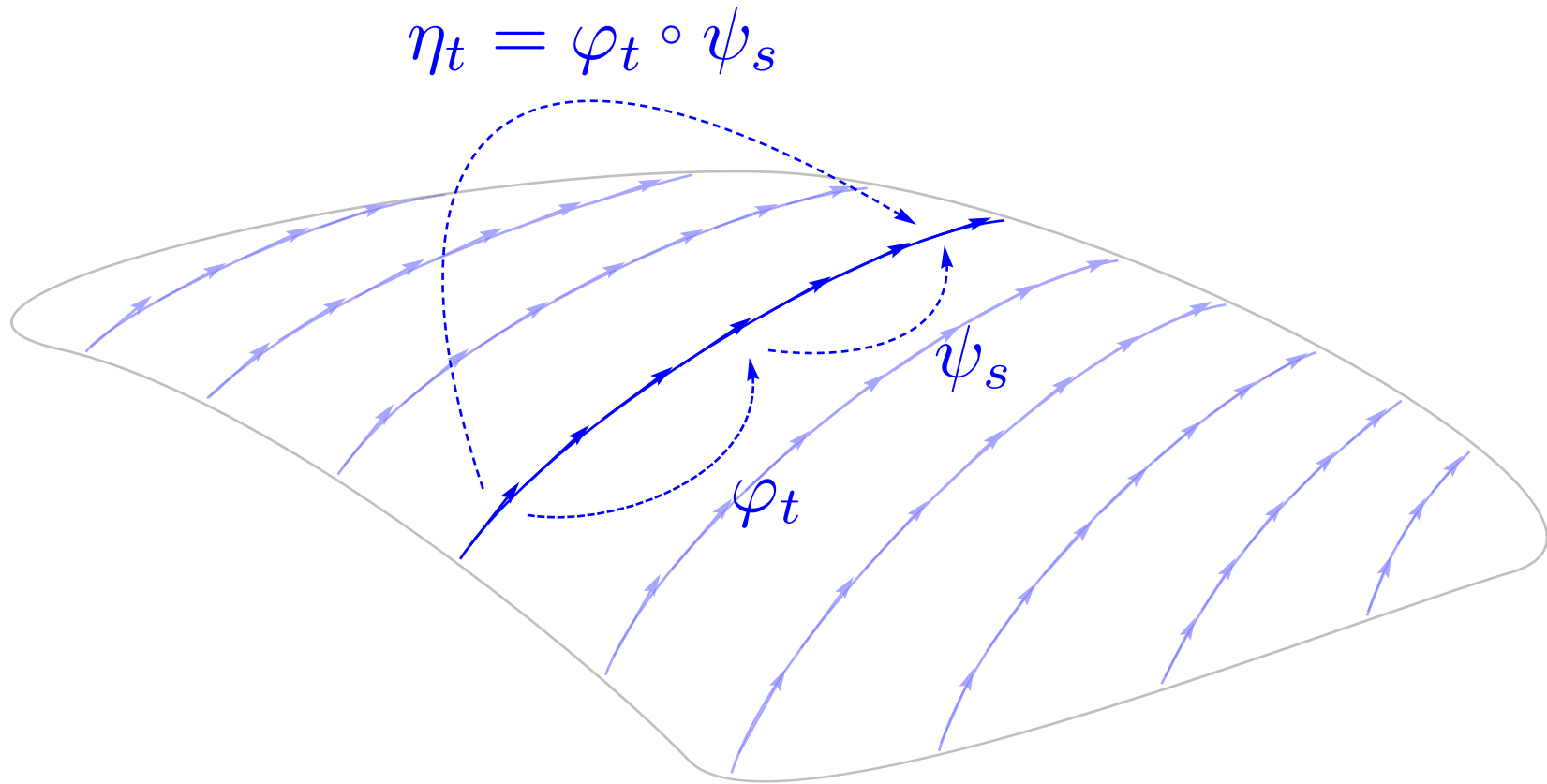












## electromagnetic theory

configuration space  $Q$ 

$$\frac{\partial}{\partial t} \begin{pmatrix} \vec{E} \\ \vec{H} \end{pmatrix} = \begin{pmatrix} 0 & -\frac{1}{\epsilon} \nabla \times \\ \frac{1}{\mu} \nabla \times & 0 \end{pmatrix} \begin{pmatrix} \vec{E} \\ \vec{H} \end{pmatrix}$$

microlocal analysis  
(Wigner transform)

phase space  $T^*Q$ 

$$-\dot{W}^\epsilon = \{\{p^\epsilon, W^\epsilon\}\}$$

$\epsilon \rightarrow 0$

$$\dot{W}_a^0 + \{\tau_a, W_a^0\} = [W_a^0, F_a]$$

unpolarized  
radiation

Fermat's principle

$$\hat{L} = n^2(q)$$

Legendre  
transform

light transport equation

$$\dot{\ell} = -\{\ell, H\}$$

cosphere  
bundle reduction

classic iso-velocity description

$$S^*Q \cong S^2Q$$

measurements

classical radiometry

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	ideal fluid dynamics	ideal light transport
Lie group	$\text{Diff}_\mu(Q)$	$\text{Diff}_{\text{can}}(T^*Q)$
dual Lie algebra representation	vorticity	light energy density
coadjoint action	$\dot{\omega} = \mathcal{L}_v \omega$	$\dot{\ell} = \mathcal{L}_{X_H} \ell$
momentum map	Kelvin's circulation theorem	conservation of radiance

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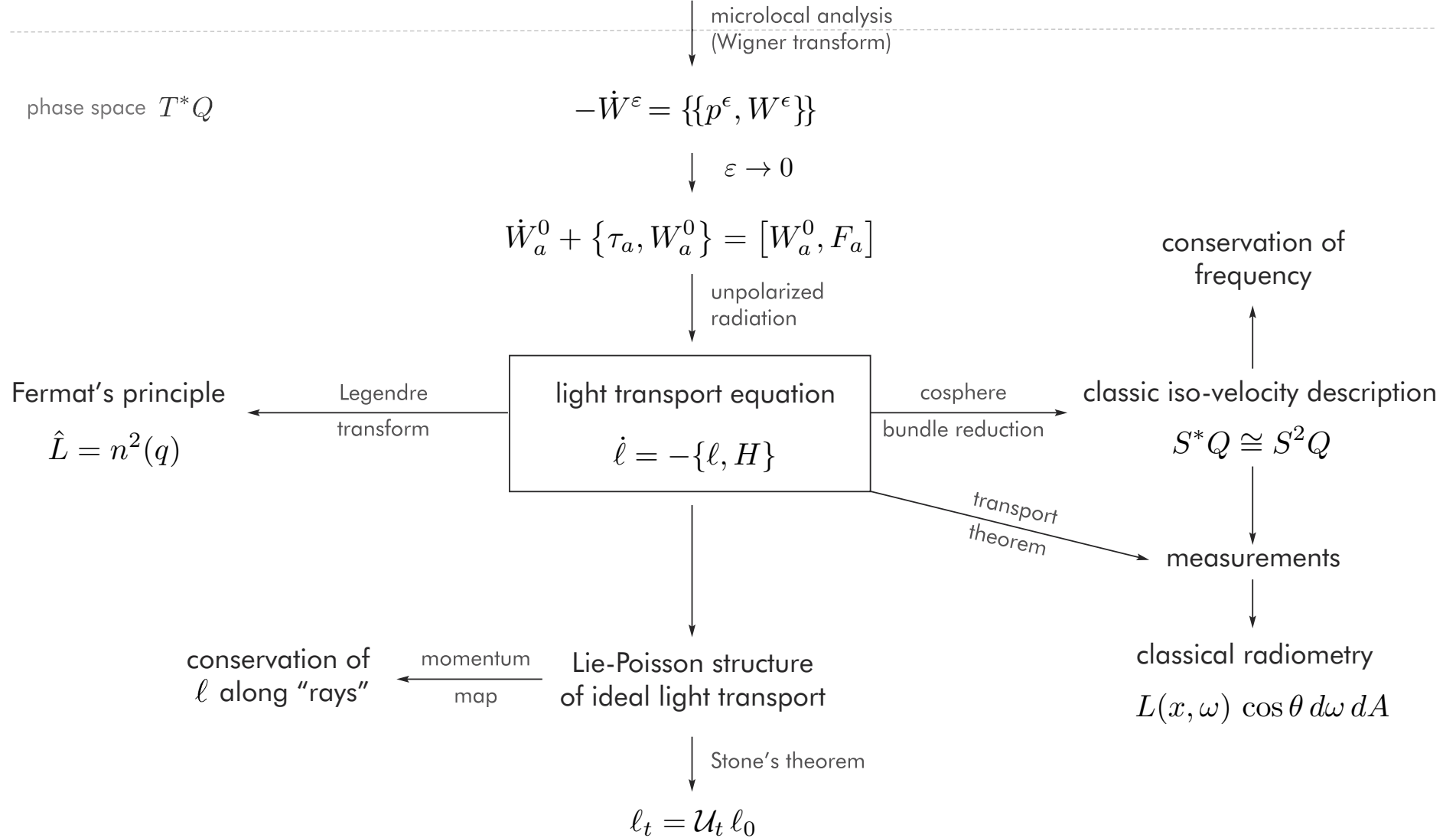
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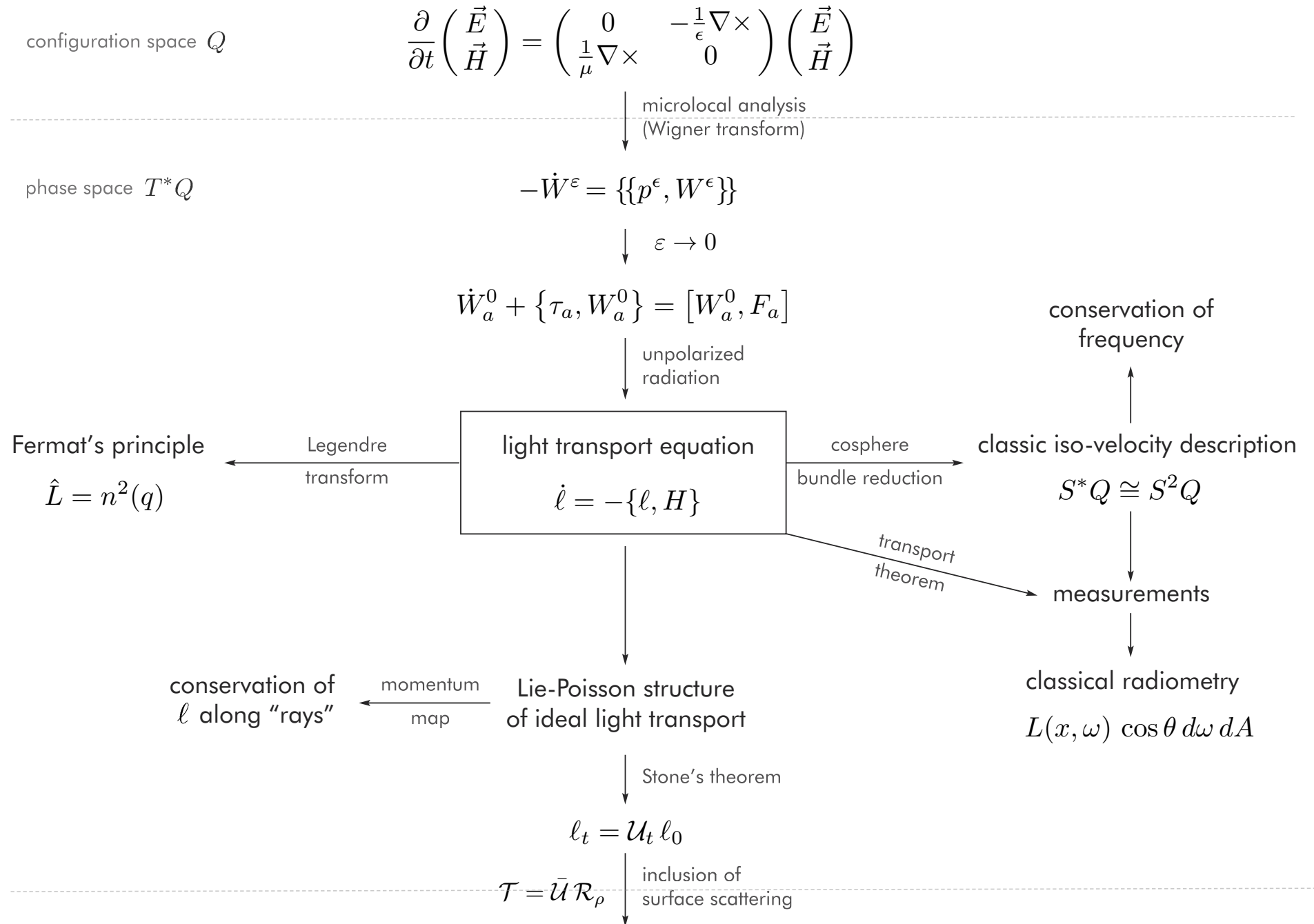
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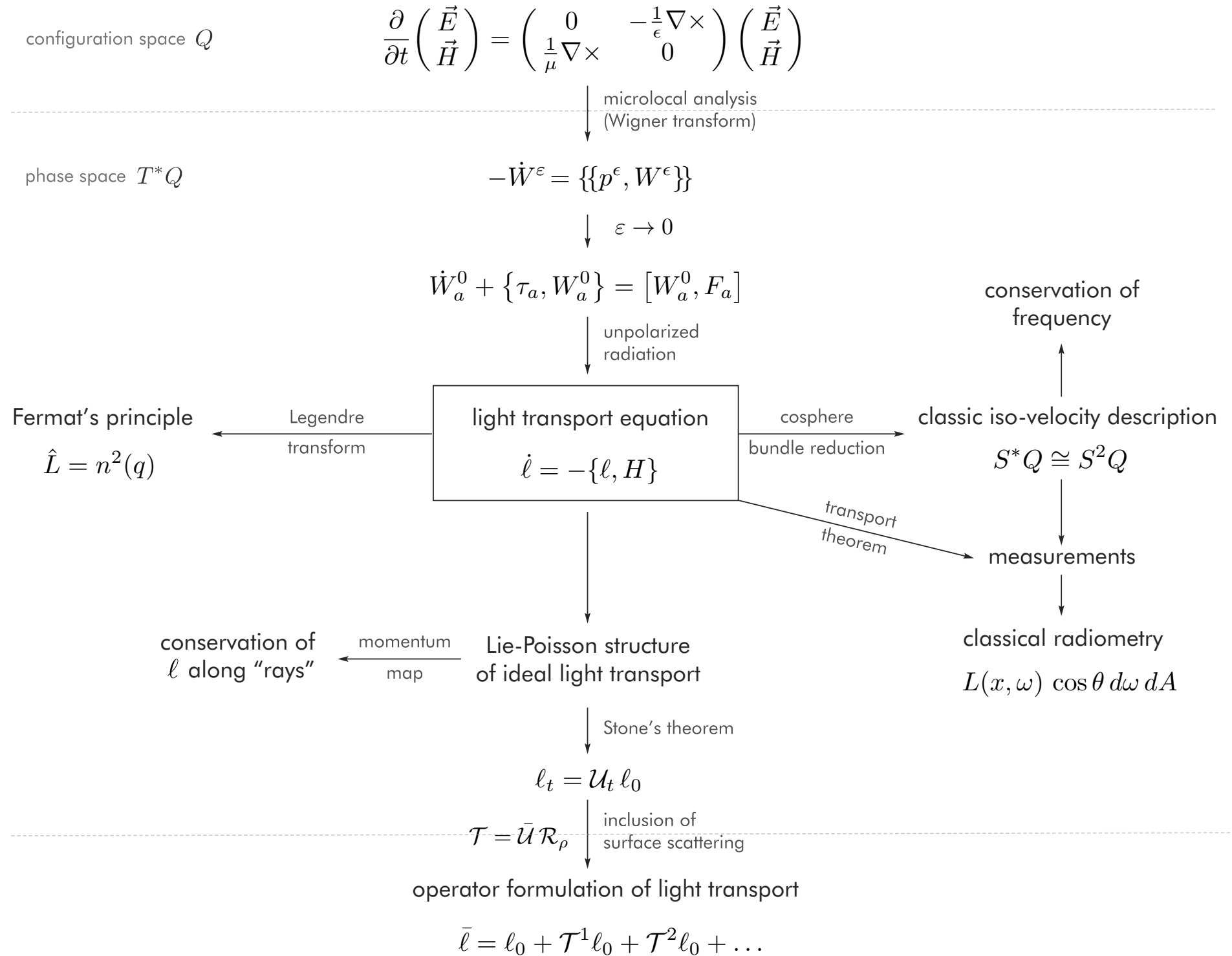
$$l_t = \mathcal{U}_t l_0$$



## electromagnetic theory



## electromagnetic theory



**... from physics  
to current computations ...**



# Challenges

## 1. Visibility.

# Challenges

1. Visibility.
2. Curse of dimensionality.

# Challenges

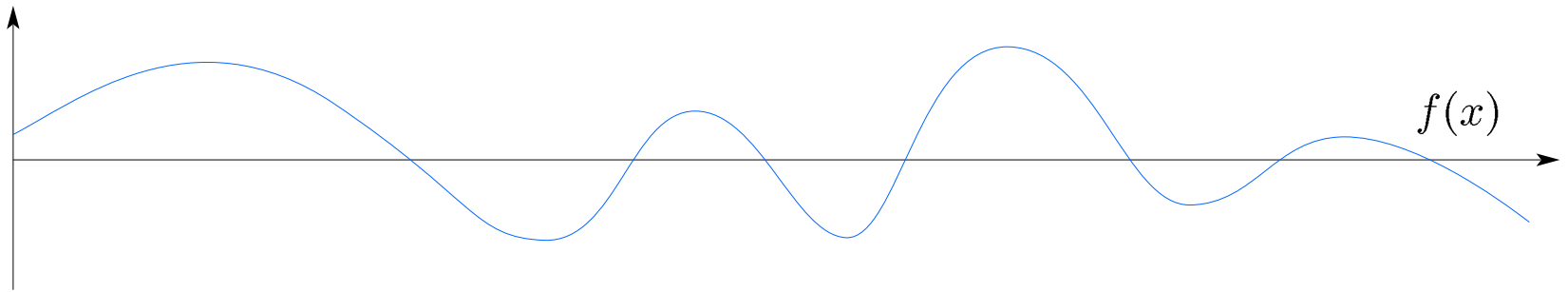
1. Visibility.
2. Curse of dimensionality.
3. Only local information is available.

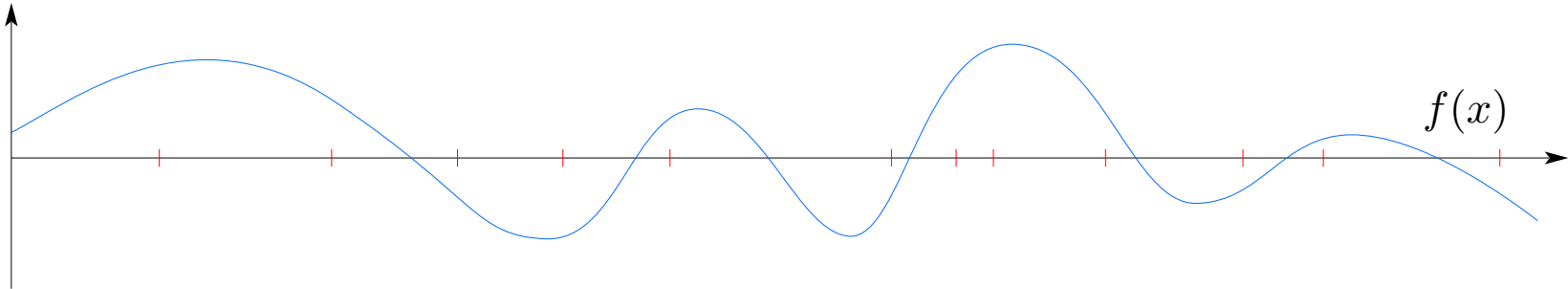
# Challenges

1. Visibility.
2. Curse of dimensionality.
3. Only local information is available.

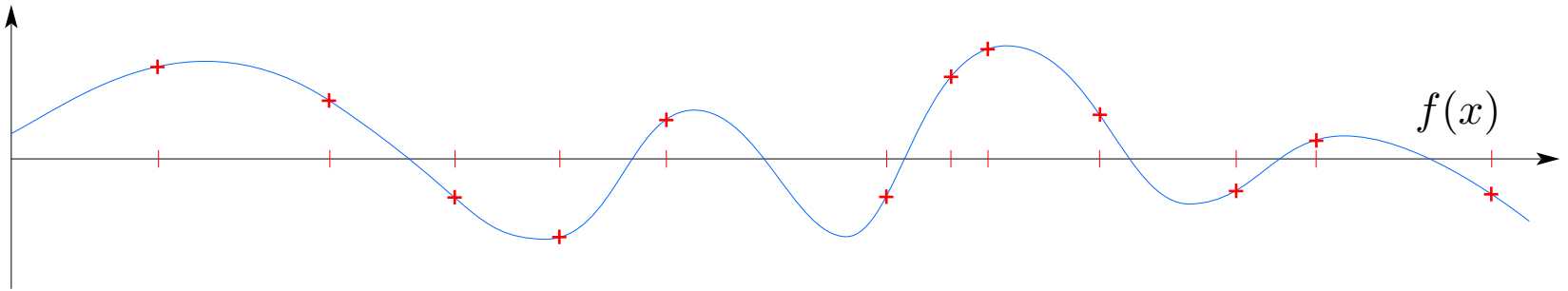
## Techniques for local information

- Quadrature rules.
- Interpolation schemes.
- Sampling theorems.
- Density estimation techniques.
- (Quasi) Monte Carlo integration.
- ...



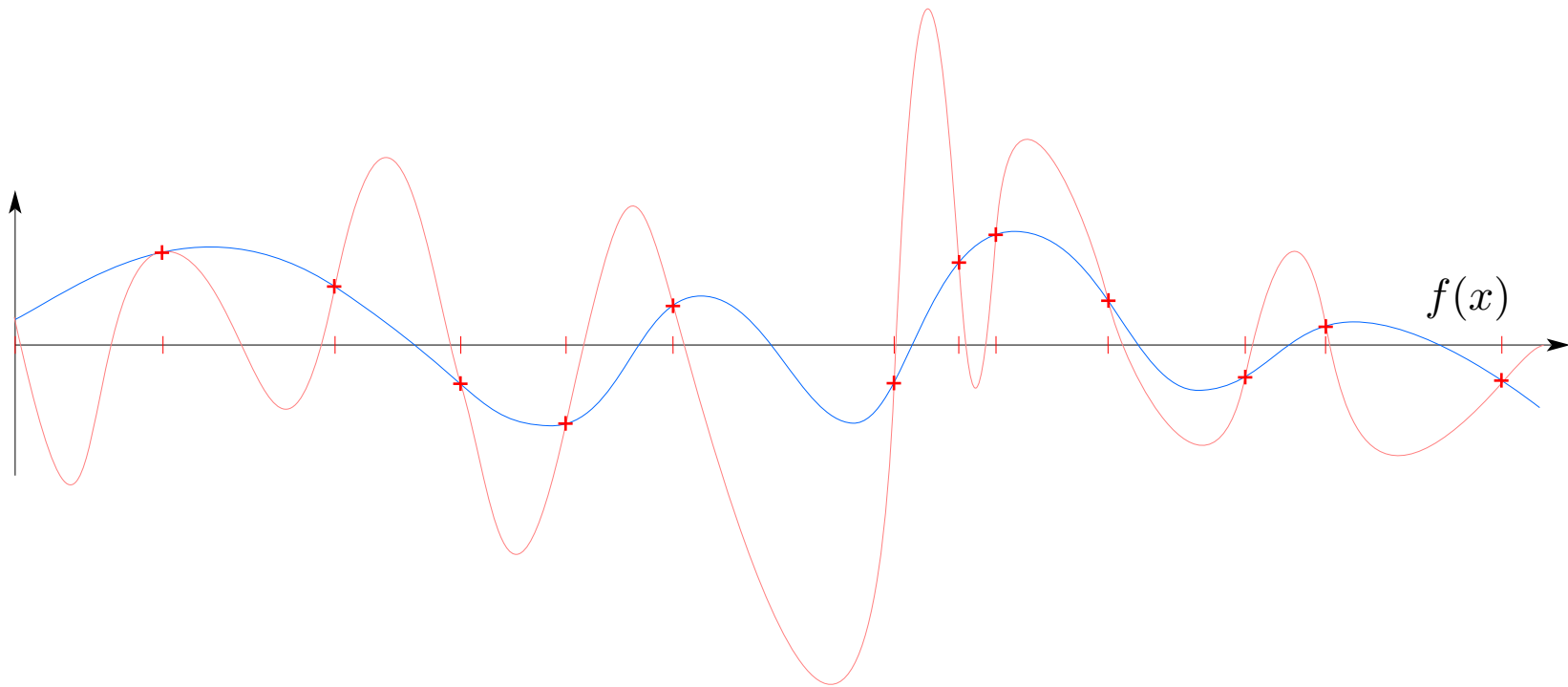


$$\frac{1}{n} \sum_{i=1}^n \frac{f(\lambda_i)}{p(\lambda_i)} \xrightarrow{n \rightarrow \infty} \int_X f(x) dx$$



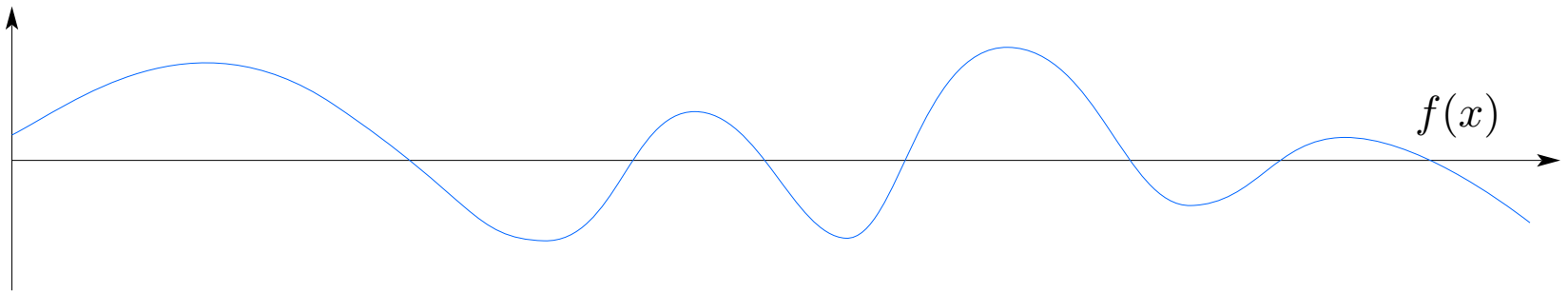


$$\bar{f}_\kappa = f(x) + \kappa \prod_{i=1}^n (x - \lambda_i)^2$$

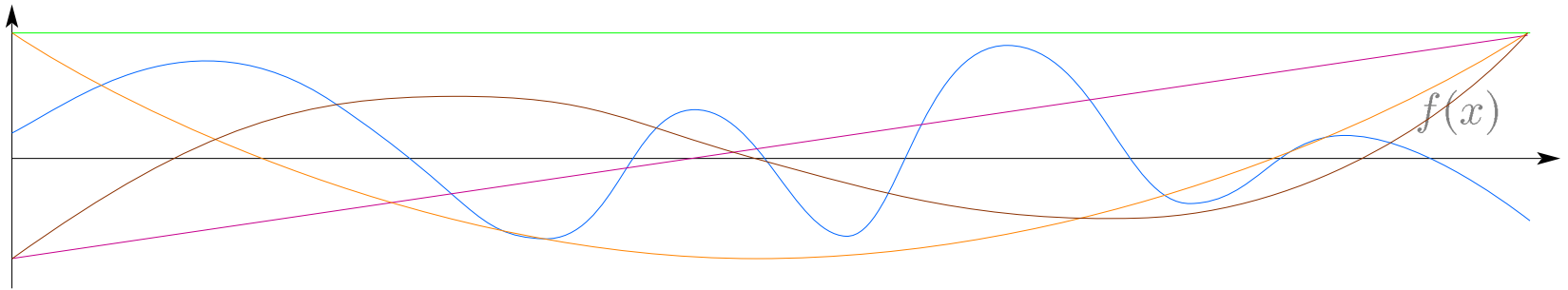


After Traub, J. F., and A. G. Werschulz, *Complexity and Information*. Cambridge University Press, 1999.

# Basis expansions

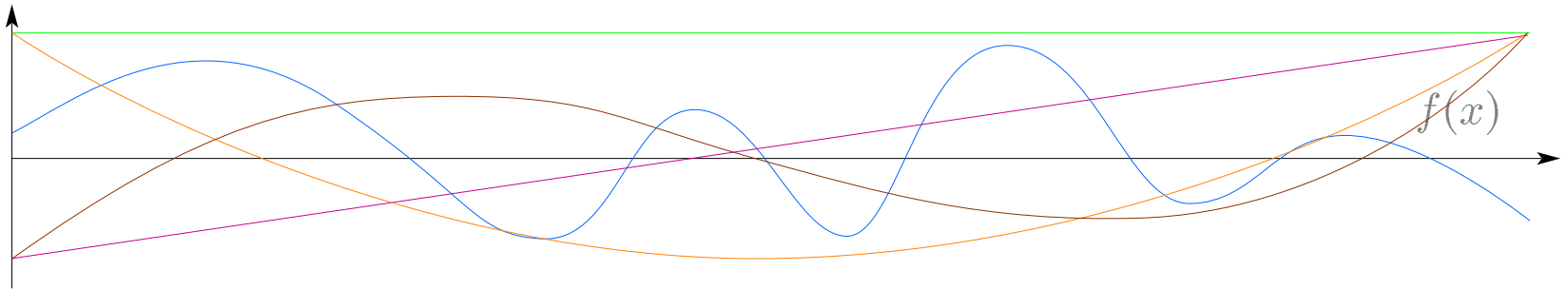


# Basis expansions



# Basis expansions

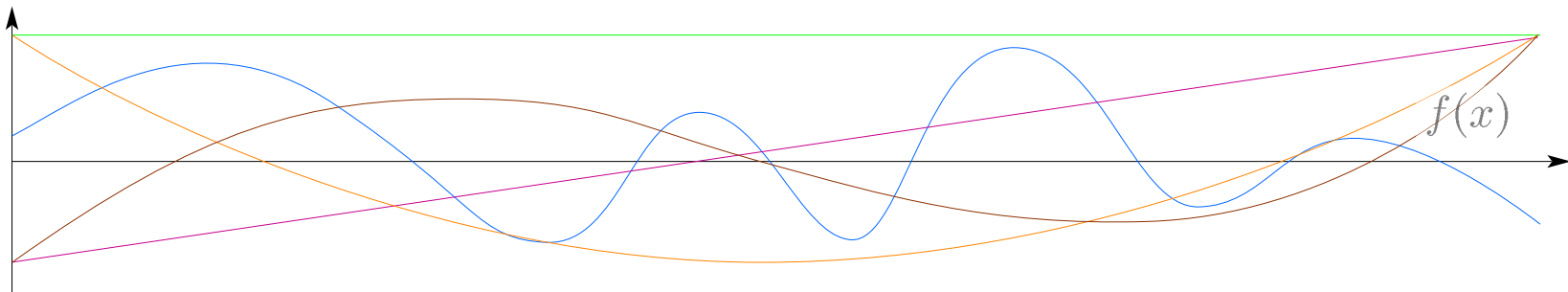
$$f(x) = \sum_{i=1}^n f_i \varphi_i(x)$$



## Basis expansions

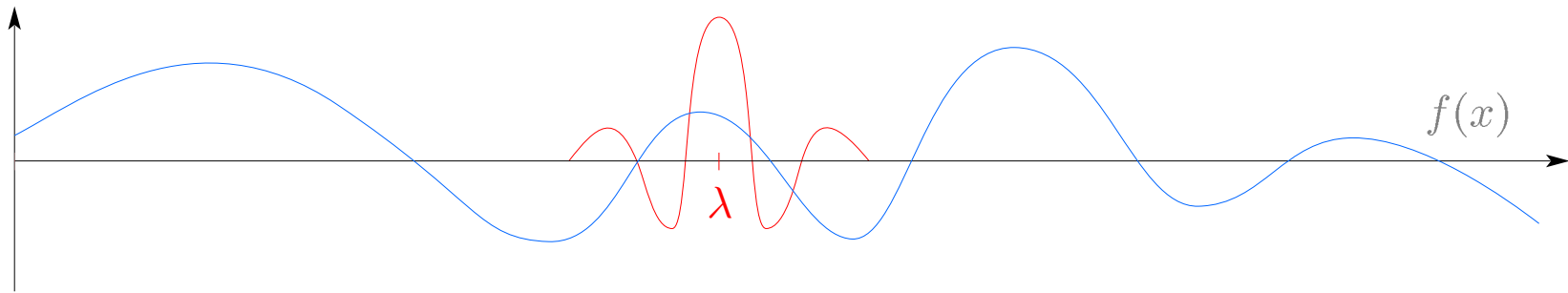
$$f(x) = \sum_{i=1}^n f_i \varphi_i(x)$$

$$= \sum_{i=1}^n \langle f(\bar{x}), \tilde{\varphi}_i(\bar{x}) \rangle \varphi_i(x)$$



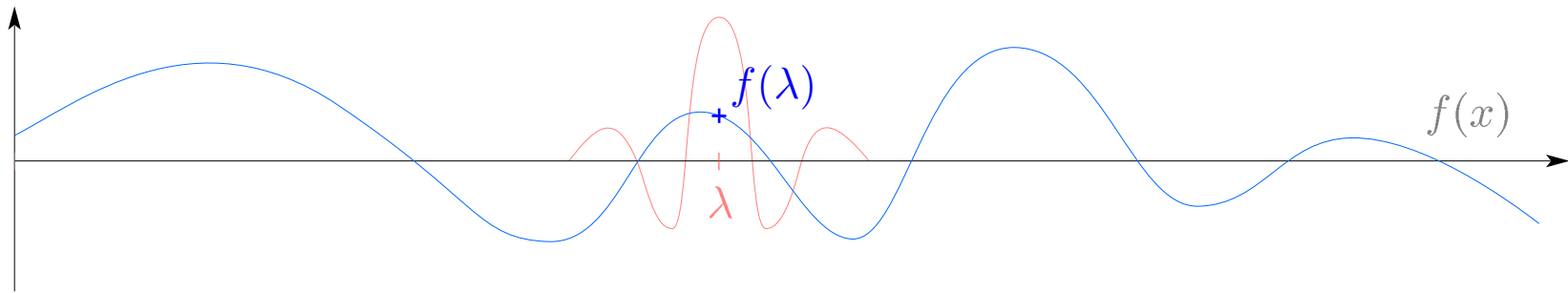
# Reproducing kernel

$$k_\lambda(\bar{x})$$



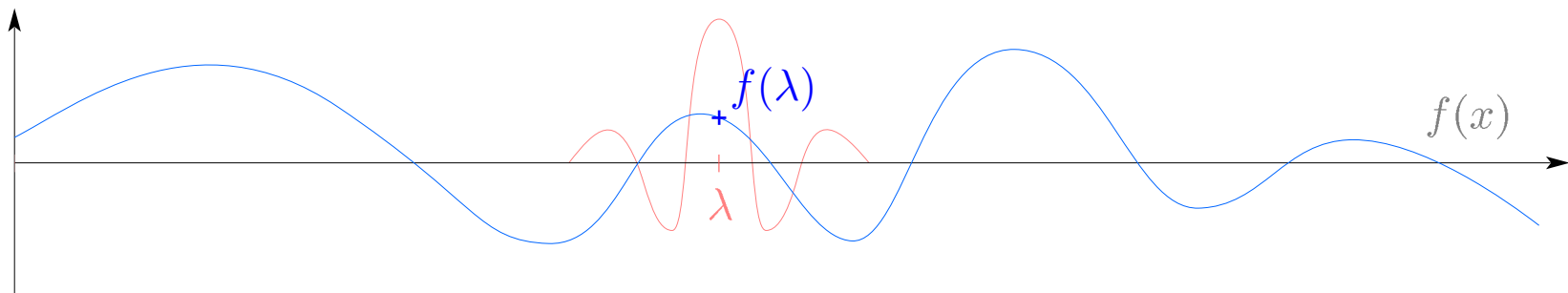
# Reproducing kernel

$$f(\lambda) = \langle f(\bar{x}), k_\lambda(\bar{x}) \rangle$$



# Reproducing kernel

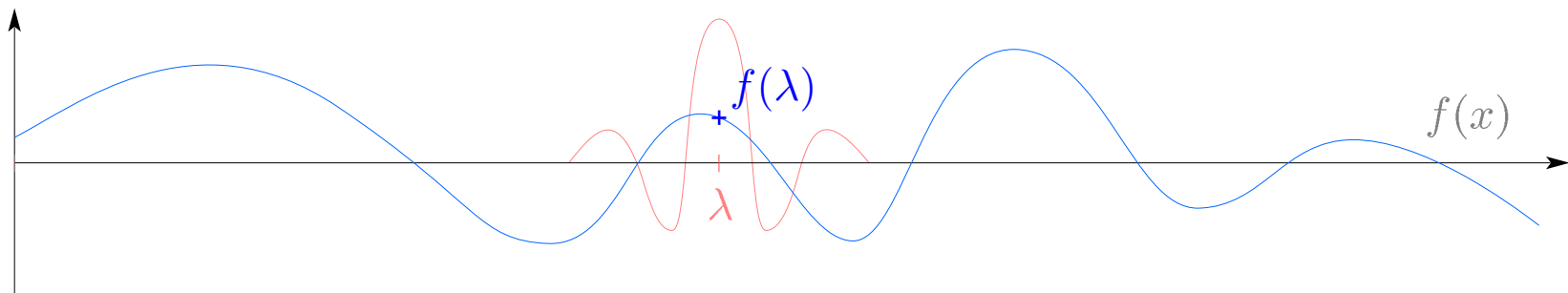
$$f(\lambda) = \langle f(\bar{x}), k_\lambda(\bar{x}) \rangle = \delta_\lambda(f)$$





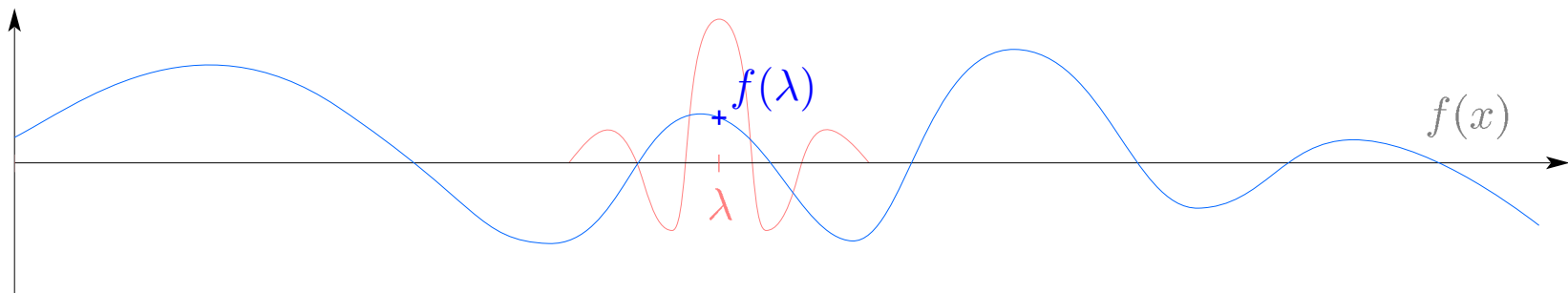
# Reproducing kernel

$$k_\lambda(x) = k(\lambda, x) = \sum_{i=1}^n \phi_i(\lambda) \phi_i(x)$$

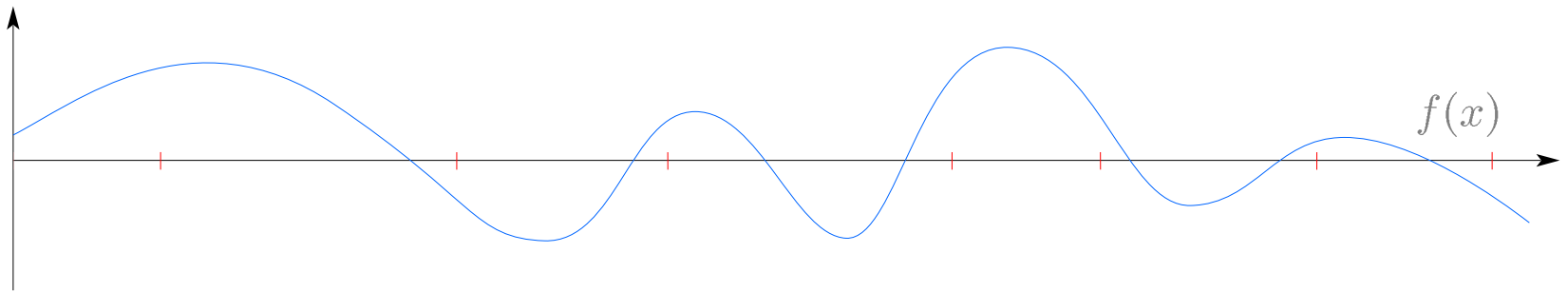


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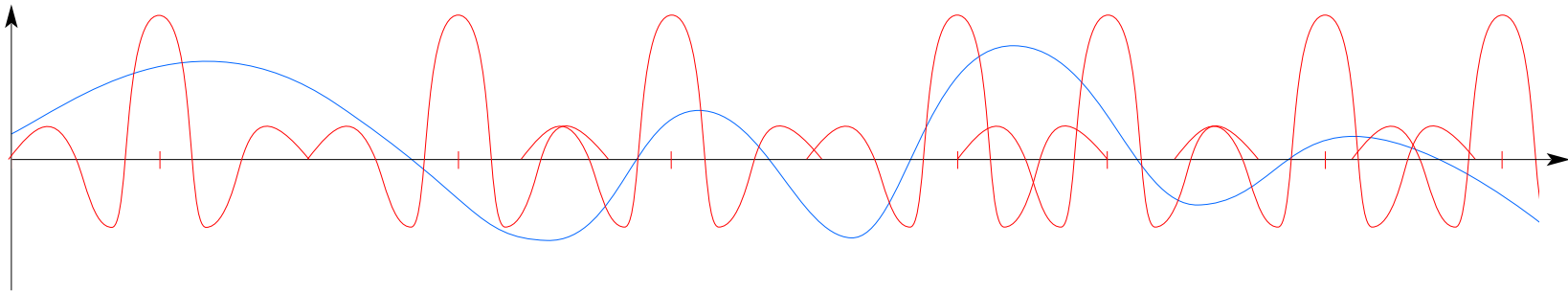


# Reproducing kernel bases



# Reproducing kernel bases

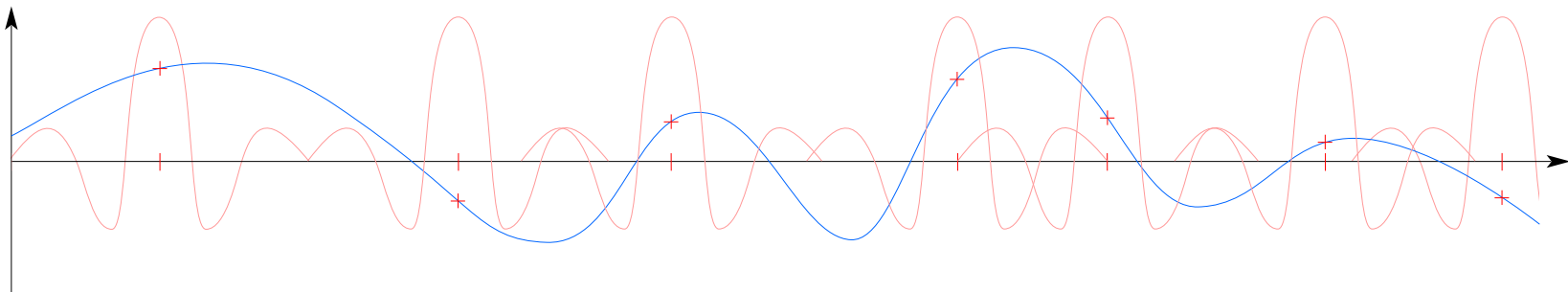
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$$= \sum_{i=1}^n f(\lambda_i) \tilde{k}_i(x)$$



## Reproducing kernel bases

- Shannon sampling theorem.
- Gauss-Legendre quadrature.
- Lagrange interpolation.
- Monte Carlo integration.
- ...

# Integration

$$I = \int_X f(x) dx$$

# Integration

$$\int_X f(x) dx = \int_X \sum_{i=1}^m f(\lambda_i) \tilde{k}_i(x) dx$$



# Integration

$$\begin{aligned}\int_X f(x) dx &= \int_X \sum_{i=1}^m f(\lambda_i) \tilde{k}_i(x) dx \\ &= \sum_{i=1}^m f(\lambda_i) \int_X \tilde{k}_i(x) dx\end{aligned}$$

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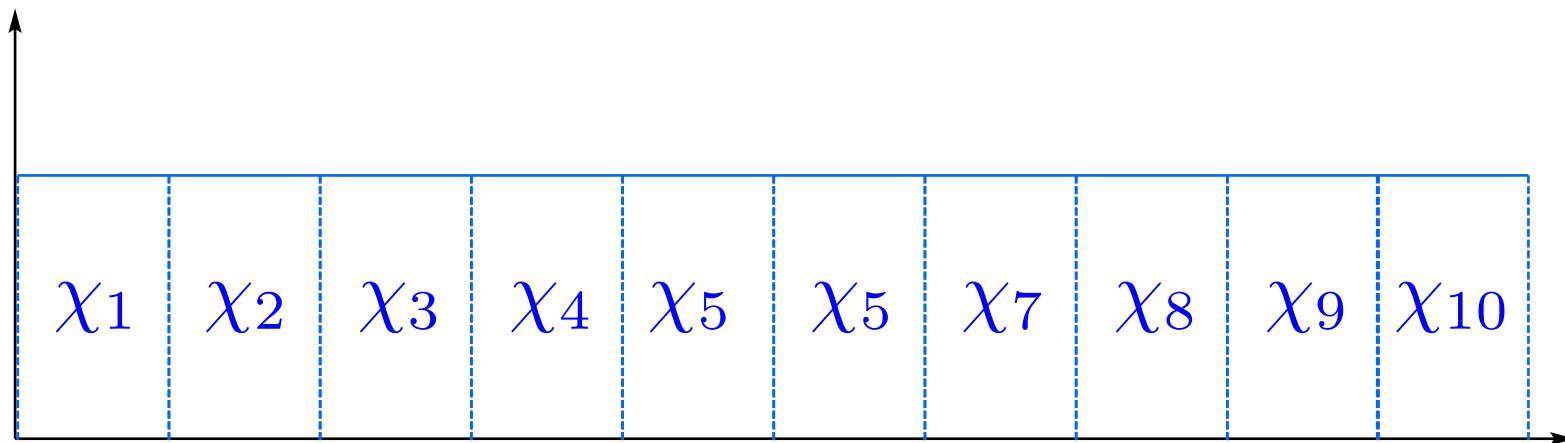
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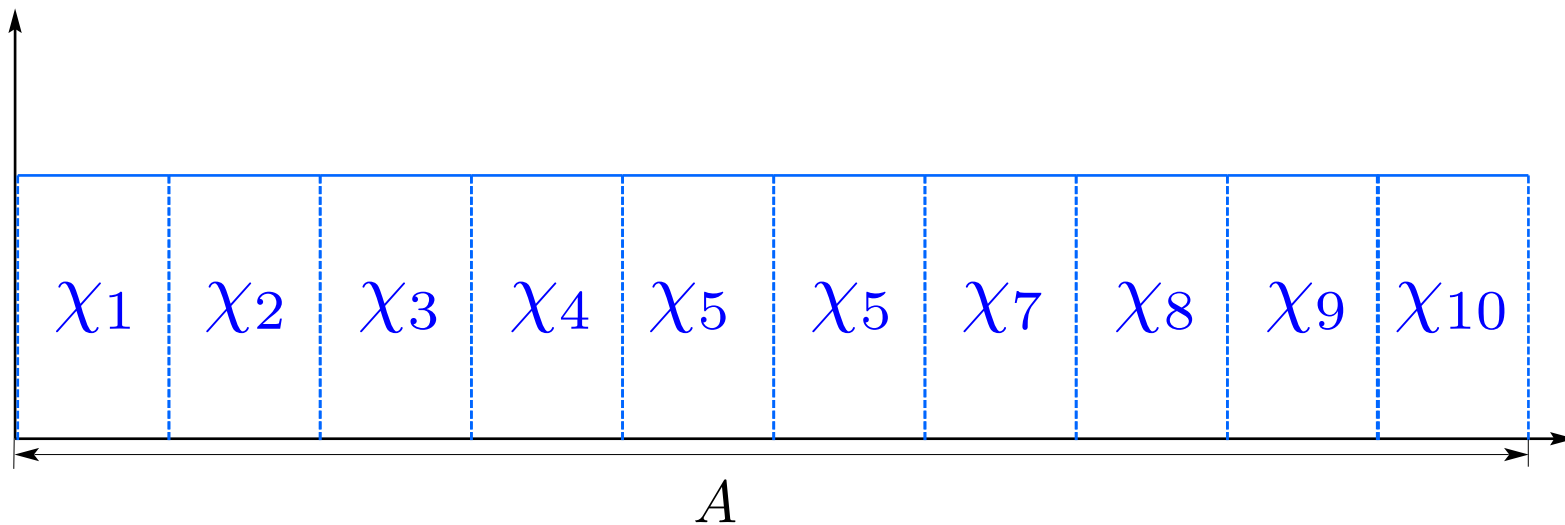
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# Reproducing kernel bases

1. Arbitrary domains and function spaces.

## Reproducing kernel bases

1. Arbitrary domains and function spaces.
2. Optimization of reproducing points.

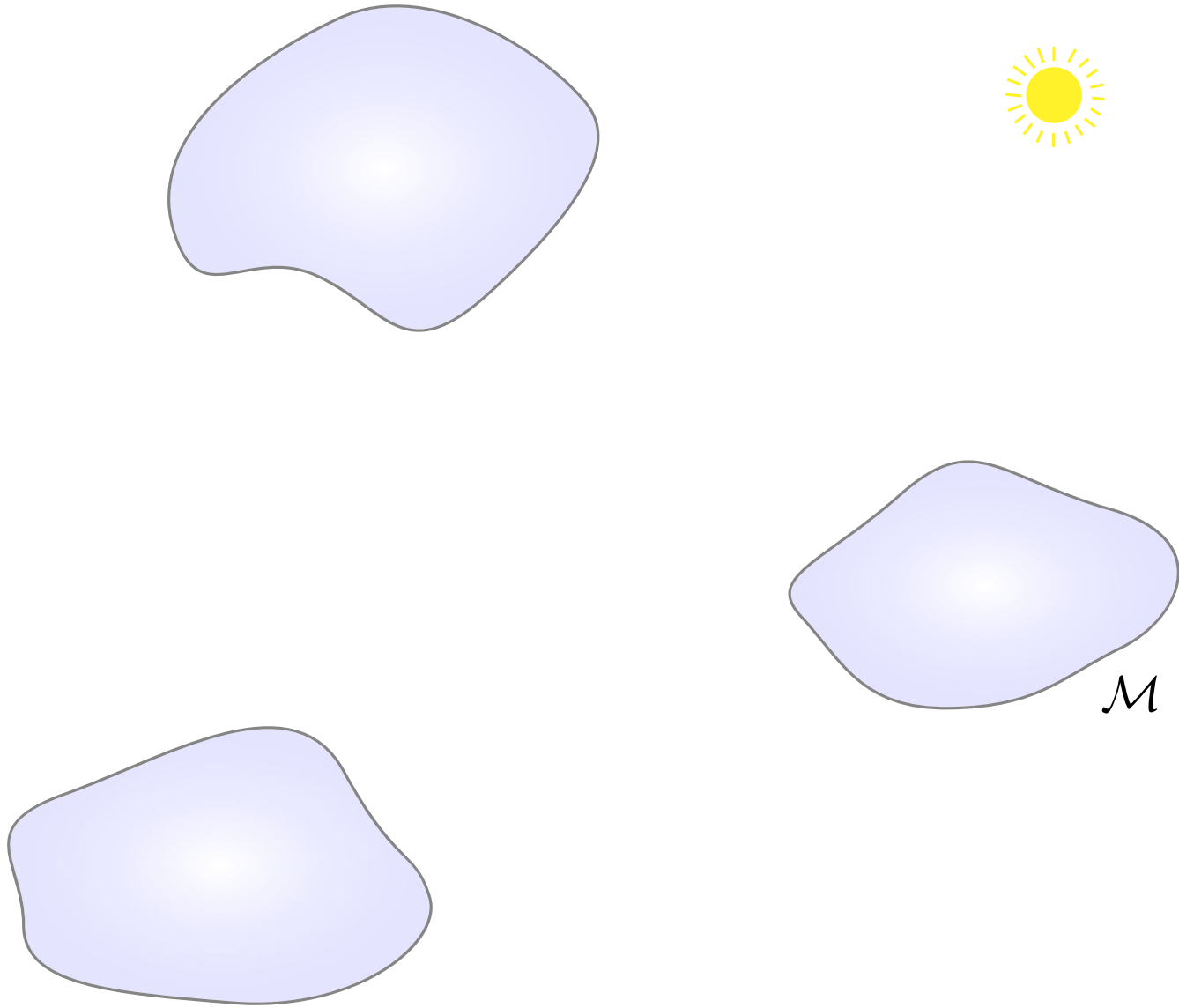
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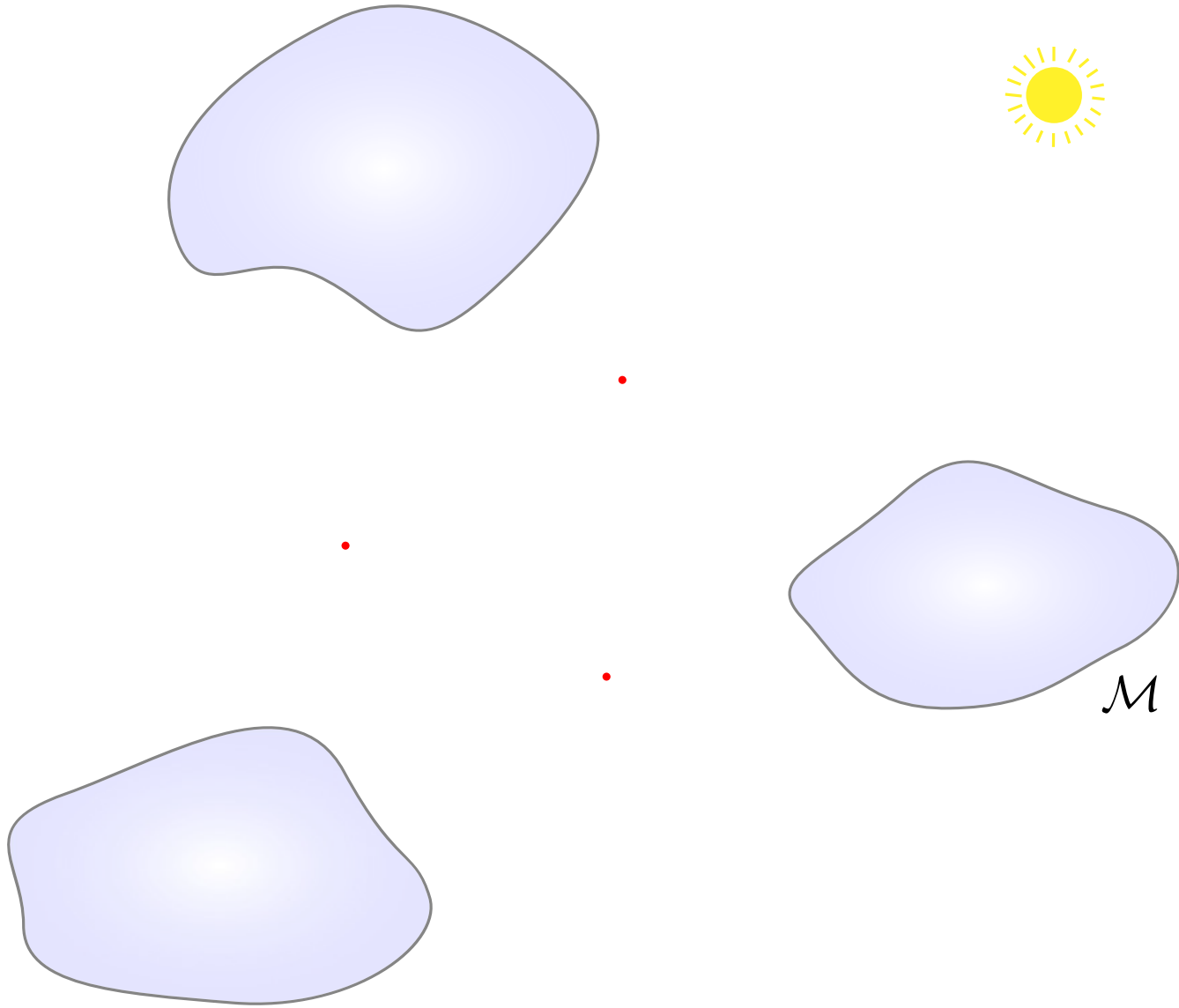
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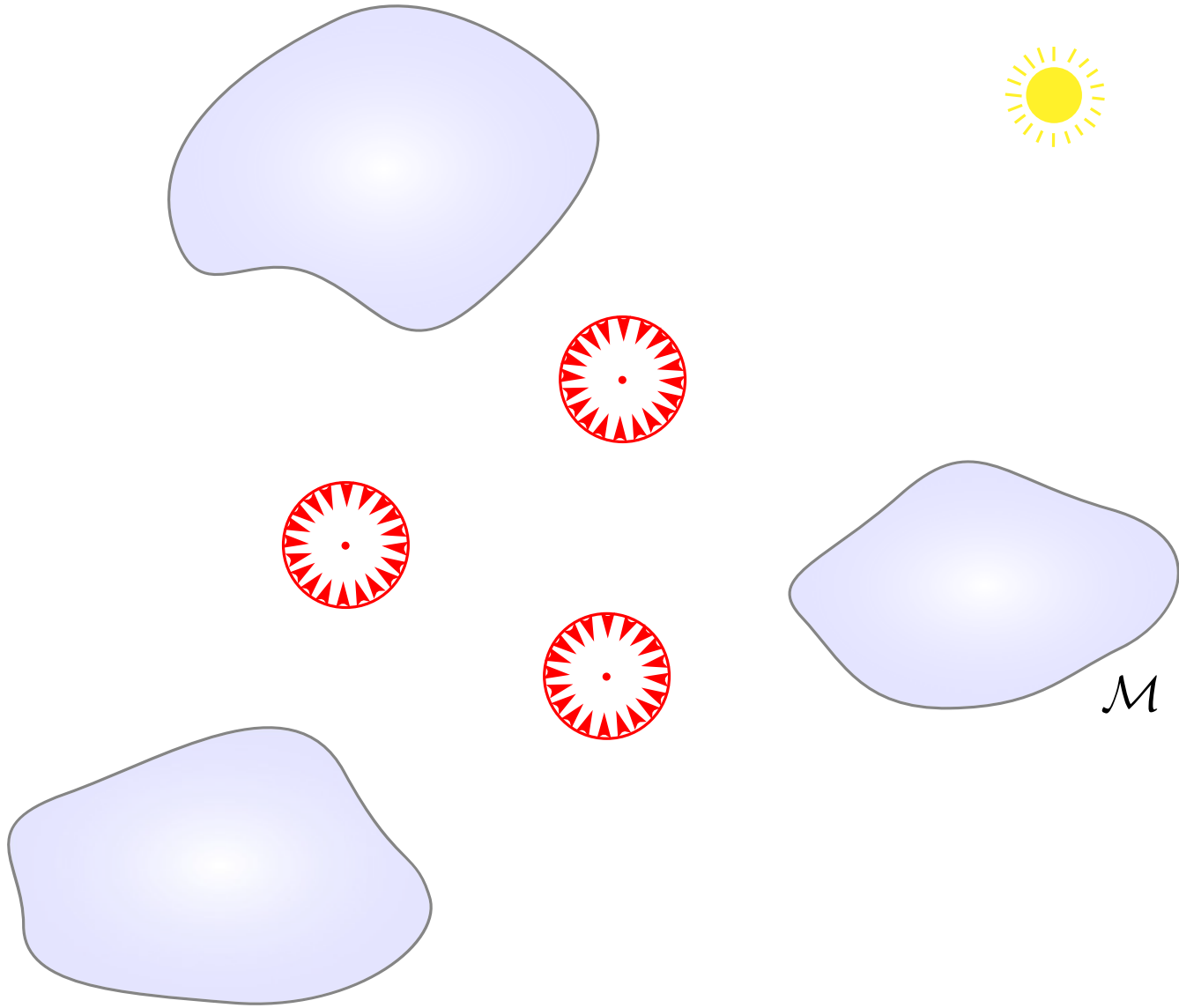
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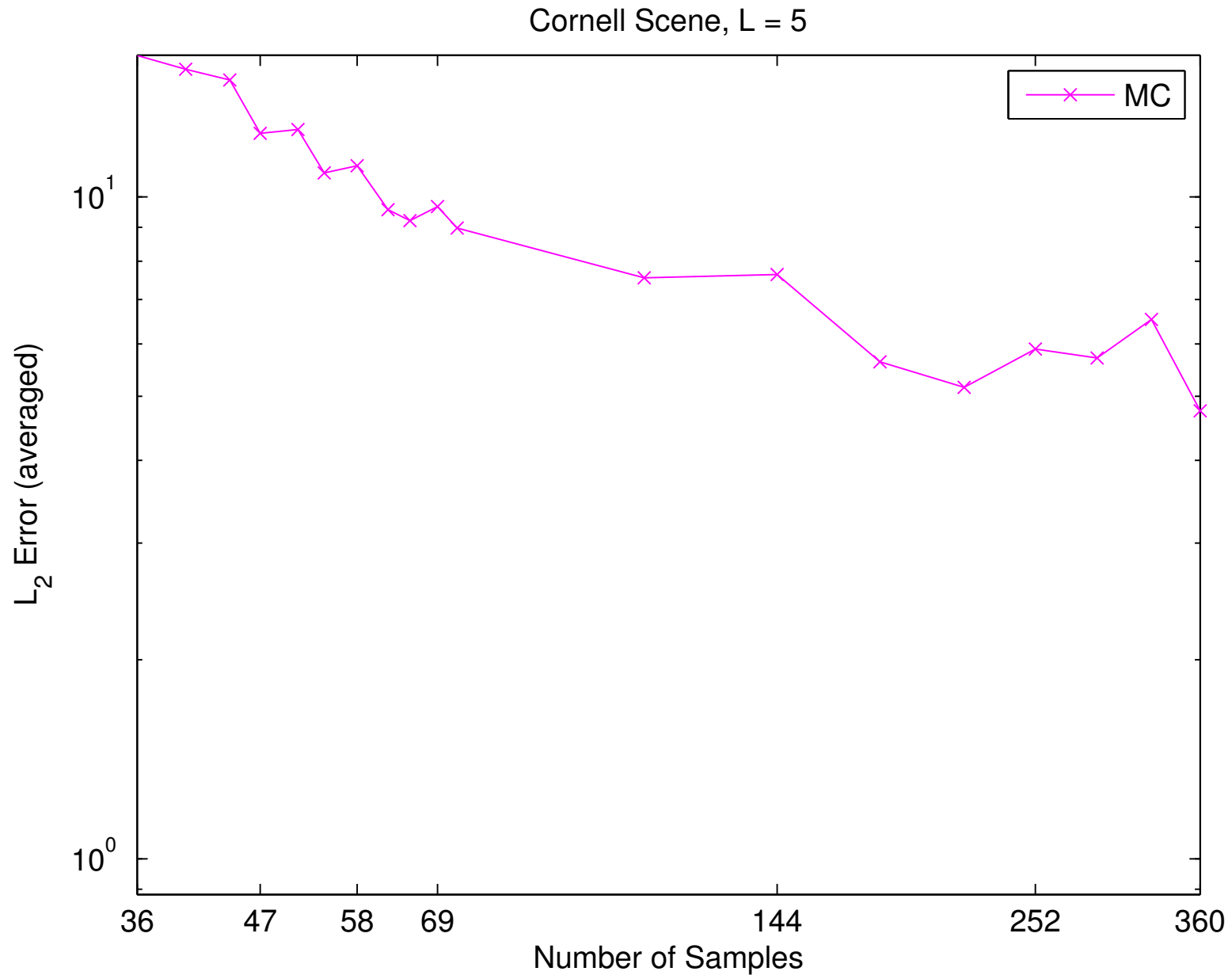
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4. Error analysis.

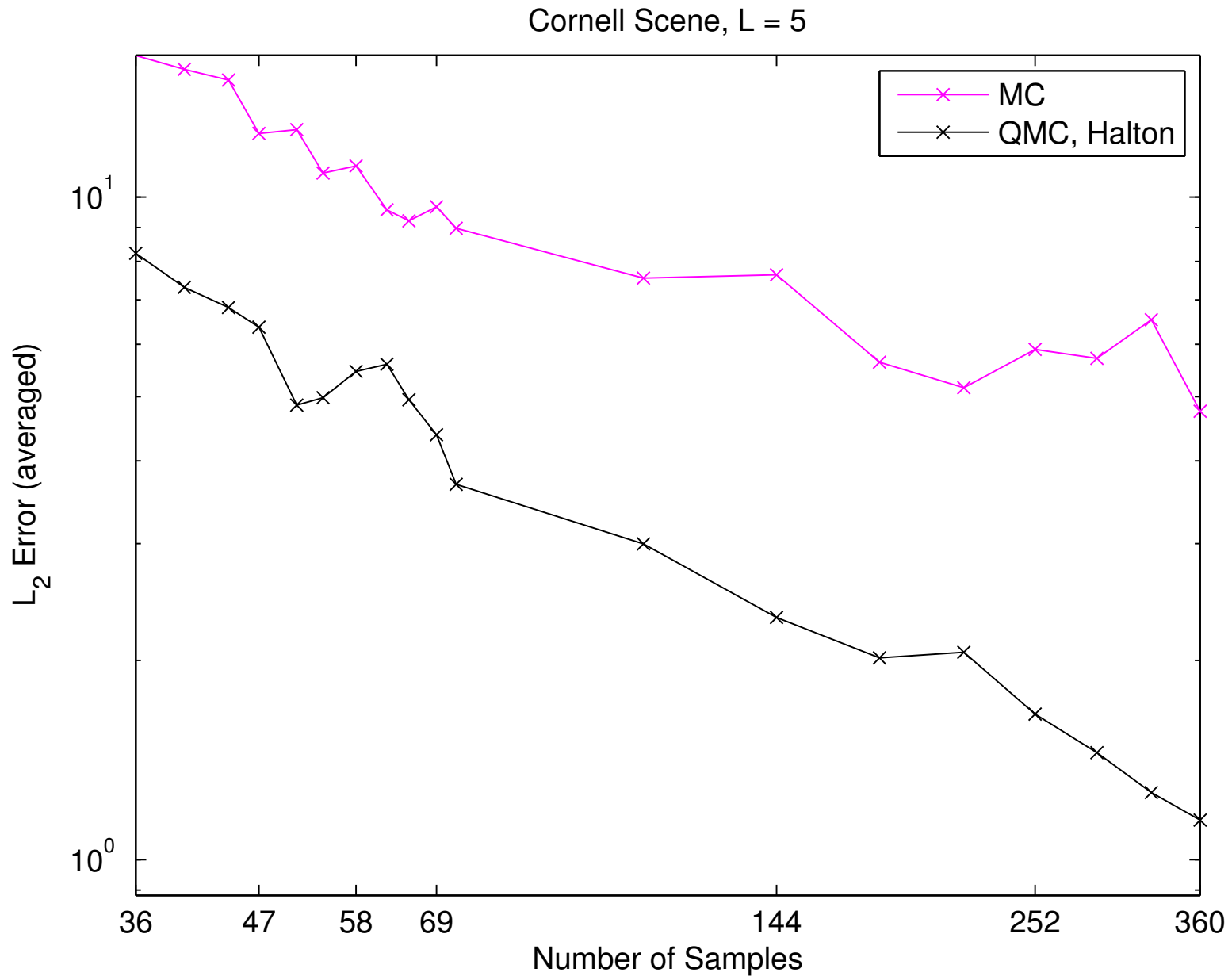


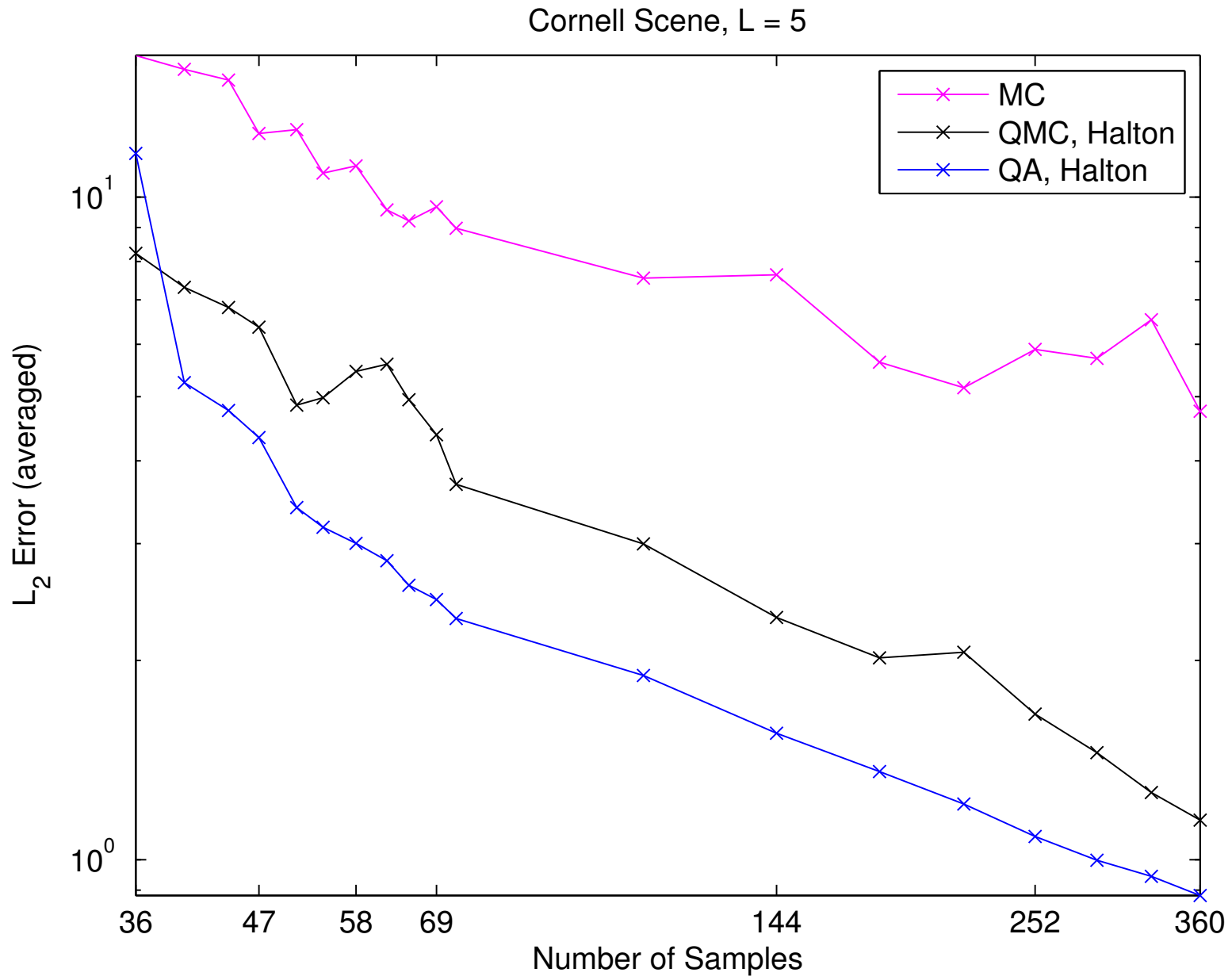


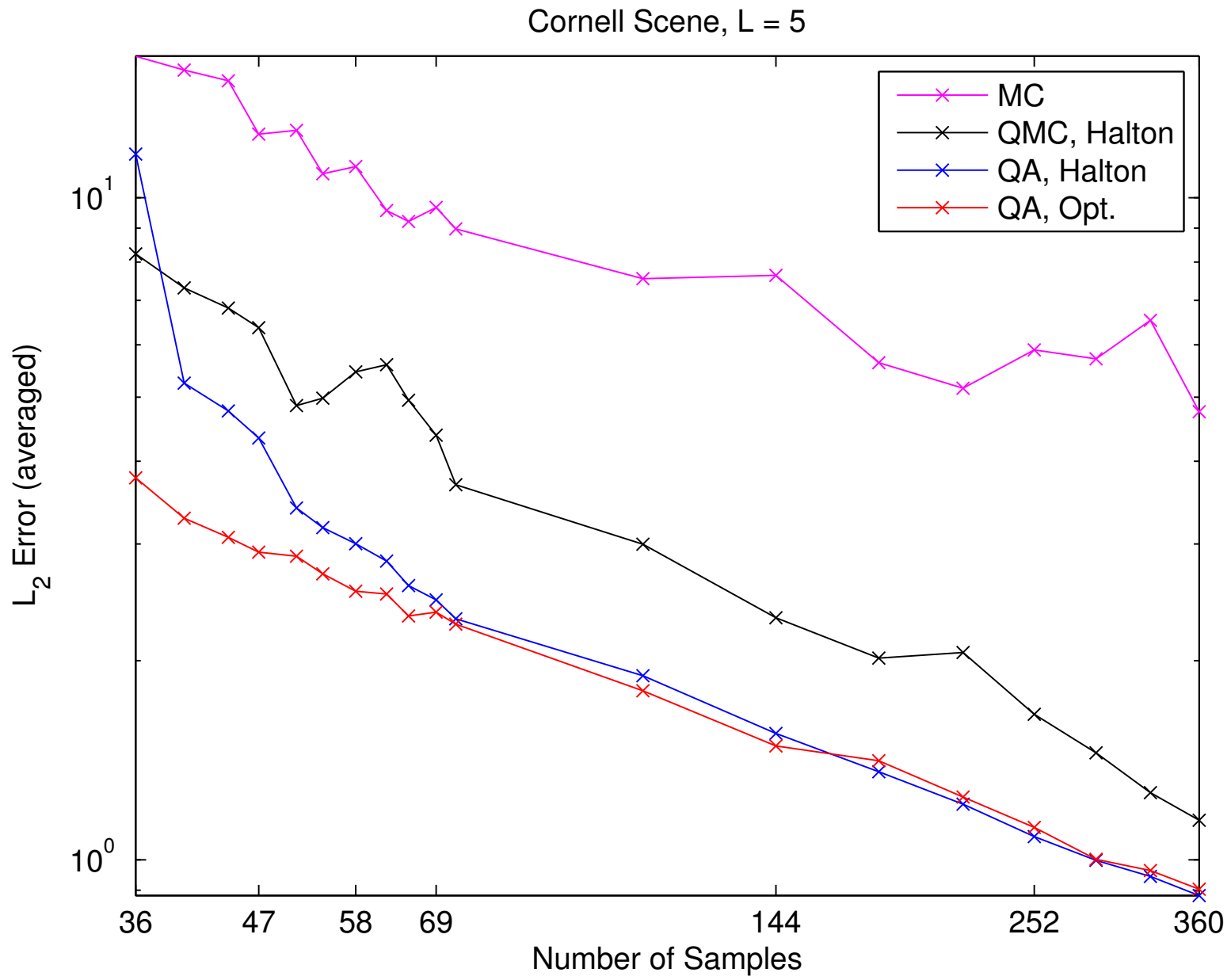


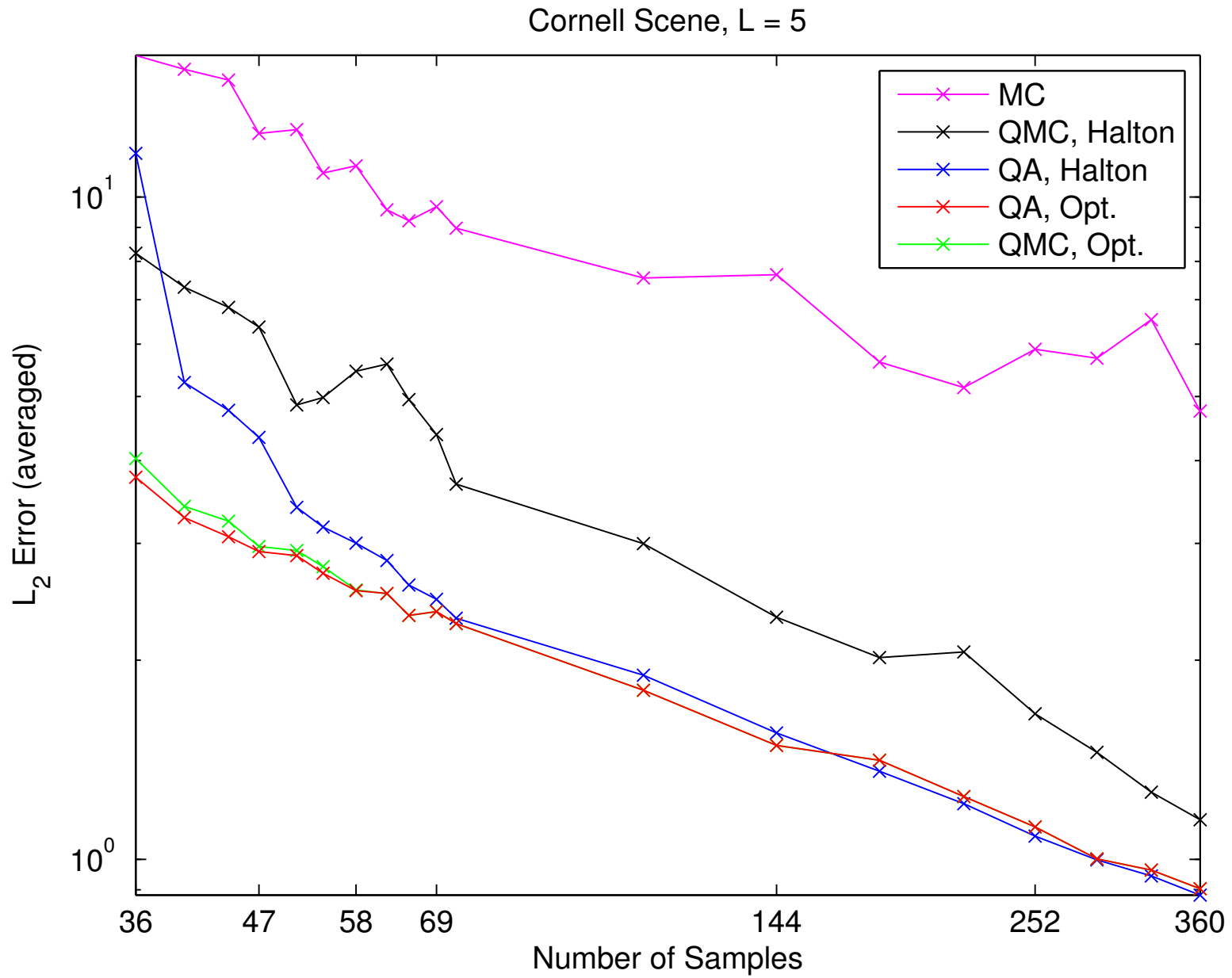














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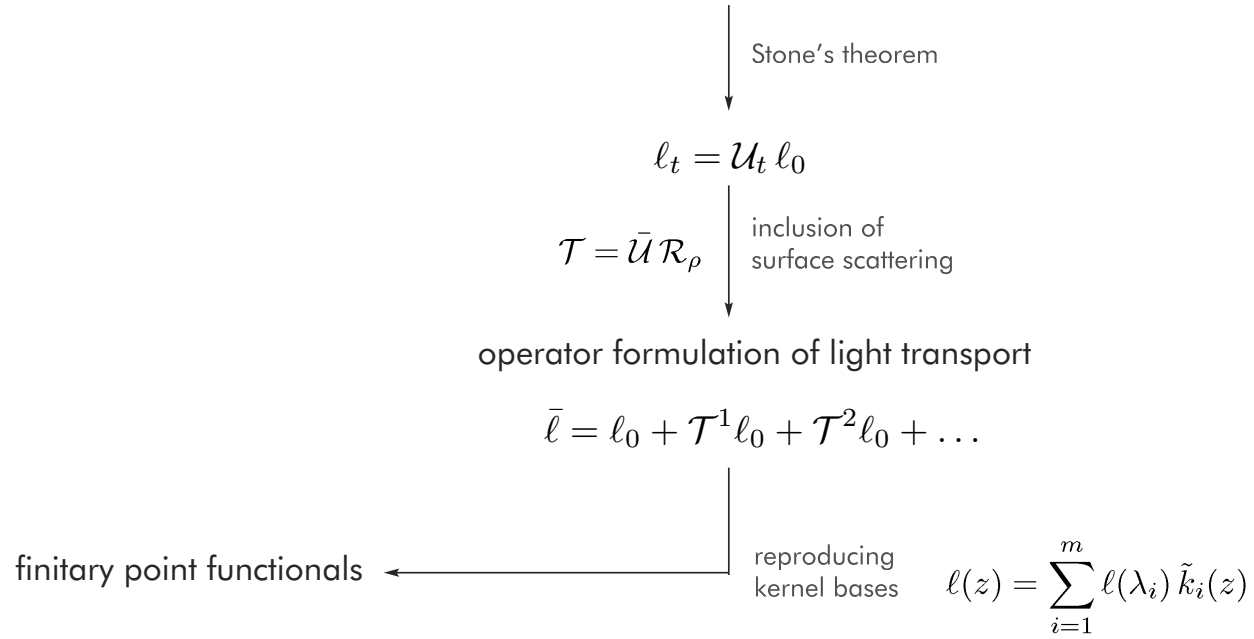
↓ Stone's theorem

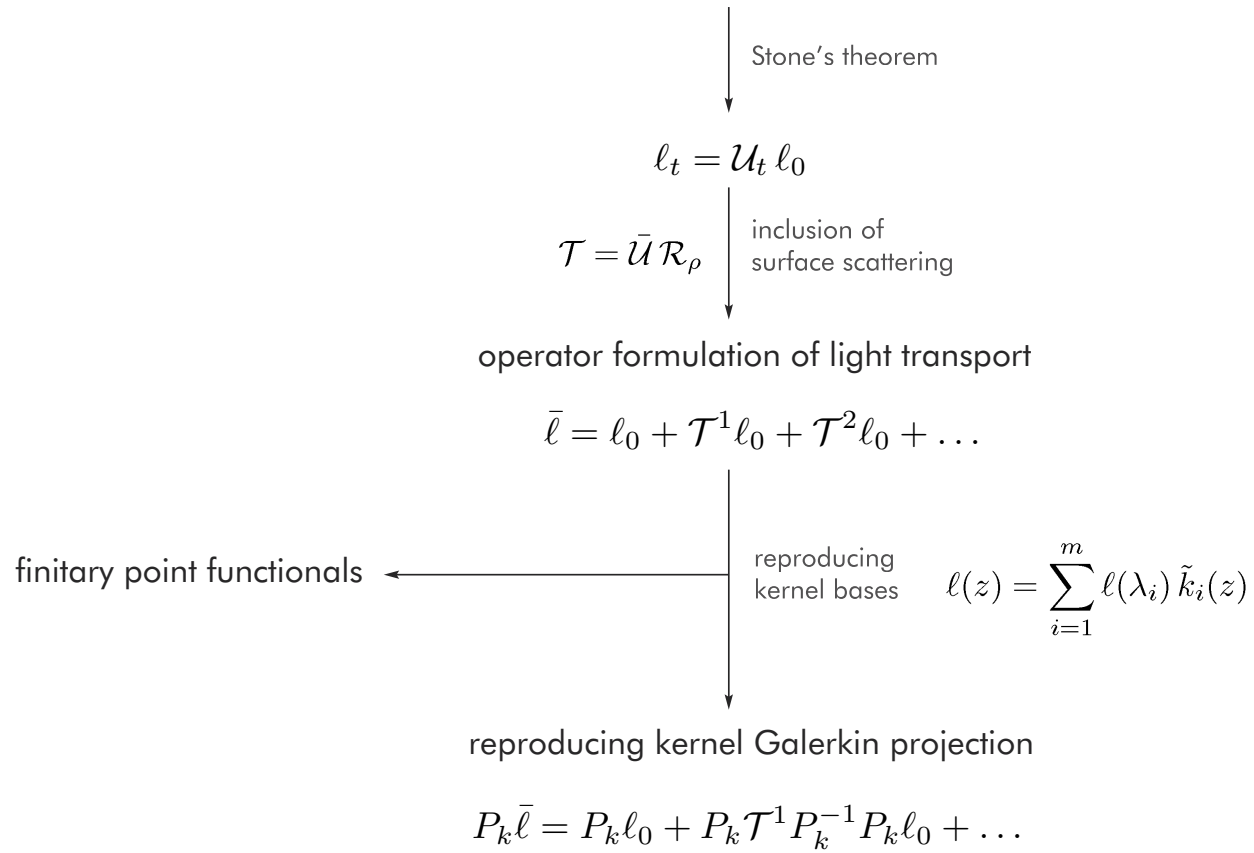
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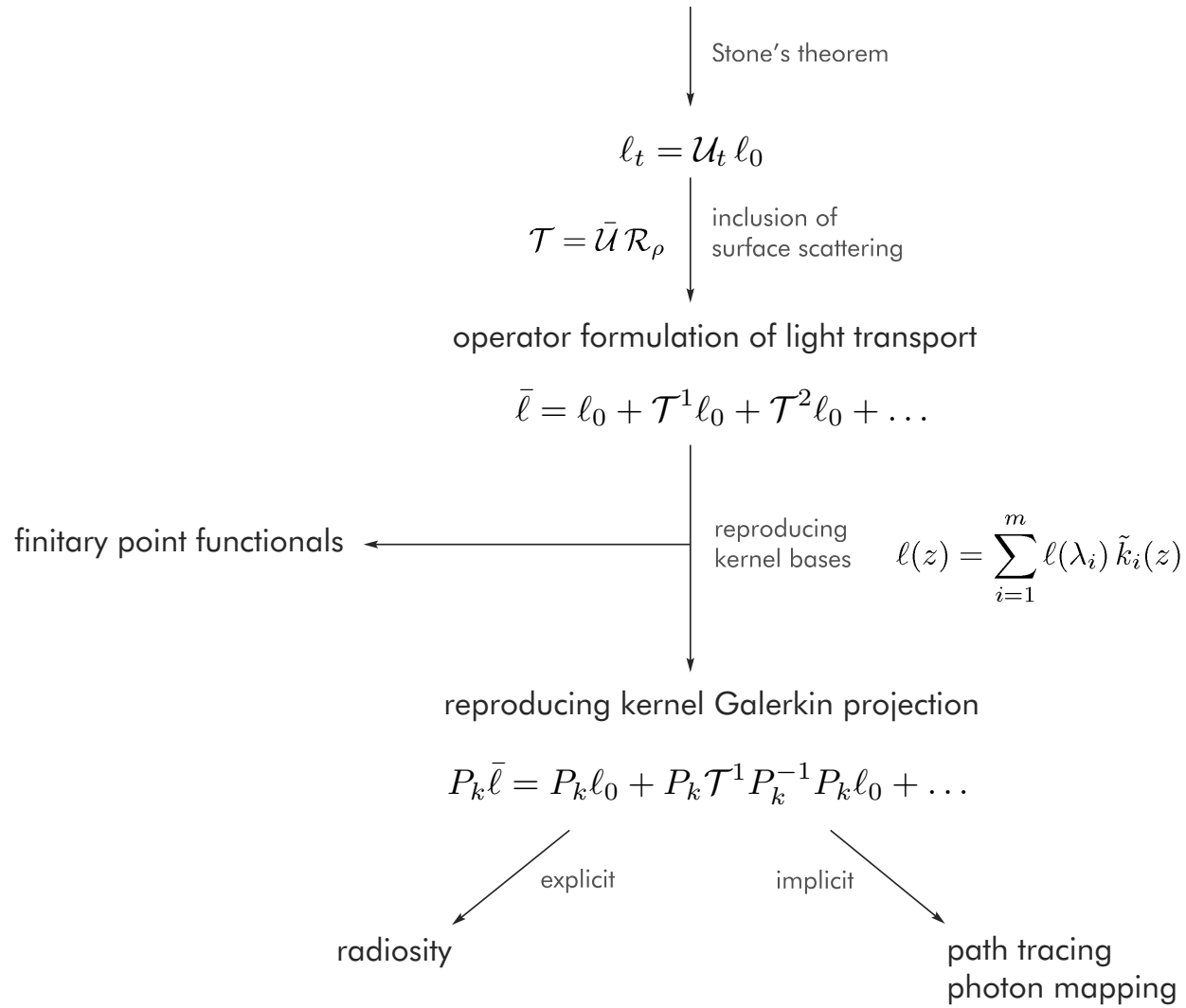
$$\mathcal{T} = \bar{\mathcal{U}} \mathcal{R}_\rho \quad \left| \begin{array}{l} \text{inclusion of} \\ \text{surface scattering} \end{array} \right.$$

operator formulation of light transport

$$\bar{l} = l_0 + \mathcal{T}^1 l_0 + \mathcal{T}^2 l_0 + \dots$$







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finitary point functionals

reproducing  
kernel bases

$$\ell(z) = \sum_{i=1}^m \ell(\lambda_i) \tilde{k}_i(z)$$

reproducing kernel Galerkin projection

$$P_k \bar{\ell} = P_k \ell_0 + P_k \mathcal{T}^1 P_k^{-1} P_k \ell_0 + \dots$$

explicit

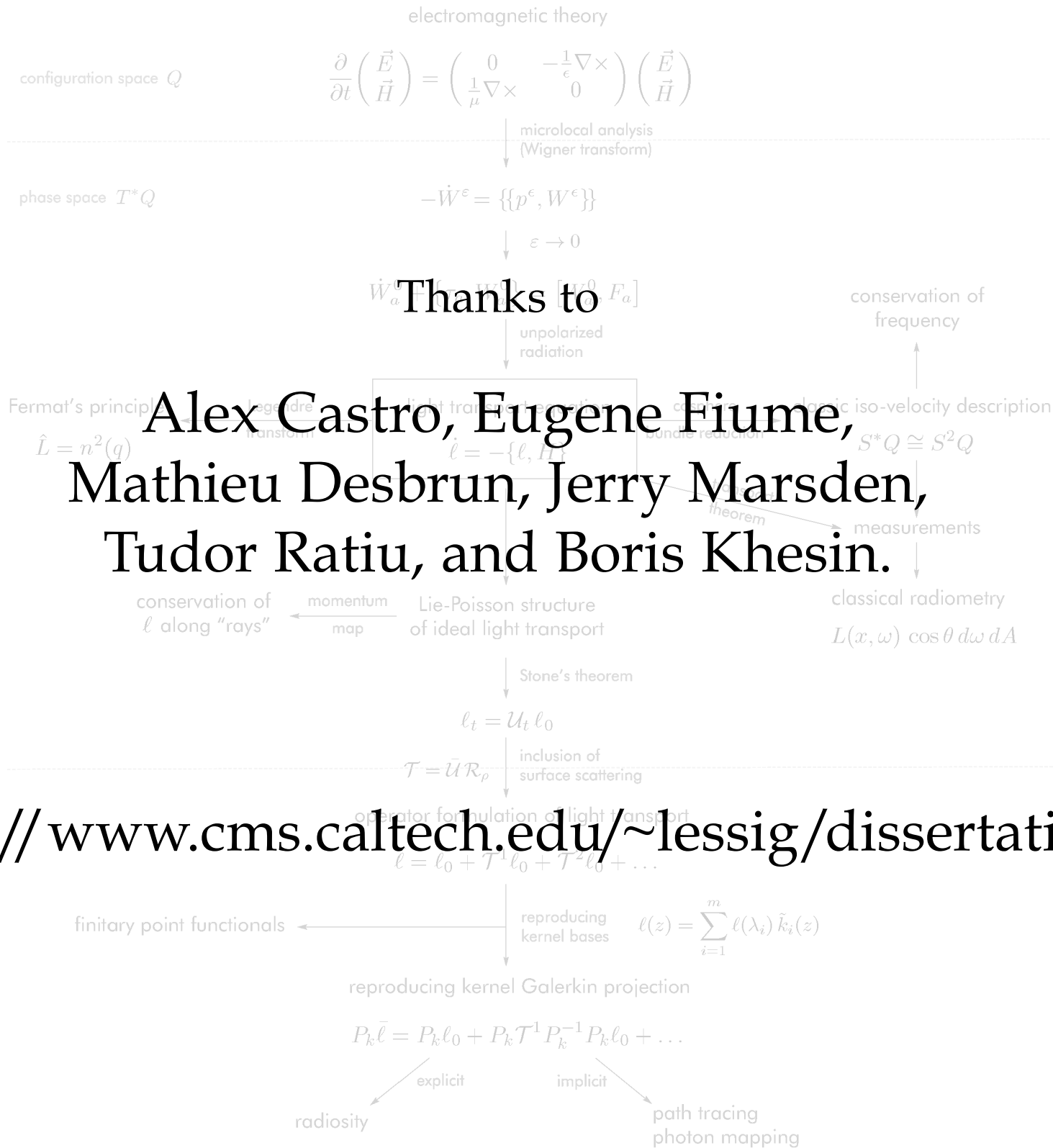
radiosity

implicit

path tracing  
photon mapping

## What next?

- Evolution operator.
- Derivative ray tracing.
- Characterization of steady state solutions.
- Function spaces of light transport.
- ...

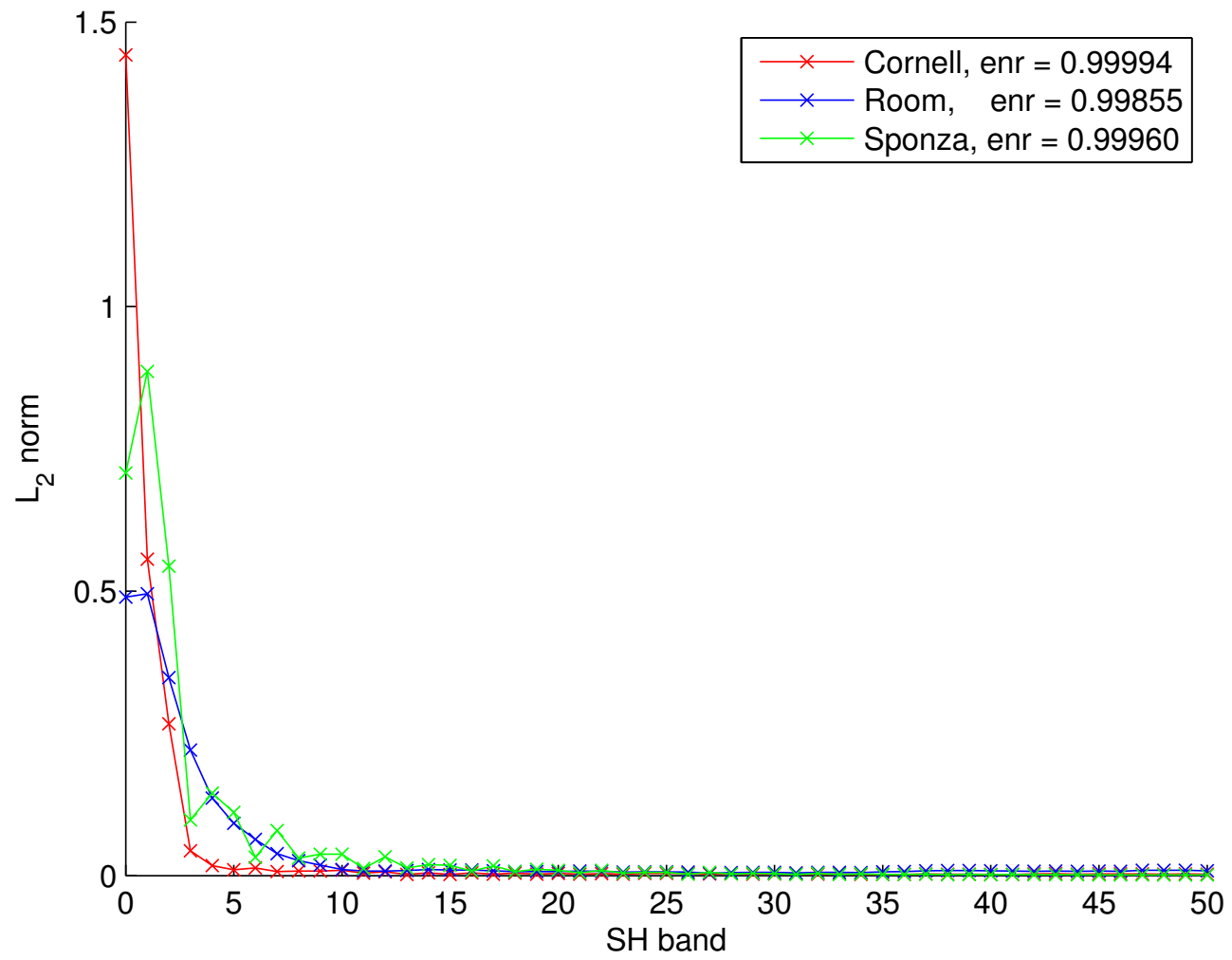


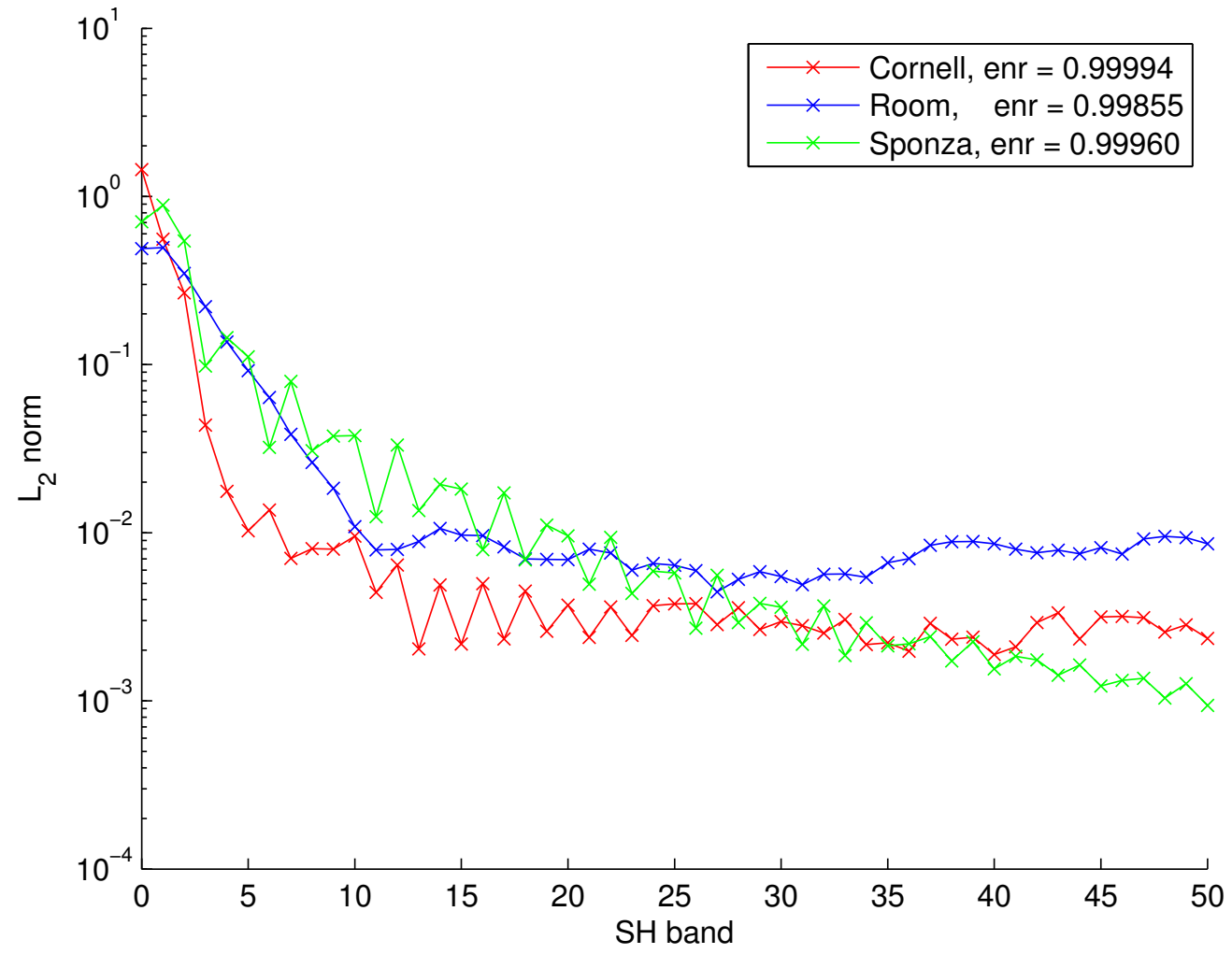
Thanks to

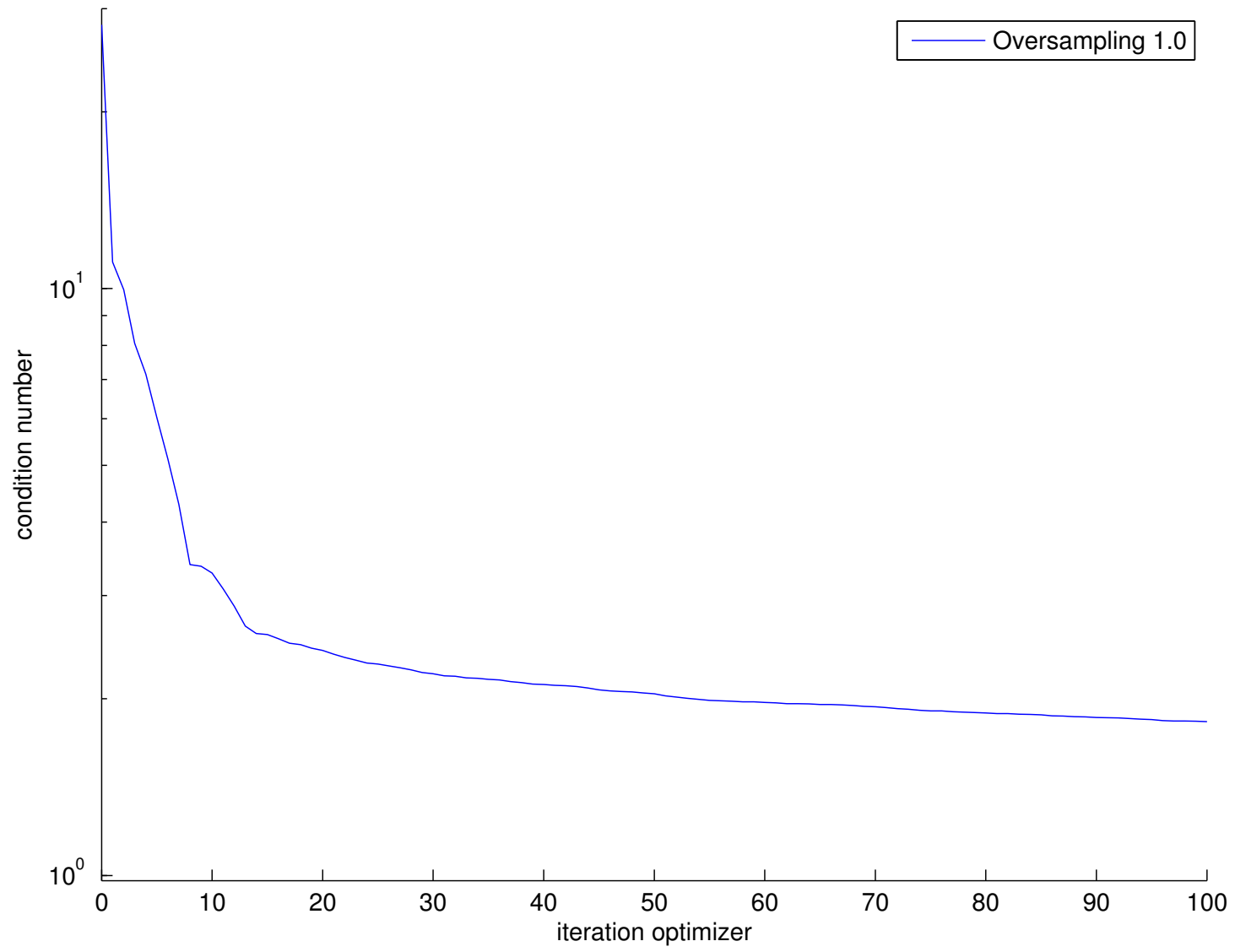
**Alex Castro, Eugene Fiume,**  
**Mathieu Desbrun, Jerry Marsden,**  
**Tudor Ratiu, and Boris Khesin.**

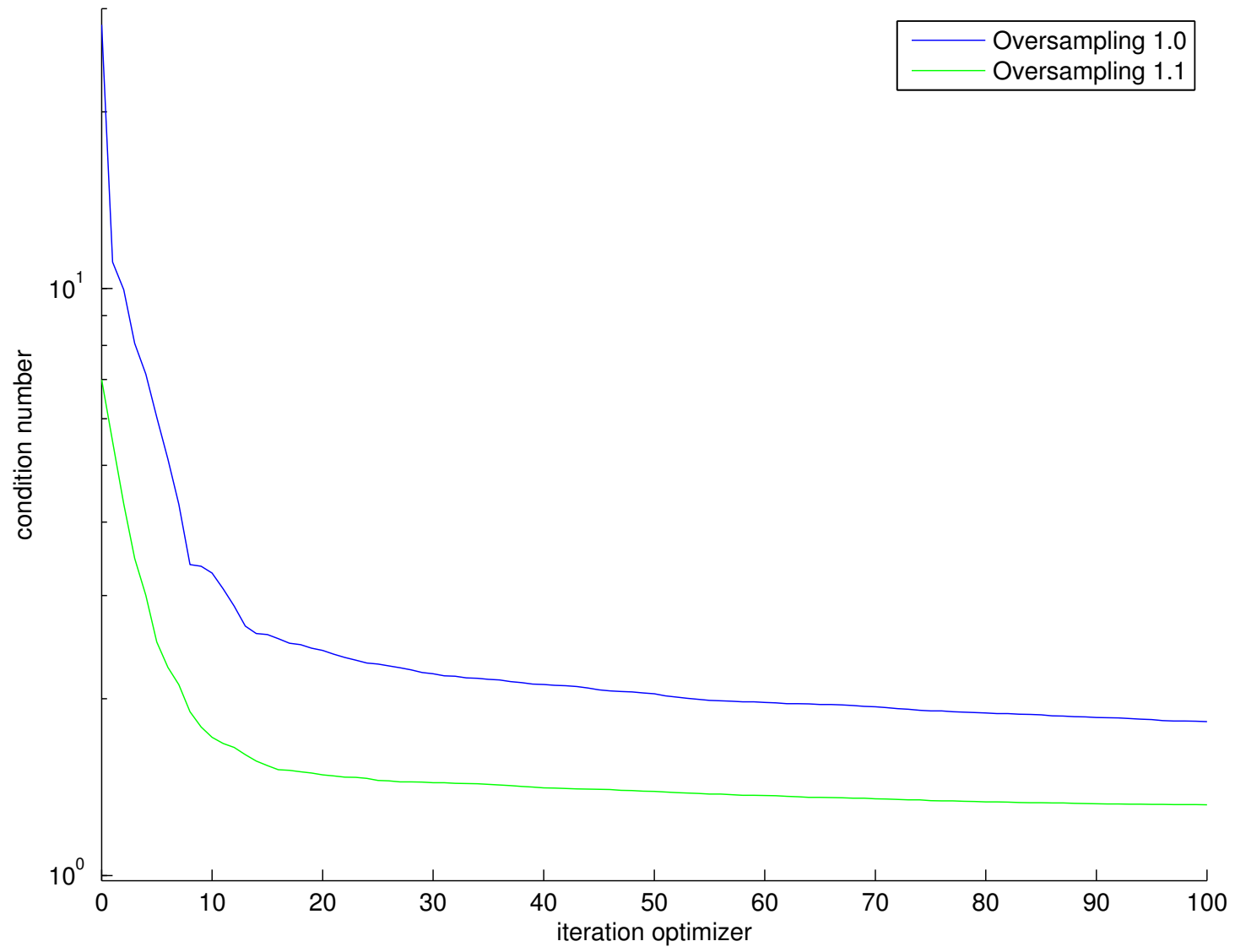
<http://www.cms.caltech.edu/~lessig/dissertation/>

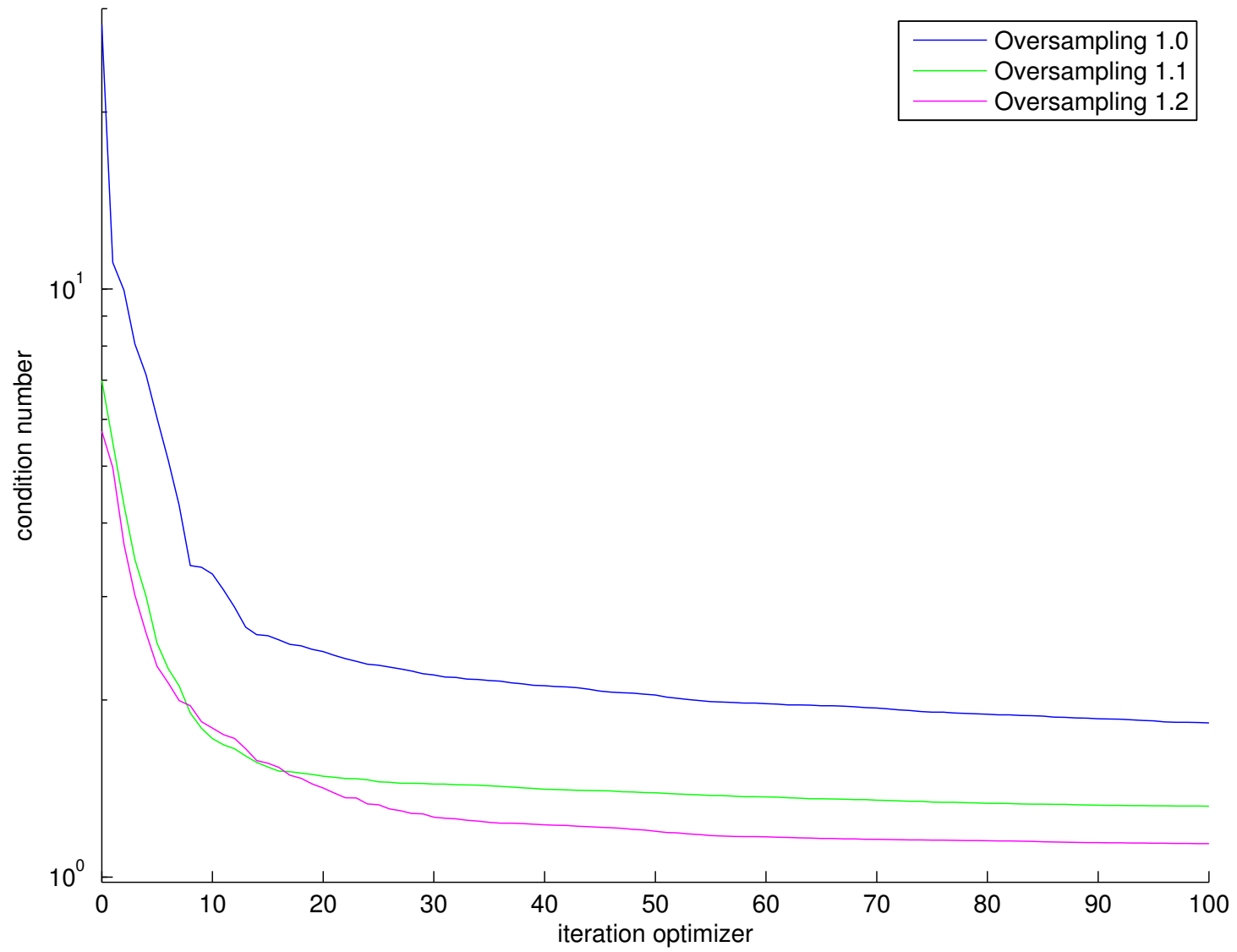


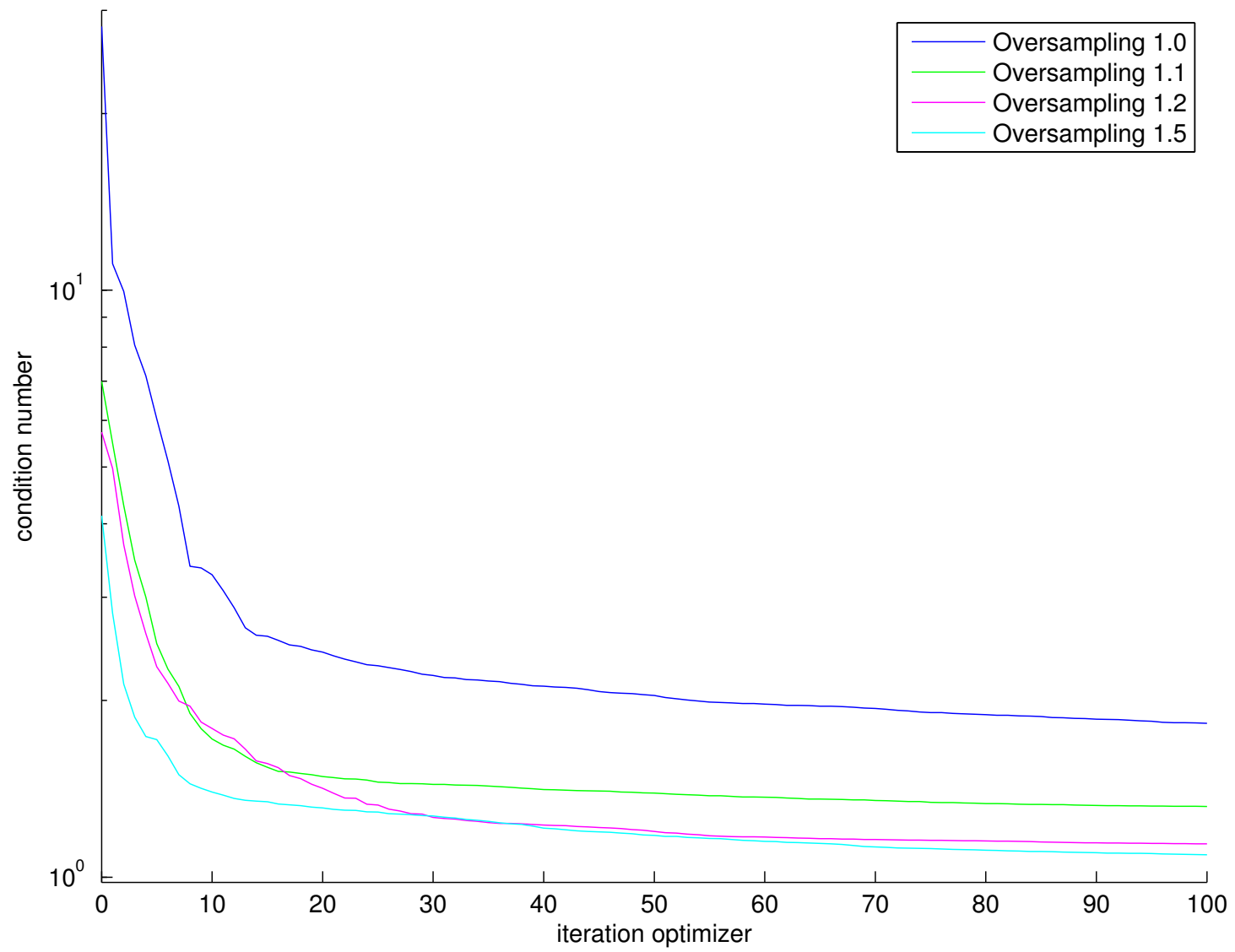


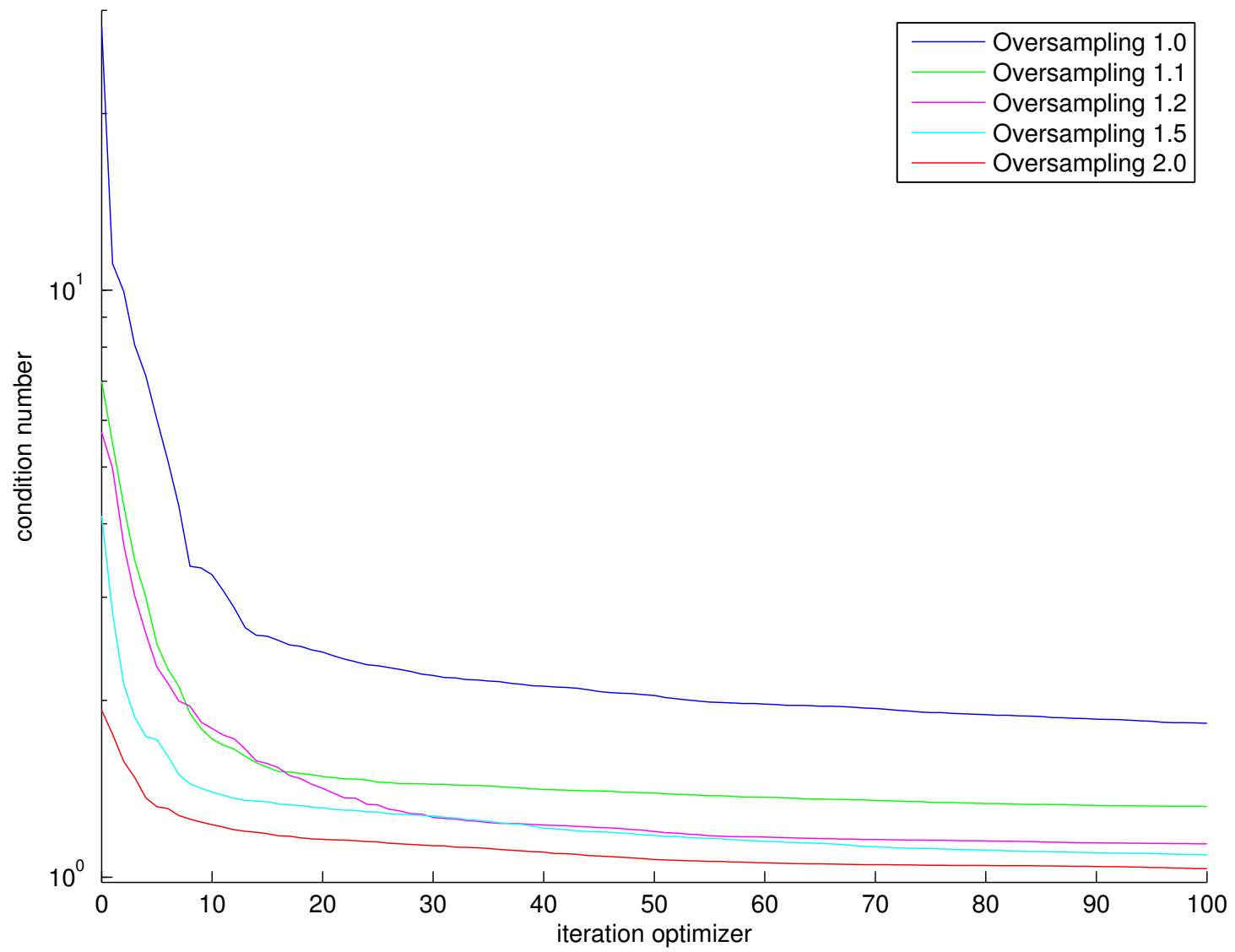


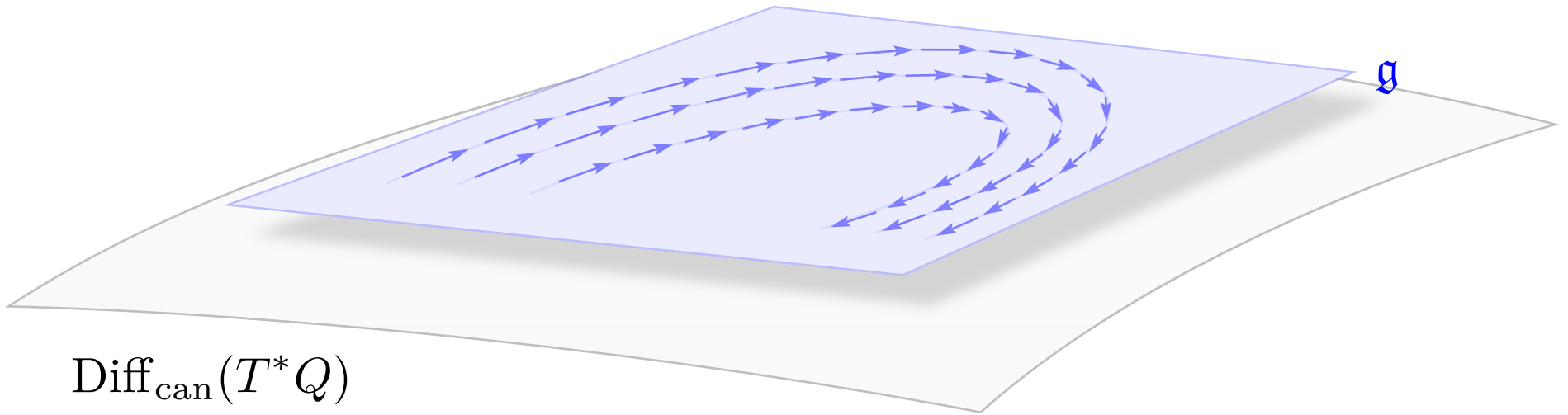












$\text{Diff}_{\text{can}}(T^*Q)$



