

Lecture 16: Wave optics and Fourier optics

Machine Learning and Imaging

BME 590L Roarke Horstmeyer

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Announcements:

Welcome to BME590 Online! Things shouldn't change much, but here's a summary:

0. I hope that everyone is safe and is doing ok!

1. See summary of all changes to transition things online here

a. Lectures are now held on Zoom (live, at same class time) and will be recorded and posted online

b. Lab session are now held on Zoom (live at same lab time) and will be recorded

c. Office hours are now held on Zoom

*My Zoom ID: 417-271-8775

2. Homework #3 is due today – please submit via class website

3. Homework #4 will be posted online today – it is due it

4. I have sent some of you feedback about your project proposal via email. If so, please send me an updated project proposal by this Thursday 3/26 at midnight. For the rest of the received proposals, I have input your grade on Sakai. If you didn't get an email or grade on Sakai, I didn't get your proposal.



Rough schedule for the rest of the semester:

Homework #4 assigned: March 24 Homework #4 due: April 7 Homework #5 assigned: April 7 Homework #5 due: April 21 Final projects due: (original) Thurs 4/23, Friday 4/24, or Monday 4/27 Final project presentations: (original) Thurs 4/23, Friday 4/24, or Monday 4/27

Questions from class survey:

Q: Are we maintaining original final project presentation dates or if these are getting shifted by 1 week to account for the extension of spring break?A: I would prefer to maintain the original presentation dates. It may be possible to shift it back a few days into finals week, but it depends on what I hear about regarding the format of other finals

Q: Would the recorded video of lectures be uploaded right after the class? Or it would be upload several days after the class?

A: Right after the class (i.e., as soon as I can after the class)

First - what is light and how can we model it?

- Interpretation #1: Radiation (Incoherent)
- Model: Rays







- Interpretation #2: Electromagnetic wave (Coherent)
- Model: Waves





- Real, non-negative
- Models absorption and brightness
 - $\mathbf{I}_{\text{tot}} = \mathbf{I}_1 + \mathbf{I}_2$

- Complex field
- Models Interference

 $\mathsf{E}_{\mathrm{tot}} = \mathsf{E}_1 + \mathsf{E}_2$

- Interpretation #3: Particle
- Model: Photons





Simple mathematical model of incoherent image formation



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Simple mathematical model of image formation





Summary: simple physical layers for incoherent imaging

- Deal with sample/image intensities I, real and non-negative
- Effect of illumination is element-wise multiplication λ
- Imaging systems blur the object via point-spread function matrix H

- Discrete pixels down-sample the object via
- Add noise into measurement $I_N(x,y) = D I_0(x,y) + N$
- Different colors add linearly

$$I_{s}(x, y) = \sum I_{0}(x, y, \lambda)$$



 $\mathbf{H}_{\mathbf{b}}(\mathbf{x},\mathbf{y}) = \mathbf{H}_{\mathbf{0}}(\mathbf{x},\mathbf{y})$

$$\mathbf{I}_{\mathbf{d}}(\mathbf{x},\mathbf{y}) = \mathbf{D} \mathbf{I}_{\mathbf{0}}(\mathbf{x},\mathbf{y})$$



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What is light and how can we model it?

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Maxwell's equations without any charge

$$\nabla \times \vec{\mathcal{E}} = -\mu \frac{\partial \vec{\mathcal{H}}}{\partial t}$$
$$\nabla \times \vec{\mathcal{H}} = \epsilon \frac{\partial \vec{\mathcal{E}}}{\partial t}$$
$$\nabla \cdot \epsilon \vec{\mathcal{E}} = 0$$
$$\nabla \cdot \mu \vec{\mathcal{H}} = 0.$$



Maxwell's equations without any charge

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$$\nabla \cdot \epsilon \vec{\mathcal{E}} = 0$$
$$\nabla \cdot \mu \vec{\mathcal{H}} = 0.$$

- 1. Take the curl of both sides of first equation
- 2. Substitute 2^{nd} and 3^{rd} equation
- 3. Arrive at the wave equation:

$$\nabla^2 \vec{\mathcal{E}} - \frac{n^2}{c^2} \frac{\partial^2 \vec{\mathcal{E}}}{\partial t^2} = 0 \qquad n = \left(\frac{\epsilon}{\epsilon_0}\right)^{1/2} \qquad c = \frac{1}{\sqrt{\mu_0 \epsilon_0}}.$$



Considering light that isn't pulsed over time, we can use the following solution:

 $u(P,t) = A(P) \cos[2\pi\nu t + \phi(P)]$ $u(P,t) = Re\{U(P) \exp(-j2\pi\nu t)\},\$



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With this particular solution, we get the following important time-independent equation:

Helmholtz Equation

$$(\nabla^2 + k^2)U = 0. \qquad k = 2\pi n \frac{\nu}{c} = \frac{2\pi}{\lambda},$$



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Helmholtz Equation

on
$$(\nabla^2 + k^2)U = 0.$$
 $k = 2\pi n \frac{\nu}{c} = \frac{2\pi}{\lambda},$

This is an important equation in physics. We won't go into the details, but it leads to the Huygen-Fresnel principle:

$$U(P_2) = \frac{1}{j\lambda} \iint_{\Sigma} U(P_1) \frac{\exp(jkr_{21})}{r_{21}} \cos\theta \, ds$$



The Huygens-Fresnel Equation

quation
$$U(P_2) = \frac{1}{j\lambda} \iint_{\Sigma} U(P_1) \frac{\exp(jkr_{21})}{r_{21}} \cos\theta \, ds$$

P₂

Aperture



The Huygens-Fresnel Equation

$$U(P_2) = \frac{1}{j\lambda} \iint_{\Sigma} U(P_1) \frac{\exp(jkr_{21})}{r_{21}} \cos\theta \, ds$$



Generally connects two points in 3D:

 $U(P_1) = U(x_1, y_1, z_1)$

 $U(P_2) = U(x_2, y_2, z_2)$

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We are usually concerned about propagation between two planes (almost always in an optical system):

 $U(P_1) = U(x_1, y_1, z_1 = z_{p1})$ $U(P_2) = U(x_2, y_2, z_2 = z_{p2})$ $U(P) = E(x, y, z)e^{ikz}$



We are usually concerned about propagation between two planes (almost always in an optical system):



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We are usually concerned about propagation between two planes (almost always in an optical system):

Paraxial approximation:

$$abla_{ot}^2 U + 2ikrac{dU}{dz} = 0$$
 Substitute in $U(P) = E(x,y,z)e^{ikz}$ and crank the wheel,

 $\nabla_{\perp}^2 E + 2ik\frac{dE}{dz} + 2k^2 E = 0$

Paraxial Helmholtz Equation. This has an exact integral solution:

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Paraxial Helmholtz Equation. This has an exact integral solution:

$$E(x,y,z) = rac{e^{ikz}}{i\lambda z} \iint_{-\infty}^{+\infty} E(x',y',0) e^{rac{ik}{2z} \left[(x-x')^2 + (y-y')^2
ight]} dx' dy'$$

Fresnel diffraction integral

This is how light propagates from one plane to the next. It's a convolution!

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Fresnel light propagation as a convolution

$$E(x,y,z) = rac{e^{ikz}}{i\lambda z} \iint_{-\infty}^{+\infty} E(x',y',0) e^{rac{ik}{2z} \left[(x-x')^2 + (y-y')^2
ight]} dx' dy'$$

$$h(x,y,z)=rac{e^{ikz}}{i\lambda z}e^{irac{k}{2z}(x^2+y^2)}$$

_

$$E(x,y,z) = E(x,y,0) * h(x,y,z)$$

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Fresnel light propagation as a convolution

$$E(x,y,z) = rac{e^{ikz}}{i\lambda z} \iint_{-\infty}^{+\infty} E(x',y',0) e^{rac{ik}{2z} \left[(x-x')^2 + (y-y')^2
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$$h(x,y,z)=rac{e^{ikz}}{i\lambda z}e^{irac{k}{2z}(x^2+y^2)}$$



$$E(x,y,z)=E(x,y,0)st h(x,y,z)$$







From the Fresnel approximation to the Fraunhofer approximation

Fresnel Approximation:

$$E(x,y,z) = rac{e^{ikz}}{i\lambda z} \iint_{-\infty}^{+\infty} E(x',y',0) e^{rac{ik}{2z} \left[(x-x')^2 + (y-y')^2
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Lets assume that the second plane is "pretty far away" from the first plane. Then,





From the Fresnel approximation to the Fraunhofer approximation

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Lets assume that the second plane is "pretty far away" from the first plane. Then,



1. Expand the squaring

$$E(x,y,z) = \frac{e^{ikz}}{i\lambda z} \iint E(x',y',0) e^{\frac{ik}{2z}(x^2+y^2)} e^{\frac{ik}{2z}(x'^2+y'^2)} e^{\frac{ik}{2z}(xx'+yy')} dx' dy'$$



From the Fresnel approximation to the Fraunhofer approximation

Fresnel Approximation:

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1. Expand the squaring

$$E(x,y,z) = \frac{e^{ikz}}{i\lambda z} \iint E(x',y',0) e^{\frac{ik}{2z}(x^2+y^2)} e^{\frac{ik}{2z}(x'^2+y'^2)} e^{\frac{ik}{2z}(xx'+yy')} dx' dy'$$

2. Front term comes out, assume second term goes away, then,

$$E(x,y,z) = C \iint E(x',y',0)e^{\frac{ik}{2z}(xx'+yy')}dx'dy'$$

$$C = \frac{e^{ikz}}{i\lambda z} e^{\frac{ik}{2z}(x^2 + y^2)}$$

Fraunhofer diffraction is a Fourier transform!!!!!!!

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This is the aperture

Two-dimensional rectangle function as an image d) Magnitude of Fourier spectrum of the 2-D rectangle

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magnitude of zebra

phase of zebra

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Last piece of the puzzle: what happens from lens to sensor?





Last piece of the puzzle: what happens from lens to sensor?



inverse Fourier transform!

This process should sound familiar....





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Model of image formation for wave optics (coherent light):



Can also model this using the Convolution Theorem





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Two modeling choices for the camera:







Linear systems and the black box

The optical black box system and the point-spread function:

Light $g_1(x_i, y_i)$ entering "black box" optical system modified by system point-spread function



$$g_2(x_2, y_2) = \iint_{-\infty}^{\infty} g_1(x_1, y_1) h(x_2 - x_1, y_2 - y_1) dx_1 dy_1$$

Assume shift invariance: This is the system point-spread function



Summary of two models for image formation

- Interpretation #1: Radiation (Incoherent)
- Model: Rays







- Real, non-negative
- Models absorption and brightness

$$\mathbf{I}_{tot} = \mathbf{I}_1 + \mathbf{I}_2$$

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Mathematical model of for incoherent image formation

• All quantities are real, and non-negative

Object absorption:

S₀(x,y)

Illumination brightness:



100

photons

60%

transmission

60

photons

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• All quantities are real, and non-negative

Object absorption:

S₀(x,y)

Illumination brightness:

B(x,y)

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Object absorption:

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Illumination brightness:





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Mathematical model of for incoherent image formation

• All quantities are real, and non-negative

Object absorption:

Illumination brightness: $S_0(x,y)$

B S₀ multiplication



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- Interpretation #2: Electromagnetic wave (Coherent)
- Model: Waves



- Complex field
- Models Interference

$$\mathsf{E}_{tot} = \mathsf{E}_1 + \mathsf{E}_2$$















Pretty much the same thing, but now we have an amplitude and a complex phase ٠

Represents wave delay across space

Sample absorption = S(x,y)



 $C(x,y) = A_i(x,y) \exp[ik\phi_i(x,y)] \quad U(x,y) = A_i(x,y) S(x,y) \exp[ik\phi_t(x,y)]$

New: complex phase delay Needed to represent wave







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Sample absorption = S(x,y)



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Output phase is sum of phase delays, product of phasors

 $\varphi_{t}(x,y) = \varphi(x,y) + \varphi_{i}(x,y)$

 $exp[ik\phi_t(x,y)] = exp[ik\phi_i(x,y)] exp[ik\phi(x,y)]$



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Conclusion:

Transmitted field = incident field x complex sample :

 $U(x,y) = C(x,y) S(x,y) \exp[ik\phi(x,y)]$





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- Interpretation #2: Electromagnetic wave (Coherent)
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- Complex field
- Models Interference

$$E_{tot} = E_1 + E_2$$

$$U = C S_0$$

J, C and S are complex!



Additional Information about sample index of refraction, spatial frequency and Fourier optics



So far: illuminate the sample and create a field that is equivalent to the sample's absorption and phase – why is this true???

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Microscope illumination and sample index of refraction

So far: illuminate the sample and create a field that is equivalent to the sample's absorption and phase – why is this true???

Sample index of refraction $n(x,y,z) = 1 + ia(x) + \phi(x)$



*For more information, see D. Paganin, Coherent X-Ray Optics, Section 2.2



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Thin sample approximation:

Sample's effect on light is multiplication with exp[-ik * n(x,y)]

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In 1D: Emerging field U(x) = incident field $U_i(x)$ * sample function s(x)



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In 1D: Emerging field U(x) = incident field $U_i(x)$ * sample function s(x)=exp[-ik n(x)]

 $U(x) = U_i(x) *exp[-ik n(x)] = U_i(x) A(x) exp[ik\phi(x)]$ A(x) = exp[k a(x)]Horstmeyer (2020)absorptionphase shift: new term for laser

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Sample absorption = A(x) Sample phase = exp[ikφ(x)]



Emerging field U = incident field $U_i(x)$ * sample function s(x)



Q: When is the emerging field equal to the absorption and phase?





Q: When is the emerging field equal to the absorption and phase?

Sample absorption = A(x) Sample phase = exp[ikφ(x)] **A:** When the incident wave = 1, means uniform in amplitude and phase:

 $U_i(x) = 1 \longrightarrow U(x) = A(x) \exp[ik\phi(x)]$



Emerging field U = incident field U_i(x) * sample function s(x)

Emerging field U

Incident field U_i

Sample absorption = A(x)

Sample phase = $exp[ik\phi(x)]$

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Microscope illumination and sample index of refraction

Q: When is the emerging field equal to the absorption and phase?

A: When the incident wave = 1, means uniform in amplitude and phase:







Model of image formation for wave optics (coherent light):





From before: Spatial frequencies = "stripes" within each image










Equivalent coordinates in the Fourier domain and at the Fourier plane



General rules for applying the Fourier transform in optics



Situation 1: From an object to a plane "really far away"



General rules for applying the Fourier transform in optics

Situation 1: From an object to a plane "really far away"



Situation 2: From an object to the back focal plane of the microscope objective lens



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General rules for applying the Fourier transform in optics



Situation 3: From an object to a plane 1 focal length away from a lens (1f-1f system)













2D Fourier Transform

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The Fourier plane provides a measure of the **ray angles at the image plane**

Doesn't contain info about spatial distribution light



Image plane ray angle θ

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The Fourier plane provides a measure of the **ray angles at the image plane**

Rays are leaving image plane at +20 degrees



Image plane ray angle θ

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A more exact model: the 4f optical system



The Fourier plane provides a measure of the **ray angles** at the image plane

Rays are coming in at +20 degrees and -15 degrees



Image plane ray angle θ

2D Fourier Transform



You typically go between 4 functions to describe one imaging system:



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