# Modeling and Measurement of Image Sensor Characteristics

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Abstract. The optical transfer function (OTF), as an objective measure of the quality of optical and electro-optical systems, is closely related to the point spread function (PSF) and other derived characteristics, such as the modulation transfer function (MTF) and the phase transfer function (PTF). The paper focused to the use a generalized OTF, which is primarily dedicated to the description of linear space invariant systems (LSI), for the purpose of sampled structures of image sensors (e.g. CCD, CMOS, CID), and to implement the derived results while utilizing the graphical user's interface (GUI) in Matlab. The model used considers the effects of the detector photo sensitive area, sampling process, as well as other CCD specific parameters, such as the charge transfer efficiency (CTE) or diffusion in order to derive the overall MTF shape. The paper also includes an experimental measurement in the real system and a comparison with the results of modeling.

# Keywords

OTF, MTF, PSF, CCD, CMOS, APS, sensor, modeling, measurement, GUI, Matlab.

# 1. Introduction

OTF is the main objective measure of image quality in optical and electro-optical systems. OTF is defined as the Fourier transform of PSF. OTF is a complex function of a real variable. Its magnitude is called modulation transfer function (MTF), and the phase of OTF is called phase transfer function (PTF). MTF can be also defined as a ratio of modulation depth in the image plane to the modulation depth in the object plane for the test pattern of the sine shape. OTF is more suitable than PSF because the overall OTF is given as a product of subsystem partial OTFs (the complex convolution is needed in the spatial domain).

Optical systems are mostly linear and space shift invariant (LSI) [6], but this is not generally true for all electro-optical systems and especially for image sensors including smart imagers. In this paper the concept of OTF analysis is generalized to be applicable to sampled structures of electro-optical systems.

# 2. Characteristics of Optical and Electro-optical Systems

### 2.1 Point Spread Function

The smallest detail the imaging system can produce is determined by its impulse response h(x, y). The impulse response, in optical systems called point spread function (PSF), describes spatial distribution of illumination in image plane, when the point source in object plane is used. PSF is the response of imaging system to the two dimensional Dirac impulse.

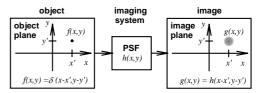


Fig. 1. Two dimensional impulse response of imaging system – point spread function (PSF).

The simplified diagram of imaging system with unit magnification is shown in Fig. 1. There is an ideal point source  $f(x,y) = \delta(x-x', y-y')$  in the object plane and shifted impulse response g(x,y) = h(x-x', y-y') in the image plane. The relation between an object and image can be expressed as

$$g(x, y) = f(x, y) * h(x, y) , \qquad (1)$$

where the object irradiance distribution f(x,y) is convolved with the impulse response h(x,y). Two dimensional convolution process is defined by the convolution integral

$$g(x, y) = f(x, y) * h(x, y)$$
  
= 
$$\int_{\mathbb{R}^{2}} f(\alpha, \beta) h(x - \alpha, y - \beta) d\alpha d\beta$$
(2)

Eqn. (2) shows that the impulse response of the ideal imaging system with a perfect replica of the object is  $h_{ideal}(x,y) = \delta(x, y)$ . An ideal optical system is capable to form a point image of a point object, which is impossible in a real imaging system, where many blurring effects occur.

#### 2.2 Transfer Functions

Eqn. (1) expresses the image at the output of the LSI imaging system by the convolution in the spatial domain. The convolution theorem [6] simplifies this process stating that the convolution in the spatial domain is a simple product in the frequency domain. Applying the Fourier transform to both sides of (1), we get

$$F \{g(x, y)\} = F \{f(x, y) * h(x, y)\} G(u, v) = F(u, v)H(u, v)$$
(3)

where F(u,v) denotes the object spectrum, G(u,v) is the image spectrum, H(u,v) denotes the spectrum of the impulse response h(x,y), and u, v are spatial frequencies.

The normalized H(u,v) is known as the optical transfer function (OTF), which is complex in general. The magnitude is referred to as the modulation transfer function (MTF) and the phase as the phase transfer function (PSF):

$$OTF \equiv F\{h(x, y)\} = |H(u, y)|e^{j\phi(u, y)}$$

$$\tag{4}$$

$$MTF \equiv |H(u,v)| \qquad PTF \equiv \phi(u,v) \tag{5}$$

In case of LSI imaging system with a sine wave input, we have a sine wave output. Reduced spatial resolution of the system causes decrease of image modulation depth (Fig. 2).

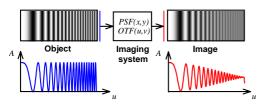


Fig. 2. Modulation decreases going through the real imaging system.

#### 2.3 Modulation Transfer Function

The modulation transfer function is the most important and the most often used characteristics of the imaging system. Besides the definition of the MTF as the magnitude of the OTF, we can define MTF as the ratio of the spatial sine wave modulation depth in the image and object planes.

Modulation depth *M* is defined as *ac* component magnitude divided by *dc* component (bias level):

$$M = \frac{A_{\max} - A_{\min}}{A_{\max} + A_{\min}} = \frac{ac}{dc} , \qquad (6)$$

where  $A_{max}$  and  $A_{min}$  are maximum and minimum values of the irradiance in image plane.

In case of LSI imaging system with the sine wave input, we have a sine wave output. The reduced spatial resolution of the system causes the modulation depth decrease of the image  $M_i$  related to the modulation depth of the object  $M_o$ . This is expressed by the modulation transfer (MT)

$$MT = \frac{M_i}{M_o} . (7)$$

The MTF is a spatial frequency dependence of the MT

$$MTF \equiv \frac{M_i(u,v)}{M_o(u,v)} , \qquad (8)$$

where u, v are spatial frequencies. MTF is usually normalized to have a unity at the zero spatial frequency.

# 2.4 Overall Transfer Function of Imaging System

Frequency domain viewpoint analysis by means of MTF is convenient especially when the analyzed imaging system consists of several subsystems. Each subsystem has its own partial transfer function and the overall transfer function can be obtained by multiplying partial ones.

$$\underbrace{f(x, y)}_{\textbf{object}} \rightarrow \underbrace{\begin{array}{c} H_1(x, y) \\ H_1(u, y) \end{array}}_{H_1(u, y)} \rightarrow \underbrace{\begin{array}{c} H_2(x, y) \\ H_2(u, y) \end{array}}_{H_2(u, y)} \rightarrow \underbrace{\begin{array}{c} H_2(x, y) \\ H_2(u, y) \end{array}}_{H(u, y)} \xrightarrow{g(x, y)}_{H_2(u, y)} \xrightarrow{g(x, y)}_{H_2(u, y)} \xrightarrow{g(x, y)}_{H_2(u, y)}$$

**Fig. 3.** The overall transfer function of the system consisting of several subsystems.

When the imaging system consists of *n* independent subsystems (Fig. 3) with PSFs  $h_1(x, y) \dots h_n(x, y)$ , the overall impulse response of the system is

$$h(x, y) = h_1(x, y) * h_2(x, y) * \dots * h_n(x, y) , \qquad (9)$$

and the overall transfer function is

$$H(u,v) = H_1(u,v) \cdot H_2(u,v) \cdot \dots \cdot H_n(u,v) .$$
(10)

# 3. Image Sensors and Their Characteristics

Introductory staff presented in the above section is directly applicable for optical and electro-optical systems in the continuous spatial domain. The basic concept needs to be generalized to be usable for imaging systems with the sampled structures.

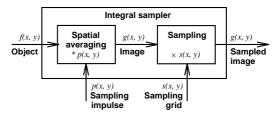


Fig. 4. Image sensor as an integral sampler.

#### 3.1 Image Sensor as an Integral Sampler

This section is aimed to describe the process of spatial averaging and image sampling in the structure of the idealized image sensor. Based on the theory of sampling [1], [6], [8], the sampling model of the sampled image sensor (Fig. 4) can be represented by the equation

$$g_{s}(x, y) = [f(x, y) * p(x, y)] \cdot s(x, y) , \qquad (11)$$

where f(x, y) is an input object, p(x, y) is a finite sampling aperture (averaging area) of varying sensitivity distributions over the sampling aperture, s(x, y) is the sampling grid.

The spectrum of the sampled image  $G_s(u, v)$  is given by Fourier transform of (11). Recalling the convolution theorem, we can write

$$G_{s}(u,v) = [F(u,v) \cdot P(u,v)] * S(u,v) , \qquad (12)$$

where F(u, v), P(u, v) and S(u, v) are Fourier images of the functions from (11). S(u, v) is a spectrum of the spatially restricted sampling grid. In case of the ideal sampling (spatially non-restricted) and the ideal image restoration

$$S(u,v) \approx \delta(u,v)$$
 . (13)

Eqn. (12) can be then rewritten to the form

$$G_r(u,v) = F(u,v) \cdot P(u,v) , \qquad (14)$$

where  $G_r(u, v)$  is a spectrum of the reconstructed image.

Considering (14), OTF of the spatial filtering (spatial averaging on the detector aperture) is obviously

$$OTF_{det}(u,v) \equiv \frac{G_r(u,v)}{F(u,v)} = P(u,v) = F\{p(x,y)\} .$$
(15)

P(u, v) is Fourier image of sampling impulse p(x, y), and it is called the detector OTF [4] or the footprint OTF [1].

For a detector of a given shape and the uniform sensitivity distribution, the function p(x, y) is defined as follows

$$p(x, y) = \begin{cases} \frac{1}{A_p} & (x, y) \in P\\ 0 & (x, y) \notin P \end{cases}$$
(16)

 $A_p$  is the detector aperture area,  $(x, y) \in P$  and  $(x, y) \notin P$  mean the position inside and outside the detector, resp.

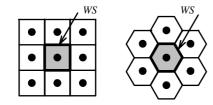


Fig. 5. Wigner-Seitz cell for the rectangular and hexagonal sampling grid. Sampling sites are depicted by black dots.

In a more general case of a non-uniform sensitivity detector aperture, p(x, y) is normalized to meet the condition

$$\iint_{x,y)\in P} p(x,y)dxdy = 1 \quad . \tag{17}$$

Considering (15), the detector MTF can be given by

$$MTF_{det}(u,v) = |OTF_{det}(u,v)| \quad . \tag{18}$$

#### 3.2 Shift Variance and Sampling MTF

Obviously, the sampled imaging system is not invariant to a space shift: position of the source object with respect to the sampling sites affects the final image data. The sampled imaging system has several different MTFs for one spatial frequency depending on the phase between the sampling grid and the object. One of possible ways of eliminating the space shift dependence from the MTF consists in evaluating the average impulse response and the average MTF assuming the scene is randomly positioned with respect to the sampling sites [1], [8]. This MTF is called the sampling MTF or the shift invariant MTF.

An analytic approach can be also used for the sampling MTF. Similarly to the detector area p(x, y), Wigner-Seitz (WS) function [3] (Fig. 5) can be defined for a given sampling grid

$$w(x, y) = \begin{cases} \frac{1}{A_w} & (x, y) \in WS \\ 0 & (x, y) \notin WS \end{cases},$$
 (19)

where  $A_w$  is an area of the Wigner-Seitz cell,  $(x, y) \in WS$ and  $(x, y) \notin WS$  and mean the position inside and outside the cell, respectively.

The sampling OTF for a given sampling grid can be defined as Fourier image of (19)

$$OTF_{samp}(u, v) = F \{w(x, y)\} = W(u, v)$$
, (20)

which yields the sampling MTF as a magnitude of (20)

$$MTF_{samp}(u,v) = \left| OTF_{samp}(u,v) \right| .$$
(21)

# 4. Detector MTF for Some Special Cases

Recalling above described theoretical results, we have analytically derived the detector MTF in the close form for some special detector shapes. Obtained results are presented including graphical representation of mathematical formulas. The development of the detector MTF and sampling MTF is very similar, and therefore, only the results for the detector MTF are given in detail.

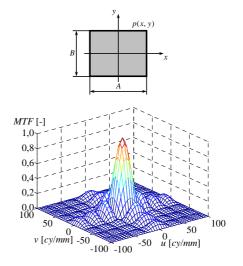


Fig. 6. Detector with the rectangularly shaped active area. Two dimensional MTF of the rectangular detector with the dimensions  $A = B = 40 \ \mu m$ .

#### 4.1 Rectangularly Shaped Detector

Rectangular or square detectors are rare, but play an important role in the simplest modeling of real sensors.

According to (16), the detector function p(x, y) is

$$p(x, y) = \begin{cases} \frac{1}{AB} & |x| < \frac{A}{2}, |y| < \frac{B}{2} \\ 0 & elsewhere \end{cases}$$
(22)

The detector OTF is simply obtained Fourier transform of the separable function p(x, y)

$$p(x, y) = \frac{1}{A} \operatorname{rect}\left(\frac{x}{A}\right) \cdot \frac{1}{B} \operatorname{rect}\left(\frac{y}{B}\right) = \frac{1}{AB} \operatorname{rect}\left(\frac{x}{A}, \frac{y}{B}\right) , \quad (23)$$

$$OTF_{det}(u,v) = F \{p(x,y)\}$$
  
= sinc(Au) · sinc(Bv) = sinc(Au, Bv) , (24)

where  $\operatorname{sinc}(x) = \sin(\pi x) / (\pi x)$ , and

$$MTF_{det}(u,v) = |OTF_{det}(u,v)| = |\operatorname{sinc}(Au, Bv)| \quad .$$
(25)

Eqn. (25) shows that the transfer function is broader for smaller detector area and vice versa. This features imaging systems, which image sensors consist of rectangular detectors. The detector of a rectangularly shaped active area and 2D graphical representation of MTF are shown in Fig. 6.

#### 4.2 L Shaped Detector

In real sensors, shapes differing from rectangular one can be found. In CMOS APS sensors, L shape is used.

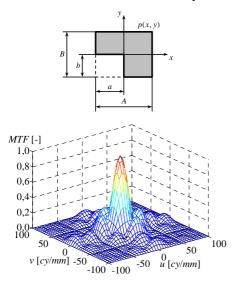


Fig. 7. Detector with the L shaped active area. Two dimensional MTF of the L shaped detector with the dimensions A = B= 40 µm, a = b = 20 µm.

The detector function p(x, y) is

$$p(x, y) = \begin{cases} \frac{1}{AB - ab} & (x, y) \in P \\ 0 & (x, y) \notin P \end{cases}$$
(26)

and the detector OTF is given by Fourier transform of the non-separable function p(x, y)

$$OTF_{det}(u,v) = = \frac{a(B-b)}{AB-ab} \operatorname{sinc}(au, (B-b)v) e^{j\pi u a} e^{-j\pi v(B-b)} + \frac{B(A-a)}{AB-ab} \operatorname{sinc}((A-a)u, Bv) e^{-j\pi u(A-a)} e^{-j\pi v(B-2b)} , \qquad (27)$$

$$MTF_{det}(u,v) = \left| OTF_{det}(u,v) \right| .$$
(28)

An L shaped active area of the detector and a graphical representation of two dimensional MTF is shown in Fig. 7.

#### 4.3 Rhomb Shaped Detector

The rhomb shaped detector exhibits several advantages over the rectangular ones. The detector function of this detector is defined as follows:

$$p(x, y) = \begin{cases} \frac{2}{AB} & \frac{1}{A} |x| + \frac{1}{B} |y| < \frac{1}{2} \\ 0 & elsewhere \end{cases}$$
(29)

and the detector OTF is given by Fourier transform of the non-separable function p(x, y)

$$OTF_{det}(u,v) = \operatorname{sinc}\left(\frac{Bv + Au}{2}\right) \cdot \operatorname{sinc}\left(\frac{Bv - Au}{2}\right)$$
(30)

$$MTF_{det}(u,v) = \left| OTF_{det}(u,v) \right|$$
(31)

The shape of the theoretically derived 2D MTF is shown in Fig. 8.The rhomb detector excels in better suppression of frequencies above Nyquist limit causing aliasing artifacts.

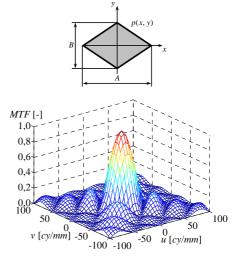


Fig. 8. Detector with the rhomb shaped active area. Two dimensional MTF of the rhomb shaped detector with the dimensions  $A = B = 40 \ \mu m$ .

#### 4.4 Hexagonally Shaped Detector

Image sensors using the hexagonally shaped detectors have several valuable properties when arranged in a hexa-

gonal sampling grid: about 13.4 % less detectors is needed [2] to reconstruct the image (radial symmetry of the spectrum) without artifacts compared to rectangular ones. The hexagonal detectors are also suitable for the localization of point light sources. The detector function for so-called side-up hexagonally shaped detector is defined as

$$p(x,y) = \begin{cases} \frac{2}{\sqrt{3}D^2} & |y| < \frac{D}{2}, \frac{\sqrt{3}}{2} |x| + \frac{1}{2} |y| < \frac{D}{2} \\ 0 & elsewhere \end{cases}$$
(32)

and the detector OTF is given by Fourier transform of the non-separable function p(x, y)

$$\begin{aligned} OTF_{det}(u,v) &= \\ &= \frac{1}{3} \Biggl\{ \operatorname{sinc} \Biggl( \frac{D}{\sqrt{3}} u \Biggr) \Biggl[ \cos \Biggl( \frac{D\pi}{2} \Biggl( \frac{u}{\sqrt{3}} - v \Biggr) \Biggr) \operatorname{sinc} \Biggl( \frac{D}{2} \Biggl( \frac{u}{\sqrt{3}} + v \Biggr) \Biggr) \\ &+ \cos \Biggl( \frac{D\pi}{2} \Biggl( \frac{u}{\sqrt{3}} + v \Biggr) \Biggr) \operatorname{sinc} \Biggl( \frac{D}{2} \Biggl( \frac{u}{\sqrt{3}} - v \Biggr) \Biggr) \Biggr] \\ &+ \cos \Biggl( \frac{D\pi}{\sqrt{3}} u \Biggr) \operatorname{sinc} \Biggl( \frac{D}{2} \Biggl( \frac{u}{\sqrt{3}} - v \Biggr) \Biggr) \operatorname{sinc} \Biggl( \frac{D}{2} \Biggl( \frac{u}{\sqrt{3}} + v \Biggr) \Biggr) \Biggr\} \quad , (33) \end{aligned}$$

$$MTF_{det}(u,v) = \left| OTF_{det}(u,v) \right| . \tag{34}$$

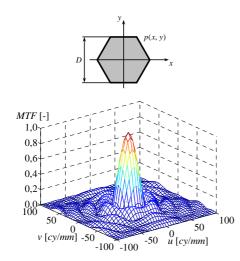


Fig. 9. Detector with the hexagonally shaped active area. Two dimensional MTF of the hexagonally shaped detector with the dimension  $D = 40 \ \mu m$ .

The detector with the hexagonally shaped active area and the graphical representation of 2D MTF is shown in Fig. 9.

## 4.5 Octagonally Shaped Detector

Analysis of the detector with the octagonal active area shape is also important because such detectors are used in FujiFilm SuperCCD sensors. The detector function for socalled side-up octagonally shaped detector is defined as

$$p(x, y) = \begin{cases} \frac{\sqrt{2} + 1}{2D^2} & |y| < \frac{D}{2}, |x| < \frac{D}{2}, \frac{\sqrt{2}}{2} |x| + \frac{\sqrt{2}}{2} |y| < \frac{D}{2}, (35) \\ 0 & elsewhere \end{cases}$$

and the detector OTF is given by Fourier transform of the non-separable function p(x, y)

$$OTF_{det}(u, v \neq 0)$$

$$= \frac{1}{2} \operatorname{sinc} \left( D(\sqrt{2} - 1)u \right) \operatorname{sinc} \left( Dv \right)$$

$$+ \frac{1}{4} \left( \frac{u}{v} + 1 \right) \operatorname{sinc} \left( \frac{\sqrt{2}}{2} D(u + v) \right) \operatorname{sinc} \left( \left( 1 - \frac{\sqrt{2}}{2} \right) D(u - v) \right)$$

$$- \frac{1}{4} \left( \frac{u}{v} - 1 \right) \operatorname{sinc} \left( \frac{\sqrt{2}}{2} D(u - v) \right) \operatorname{sinc} \left( \left( 1 - \frac{\sqrt{2}}{2} \right) D(u + v) \right), \quad (36)$$

$$OIF_{det}(u, v = 0)$$
  
=  $\frac{1}{2} \operatorname{sinc}\left(\left(1 - \frac{\sqrt{2}}{2}\right)Du\right)\operatorname{sinc}\left(\frac{\sqrt{2}}{2}Du\right) + \frac{1}{2}\operatorname{sinc}(Du)$ , (37)

 $MTF_{det}(u,v) = |OTF_{det}(u,v)|$ 

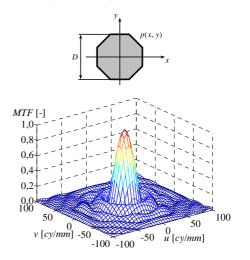


Fig. 10. Detector with the octagonally shaped active area. 2D MTF of the octagonal shaped detector with the dimension  $D = 40 \ \mu m$  and its profile.

The detector with the octagonally shaped active area and the graphic representation of 2D MTF is shown in Fig. 10.

#### 4.6 Circularly Shaped Detector

The detector with circularly shaped active area is not directly used in image sensors (we can find it in special structures using fiber-optic bundle to produce an input image for the sensor). The spatial averaging process is performed within an individual fiber. The detector function for the circularly shaped detector is defined as

$$p(x,y) = \begin{cases} \frac{4}{\pi D^2} & \sqrt{x^2 + y^2} < \frac{D}{2} \\ 0 & elsewhere \end{cases}$$
(39)

and the detector OTF is given by Fourier transform of the non-separable function p(x, y)

$$OTF_{det}(u,v) = \frac{2J_1(\pi D\sqrt{u^2 + v^2})}{\pi D\sqrt{u^2 + v^2}} = \text{jinc}\left(\frac{D}{2}\sqrt{u^2 + v^2}\right), \quad (40)$$

(38)

where  $\text{jinc}(x) = 2J_1(\pi Dx) / (\pi Dx)$  and  $J_1(x)$  is the Bessel function of the first kind and order. Next,

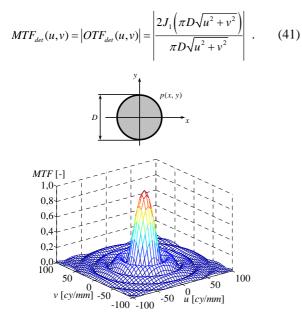


Fig. 11. Detector with the circularly shaped active area. 2D MTF of the circularly shaped detector with the diameter  $D = 40 \mu m$ .

The detector with the circularly shaped active area and the graphic representation of the 2D MTF is shown in Fig. 11.

## 5. Overall MTF of the Imaging System

The simplified model was developed for an effective testing of MTF shape dependence on system parameters. Theoretical results were also implemented into a Matlab based computer program.

The proposed model (Fig. 12) comprises a diffraction limited optical subsystem and an image sensor (geometrical properties: the shape and the size of the detector and the sampling grid, CCD specific properties for diffusion and charge transfer efficiency MTF modeling). The image reconstruction subsystem is not implemented in this model.

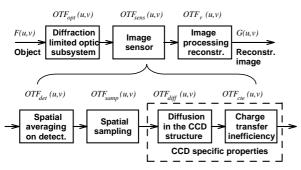


Fig. 12. Model of the imaging system with the image sensor for the MTF modeling purposes.

Considering Fig. 12, OTF of the whole imaging system (condition of the unitary transfer function in the image processing subsystem  $OTF_r(u, v) = 1$ ) is given by

$$OTF(u,v) = OTF_{out}(u,v) \cdot OTF_{sens}(u,v) , \qquad (42)$$

where OTF of the CCD image sensor (including both geometrical and CCD specific properties) is

$$OTF_{sens}(u,v) = OTF_{det}(u,v) \cdot OTF_{samp}(u,v) \\ \cdot OTF_{diff}(u,v) \cdot OTF_{cte}(u,v)$$
(43)

 $OTF_{det}(u, v)$  is the detector OTF,  $OTF_{samp}(u, v)$  is sampling OTF,  $OTF_{diff}(u, v)$  is diffusion OTF and  $OTF_{cte}(u, v)$  is OTF affected by the charge transfer efficiency in the CCD. Both  $OTF_{det}(u, v)$  and  $OTF_{samp}(u, v)$  are so-called geometrical transfer functions in contrast to  $OTF_{diff}(u, v)$  and  $OTF_{cte}(u, v)$ , which are specific for the CCD structure.

#### 5.1 MTF of the Optical Subsystem

The diffraction limited optical subsystem is considered in the proposed model. Properties of such an optical device are described by the diffraction limited MTF.

OTF of the diffraction limited optical subsystem [1] with the circularly shaped aperture given by Fourier transform of Airy distribution (Fig. 13) is

$$OTF(u_r) = H(u_r)$$

$$= \begin{cases} \frac{2}{\pi} \left[ \arccos\left(\frac{u_r}{u_c}\right) - \frac{u_r}{u_c} \sqrt{1 - \left(\frac{u_r}{u_c}\right)^2} \right] & u_r \le u_c \\ 0 & u_r > u_c \end{cases}$$
(44)

where  $u_r$  is radial and  $u_c$  is cutoff spatial frequency

$$u_c = 1/\lambda (F/\#) . \tag{45}$$

 $\lambda$  is the wavelength of light and *F*/# is relative aperture.

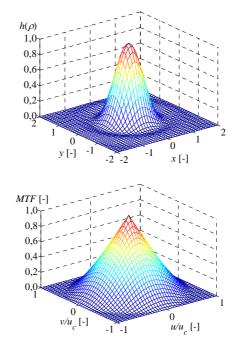


Fig. 13 2D Airy distribution and corresponding MTF of the diffraction limited optical system with circular aperture.

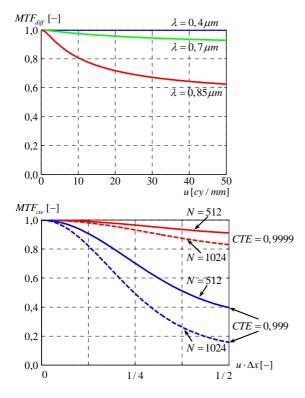


Fig. 14. Diffusion MTF and charge transfer efficiency MTF in the CCD specific subsystem model.

#### 5.2 CCD Specific Transfer Functions

The proposed model provides also two CCD specific transfer functions: the diffusion MTF and MTF of the charge transfer inefficiency; both are described in detail in [1], [4]. Here in Fig. 14, only the graphical representation of these MTFs is depicted.

Fig. 14 shows that the diffusion MTF play a significant role for the long wavelength only, i.e. in the near-IR and IR area. CTE MTF is not the very important in the CCD with the high transfer efficiency even with high number of transfers along a CCD register.

# 6. MTF Modeling and Measurement

The overall MTF of the imaging system with the image sensor is given by a product of many partial MTFs. Each of these MTFs depends on several parameters. It is almost necessary to use a computer program for effective analysis of the system. We have implemented GUI application called ISMOT (Image Sensor Modeling Toolbox) under Matlab. This application enables modeling of the following tasks: optical subsystem properties, detector shape and sampling grid, CCD sensor specific properties (diffusion, CTE). All the charts were generated using ISMOT.

Even the most sophisticated models cannot take into account all the effects in real imaging systems. Any case, we have to check the modeled characteristics by measuring real systems. For this purpose, we built a simple measurement system with the MTF evaluation by GUI application called MTF EVAL under Matlab. This system uses reflective test pattern with a linear or logarithmic sweep. After shooting the pattern, its modulation depth is determined and MTF plotted. The pattern and the program were optimized for the measurement of the digital camera MTF.

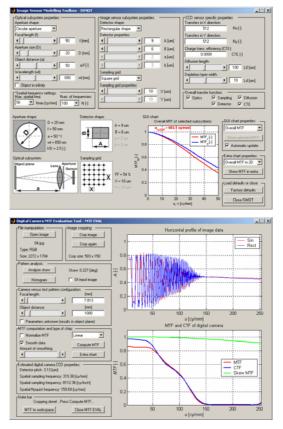


Fig. 15. Image Sensor Modeling Toolbox and MTF Evaluation Tool.

Results of the particular measurement and modeling are presented in Fig. 17. The difference between characteristics is caused by the simplified ISMOT model especially. This model comprises diffraction limited optical and image sensor subsystems only. Better model should take more subsystems into account (real optical systems with aberrations, micro-lens structures, optical anti-aliasing filters, color mosaic filters, more accurate geometric and physical models of image sensor, A/D conversions, interpolation algorithms, and other image processing).

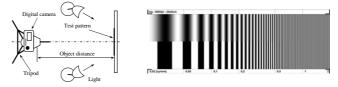


Fig. 16. Configuration of the measuring system and the test pattern with logarithmic sweep.

## 7. Conclusions

The knowledge of the operation of the first part of the imaging system, i.e. the image sensor, is very important.

Many of the image processing functions can be implemented into the image sensor today. Image processing often requires an input signal with specific qualitative parameters. In order to fulfill these parameters, the objective measures e.g. MTF should have a specific shape. Mentioned facts raise the importance of modeling and/or measurement of image sensor characteristics. The main characteristics of the image sensors are described in this paper.

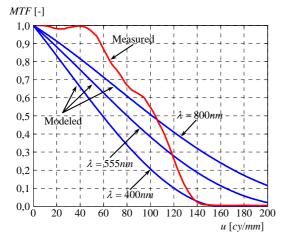


Fig. 17. Results of modeling and measurement of digital camera.

The proposed model comprises geometrical as well as CCD specific physical properties of the image sensor. We have tested different geometrical structures of an area image sensor. Currently, most of the detector arrays utilize a rectangular geometry. However, other detector shapes and sampling structures may offer an improved performance. Some advantages of hexagonal or rhombic structures were mentioned in the paper. Also L shaped detectors (most commonly used in CMOS APS) were analyzed. Modeling results show that the particular detector MTF needs to be calculated for the detector active area effective design. In the image sensor design there are many conflicting requirements e.g. SNR and MTF that could be considered. For the more comprehensive MTF model, many additional physical parameters could be taken into account.

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