# ON A BASIC CONSIDERATION OF THE WARP MODEL OF HOUGH TRANSFORM

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#### **ABSTRACT**

The Warp Model of the Hough transform is proposed to provide the extended Hough transform functions(EHT). The Warp Model is a skewed parameter space  $(\mu, \xi)$ , which is homeomorphic to the original  $(\rho, \theta)$ parameter space. It is important that to introduce the skewness of the parameter space is to define the angular and positional sensibility to detect lines.

In this paper, the Hough transform function is extended at first by introducing three functional conditions to ensure the homeomorphic relation between  $(\mu, \xi)$  and  $(\rho, \theta)$  parameter spaces. After proving these conditions to be feasible, a procedure to derive the transform function is presented by using the Warp Model so that the given angular and posional sensibility could be realized.

### 1. INTRODUCTION

The basic function of Hough transform defined by eq.(1) should not be an unique expression by which the line pattern detection could be realized.<sup>1)</sup>

$$
\rho = x \cdot \cos \theta + y \cdot \sin \theta \tag{1}
$$

In order to extend the functional expression of Hough transform, we have proposed the extended Hough transform functions (EHT) and its functional conditions to be satisfied by EHT.<sup>2)</sup> As EHT functions are defined so that the new parameter space corresponds homeomorphically to  $(\rho, \theta)$  space, it is emphasized in this paper that specifing the functional expression of EHT is equivalent to specifing the sensitivity distribution of the parameter space of Hough transform. The 'Warp Model' of Hough transform was introduced to describe clearly the sensitivity distribution of the parameter space.

The conditions to be satisfied by EHT functions and the Warp Model of the EHT are firstly introduced, and after proving these conditions to be feasible, a procedure to design the transform function is presented by means of the sensitivity measures defined by the Warp Model. A few examples of the specific Warp Models are presented to show the utility of the Warp Model.

# 2. EHT AND WARP MODEL

The essential property of Hough transform is to ensure an unique one-to-one mapping, a hoeomorphic mapping, between a line in the pattern space and its parameter pair in the parameter space. If we could find other homeomorphic mapping functions, the functional expression of Hough transform would be extended. This new extended expression of Hough transform is called 'Extended Hough Transform (EHT)' in this paper.

#### 2.1 Conditions for EHT

Let the EHT function be denoted by eq.(2) in this paper. The parameters  $\mu$  and  $\xi$  in eq.(2) are for the parameters for the arbitrary position and for the arbitrary angle( or orientation) of the straight line, respectively. Any transform functions given by eq.(3) could be an EHT function on condition that the following three conditions be satisfied.

$$
g(\mu, \xi) = x.f_1(\mu, \xi) + y.f_2(\mu, \xi) \tag{2}
$$

Condition-1:  $f_1(\mu, \xi), f_2(\mu, \xi)$  and  $g(\mu, \xi)$  should be an unique(single-valued) and continuous functions of the parameters  $\mu$  and  $\xi$ , where  $f_1^2 + f_2^2 \neq 0$ .

As  $f_1^2 + f_2^2 \neq 0$ , eq.(2) can be replaced by eq.(3). In eq.(3), when let  $\arctan \frac{f_1(\mu,\xi)}{f_2(\mu,\xi)}$  and  $\frac{g(\mu,\xi)}{\sqrt{f_1^2+f_2^2}}$  be replaced by  $\phi(\mu, \xi)$  and  $R(\mu, \xi)$ , respectively, eq.(3) can simply be represented by eq.(4).

$$
\frac{g}{\sqrt{f_1^2 + f_2^2}} = x, \frac{f_1}{\sqrt{f_1^2 + f_2^2}} + y, \frac{f_2}{\sqrt{f_1^2 + f_2^2}} \tag{3}
$$

$$
R(\mu, \xi) = x \cdot \cos \phi(\mu, \xi) + y \cdot \sin \phi(\mu, \xi) \tag{4}
$$

As functions  $f_1(\mu, \xi)$ ,  $f_2(\mu, \xi)$  and  $g(\mu, \xi)$  are singlevalued, the modified parameters  $(\phi, R)$  in eq.(4) become single-valued functions of  $\mu$ , and  $\xi$ , and therefore we can call these parameters as equivalent distance R from the origin and equivalent perpendicular angle  $\phi$  of the EHT defined by eq.(2).

ij

**Condition-2:** The equivalent distance  $R(\mu, \xi)$  and perpendicular angle  $\phi(\mu, \xi)$  must be monotonously increasing( or decreasing) with respect to  $\mu$  and  $\xi$ , respectively. Therefore, eq.(5) must be satisfied. Figure



**Fig.1** Condition-2 **of EHT** 

**1 gives** the pictorial interpretation of this condition.

$$
\frac{\partial R(\mu,\xi)}{\partial \mu} > (or <)0
$$
\n
$$
\frac{\partial \phi(\mu,\xi)}{\partial \xi} > (or <)0
$$
\n(5)

**Condition-8: When let the boudaries of** the **px**rameters  $\xi$  and  $\mu$  be  $\xi_K$ ,  $\xi_0$ ,  $\mu_L$  and  $\mu_0$ , eq.(6) must **'be** satisfied as **the** boundary conditions for the **param**eters  $\phi$  and  $R$  for any  $\mu$  and any  $\xi$ , where  $B$  is the given range of parameter  $\rho$ . **Figure 2** gives an interpretation of this condition.

$$
|\phi(\mu_l, \xi_K) - \phi(\mu_l, \xi_0)| = \pi
$$
 (6)  

$$
R(\mu_l, \xi_K) - R(\mu_l, \xi_0) = 0
$$
  

$$
R(\mu_L, \xi_k) \ge \frac{B}{2} R(\mu_0, \xi_k) \le \frac{-B}{2}
$$

### **2.2 Warp Model of EHT**

In order to demonstrate the feasibilities of the conditions, suppose that the parameter spaces  $(\rho, \theta)$  and  $(\mu, \xi)$  were digitized into  $L \times K$  cells homogeniously **as shown** in **Fig.3, As** the **domain for** the **parameter**  space  $(\rho, \theta)$  should be  $0 \le \theta < \pi$  and  $\frac{-B}{2} \le \rho < \frac{B}{2}$ , and if let the domain of the space  $(\mu, \xi)$  be  $D \times C$ , the relations between the cell sizes of  $\Delta \rho \times \Delta \theta$  and  $\Delta \mu \times \Delta \xi$  can be given by eq.(7). Let the borders of cells be identified by  $(\rho_i, \theta_k)$  and  $(\mu_i, \xi_k)$  where  $l=0,1,2,...,L$ and  $k=0,1,2,...,K$ .

$$
\Delta \rho = \frac{B}{D}.\Delta \mu \tag{7}
$$

$$
\Delta \theta = \frac{\pi}{C}.\Delta \xi
$$

How should the cell array  $(\mu_l, \xi_k)$  in  $(\mu, \xi)$  space be **observed** from an observer on the space  $(\rho, \theta)$  ? As **shown** in Fig.4, it **is** obvious that the **skewed cell array**   $(R(\mu_l, \xi_k), \phi(\mu_l, \xi_k))$  would be observed. We will call this **skewed dl array as** the **'Warp Model"** of EHT. The point **to show that the EHT** is truely an **altema**tiveof the **Hough** transform is to **show** the **Warp Model**  could cover the cell array  $(\rho_l, \theta_k)$  uniquely.

**2.3 Proofs for Conditions** 

### (I) Condition-l



**Fig.3** Relation between  $(\mu, \xi)$  and  $(\rho, \theta)$  spaces



Fig.4 The Warp Model  $(R, \phi)$  of EHT

In oder to ensure the **correspondence** between the cell **array**  $(\rho, \theta)$  and  $(R(\mu, \xi), \phi(\mu, \xi))$  to be homeomorphic, it is sufficient to ensure the functions  $R(\mu,\xi)$  and  $\phi(\mu,\xi)$ to be single-valued and continuous with respect to  $\rho$ and  $\theta$ , respectively. Therefore, as known from eq's.(3) and (4), it is sufficient to ensure functions  $f_1(\mu, \xi)$ ,  $f_2(\mu,\xi)$  and  $g(\mu,\xi)$  to be single-valued and countinuous with respect to  $\mu$  and  $\xi$ , respectively.(QED)

<sup>&</sup>lt;sup>1</sup>an analogy to the skewed warp and weft of the fabrics

#### $(2)$  Condition- $2$

In addition to the Condition-I, as shown in Fig.5, it **would be feasible that the functions**  $R(\mu,\xi)$  **and**  $\phi(\mu,\xi)$ should be **monotonously** increasing **(or decreasing) with**  respect to  $\rho$  and  $\theta$ , respectively. Therefore, eq.(8) can he **e-ily provided hy means of eq.(T).(QED)** 

$$
\frac{\partial \phi(\mu,\xi)}{\partial \theta} = \frac{C}{\pi} \cdot \frac{\partial \phi(\mu,\xi)}{\xi} > (<)0 \tag{8}
$$
\n
$$
\frac{\partial R(\mu,\xi)}{\partial \rho} = \frac{D}{B} \cdot \frac{\partial R(\mu,\xi)}{\partial \mu} > (<)0
$$

**(3)** Condition-8

As **shown** in **Fig.6, in order to** ensure **the Warp Model**   $R(\mu_l, \xi_k)$  to cover the cell array  $(\rho, \theta)$ , eq.(9) must be satisfied for all  $\mu_l$ ,  $l=0,1,2,...,L$ .

In addition to **eq.**(9), for all  $\xi_k$  **except**  $k=0$  and K.  $eq.(10)$  should be applicable where B is the given range for  $\rho$  parameter. ( $QED$ )

$$
R(\mu_l, \xi_K) = R(\mu_l, \xi_0) \tag{9}
$$

$$
\phi(\mu_l, \xi_K) = \phi(\mu_l, \xi_0) + \pi
$$
  

$$
R(\mu_L, \xi_k) \ge \frac{B}{2} \quad R(\mu_0, \xi_k) \le \frac{-B}{2} \quad (10)
$$

# **3. HOW TO DESIGN EHT**  FUNCTION

**A** basic idea and a procedure to design the EHT **func**tion are **proposed** by **means of the** Warp **Model.** 







**Fig.6** Boundary conditions of  $\phi$  and  $R$ 

## **3.1 Sensitivity of Line Detection**

It is important to notice that the partial differential  $\frac{\partial \phi}{\partial \theta}$ defined by **eq.18) can** be physically interpreted **as** a kind **of** 'thr **angular sensitivity' or** 'the **angular resolution**  rate' of the given EHT characterized by  $(R(\mu, \xi), \phi(\mu, \xi))$ in **eq.(4).** 

In the same way, the partial differential  $\frac{\partial R}{\partial \rho}$  means a kind of 'the positional sensitivity' of the line detection by the EFIT. **In** other **words, the skewness of** the Warp Model **of** the EHT represents the angular and positional sensitivities of the EHT.

Let  $S_{\phi}$  and  $S_R$  be the angular and positional sensitivities. Fortunately, as clearly given in eq.(8), these sensitivities **can** be defined by **eq.(ll),** 

$$
S_{\phi} = \frac{C}{\pi} \cdot \frac{\partial \phi}{\partial \xi}
$$
  
\n
$$
S_R = \frac{B}{D} \cdot \frac{\partial R}{\partial \mu}
$$
\n(11)

**3.2 Procedure to design EHT functions**  Therefore, **the** exact expresion **of** the EHT function can he derived by solving the **differentia!** equations given by  $S_{\phi}$  and  $S_R$  in eq.(11) under the constraint of the Condition-1,2, and 3. The solutions  $\phi(\mu, \xi)$  and  $R(\mu,\xi)$  are the exact expression of the EHT in which **the** specified **sensitivities me** actually **realized.** 

### **3.3 Examples of EHT**

**h few examples** of ERT functions are presented to demonstrate the procedure.

(2) **Exarnple(1)** 

**Suppose** to **design a** EHT function of which angular and positional sensitivities are increasing at about  $\theta =$  $\frac{\pi}{2}$  as given by eq.(12) and **Fig.7**.

$$
S_{\phi} = \frac{C}{\pi} \cdot (\xi - \frac{\pi}{2})^2 + a
$$
 (12)  

$$
S_R = \frac{B}{D} \cdot (\xi - \frac{\pi}{2})^2 + a'
$$

The parameter  $\phi(\mu, \xi)$  can be easily solved to be eq.(13) on condition that  $C = \pi$  when  $0 \leq \xi < \pi$ , and that  $a = (1 - \frac{\pi^2}{12})$  and  $b = \frac{\pi^3}{24}$  when  $\phi(\xi = 0) = 0$  and  $\phi(\xi = \pi) = \pi$ .

The another parameter  $R(\mu, \xi)$  can also be derived by **cq.**(14) on condition that  $a' = (1 - \frac{\pi^2}{12})$  and  $b' = 0$  when  $R(\mu = 0) = 0$ ,  $R(\mu = R) = R$  and  $\overline{B} = D$ .

Therefore, the transform function of this EHT **was designed as**  $R(\mu, \xi) = x \cdot \cos \phi(\mu, \xi) + y \cdot \sin \phi(\mu, \xi)$  on the basis of the solusions of **eq.'s** (13) **and (14). Figure 8 shows the skewed** parameter **space,** Warp **Modd, of**  this **EHT.** 

$$
\phi(\mu, \xi) = \int S_{\phi} d\xi = \frac{(\xi - \frac{\pi}{2})^3}{3} + a\xi + b
$$

$$
= \frac{(\xi - \frac{\pi}{2})^3}{3} + (1 - \frac{\pi^2}{12})\xi + \frac{\pi^3}{24}
$$
(13)



**Fig.7** An example of the sensitivities  $\frac{\partial \phi}{\partial t}$  and  $\frac{\partial R}{\partial u}$ 

$$
R(\mu, \xi) = \int S_R d\mu = \frac{B}{D} \cdot \int \{ (\xi - \frac{\pi}{2})^2 + a' \} d\mu
$$

$$
= \mu \cdot (\xi - \frac{\pi}{2})^2 + (1 - \frac{\pi^2}{12}) \tag{14}
$$



**Fig.8** An example **of** the **Warp** Model

#### **(2) Example** (2)

Suppose to **introduce a** EHT function such that its angular sensitivity **becomes** linear **as** defined by **eq.(15)**  and that its positional sensitivity becomes flat as defined by  $eq.(16)$ .

Under the same constraints of the example  $(1)$ ,  $\phi(\mu, \xi)$ and  $R(\mu, \xi)$  are easily solved, and eq.(17) was provided **as** the **EHT** transform function. **Figure** 9 **shows** the **Warp Model** of **this** EHT.

$$
S_{\phi} = \frac{2}{\pi} \xi \tag{15}
$$

$$
S_R = 1\tag{16}
$$

$$
R(\mu, \xi) = \mu \quad \phi(\mu, \xi) = \frac{\xi^2}{\pi}
$$
 (17)

 $R(\mu, \xi) = x \cdot \cos \phi(\mu, \xi) + y \cdot \sin \phi(\mu, \xi)$ 

# **4. CONCLUSION**

This paper proposed the Warp Model of the Hough parameter **space** in order to **give** a pictorial interpretation of the extended Hough transform(EHT), and **to** introduce a procedure to design the EHT function. As the partial differentials of the Warp Model **mean** a kind of the sensitivity of the line extraction, just by specifing the sensitivity at request and by solving the partial differentials under the constraints, the **new** EHT function can be provided.

Therefore, it **can be** said that this paper should be **effec**tive to integrate the so-called 'performance' <sup>6)</sup>, 'quantization'  $4^{1,5}$  and 'parameterization' problems of the **Hough** transform. **From** this **view** point, the following subjects of this paper should be investigated hereafter. **(1)** To **find** out **the** fat, noise robust algorithms **of EHT3)** 

(2) To **make** the functional conditions of EHT **more**  target specific

(3) **To** clarify the relations among the transform func $tion (=EHT)$ , parameterization, and performance prob**lems** 



**Fig.9** Another example or **the** Warp Modcl

# **REFERENCES**

1) **Stockrnan,G.C.** and Agrawala,A.K. : Equivalence of **I-lough curve** detection to template matching, Gom. of ACM, Vol.20, No.11, pp.820-822 (Nov.1977)

2) Koshimizu, H. and Numada, M. : On the extensive reconstruction of Hough transform, Proc. of ICCV'90, pp. **740-743 (Osaka), (Dec. 1990)** 

**3)** Koshimixu,H. and **Numada,** M.: **On a** fast **Hough transform method PCHT barred** on piece-wise linear **IIough** function, **Tranu.IEICE, Vo1.372-D-11, No.1, pp.56- 65 (Jan.** I989)

4) Morimoto,M., **Shakunaga, T., Akamatu,** *5,* **and** Sue**naga,** Y.: A high resolution **Hough** transform using variable filter, **Trans.** IEICE, **VoI.J75-D-11, No.9, pp.IS4R-1556 (Sep. 1992)** 

5) Wada, T. and Matsuyama, T.  $:\gamma - \omega$  Hough transform, **PFC)C. ICPR'92, pp. 272-275 (Aug.1992)** 

 $6)$ Svalbe, I.D.: Natural representation for straight lines **and** Hough **transform on** discrete **array, Trans.IEEE, Vol.PAMI- 11, No.9, pp.94 1-950 (Sep. 1989)**