

# Efficient Omni-image Unwarping using Geometric Symmetry

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**Abstract** In order to save storage space of a pano-mapping table used in omni-image unwarping, a geometric symmetry method is proposed. First of all, this method partitions a 360 degree omni-image into eight 45 degree omni-image sectors. Then, we partition the pano-mapping table into eight regions accordingly, with each pano-mapping table region corresponding to exactly one omni-image sector. We analyze the geometric symmetry relationship among these omni-image sectors and pano-mapping table regions. We find that if we know the mapping data in any one pano-mapping table region, it is easy to calculate the mapping data of the other seven pano-mapping table regions. Thus, in the final step, we perform omni-image unwarping based on only one pano-mapping table region, which reduces pano-mapping table size by seven-eighths. Reducing the pano-mapping size is very useful for implementing omni-image unwarping in embedded systems. Experiments on TI DSP based embedded systems indicate that the proposed method reduces seven-eighths of pano-mapping table size, and improves the unwarping speed by a factor of 2.74.

**Keywords** *Catadioptric imaging, omni-directional image, computer vision, image processing, panorama*

## 1. Introduction

Catadioptric omni-directional imaging systems (or simply omni-cameras) are becoming popular in applications that need wide field of view (FOV), such as robot vision[1-5], visual surveillance[6-8] and 3D scene reconstruction[9]. The images captured with omni-cameras are usually called omni-images, as shown in Fig. 8(a). Unfortunately, although omni-images provide as wide as 360 degree FOVs, they are warped. Many applications require transforming omni-images into unwarped images (or panoramic images, as shown in Fig. 8(b)) that are suitable for human perception, this procedure is called omni-image unwarping.

In the literature, there are roughly two kinds of omni-image unwarping approaches [1] — ray-trace coordinate calculation and concentric circle approximation. The former approach [10-13] calculates the pixel position relationship between omni-images and their corresponding panoramic images. This method cal-

culates panorama images with both high precision and less deformation. However, it needs information on omni-camera parameters, including focal length of the lens, coefficients of mirror surface shape equations, etc., which in some situations is difficult to know or estimate. The concentric circle approximation approach [14] treats omni-images as a series of concentric circles, and maps these concentric circles to the same-length horizontal rows in panoramic images via trigonometric transformations.

Jeng, Tsai and Wu [15-16] propose a pano-mapping table method for unwarping omni-images taken by almost any kind of omni-cameras, without requiring prior knowledge about the camera parameters in advance. In this work, a pano-mapping table is regarded as a summary of omni-camera parameters, and this pano-mapping table is created only once for a specific omni-camera. However, the pano-mapping table is very large in size, so it needs significant memory space to store the table. This problem is especially serious in embedded system implementation of omni-cameras, since there is limited memory space in embedded systems, such as in a DSP and or a FPGA.

We propose reducing seven-eighths of a pano-mapping table based on geometric symmetry of omni-images and pano-mapping table. The ideas and procedures behind this method include: a) Treating the omni-image as a series of concentric circles, and partitioning the omni-image into eight geometrically symmetric regions in radial directions. That is, we partition the 360 degree of an omni-image into eight omni-image sectors uniformly, with each omni-image sector being 45 degree. b) We partition the pano-mapping table into eight regions accordingly, with each pano-mapping table region corresponding to exactly one omni-image sector. c) By deducing and establishing the geometrical symmetry relationship among these omni-image sectors and pano-mapping table regions, we can perform omni-image unwarping based on only one pano-mapping table region. This is because, based on the geometric symmetry relationship, the mapping data of the remaining seven pano-mapping table regions can be calculated with a few simple CPU operations.

Reducing pano-mapping size has extraordinary value in implementing omni-image unwarping in embedded systems, because there is usually limited memory in these systems. Experiments on TI DSP based embedded systems indicate that the proposed method reduces seven-eighths of the pano-mapping table size, and this method improves the unwarping speed by a factor of 2.74. The speed improvement comes mainly from the reduced memory access of a pano-mapping table.

The remainder of this paper is organized as follows: Section 2 reviews techniques for omni-image unwarping. In Section 3 we discuss geometric symmetry. Unwarping based on a reduced pano-mapping table is outlined in Section 4. Experiments are summarized in Section 5. Finally, some concluding remarks are given in Section 6.

## **2. Review of omni-images unwarping method based on pano-mapping table**

In order to avoid the calibration of omni-cameras and reduce the computation time used for omni-images unwarping, Jeng and Tsai [16] proposed an approach that is based on a pano-mapping table. This pano-mapping table is created only once by a landmark learning process. The inputs of this learning process are a set of land-

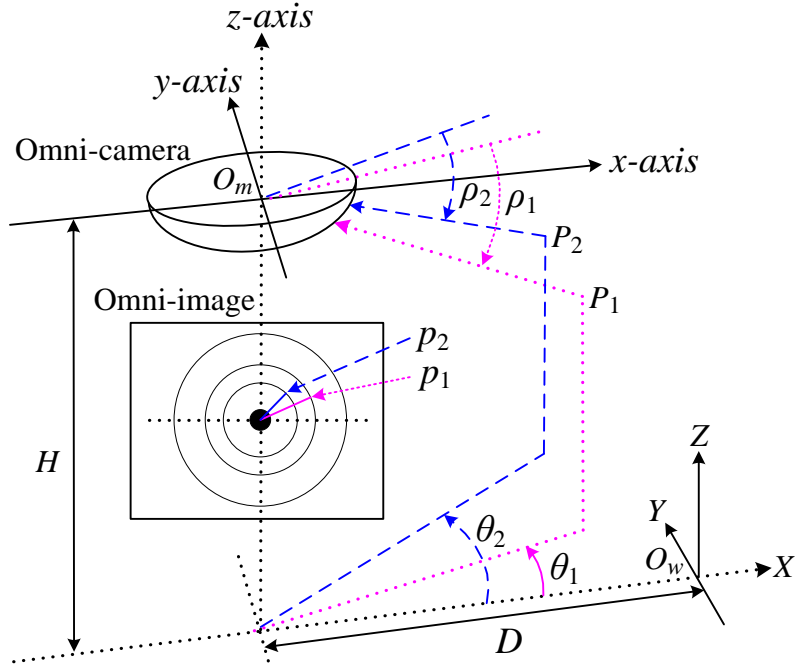
mark points in the world and the set of corresponding points in a given omni-image. Fig. 1 illustrates the coordinate systems of an omni-camera, an omni-image and the world space, and Table 1 shows an example of a  $M \times N$  size pano-mapping table [15].

In Fig. 1,  $P_1$  and  $P_2$  are two landmark points in the real world, and  $p_1$  and  $p_2$  are the corresponding image points. Jeng and Tsai [16] denote the coordinates of a real-world point  $P$  as  $(\theta, \rho)$ , where  $\theta$  and  $\rho$  are the azimuth angle and elevation angle of an incident light ray; and denote the coordinates of an image pixel  $P$  as  $(\mu, \nu)$ .

As shown in Table 1, the pano-mapping table is a 2-dimensional table, with the horizontal and vertical axes specifying the possible ranges of  $\theta$  and  $\rho$  in  $M$  and  $N$  increments respectively. In the pano-mapping table, each entry  $E_{i,j}$  has a pair of indices  $(i, j)$ . Each entry  $E_{i,j}$  specifies a pair  $(\theta_i, \rho_j)$ , defines an infinite set  $S_{i,j}$  of real-world points on the light ray with azimuth angle  $\theta_i$  and elevation angle  $\rho_j$ . All the points in  $S_{i,j}$  project onto an identical pixel  $p_{i,j}$  in an omni-image. This process is pano-mapping  $f_{pm}$  from  $S_{i,j}$  to  $p_{i,j}$  as shown in Fig. 2. In Table 1, each entry  $E_{i,j}$  is filled with the coordinates  $(\mu_{i,j}, \nu_{i,j})$  of pixel  $p_{i,j}$  in the omni-image, where the values  $(\mu_{i,j}, \nu_{i,j})$  are computed as:

$$\begin{cases} \theta_i = i \times (2\pi / M) & \text{for } i = 0, 1, 2, \dots, M-1, \\ \rho_j = j \times [(\rho_e - \rho_s) / N] + \rho_s & \text{for } j = 0, 1, 2, \dots, N-1, \\ r_j = f_r(\rho_j) = \sum_{n=0}^4 (a_n \times \rho_j^n), \\ \mu_{i,j} = r_j \times \cos \theta_i, \\ \nu_{i,j} = r_j \times \sin \theta_i \end{cases} \quad (1)$$

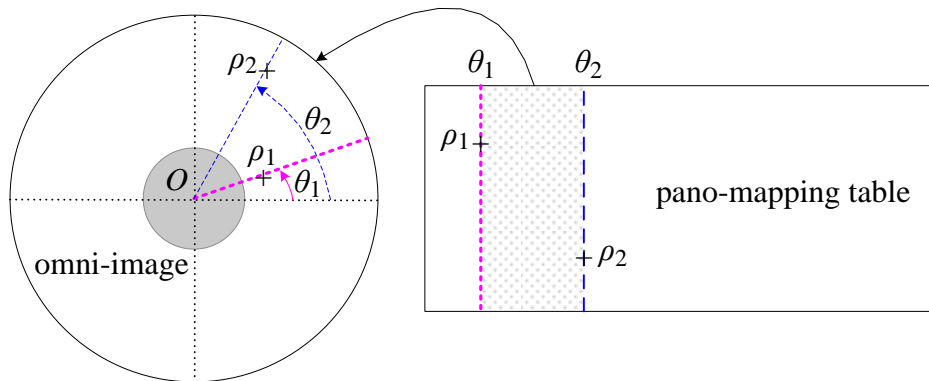
where  $\rho_e$  and  $\rho_s$  specify the omni-camera's maximum and minimum value of the elevation angles;  $f_r(\rho)$  is a nonlinear function, it specifies the relation between elevation angle  $\rho$  and  $r$ , where  $r$  is the radial distance from image pixel  $P$  at coordinates  $(\mu, \nu)$  in the omni-image to the omni-image center; and the coefficients  $a_0$  through  $a_4$  of  $f_r(\rho)$  are estimated using the image and real-world coordinate data of the previously mentioned corresponding landmark point pairs.



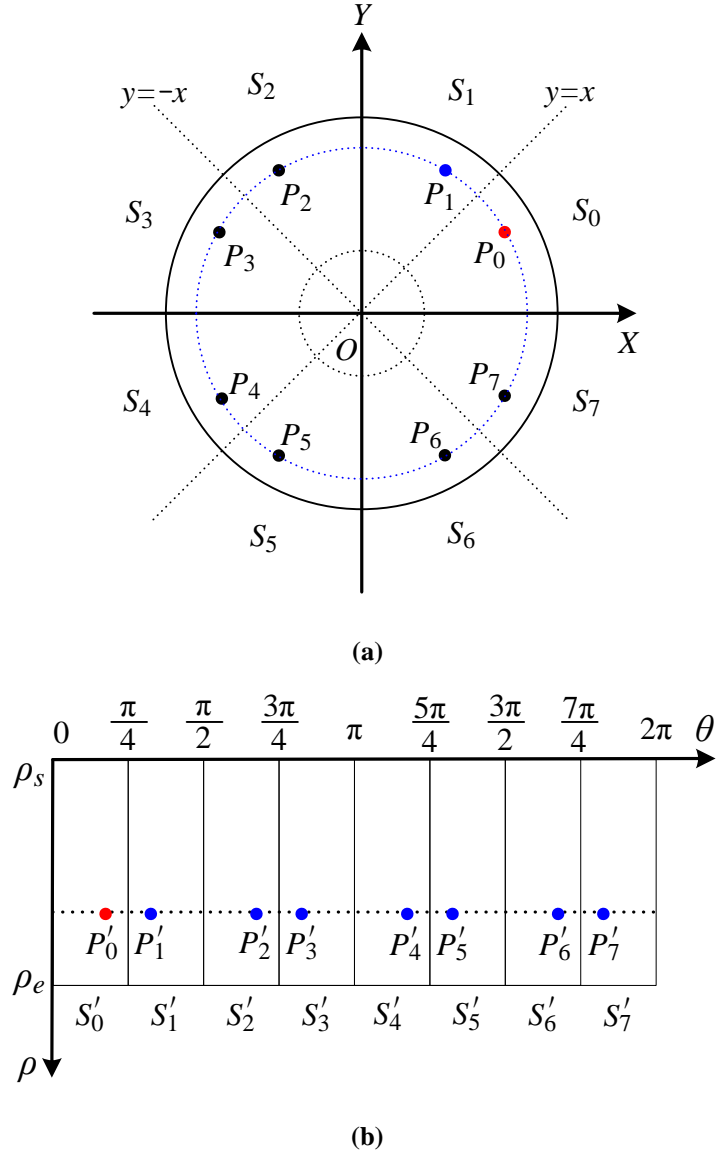
**Fig. 1** Omni-camera, omni-image and world space coordinate systems, adapted from [15]

**Table 1** Example of pano-mapping table of size  $M \times N$

	$\theta_0$	$\theta_1$	...	$\theta_{M-1}$
$\rho_0$	$(\mu_{00}, \nu_{00})$	$(\mu_{10}, \nu_{10})$	...	$(\mu_{M-1, 0}, \nu_{M-1, 0})$
$\rho_1$	$(\mu_{01}, \nu_{01})$	$(\mu_{11}, \nu_{11})$	...	$(\mu_{M-1, 1}, \nu_{M-1, 1})$
$\rho_2$	$(\mu_{02}, \nu_{02})$	$(\mu_{12}, \nu_{12})$	...	$(\mu_{M-1, 2}, \nu_{M-1, 2})$
$\rho_3$	$(\mu_{03}, \nu_{03})$	$(\mu_{13}, \nu_{13})$	...	$(\mu_{M-1, 3}, \nu_{M-1, 3})$
...	...	...	...	...
$\rho_{N-1}$	$(\mu_{0, N-1}, \nu_{0, N-1})$	$(\mu_{1, N-1}, \nu_{1, N-1})$	...	$(\mu_{M-1, N-1}, \nu_{M-1, N-1})$



**Fig. 2** Mapping between pano-mapping table and omni-image, adapted from [15]



**Fig. 3** Geometrical symmetry partitioning of omnimage and pano-mapping table. a Omnimage symmetry partitioning; b Pano-mapping table partitioning

### 3. Geometric symmetry analysis of omnimages unwarping

#### 3.1 Geometric symmetry partitioning

We analyze the geometric symmetry properties in an omnimage and a pano-mapping table. According to Equation (1), we know that the azimuth angle  $\theta$  ranges from 0 to  $2\pi$ , and the values of  $(\mu_{ij}, \nu_{ij})$  in a pano-mapping table are related with  $\theta$  by trigonometric functions (i.e., sine and cosine functions).

In order to analyze the geometrical symmetry properties, we partition the omnimage and pano-mapping table into eight equal parts as shown in Fig. 3. In Fig. 3(b), the pano-mapping table is partitioned into eight parts, each part has an angle

interval of  $\pi/4$ . In Fig. 3(a), the omni-image is partitioned into eight equal sectors by four straight lines  $X$ -axis,  $Y$ -axis,  $y=x$  and  $y=-x$ , these straight lines intersect at the circular center of the omni-image. The partitioned parts in an omni-image are omni-image sectors, denoted as  $S_k$  ( $k=0,1,\dots,7$ ) in Fig. 3(a); and the partitioned parts in pano-mapping table are pano-mapping table sectors, denoted as  $S'_k$  ( $k=0,1,\dots,7$ ) in Fig. 3(b). For the convenience of geometric symmetry deduction, we set the origin of an omni-image's coordinate system at the center of the omni-image, as is shown in Fig. 3(a), and we describe the proposed method based on this omni-image origin setting. When implementing the proposed method, we need to perform a coordinate system transformation for the omni-image.

**Proposition 1:** Entries that have the same elevation angle in a pano-mapping table correspond to a circle of pixels in an omni-image, and the circle center is the center of the omni-image.

**Proof:** Suppose there are  $K$  ( $K \geq 2$ ) entries that have the same elevation angle in pano-mapping table, their azimuth angle  $\theta$  indices are  $i_{-k}$  ( $k=0,1,\dots,K-1$ ), and their elevation angle  $\rho$  indices are  $j_{-k}$  ( $k=0,1,\dots,K-1$ ).

Since  $\sin^2 \theta + \cos^2 \theta = 1$ . So, for  $k=0,1,\dots,K-1$  there exists:

$$\begin{aligned} & \mu_{i_{-k},j_{-k}}^2 + \nu_{i_{-k},j_{-k}}^2 \\ &= r_{j_{-k}}^2 \times \cos^2 \theta_{i_{-k}} + r_{j_{-k}}^2 \times \sin^2 \theta_{i_{-k}} \\ &= r_{j_{-k}}^2 \times (\cos^2 \theta_{i_{-k}} + \sin^2 \theta_{i_{-k}}) \\ &= r_{j_{-k}}^2 \end{aligned} \quad (2)$$

Equation (1) tells us that:

$$r_{j_{-k}} = \sum_{n=0}^4 (a_n \times \rho_{j_{-k}}^n) \quad (3)$$

Substituting Equation (3) into Equation (2), for  $k=0,1,\dots,K-1$  we have:

$$\mu_{i_{-k},j_{-k}}^2 + \nu_{i_{-k},j_{-k}}^2 = \left( \sum_{n=0}^4 (a_n \times \rho_{j_{-k}}^n) \right)^2 \quad (4)$$

Since the entries have the same elevation angle  $\rho$ , so there exists:

$$\mu_{i_{-0},j_{-0}}^2 + \nu_{i_{-0},j_{-0}}^2 = \mu_{i_{-1},j_{-1}}^2 + \nu_{i_{-1},j_{-1}}^2 = \mu_{i_{-2},j_{-2}}^2 + \nu_{i_{-2},j_{-2}}^2 = \dots \quad (5)$$

As we know from the definition of a pano-mapping table, entry values  $(\mu_{i_j}, \nu_{i_j})$  denote the coordinates of a pixel in an omni-image. According to Equation (5), pixels  $P_k$  ( $k=0,1,\dots,K-1$ ) lie on the same circle in an omni-image, and the circle center is the center of the omni-image. Therefore, the proposition is proven. ■

For example, entries  $P'_m$  ( $m=0,1,2,3,4,5,6,7$ ) in Fig. 3(b) have the same elevation angle, and their corresponding pixels in an omni-image are  $P_m$  ( $m=0,1,2,3,4,5,6,7$ ) in Fig. 3(a), and pixels  $P_m$  ( $m=0,1,2,3,4,5,6,7$ ) lie on the same circle, centered at the center of the omni-image.

### 3.2 Geometric symmetry deduction on an omni-image

Based on the partitioned omni-image, we deduce the geometric symmetry properties. In Fig. 4, consider a pixel  $P_0$  in an omni-image sector  $S_0$ , there are pixels  $P_1, P_2, P_3, P_4, P_5, P_6, P_7$  in omni-image sectors  $S_1, S_2, S_3, S_4, S_5, S_6, S_7$  separately, where: (a)  $P_1$  is the point symmetric to  $P_0$  with respect to (w.r.t.) the line  $y=x$ ; (b)  $P_2$  is the point symmetric to  $P_1$  around the  $Y$ -axis; (c)  $P_3$  is the point symmetric to  $P_2$  w.r.t. the line  $y=-x$ ; (d)  $P_4$  is the point symmetric to  $P_3$  around the  $X$ -axis; (e)  $P_5$  is the point symmetric to  $P_4$  w.r.t. the line  $y=x$ ; (f)  $P_6$  is the point symmetric to  $P_5$  w.r.t. the  $Y$ -axis; (g)  $P_7$  is the point symmetric to  $P_6$  w.r.t. the line  $y=-x$ .

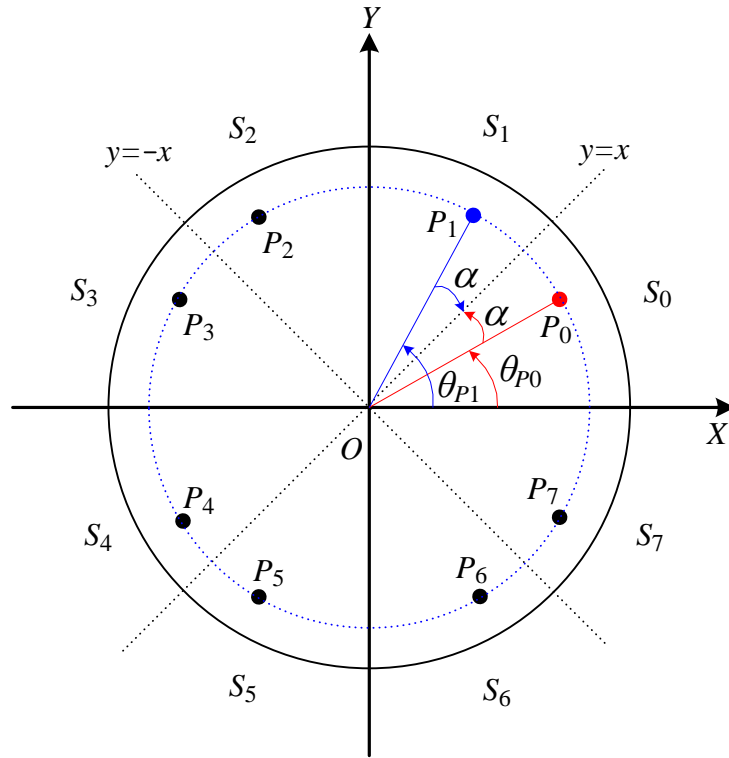


Fig. 4 Geometrical symmetry deduction on an omni-image

**Proposition 2:** In Fig. 4, suppose the coordinates of pixel  $P_0$  are  $(x_0, y_0)$ , then the coordinates of pixels  $P_m$  ( $m=0,1,2,3,4,5,6,7$ ) can be computed as:

$$\begin{cases} P_0 = (x_0, y_0) \\ P_1 = (y_0, x_0) \\ P_2 = (-y_0, x_0) \\ P_3 = (-x_0, y_0) \\ P_4 = (-x_0, -y_0) \\ P_5 = (-y_0, -x_0) \\ P_6 = (y_0, -x_0) \\ P_7 = (x_0, -y_0) \end{cases} \quad (6)$$

**Proof:** Suppose the angle between  $X$ -axis and  $\overline{OP_0}$  is  $\theta_{P_0}$ , the angle between  $X$ -axis and  $\overline{OP_1}$  is  $\theta_{P_1}$ . Since  $\theta_{P_0} + \alpha = \pi/4$ , we have:

$$\alpha = \pi/4 - \theta_{P_0} \quad (7)$$

From Fig. 4 it follows that:

$$\theta_{P_1} = \theta_{P_0} + \alpha + \alpha \quad (8)$$

Substituting Equation (7) into Equation (8), we obtain:

$$\theta_{P_1} = \pi/2 - \theta_{P_0} \quad (9)$$

If the coordinate values of pixel  $P_1$  are  $(x_1, y_1)$ , then:

$$\begin{cases} x_1 = r_{P_1} \times \cos \theta_{P_1} \\ y_1 = r_{P_1} \times \sin \theta_{P_1} \end{cases} \quad (10)$$

Since,

$$\begin{cases} x_0 = r_{P_0} \times \cos \theta_{P_0} \\ y_0 = r_{P_0} \times \sin \theta_{P_0} \end{cases} \quad (11)$$

Substituting Equation (9) into Equation (10) yields:

$$\begin{cases} x_1 = r_{P_1} \times \cos \theta_{P_1} = r_{P_1} \times \cos(\pi/2 - \theta_{P_0}) = r_{P_1} \times \sin \theta_{P_0} \\ y_1 = r_{P_1} \times \sin \theta_{P_1} = r_{P_1} \times \sin(\pi/2 - \theta_{P_0}) = r_{P_1} \times \cos \theta_{P_0} \end{cases} \quad (12)$$

Since pixels  $P_0$  and  $P_1$  are symmetric points about line  $y=x$ , which means  $r_{P_0} = r_{P_1}$ . Thus, based on Equations (11) and (12), we have:

$$\begin{cases} x_1 = r_{P_1} \times \sin \theta_{P_0} = r_{P_0} \times \sin \theta_{P_0} = y_0 \\ y_1 = r_{P_1} \times \cos \theta_{P_0} = r_{P_0} \times \cos \theta_{P_0} = x_0 \end{cases} \quad (13)$$

Thus, the coordinates of pixel  $P_1$  can be denoted as  $(y_0, x_0)$ .

Suppose the coordinate values of pixel  $P_2$  are  $(x_2, y_2)$ , since  $P_2$  and  $P_1$  are symmetric points w.r.t. the  $Y$ -axis, so  $x_2 = -x_1$  and  $y_2 = y_1$ , after substituting into Equation (13) we obtain:

$$\begin{cases} x_2 = -y_0 \\ y_2 = x_0 \end{cases} \quad (14)$$

Thus, the coordinates of pixel  $P_2$  can be denoted by  $(-y_0, x_0)$ .

A similar method can be used on pixels  $P_3, P_4, P_5, P_6, P_7$ . This proves the proposition. ■

### 3.3 Geometrical symmetry deduction on a pano-mapping table

For the eight symmetric pixels  $P_m (m=0,1,2,3,4,5,6,7)$  shown in Fig. 4, we analyze their mapping entries  $P'_m (m=0,1,2,3,4,5,6,7)$  in the pano-mapping table separately. Fig. 5 illustrates the geometric symmetry properties in the pano-mapping table.

**Proposition 3:** For the eight symmetrical pixels  $P_m (m=0,1,2,3,4,5,6,7)$  shown in Fig. 4, and their mapping entries  $P'_m (m=0,1,2,3,4,5,6,7)$  in pano-mapping table in Fig. 5, suppose that the coordinate of  $P_0$  is  $(x_0, y_0)$ , the angle between



the  $X$ -axis and  $\overline{OP_0}$  is  $\theta_{P_0}$  in Fig. 4, then the azimuth angle and elevation angle of entries  $P_m'$  ( $m=0,1,2,3,4,5,6,7$ ) in Fig. 5 are  $\theta_{P_m}'$  and  $\rho_{P_m}'$ . Where:

$$\sum_{n=0}^4 (a_n \times \rho_{P_m}'^n) = \sqrt{x_0^2 + y_0^2} \quad (m=0,1,2,3,4,5,6,7) \quad (15)$$

and,

$$\theta_{P_m}' = \begin{cases} m \times \pi / 4 + \theta_{P_0} & \text{if } m=0,2,4,6 \\ (m+1) \times \pi / 4 - \theta_{P_0} & \text{if } m=1,3,5,7 \end{cases} \quad (16)$$

**Proof:** Following Proposition 2, we substitute Equation (6) into Equation (4) giving us:

$$x_0^2 + y_0^2 = \left( \sum_{n=0}^4 (a_n \times \rho_{P_m}'^n) \right)^2 \quad (m=0,1,2,3,4,5,6,7) \quad (17)$$

Based on Equation (17), Equation (15) is proven. Now, we prove that Equation (16) is true. Let us consider the case when  $m=0$ , which corresponds to pixel  $P_0$  in Fig. 4 and entry  $P_0'$  in Fig. 5. For pixel  $P_0$ , there exists:

$$\theta_{P_0} = \arctg \frac{y_0}{x_0} \quad (18)$$

Suppose the  $i, j$  indices of entry  $P_0'$  in the pano-mapping table (Fig. 5) are  $i_{P_0}$  and  $j_{P_0}$ . Following Equation (1) we have:

$$\begin{cases} \mu_{i_{P_0}, j_{P_0}} = r_{j_{P_0}} \times \cos \theta_{i_{P_0}} \\ \nu_{i_{P_0}, j_{P_0}} = r_{j_{P_0}} \times \sin \theta_{i_{P_0}} \end{cases} \quad (19)$$

Where,

$$\theta_{i_{P_0}} = \theta_{P_0}' \quad (20)$$

Since entry  $P_0'$  in the pano-mapping table (Fig. 5) is mapped to pixel  $P_0$  in the omni-image (Fig. 4), entry value of  $P_0'$  is the same as the coordinates of pixel  $P_0$ , which means:

$$\begin{cases} \mu_{i_{P_0}, j_{P_0}} = y_0 \\ \nu_{i_{P_0}, j_{P_0}} = x_0 \end{cases} \quad (21)$$

Resolving Equations (18), (19), (20) and (21) yields:

$$\theta_{P_0}' = \theta_{P_0} = 0 \times \pi / 4 + \theta_{P_0} \quad (22)$$

Thus, Equation (16) is true when  $m=0$ .

Let us consider the case when  $m=1$ , which corresponds to pixel  $P_1$  in Fig. 4 and entry  $P_1'$  in Fig. 5. For pixel  $P_1$ , according to Equation (6), the coordinate of  $P_1$  is  $(y_0, x_0)$ . Thus,

$$\theta_{P_1} = \arctg \frac{x_0}{y_0} \quad (23)$$

Suppose the  $i, j$  indices of entry  $P_1'$  in the pano-mapping table (Fig. 5) are  $i_{P_1}$  and  $j_{P_1}$ . Following Equation (1) we have:

$$\begin{cases} \mu_{i_{P_1}, j_{P_1}} = r_{j_{P_1}} \times \cos \theta_{i_{P_1}} \\ \nu_{i_{P_1}, j_{P_1}} = r_{j_{P_1}} \times \sin \theta_{i_{P_1}} \end{cases} \quad (24)$$

Where,

$$\theta_{i_{P_1}} = \theta'_{P_1} \quad (25)$$

Since the entry  $P'_1$  in the pano-mapping table (Fig. 5) is mapped to pixel  $P_1$  in the omni-image (Fig. 4), coordinates of  $P'_1$  is the same as  $P_1$ , implying:

$$\begin{cases} \mu_{i_{P_1}, j_{P_1}} = x_0 \\ \nu_{i_{P_1}, j_{P_1}} = y_0 \end{cases} \quad (26)$$

Resolving Equations (24), (25) and (26), yields:

$$ctg(\theta'_{P_1}) = \frac{x_0}{y_0} \quad (27)$$

According to Fig. 4 and Fig. 5, we know that  $0 \leq \theta_{P_0}, \theta_{P_1}, \theta'_{P_1} \leq \pi/2$ . From Equations (18) and (27) it follows that:

$$\theta'_{P_1} = \pi/2 - \theta_{P_0} = (1+1) \times \pi/4 - \theta_{P_0} \quad (28)$$

Thus, Equation (16) is true when  $m=1$ .

A similar method can be used for  $m=2,3,4,5,6,7$ . This proves the proposition. ■

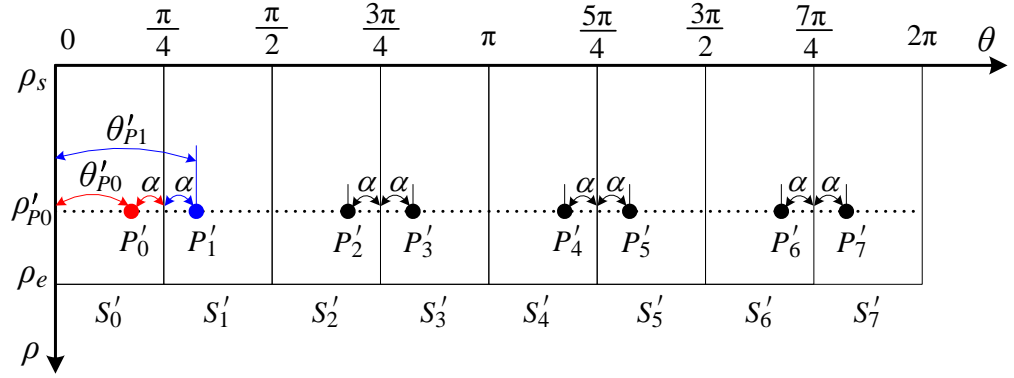


Fig. 5 Geometric symmetry deduction on pano-mapping table

## 4. Omni-images unwarping based on a one-eighth pano-mapping table

### 4.1 Creating a one-eighth pano-mapping table

In order to reduce the size of the pano-mapping table, we discuss how to utilize the geometric symmetry properties that exist in an omni-image and a pano-mapping table. Fig. 6 illustrates the one-eighth pano-mapping table.

We divide the range  $\pi/4$  rad ( $45^\circ$ ) (i.e., one-eighth of  $2\pi$  rad ( $360^\circ$ )) of azimuth angles equally into  $L$  units, where  $L = \left\lceil \frac{M}{8} \right\rceil$  and  $M$  is the number of azimuth angle units for dividing range  $2\pi$  rad ( $360^\circ$ ) in Equation (1). Thus:

$$\theta_{T_i} = i \times [(\pi/4)/L] \quad \text{for } i=0,1,2,\dots,L-1 \quad (29)$$

Then, the range of elevation angles (from  $\rho_s$  to  $\rho_e$ ) is divided into  $N$  units, which can be described as:

$$\rho_{T\_j} = j \times [(\rho_e - \rho_s) / N] + \rho_s \quad \text{for } j = 0, 1, 2, \dots, N-1 \quad (30)$$

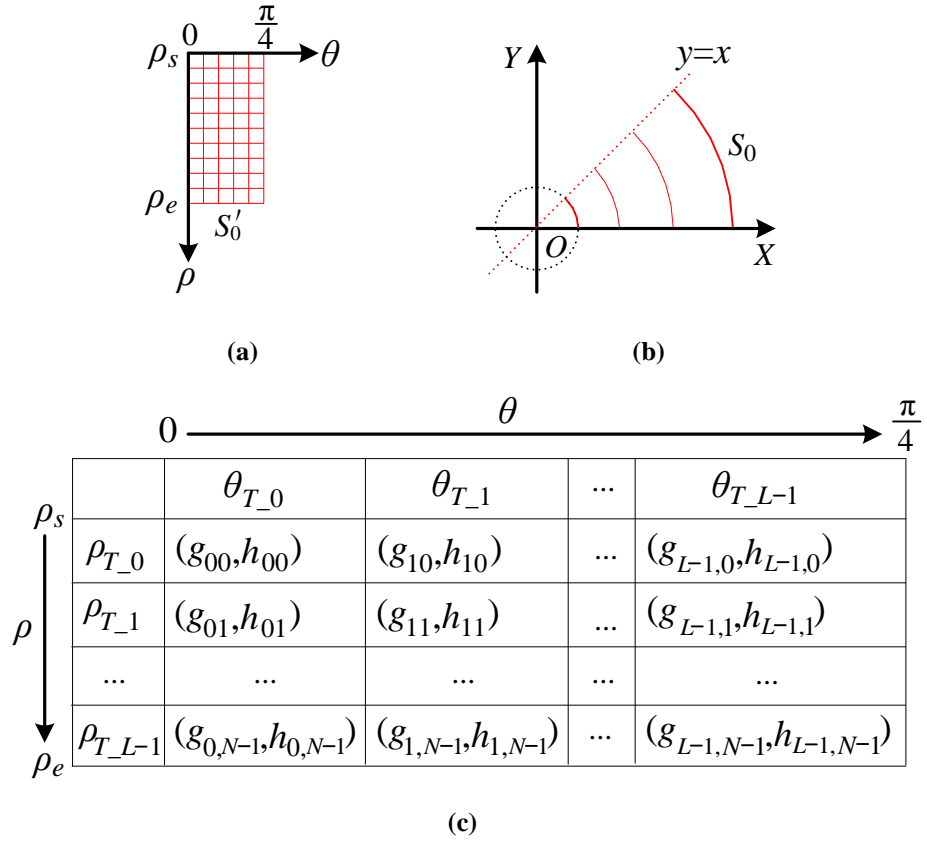
Entries in the one-eighth pano-mapping table (Fig. 6(c)) correspond directly to pixel coordinates of the omni-image sector  $S_0$  (Fig. 6(b)), the coordinate computation formula is:

$$\begin{cases} g_{i,j} = r_j \times \cos \theta_{T\_i} \\ h_{i,j} = r_j \times \sin \theta_{T\_i} \end{cases} \quad (31)$$

where,

$$r_j = \sum_{n=0}^4 (a_n \times \rho_{T\_j}^n) \quad (32)$$

With  $(a_0, a_1, a_2, a_3, a_4)$  sharing the same value and interpretation as those in Equation (1).



**Fig. 6** One-eighth omni-image and one-eighth pano-mapping table creation. a Azimuth angle of the one-eighth pano-mapping table ranges from 0 to  $\pi/4$ ; b One-eighth of an omni-image whose azimuth angle ranges from 0 to  $\pi/4$ ; c One-eighth pano-mapping table created

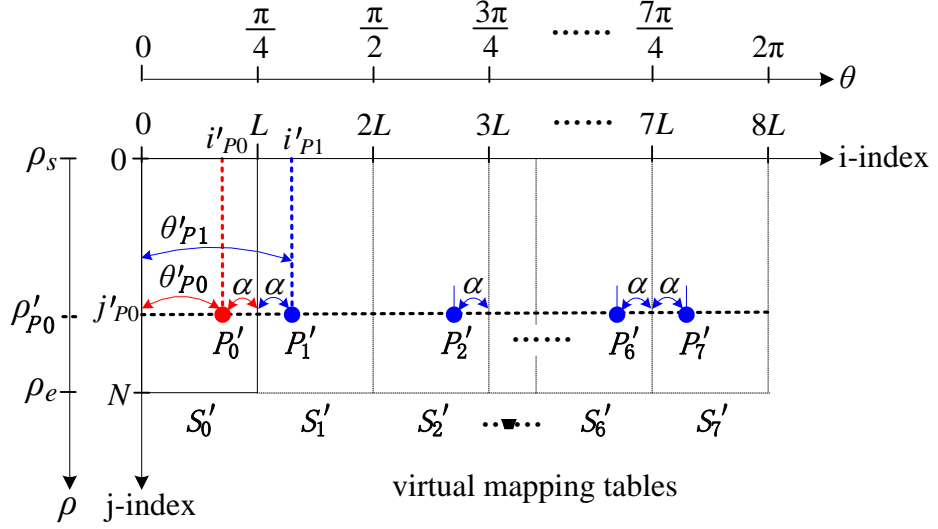


Fig. 7 Reusing the one-eighth pano-mapping table to create “virtual mapping tables”

## 4.2 Reusing the one-eighth pano-mapping table based on geometric symmetry

After creating the one-eighth pano-mapping table, we can find that it is easy to unwarp the first omni-image sector  $S_0$ . However, how can we unwarp the remaining seven omni-image sectors (i.e. sectors  $S_1, S_2, S_3, S_4, S_5, S_6, S_7$ )? The answer is reusing the created one-eighth pano-mapping table based on geometric symmetry.

Fig. 7 illustrates the idea behind this reusing approach. We create a “virtual mapping table” for each of the remaining seven omni-image sectors  $S_1, S_2, S_3, S_4, S_5, S_6, S_7$ , and denote these “virtual mapping tables” as  $VMP_1, VMP_2, VMP_3, VMP_4, VMP_5, VMP_6, VMP_7$  separately. Accordingly, the one-eighth pano-mapping table created for omni-image sector  $S_0$  is a “real mapping table ( $RMP$ )” that is stored in computer memory. We discuss the method for creating “virtual mapping tables”  $VMP_k$  ( $k=1, 2, 3, \dots, 7$ ) in Algorithm 1.

**Algorithm 1.** Creating “virtual mapping tables”  $VMP_k$  ( $k=1, 2, 3, \dots, 7$ ) based on one-eighth pano-mapping table  $RMP$ .

**Step 1.** Define the size of each “virtual mapping table” to be the same as  $RMP$ , i.e., the two dimensions have  $L \times N$  entries for each “virtual mapping table”  $VMP_k$  ( $k=1, 2, 3, \dots, 7$ ).

**Step 2.** Define the corresponding azimuth angle range of  $VMP_k$  from  $\pi/4 \times k$  to  $\pi/4 \times (k+1)$ , and elevation angle range from  $\rho_s$  to  $\rho_e$ . In order to ensure sequential continuity of i-indices between the created one-eighth pano-mapping table  $RMP$  and the seven “virtual mapping tables”  $VMP_k$  ( $k=1, 2, 3, \dots, 7$ ), we define the i-index of  $VMP_k$  ( $k=1, 2, 3, \dots, 7$ ) starting from  $L \times k$  and ending at  $L \times k + L - 1 = L \times (k+1) - 1$  (since the i-index length of each “virtual mapping table” is  $L$ ). For example, the i-index of  $VMP_1$  starts from  $L$  and ends at  $L \times 2 - 1$ , the i-index of  $VMP_2$  starts from  $L \times 2$  and ends at  $L \times 3 - 1$ .

**Step 3.** Fill in the entries in “virtual mapping tables”  $VMP_k$  ( $k=1,2,3,\dots,7$ ). For each entry (say  $P_0'$ ) in  $RMP$  (see Fig. 7), do the following operations:

**Substep 3.1.** Suppose the i-index and j-index of  $P_0'$  are  $i_{P_0}'$  and  $j_{P_0}'$ , the azimuth angle and elevation angle of  $P_0'$  are  $\theta_{P_0}'$  and  $\rho_{P_0}'$ . Substituting into Equations (29) and (30), there exists:

$$\theta_{P_0}' = i_{P_0}' \times [(\pi/4)/L] \quad (33)$$

and

$$\rho_{P_0}' = j_{P_0}' \times [(\rho_e - \rho_s)/N] + \rho_s \quad (34)$$

**Substep 3.2.** Suppose  $P_k'$  ( $k=1,2,3,\dots,7$ ) in “virtual mapping tables”  $VMP_k$  ( $k=1,2,3,\dots,7$ ) are geometrical symmetry entries of  $P_0'$ , and the i-index and j-index of  $P_k'$  ( $k=1,2,3,\dots,7$ ) are  $i_{P_k}'$  and  $j_{P_k}'$ , the azimuth angle and elevation angle of  $P_k'$  are  $\theta_{P_k}'$  and  $\rho_{P_k}'$ . Substituting into Equations (29) & (30), we have:

$$\theta_{P_k}' = i_{P_k}' \times [(\pi/4)/L] \quad \text{for } k=1,2,\dots,7 \quad (35)$$

and

$$\rho_{P_k}' = j_{P_k}' \times [(\rho_e - \rho_s)/N] + \rho_s \quad \text{for } k=1,2,\dots,7 \quad (36)$$

Following Equations (15) and (16) in Proposition 3, and resolving Equations (33), (34), (35) and (36) yields:

$$i_{P_k}' = \begin{cases} k \times L + i_{P_0}' & \text{if } k=2,4,6 \\ (k+1) \times L - i_{P_0}' & \text{if } k=1,3,5,7 \end{cases} \quad (37)$$

and

$$j_{P_k}' = j_{P_0}' \quad \text{for } k=1,2,\dots,7 \quad (38)$$

**Substep 3.3.** Fill the seven entries  $P_k'$  ( $k=1,2,3,\dots,7$ ). Suppose the entry values of  $P_0'$  are  $(g_{i'P_0, j'P_0}, h_{i'P_0, j'P_0})$  (note that  $g_{i'P_0, j'P_0}$  and  $h_{i'P_0, j'P_0}$  are already known by Equation (31)). According to Equations (6) in Proposition 2, and Equations (37) and (38), the values of entries  $P_k'$  ( $k=1,2,3,\dots,7$ ) should be calculated using the following equations:

$$\begin{cases} P_1' = (h_{i'P_0, j'P_0}, g_{i'P_0, j'P_0}) \\ P_2' = (-h_{i'P_0, j'P_0}, g_{i'P_0, j'P_0}) \\ P_3' = (-g_{i'P_0, j'P_0}, h_{i'P_0, j'P_0}) \\ P_4' = (-g_{i'P_0, j'P_0}, -h_{i'P_0, j'P_0}) \\ P_5' = (-h_{i'P_0, j'P_0}, -g_{i'P_0, j'P_0}) \\ P_6' = (h_{i'P_0, j'P_0}, -g_{i'P_0, j'P_0}) \\ P_7' = (g_{i'P_0, j'P_0}, -h_{i'P_0, j'P_0}) \end{cases} \quad (39)$$

### 4.3 Unwarping omni-images based on one-eighth pano-mapping table

Given an input omni-image  $G$  and a one-eighth pano-mapping table  $RMP$  with  $L \times N$  entries, we may generate a corresponding generic panoramic image

$Q$  which is  $8L$  pixels in width and  $N$  pixels in height. The algorithm for this unwarping approach is as follows:

**Algorithm 2.** Unwarping omni-image  $G$  into generic panoramic image  $Q$  with the aid of an one-eighth pano-mapping table  $RMP$ .

**Step 1.** Divide the panoramic image  $Q$  into eight equal sub-pano-images in the width direction, with each sub-pano-image sized  $L \times N$ , and denote these sub-pano-images as  $Q_k$  ( $k=0,1,2,3,\dots,7$ ).

**Step 2.** For each entry  $P_0'$  in a one-eighth pano-mapping table  $RMP$ , suppose the the i-index and j-index of  $P_0'$  are  $i_{P_0}'$  and  $j_{P_0}'$ , and the entry values of  $P_0'$  are  $(g_{i_{P_0}',j_{P_0}'}, h_{i_{P_0}',j_{P_0}'})$ . Now, we fill in a pixel color for each of the eight sub-pano-images  $Q_k$  ( $k=0,1,2,3,\dots,7$ ) as follows:

**Substep 2.1.** The first sub-pano-image  $Q_0$  corresponds to the first omni-image sector  $S_0$  of omni-image  $G$ , and we can unwarmp omni-image sector  $S_0$  into sub-pano-images  $Q_0$  based directly on the created one-eighth pano-mapping table  $RMP$ . The method assigns the color values of the pixel  $P_0'$  of omni-image  $G$  at coordinates  $(g_{i_{P_0}',j_{P_0}'}, h_{i_{P_0}',j_{P_0}'})$ , to the pixel  $q_0$  of panoramic image  $Q$  at coordinates  $(i_{P_0}', j_{P_0}')$ .

**Substep 2.2.** The remaining seven sub-pano-images  $Q_k$  ( $k=1,2,3,\dots,7$ ) correspond to omni-image sectors  $S_k$  ( $k=1,2,3,\dots,7$ ) of omni-image  $G$  separately, and we can unwarmp these omni-image sectors  $S_k$  ( $k=1,2,3,\dots,7$ ) into sub-pano-images  $Q_k$  ( $k=1,2,3,\dots,7$ ) based on the “virtual mapping tables”  $VMP_k$  ( $k=1,2,3,\dots,7$ ). The method assigns the color values of pixel  $P_k'$  of omni-image  $G$  at coordinates  $P_k'$ , to the pixel  $q_k$  of panoramic image  $Q$  at coordinates  $(i_{P_k}', j_{P_k}')$ , where  $P_k'$  is calculated using Equation (39),  $i_{P_k}'$  comes from Equation (37) and  $j_{P_k}'$  from Equation (38).

**Substep 2.3.** After all entries in the one-eighth pano-mapping table  $RMP$  are processed, the final  $Q$  is just the panoramic image that is unwarped from omni-image  $G$ .

As we can see in Algorithm 2, the one-eighth pano-mapping table is used to unwarmp one omni-image sector (which is  $\pi/4$  in radian, one-eighth of  $2\pi$ ). On the other hand, when unwarping the other seven omni-image sectors (which are totally  $7\pi/4$  in radian, seven-eighth of  $2\pi$ ), we use Equations (37), (38) and (39) to find the corresponding coordinates for unwarping, and these Equations need about 4 arithmetic operations in CPU. Thus, the proposed method saves seven-eighth pano-mapping table with very few CPU operations.

## 5. Experiments

### 5.1 Omni-image samples

In this experiment, we unwarmp omni-images that are acquired using the parabolic catadioptric omni-camera designed by us in [1]. The omni-camera captures omni-

images that are in 24 bit RGB format, with an effective resolution of  $1888 \times 1888$  for each of the captured omni-image. In order to analyze the performance and the required one-eighth pano-mapping table size at different omni-image resolutions, we scale the captured omni-images to produce  $944 \times 944$ ,  $472 \times 472$  sized omni-images using down-sampling techniques.

The resolutions of the unwarped panoramic images can be defined according to the application requirements. However, in order to maintain the aspect ratio of the image, we define three typical panoramic image resolutions in this experiment, which are  $2560 \times 576$ ,  $1280 \times 288$ ,  $640 \times 144$ .

During the experiment, we capture twenty  $1888 \times 1888$  sized omni-images with the parabolic catadioptric omni-camera; then scale them to get twenty  $944 \times 944$  sized omni-images and twenty  $472 \times 472$  sized omni-images. The images are divided into three groups of omni-image samples, with 20 omni-images in each group having the same resolution.

In the experiment, each omni-image in the three groups is unwarped 1000 times into panoramic images of different image size, including  $2560 \times 576$ ,  $1280 \times 288$  and  $640 \times 144$ , to get an accurate estimate of the unwarping time.

## 5.2 Experimental environment

The experimental scenario is an embedded system for omni-directional robot vision. In this embedded system, a C6000 TMS320DM642 DSP (Digital Signal Processor) from TI (Texas Instruments) corporation is used as the embedded CPU, which is specially designed to optimize image processing performance with a stunning capability of 5760MIPS at a clock rate of 720MHz. There is a 32MB RAM (Random Access Memory) that can be used for image and pano-mapping table storage. The compiler is Code Composer Studio (CCStudio) Version 2.20.18.

## 5.3 Experimental results

### 5.3.1 Mapping table storage reduction

Table 2 illustrates comparison of the proposed one-eighth pano-mapping table with that presented in [16] in terms of mapping table storage size. We define three different sized one-eighth pano-mapping tables (i.e.,  $320 \times 576$ ,  $160 \times 288$  and  $80 \times 144$ ), which correspond to the three different panoramic image sizes (i.e.,  $2560 \times 576$ ,  $1280 \times 288$  and  $640 \times 144$ ). For every entry in the one-eighth pano-mapping table, in total 4 bytes are needed to store the x and y coordinates (2 bytes for each of the x and y coordinates).

As we can see in Table 2, the proposed one-eighth pano-mapping table needs just one-eighth storage space compared with that of Jeng [16]. This is because we can use the geometric symmetry properties of omni-images and pano-mapping tables to infer the correspondence between omni-images and panoramic images for seven-eighths of the unwarping process, with the help of Equations (37), (38) & (39) and Algorithm 2 above.

**Table 2** Mapping table storage of the proposed approach compared to Jeng[16]

Omni-image resolution	Panoramic image resolution	Jeng[16] (Bytes)	Proposed (Bytes)	Reduced Storage Ratio
1888×1888	2560×576	5,898,240	737,280	0.875
944×944	2560×576			
472×472	2560×576			
1888×1888	1280×288	1,474,560	184,320	0.875
944×944	1280×288			
472×472	1280×288			
1888×1888	640×144	368,640	46,080	0.875
944×944	640×144			
472×472	640×144			
Reduced Storage Ratio: 0.875				

**Table 3** Speed of the proposed approach compared to Jeng[16]

Omni-image resolution	Panoramic image resolution	Jeng[16] (ms)	Proposed (ms)	Improvement Ratio
1888×1888	2560×576	1243.9	544.7	2.28
944×944	2560×576	1105.7	365.9	3.02
472×472	2560×576	1008.1	276.4	3.65
1888×1888	1280×288	325.2	162.6	2.00
944×944	1280×288	288.6	107.7	2.68
472×472	1280×288	254.1	71.1	3.57
1888×1888	640×144	87.4	49.8	1.76
944×944	640×144	74.2	31.5	2.36
472×472	640×144	64.5	19.3	3.34
Average Improvement Ratio: 2.74				

### 5.3.2 Omni-image unwarping speed comparison

In the proposed one-eighth pano-mapping table method, only one omni-image sector can be unwarped directly using the mapping table created, while the other seven omni-image sectors can only be unwarped based on Equations (37), (38), (39) and Algorithm 2 indirectly, which need about 4 extra CPU arithmetic operations for each pixel.

Thus, it may appear that the proposed method will slow down the unwarping to some extent. However, experimental results shown in Table 3 give the opposite answer. According to the experimental results, we find that the proposed one-eighth pano-mapping table makes the unwarping speed 2.74 times faster on the average than the method in Jeng [16].

The speedup of proposed method comes mainly from the reduced pano-mapping table access. As we know, in embedded system implementation, memory access is a time-consuming operation, it costs much more CPU cycles to fetch data from external memory than performing CPU arithmetic operations [17,18]. Although we need about 4 extra CPU arithmetic operations to unwarped each pixel

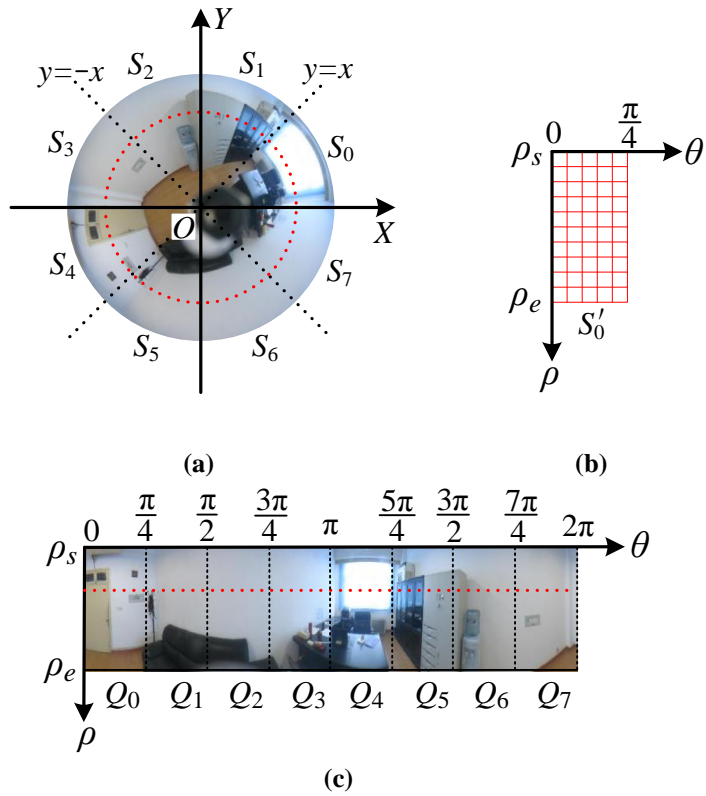


in the seven omni-image sectors, we do not need to read data from the pano-mapping table which is stored in external or DSP cache memory.

### 5.3.3 Omni-image, one-eighth pano-mapping table and panoramic image

Fig. 8 illustrates a captured omni-image, the one-eighth pano-mapping table and panoramic image. As is shown in Fig. 8(a), the omni-image is divided into eight sectors by four straight lines  $X$ -axis,  $Y$ -axis,  $y = x$  and  $y = -x$ , these sectors are denoted by  $S_0, S_1, S_2, S_3, S_4, S_5, S_6, S_7$ . In Fig. 8(b), a one-eighth pano-mapping table is created, which directly maps the omni-image sector  $S_0$  to panoramic image sector  $Q_0$  shown in Fig. 8(c). The other seven omni-image sectors (i.e.,  $S_1, S_2, S_3, S_4, S_5, S_6, S_7$ ) are unwarped to panoramic image sectors (i.e.,  $Q_1, Q_2, Q_3, Q_4, Q_5, Q_6, Q_7$ ) based on Equations (37), (38), (39) and Algorithm 2, which is derived from the geometric symmetry properties of the omni-image and the pano-mapping table.

In order to compare the quality of achieved panoramic images, we unwarp omni-images using both the proposed method and Jeng [16] method, the results are shown in Fig. 9. In this figure, the first column (Fig. 9(a)) are omni-images to be unwarped, their resolution is  $1888 \times 1888$ ; the second and third columns (Fig. 9(b), (c)) are panoramic images achieved with the proposed method and Jeng [16] method respectively, which have same resolution of  $1280 \times 288$ . Based on geometric symmetry, the proposed method recovers identical mapping data as those in Jeng's pano-mapping table [16], which results in the same panoramic images in Fig. 9(b) and Fig. 9(c), showing that the proposed method does not degrade image quality.



**Fig. 8** Omni-image, one-eighth pano-mapping table and panoramic image. a Omni-image to be unwarped; b One-eighth pano-mapping table; c Panoramic image achieved by unwarping the omni-image with proposed one-eighth pano-mapping table



(a)



(b)



(c)

**Fig. 9** Omni-image unwarping results of proposed method and Jeng [16] method. a Omni-images to be unwarping; b Panoramic images achieved with proposed method; c Panoramic images achieved with Jeng [16] method

## 6. Conclusions

A pano-mapping table size reduction method is proposed for omni-image unwarping, which is based on observing geometric symmetry properties of omni-images and the pano-mapping table. Experimental results demonstrate that the proposed method reduces seven-eighths of the pano-mapping table size and improves omni-image unwarping speed by 2.74 times. This work assumes that the omni-camera is

well aligned, which makes the geometric symmetry relationship possible. In the future work, we will study methods for reducing pano-mapping table size when an omni-camera is misaligned.

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