Diagnostic Medical Image Processing Reconstruction





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- 1 C-Arm Computed Tomography
 - Historical Notes
 - Principle of C-arm CT
 - Efficient Projection of Voxels
 - Take Home Messages
 - Further Readings

Historical notes



- C-arm CT was introduced as a commercial product in 1999.
- Reconstruction module was just an add on feature that time.
- Today C-arm CT became standard and a driving force of innovation in X-ray imaging.
- The major problem was the mathematical characterization and the calibration of the acquisition geometry.
- The breakthrough idea was the usage of homogeneous coordinates and of (3 × 4)-projection matrices that were standard in computer vision since the early 90-ies.
- In 2000 the first hardware accelerators (DSP's) for C-arm CT were shipped.
- Nowadays hardware accelerated C-arm CT is standard, and still in the major focus of research.

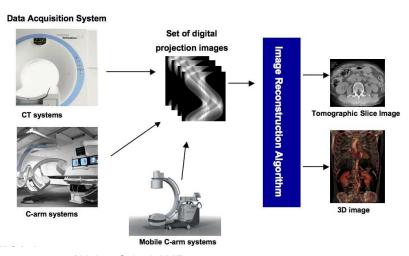




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Basic Idea



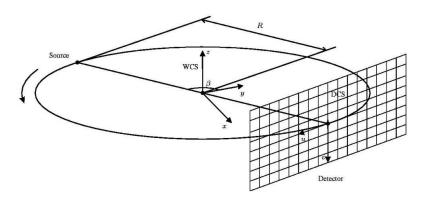


: Image courtesy of Holger Scherl, LME



Basic Idea





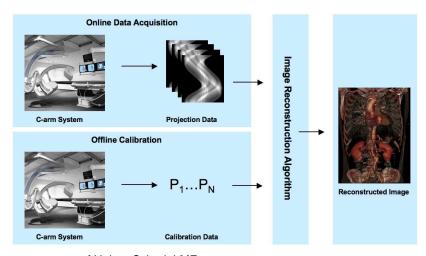
WCS World Coordinate System
DCS Detector Coordinate System

: Image courtesy of Holger Scherl, LME



Basic Idea





: Image courtesy of Holger Scherl, LME



Principle of C-arm CT



$$\mathcal{F}_{i}\left(\begin{array}{c} X \\ Y \\ Y \end{array}\right) = \left(\begin{array}{c} X \\ Y \\ Y \end{array}\right) \mathcal{O}\left(\begin{array}{c} X/Y \\ Y/Y \\ Y/Y \end{array}\right)$$

- Input 2-D X-ray projection images, projection matrices.
- Step 1 Perform proper weighting scheme on images.
- Step 2 Filter the projection images along horizontal lines.
- Step 3 Perform a weighted back-projection along projection rays.
- Output Reconstructed volume



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Volume Elements: Voxels



The back-projection is done voxel-driven, i.e. each voxel of the $(N \times N \times N)$ volume is projected into the image plane for each projection image.

- The first element of the volume has the coordinates $\mathbf{v} = (v_1, v_2, v_3, 1)^T$
- The increment in *x*-direction is denoted by $\Delta x = (\Delta x, 0, 0, 1)^T$.
- The increment in *y*-direction is denoted by $\Delta y = (0, \Delta y, 0, 1)^T$.
- The increment in *z*-direction is denoted by $\Delta z = (0, 0, \Delta z, 1)^T$.



Back-Projection Algorithm



For a given set of projection matrices $P_n \in \mathbb{R}^{3\times 4}$, $n = 1, 2, \dots, N_v$, we get the following back-projection algorithm:

FOR
$$n = 1, 2, ..., N_v$$

FOR $m = 1, 2, ..., N$

FOR $l = 1, 2, ..., N$

$$p = P_n(\mathbf{v} + k\Delta \mathbf{x} + l\Delta \mathbf{y} + m\Delta \mathbf{z})$$

$$x = p_1/p_3$$

$$y = p_2/p_3$$
Volume[m][l][k] = Volume[m][l][k] + $\frac{1}{p_3^2}$ filtered_image(x, y)

Efficiency Considerations



Due to the linearity properties we can write:

$$\boldsymbol{\rho} = \boldsymbol{P}_n(\boldsymbol{v} + \boldsymbol{k} \cdot \Delta \boldsymbol{x} + \boldsymbol{I} \cdot \Delta \boldsymbol{y} + \boldsymbol{m} \cdot \Delta \boldsymbol{z}) \tag{1}$$

$$= P_n \mathbf{v} + k \underbrace{P_n \cdot \Delta \mathbf{x}}_{\mathbf{p}_x} + I \underbrace{P_n \cdot \Delta \mathbf{y}}_{\mathbf{p}_y} + m \underbrace{P_n \cdot \Delta \mathbf{z}}_{\mathbf{p}_z}$$
(2)

We conclude:

- The vector $P_n v$ is constant for all iterations.
- The values of \boldsymbol{p}_x , \boldsymbol{p}_y , and \boldsymbol{p}_z are constant for all iterations.
- The matrix vector product can be rewritten to get a more efficient back-projection.



Back-Projection Algorithm



```
compute: \mathbf{v}_n, \mathbf{p}_x, \mathbf{p}_y, and \mathbf{p}_z

FOR m=1,2,\ldots,N

FOR l=1,2,\ldots,N

\begin{bmatrix} \mathbf{p} = \mathbf{v}_n + k\mathbf{p}_x + l\mathbf{p}_y + m\mathbf{p}_z \\ x = p_1/p_3 \\ y = p_2/p_3 \\ \text{Volume}[m][l][k] = \text{Volume}[m][l][k] + \frac{1}{p_s^2} \text{filtered\_image}(x,y) \end{bmatrix}
```

Efficient Ratio Computation



- The most time consuming operation in the inner loop is the ratio computation.
- The projection geometry is computed in the calibration step. The values of p_3 and its range are know.
- Ratio $1/p_3$ can be efficiently computed by:
 - regression function (approx. errors known in advance)
 - look-up table



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Take Home Messages



- Acquisition Geometry in C-arm systems is characterized by projection matrices.
- Calibration is done offline and by technicians.
- Voxel-driven back-projection more or less determines the complexity of reconstruction.
- Hardware oriented implementation required.





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Further Readings



- Cone beam reconstruction was first introduced in 1984 by this paper:
 - L.A. Feldkamp, L.C. Davis and J.W. Kress: Practical cone-beam algorithm, J Opt Soc Am, A6, 1984, p. 612-619
- The usage of homogeneous coordinates for C-arm reconstruction is described in:
 - K. Wiesent, K. Barth, N. Navab, P. Durlak, T. Brunner, O. Schuetz, W. Seissler: Enhanced 3-D-reconstruction algorithm for C-arm systems suitable for interventional procedures, IEEE Transactions on Medical Imaging, 2000 May; Vol. 19, No. 5:391-403