

## Introduction

- Modern medical imaging techniques can produce large amounts of image data
- Transmission of these large datasets can be problematic, especially in interactive applications
- Progressive transmission addresses this concern by reconstructing an image when only part of the data is received, then refining the reconstruction as new information becomes available
- If receivers can recognize the presence or absence of features of interest, they can decide to continue or abort transmission before all the data is received
- The goal of progressive transmission is to allow reconstruction of the most detailed image with as little data as possible
- The general outline of progressive transmission of an image  $A = (a_{IJK})$  is:
  - decompose  $A = \sum_{i=1}^n \bar{A}_i$ ,  $\bar{A}_i$  and  $\bar{A}_j$  disjoint.
  - order  $\{\bar{A}_i\}_{i=1}^n = \{\bar{A}_j\}_{j=1}^n$
  - transmit  $A_1, A_2, A_3, \dots$
  - $A_1; A_1, A_2; A_1, A_2, A_3; \dots$  used for successive approximations of  $A$

## Mathematical Background

### Direct Progressive Transmission

- Individual Best Remaining Region (IBRR) ordering strategy:
 

If  $A_1, A_2, \dots, A_s$  are transmitted, the next,  $A_{s+1}$ , is one of the unsent slices,  $A_j$  for which  $\max_{A_j} ||R(A_1, A_2, \dots, A_s)_{j^{th} slice} - A_j||$  is minimized;  $R$  is a (partial) reconstruction

## Transform Space Progressive Transmission

Algorithm:

1. Compute  $(T(A))_{IJK}$
2. Determine decreasing order of elements  $|T(A)_{IJK}|$ ; retain first  $d\%$  of them
3. Zero remaining (100-d)% of the elements of  $(T(A))_{IJK}$
4. Apply  $T^{-1}$  to modified matrix

This produces an approximate image to  $A$ , incorporating  $d\%$  of the elements of  $(T(A))_{IJK}$

For the illustration below, we have used  $T = \mathcal{F}$

## Data and Methods

- The Fourier ( $\mathcal{F}(A)$ ) method was used with a 3D MRI head data set and compared with the use of IBRR direct optimal strategy with decomposition by slices



Figure 1: Two views of the MRI head test data set (50 slices, each 256x256 pixels).

## Results

### Progressive Imaging: Direct (IBRR)

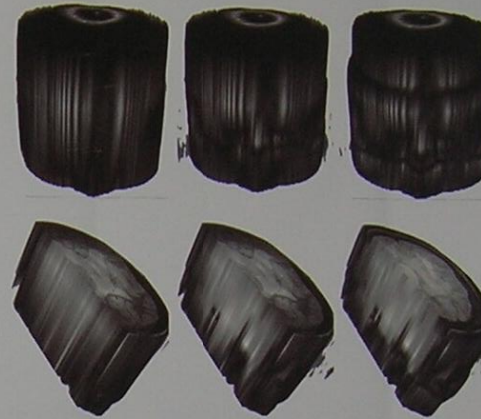


Figure 2: IBRR direct scheme for a slice decomposition of the image in Fig. 1. (a) 8% of data transmitted, (b) 12% transmitted and (c) 20% transmitted.

### Progressive Imaging: Transform Space Algorithm



Figure 3: Fourier transform strategy for decomposition of the image in Fig. 1. (a) 8% of data transmitted, (b) 12% transmitted and (c) 20% transmitted.

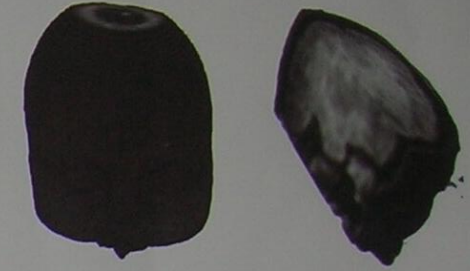


Figure 4: The Fourier transform scheme shows some detail even with only 1% of the data transmitted.

## Conclusions

- The transform space approach to progressive transmission, illustrated here with the Fourier transform:
  - is easy to implement
  - reproduces good internal detail when compared to the IBRR approach
  - permits fast decomposition and reconstruction

## References

1. Baeza, J. Villanueva-Oller, R.J. Villanueva and A.G. Law. Progressive Transmission of Images: Adaptive Best Strategies. To appear: Math. Comp. Modelling.
2. R.A. Brown, A.G. Law, J.R. Mitchell, H. Zhu, I. Baeza, J. Villanueva-Oller and R.J. Villanueva. Progressive Transmission of 3D MR Images: Data- and Transform-Space Strategies. To be presented: Intern. Conf. on Computing, Communications and Control Technologies (CCCT '04), Austin, Texas, August 14-17, 2004.
3. R.A. Brown, H. Zhu and J. R. Mitchell. Distributed Vector Processing of the S-transform for Medical Applications. Proceedings of the Annual IEEE CCECE, 2:1129-1133, 2002.
4. E. Defez, A. Law, J. Villanueva-Oller and R.J. Villanueva. Matrix Cubic Splines for Progressive Transmission of Images. Journal of Math. Imaging and Vision 17:41-53, 2003.
5. H. Zhu, R.A. Brown, R.J. Villanueva, J. Villanueva-Oller, M.L. Lauzon, J.R. Mitchell and A.G. Law. Progressive Imaging: S-transform Order. To appear: J. Austral. Math. Soc. B Series.
6. H. Zhu, B. G. Goodyear, M.L. Lauzon, R.A. Brown, G. Mayer, A.G. Law, L. Mansinha and J.R. Mitchell. A New Local Multiscale Fourier Analysis for MRI. Med. Phys. 30(6): 1134-1141, 2003.
7. H. Zhu, X. Wei, Y. Zhang, G.S. Mayer and J.R. Mitchell. Temporal Texture Analysis of Normal Appearing White Matter in Multiple Sclerosis. Proceedings of the 11th Annual Meeting of ISMRM, p. 227, 2003.
8. R.A. Brown, H. Zhu, J.R. Mitchell, A.G. Law. 3D Progressive Imaging With Feature Selection. To be presented: CISST '04, Las Vegas, Nevada, June 21-24, 2004.

