### A GEOMETRY-AWARE FRAMEWORK FOR COMPRESSING 3D MESH TEXTURES

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#### ABSTRACT

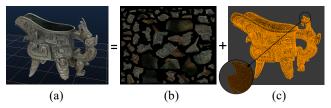
This paper proposes a novel prediction tool for improving the compression performance of texture atlases. This algorithm, called Geometry-Aware (GA) intra coding, takes advantage of the topology of the associated 3D meshes, in order to reduce the redundancies in the texture map. For texture processing, the concept of the conventional intra prediction, used in video compression, has been adapted to consider neighboring information on the 3D surface. We have also studied how this prediction tool can be integrated into a complete coding solution. In particular, a block scanning strategy and a graph-based transform for residual coding have been proposed. Results show that the knowledge of the mesh topology significantly improves the compression efficiency of texture atlases<sup>1</sup>.

Index Terms— Intra prediction, 3D mesh, texture map

## **1** Introduction

With the recent development of 3D scanning technologies, 3D models have been finely detailed. This has made the 3D representation a trending media format for novel applications, such as architectural or historical artifacts presentation, virtual reality, *etc* [1, 2, 3, 4]. As a result, the ability to transmit them easily through networks has attracted great attention in both academia and industry. 3D models commonly consist of a mesh, with geometry information (3D vertices) and its corresponding topology (connectivity among elements), as well as optional attribute information such as normals, colors, *etc.* To make the rendering more realistic, usually, 2D texture maps such as the diffusion, specular and bump maps are applied on mesh surface to present material properties, high frequency details, *etc.* 

The compression of 3D mesh has been widely studied. A survey of such methods can be found in [5]. While the compression of textures from the perspective of rendering systems has been thoroughly studied [6, 7], the texture compression from the perspective of transmission or storage is almost overlooked. The former aims at compressing the texture maps to



**Fig. 1**. (a) A realistic 3D model consists of (b) texture information, mapped onto a (c) triangular mesh.

reduce the memory usage at the run-time and to provide the ability to render directly from the compressed textures loaded in rendering systems. The latter compresses the texture for storage and transmission, *i.e.* to reduce download or disk size. This paper proposes a new framework to compress the texture maps in order to reduce the storage size more efficiently than the traditional methods.

Traditional still image compression schemes, such as JPEG, are often used for storing texture maps [8]. Although such approaches may provide up to 50:1 compression rate [7], they are still less efficient than the conventional intra coding used in video compression standards [9]. To further exploit spatial redundancies, the conventional intra coding methods partition an image into blocks, and use parts of already coded adjacent blocks as references to predict the current block. Afterward, the residual signal between the original block and the predicted block is represented in the transform domain to remove the remaining correlation. Examples of intra coding algorithm integrated in video Coding (AVC) [10] and High Efficiency Video Coding (HEVC) [11].

Adjacent parts of the 3D mesh might not be adjacent in the associated 2D texture maps, even though the texture on the surface of an object seems continuous. An example of 3D model, decomposed into geometry and texture information, is shown in Fig. 1. As can be seen, the texture information can be split into several disconnected patches in a 2D atlas. Consequently, blocks on the patch borders have non-informative neighbors (*i.e.* black areas between the patches). For instance, for block C in Fig. 2, none of the conventional neighboring blocks, namely A and B contains proper texture information for its prediction. Therefore, traditional intra coding methods would result in a poor prediction accuracy.

In this paper, we assume that the mesh is already coded

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**Fig. 2**. The blocks A and B around the border block C are non-informative references.

and available at the decoder. So, we exploit it for finding more relevant references for texture prediction. To this end, for the regions where the conventional reference block is noninformative, such as Fig. 2, the texture information of adjacent areas on the 3D surface is used (Section 2). Due to the fact that the texture consists of several disconnected regions, we also propose a block scanning method based on the knowledge of the mesh surface as an alternative to the regular raster scanning (Section 3). Moreover, a graph transformation is proposed to decorrelate the residual signal of blocks on the border of patches (Section 4).

# 2 Geometry-aware intra prediction

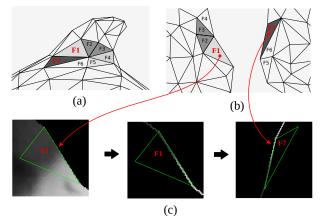
## 2.1 Conventional intra prediction

From high level point of view, intra prediction is a predefined modeling tool with several internal modes that are adjusted with its parameters. These parameters determine texture pattern to be produced by reference pixels from previously coded blocks. Depending on the parameter setting, the selected pattern can either be directional or plain. For example, HEVC uses one row and one column of references (*i.e.* from the left and to the above of a block) to apply a prediction model with 35 internal modes, including the DC, the Planar and 33 angular modes.

In our context, the conventional intra prediction is not able to distinguish between informative and non-informative parts of a texture atlas. Therefore, its use for texture compression produces high energy residual signals on blocks which are positioned on patch borders. This poor prediction performance is due to the inaccuracy of non-informative references. In order to address this problem, the topology of the mesh is proposed to be utilized for finding more correlated references for intra prediction. However, for the texture modeling step, we adopt the same set of 35 intra modes of HEVC.

## 2.2 Proposed intra prediction

Discrete patches on texture atlas can be mapped to continuous 3D texture using mesh triangles, as shown in Fig. 3-(a). The algorithm proposed in this paper uses this information to fill the empty set of references, when the block is positioned on a patch border (Fig. 3-(b)). For this purpose, first, the neighbors of a border block are detected using the mesh connectivity.



**Fig. 3.** Process of copying border references from remote neighbors. A 3D mesh in (a) is mapped into a 2D atlas in (b). According to this mapping, the block F7 can be used as the remote neighbor of F1, hence, its interior border is copied to the exterior border of F1 (c).

Then, if they are already coded, their border pixels are copied to fill the references of the current block. Such neighbors might be remote on the 2D texture atlas, yet, adjacent on the 3D mesh.

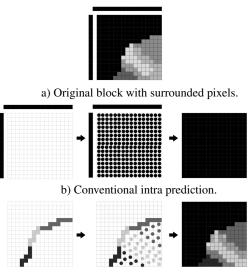
Fig. 3-(c) shows how the proposed algorithm copies the inner border of remote triangles on the border of the current triangle. In some inevitable cases, the proposed reference copying is not possible, since the remote neighbor is not coded yet.

The references that were replaced on the border of the patches with such an approach are irregularly positioned. This is in contrary with the conventional intra prediction algorithm, where the references are regularly placed on the top row and left column. This makes the conventional block prediction challenging. For instance, the block prediction algorithm of HEVC performs a backward projection along with a linear interpolation on the reference pixels in order to produce the prediction values within the block [12]. The formulation of this process requires the reference pixels to be aligned in one row and one column.

To address the above problem, our algorithm integrates a forward reference projection, instead of the regular backward one. This process is shown in Fig. 4 and consists of two steps: 1) forward projection of reference pixels on non-integer positions within a block, 2) interpolation of integer positions using up to four non-integer neighbors. For comparison, Fig. 4 also shows the resulting prediction with the conventional intra prediction algorithm on a border block.

# 3 Geometry-aware block scanning

The use of remote references on border blocks makes the regular raster scanning of blocks inefficient. Indeed, the scanning may require access to remote references that are not yet coded. As discussed, this problem is inevitable due to in-



c) Proposed intra prediction with irregular references.

**Fig. 4**. Block prediction of a border block. Left: set of reference samples. Middle: propagation of reference samples (reference projection). Right: intra prediction (interpolation).

complete data access on the 2D atlas. However, its frequency of occurrence can significantly be reduced by using a smart block scanning that takes advantage of mesh connectivity.

The proposed scanning algorithm starts from an initial block that contains the geometric centroid of the largest patch on the 2D atlas. Once the initial block is coded, its neighboring blocks are checked to choose the next block to be coded. For this purpose, two rules are applied to prioritize neighboring blocks:

**Rule 1:** Candidates with higher number of available neighboring blocks have a higher priority.

**Rule 2:** Among candidates with the same number of available references, those with available reference blocks at above and left have higher priority.

Starting from the centroid, all blocks within the first patch (*i.e.* largest patch) can apply the conventional intra prediction algorithm. The only exception is that sometimes, we may have to use a reference row and a column at bottom and right, respectively. For these blocks, one can simply rotate the block as well as its references, in order to put the reference row and column on their right position. Then, the conventional algorithm can be applied to any block in the first patch. Even the border blocks.

Once all the blocks within the first patch are scanned, the next step is to scan the next patch. To do so, we first detect the triangles positioned on the border of the first patch. Then, their remote neighbor triangles are found in other patches, by using the 3D mesh. In the proposed scanning method, the next patch is selected as the one with the most neighboring pixels on the border.

# 4 Geometry-aware residual coding with graph transform

Conventional residual coding methods usually use the Discrete Cosine Transform (DCT) to compact the information for transmission. Despite its numerous benefits, applying the DCT on the residual signal of border blocks is not efficient. This is due to the fact that the informative part of border residual blocks is not square, and this would result in a large energy on the coefficients in higher frequencies. To address this problem, our geometry-aware residual coding method utilizes the mesh connectivity and detects border blocks to apply a graph-based transform on their residual, called the Graph Fourier Transform (GFT) [13, 14, 15].

Once a border block with the size of  $B_S \times B_S$  is predicted and its residual signal R is calculated, the GFT is performed with the following steps:

Step 1) Constructing a graph for each border block based on its residual data R. Moreover, a mask M is reconstructed from the geometry information of the block to contain its informative pixels coordinates.

**Step 2**) Forming an undirected connected graph  $\mathcal{G} = \{\mathcal{V}, \mathcal{E}, \mathbf{A}\}$  from the masked residual, which consists of a finite number of vertices corresponding to the residual data at position  $\{i, j\}, i, j = 1 \dots B_S$ , such that M(i, j) = 1. The set  $\mathcal{E}$  of edges is formed by using four neighbors around each residual value.

**Step 3**) Constructing an adjacency matrix **A** from the edges in  $\mathcal{G}$ .

**Step 4)** Calculating the degree of each node and construct matrix  $\mathbf{D}$  as a diagonal degree matrix whose *i*-th diagonal element is equal to the sum of the weights of all edges incident to node *i*.

The subtraction of matrix A from **D** form the Laplacian matrix **L**:

$$\mathbf{L} = \mathbf{D} - \mathbf{A},\tag{1}$$

where **L** is a symmetric semi-definitive matrix and can be diagonalized as:

$$\mathbf{L} = \mathbf{U}^{\mathrm{T}} \mathbf{\Lambda} \mathbf{U},\tag{2}$$

where U is the matrix of eigen-vectors and the diagonal matrix  $\Lambda$  consists of eigenvalues. The matrix U is used to compute the unweighted GFT coefficients as:

$$\hat{R} = \mathbf{U}R,\tag{3}$$

and the inverse is computed as:

$$R = \mathbf{U}^T \hat{R}.$$
 (4)

One interest of GFT is that its number of coefficients is equal to the number of informative coordinates in the input residual R. These coefficients are normally quantized and coded using a proper arithmetic coding.

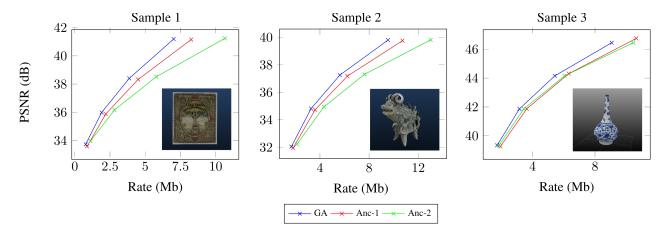


Fig. 5. Rate-PSNR curves of the proposed algorithm (GA) against two configurations of the anchor (Anc) on 3 diffusion maps.

# **5** Experimental Results

We have implemented all the proposed tools in a complete coding solution. This section presents its compression performances in different conditions. The input data comes from [16], which consists of three ancient objects with different maps (normal, diffusion *etc.*). In this experiments, only the diffusion maps that represents the "natural" texture of object are tested.

The proposed Geometry-Aware (GA) algorithm is compared against the conventional intra prediction as the anchor, in terms of Bjontegaard Delta Rate (BD-R) [17]. For this purpose, different configurations were considered for the anchor algorithms. The first configuration (Anc-1) uses the raster scanning and the conventional intra prediction, but applies the GFT on border blocks and the Peak Signal-to-Noise Ration (PSNR) has been calculated only on the informative pixels of the atlas. The second anchor (Anc-2) performs similarly to Anc-1, except that it uses the DCT instead of the GFT on the border blocks.

For simplicity and without loss of generality, the performance evaluation has been carried out under two conditions. First, a united entropy coder based on arithmetic coding has been shared between the proposed and the anchor methods. This entropy coder allows rate calculation of individual syntax elements as well as an entire sequence. Second, a fixed block size partitioning has been used in each configuration. In other words, for each comparison, the entire 2D atlas has been coded with a constant block size. However, the results are provided as the average BD-R gain over different block sizes, namely  $16 \times 16$ ,  $32 \times 32$  and  $64 \times 64$ .

Table 1 compares the defined configurations of the proposed algorithm GA against the two anchor methods, in terms of BD-R. Each negative value indicates the percentage of compression gain achieved by the "GA" configuration against the "Anc" configuration of the corresponding column, when applied on the 3D sample of the corresponding row. Moreover, Fig. 5 demonstrates the rate-distortion curves of different configurations on each test sample. As can be seen, a promising compression gain can be achieved by using the proposed geometry-aware intra coding tools.

Our GA encoding scheme is more complex than the anchors. However, it is not a problem as free view-point applications support asymmetrical compression-decompression scheme (*compress once, decompress many*).

**Table 1.** Performance comparison of the the proposed GAalgorithm against, two anchors, in terms of BD-R (%).

Sample	Anc-1	Anc-2
Sample-1	-16.1%	-29.6%
Sample-2	-11.0%	-23.2%
Sample-3	-17.3%	-19.4%

# 6 Conclusion and future work

In this work, we propose a framework for compressing texture atlases of 3D models. Conventional image compression methods treat atlas of 3D objects simply as 2D signals and do not benefit from their geometry information. In this paper, a pixel prediction method with a proper reference selection and block scanning strategy and an alternative residual transformation are integrated in the conventional intra coding algorithm.

As a future work, one can integrate the proposed algorithm within existing codecs, such as HEVC test Model (HM), in order to evaluate its coding performances on texture maps. This would require normative changes in all three domains of prediction, scan and residual coding. Such experiment allows benefiting from highly optimized tools of HEVC, such as Context Adaptive Binary Arithmetic Coding (CABAC), residual coding, flexible block partitioning *etc*.

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