# Quantization in Relative Gradient Angle Domain For Building Polygon Estimation 

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## Introduction

- Building footprint extraction in remote sensing data benefits many important applications
- Urban planning
- Population estimation
- Convolutional neural networks (CNNs) is powerful but often generate imprecise building morphologies including noisy edges and round corners



## Segmentation CNN

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## Introduction

- In this paper, we propose a method that uses prior knowledge of building corners to create angular and concise building polygons from CNN segmentation outputs


Our method

## Building segmentation probability map



## Block Diagram




Boundary Orientation Relation Set detection (Red)


Histogram


## Block Diagram



## Relative Gradient Angle Transform

- We want to describe object boundary shapes with gradient angles



## Gradient angle

- Similar angles may have large numerical differences
- For example, we may have two neighboring gradient angles, $\mathrm{A}=1^{\circ}$ and $\mathrm{B}=359^{\circ}$, but their smallest angle difference is $2^{\circ}$
- The relative gradient angle of B with respect to A is $\boldsymbol{A}+(\boldsymbol{B}-$ A) $=-1^{\circ}$


## Relative Gradient Angle Transform

- We propose Relative Gradient Angle (RGA) Transform that iterates through gradient angles along an object's contour and sequentially computes relative gradient angles with respect to previously computed angle


Building contour

Degree


Transformed contour signal in RGA

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## Boundary Orientation Relation Set

- We name the set of angle relationships a Boundary Orientation Relation Set (BORS)
- In this paper, we assume the angle relationships in building applications to be orthogonal or parallel
- The BORS for building applications is $\{90,180,270\}$
- We detect the relative gradient angles with angle relationships described by BORS


Red: detected relative gradient angles

## Quantization

- By quantizing contour angles to the detected angles, we replace round corners with sharp corners



## Building Polygon Extraction

- Building polygon is obtained by computing the intersections between edges


Compute $\xrightarrow{\text { intersections }}$


## Experimental Results

a)


I


II


III


IV


VI
a) Ground truth contours
b) Contours of segmentation mask from PSPNet outputs
c) Polygons extracted by our method

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