

SEMANTIC ANNOTATION OF URBAN SCENES: SKYLINE AND WINDOW DETECTION

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Outline

Introduction

Skylinedetection

Extracting the 3D model

Interactive demo

Experiment

Experiment



420px

Did you see?

- ▶ building

Did you see?

- ▶ building
- ▶ tree

Did you see?

- ▶ building
- ▶ tree
- ▶ bicycle

Did you see?

- ▶ building
- ▶ tree
- ▶ bicycle
- ▶ street lamp

Did you see?

- ▶ building
- ▶ tree
- ▶ bicycle
- ▶ street lamp
- ▶ red car

Did you see?

- ▶ building
- ▶ tree
- ▶ bicycle
- ▶ street lamp
- ▶ red car
- ▶ blue car

Did you see?

- ▶ building
- ▶ tree
- ▶ bicycle
- ▶ street lamp
- ▶ red car
- ▶ blue car
- ▶ brand of the car?

Experiment

Experiment



420px

Q

- ▶ Why are we so good at object/depth recognition?

Q

- ▶ Why are we so good at object/depth recognition?
- ▶ How can we apply vision to a computer system?

Q

- ▶ Why are we so good at object/depth recognition?
- ▶ How can we apply vision to a computer system?
 - ▶ *Computer Vision*

Outline

Human perception

- ▶ depth cue, binocular disparity

Human perception

- ▶ depth cue, binocular disparity
- ▶ Classify objects: feature detection

Human perception

- ▶ depth cue, binocular disparity
- ▶ Classify objects: feature detection
 - ▶ straight lines

Human perception

- ▶ depth cue, binocular disparity
- ▶ Classify objects: feature detection
 - ▶ straight lines
 - ▶ right angles

Where is my research about?

- ▶ Annotation of urban scenes

Where is my research about?

- ▶ Annotation of urban scenes
 - ▶ Skyline detection



Where is my research about?

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 - ▶ Skyline detection



Where is my research about?

- ▶ Annotation of urban scenes
 - ▶ Skyline detection



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Skylinedetection

Future research

Extracting the 3D model

Interactive demo

Application examples of annotation of urban scenes

- ▶ 3D city models

Application examples of annotation of urban scenes

- ▶ 3D city models
 - ▶ Driving simulation

Application examples of annotation of urban scenes

- ▶ 3D city models
 - ▶ Driving simulation
 - ▶ Augmented reality

Application examples of annotation of urban scenes

- ▶ 3D city models
 - ▶ Driving simulation
 - ▶ Augmented reality
 - ▶ Building recognition

Application examples of annotation of urban scenes

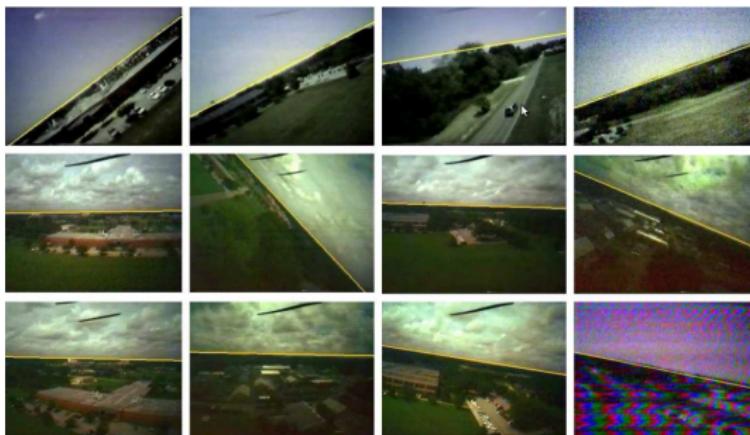
- ▶ 3D city models
- ▶ Driving simulation
- ▶ Augmented reality
- ▶ Building recognition
- ▶ Analysis building deformation

Application examples of annotation of urban scenes

- ▶ 3D city models
- ▶ Driving simulation
- ▶ Augmented reality
- ▶ Building recognition
- ▶ Analysis building deformation
 - ▶ 'noord-zuidlijn'

Skyline detection application example

- ▶ Horizon detection for Unmanned Air Vehicles



width=420px

Skyline in urban scenes

- ▶ Canny edge detection

Skyline in urban scenes

- ▶ Canny edge detection
- ▶ Result: Binary image (edge or no edge)

Skyline in urban scenes

- ▶ Canny edge detection
- ▶ Result: Binary image (edge or no edge)
- ▶ **top sharp edge assumption**
"The first sharp edge (seen from top to bottom) in the image represents the skyline."

Skyline detection algorithm

- ▶ The image is sliced in $\#w$ pixelcolumns

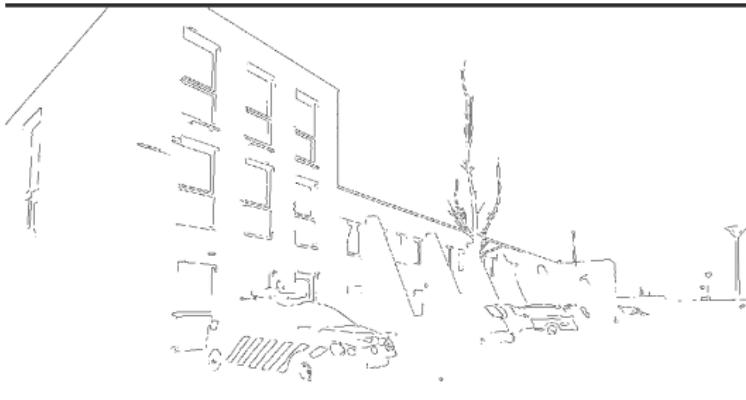
Skyline detection algorithm

- ▶ The image is sliced in $\#w$ pixelcolumns
- ▶ Each column present $\#h$ binary edge values (edge or no edge)

Skyline detection algorithm

- ▶ The image is sliced in $\#w$ pixelcolumns
- ▶ Each column present $\#h$ binary edge values (edge or no edge)
- ▶ **y-location of the first edge value is stored**

Skyline detection Result



Hypothesis based skyline detection, assumption

"The first sharp edge (seen from top to bottom) in the image represents the skyline."

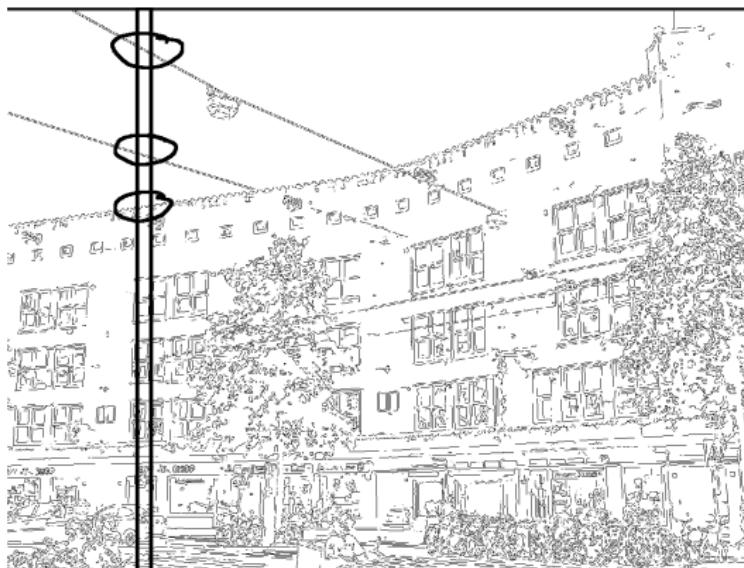
- ▶ Example of a scene where this assumption is violated



Hypothesis based skyline detection, assumption

► Change of assumption

"The skyline is part of the first n sharp edges (seen from top) (e.g. $n = 3$)



Hypothesis based skyline detection, algorithm

- ▶ Use existing column based approach

Hypothesis based skyline detection, algorithm

- ▶ Use existing column based approach
 - ▶ Generate n hypothesis

Hypothesis based skyline detection, algorithm

- ▶ Use existing column based approach
 - ▶ Generate n hypothesis
 - ▶ classify hypothesis with additional info

Hypothesis based skyline detection, algorithm

- ▶ Use existing column based approach
 - ▶ Generate n hypothesis
 - ▶ classify hypothesis with additional info
 - ▶ texture

Hypothesis based skyline detection, algorithm

- ▶ Use existing column based approach
 - ▶ Generate n hypothesis
 - ▶ classify hypothesis with additional info
 - ▶ texture
 - ▶ color

Hypothesis based skyline detection, algorithm

- ▶ Use existing column based approach
 - ▶ Generate n hypothesis
 - ▶ classify hypothesis with additional info
 - ▶ texture
 - ▶ color
 - ▶ height variation

Expected result on hypothesis classification based on color



Expected result on hypothesis classification based on height variation



Outline

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Method II: Histogram based approach

Facade rectification

Interactive demo

Overview

- ▶ Create (top view) 2D model of the scene using *Openstreetmap*



Overview

- ▶ Create (top view) 2D model of the scene using *Openstreetmap*



- ▶ Align 2D model with the scene using *FIT3D toolbox*

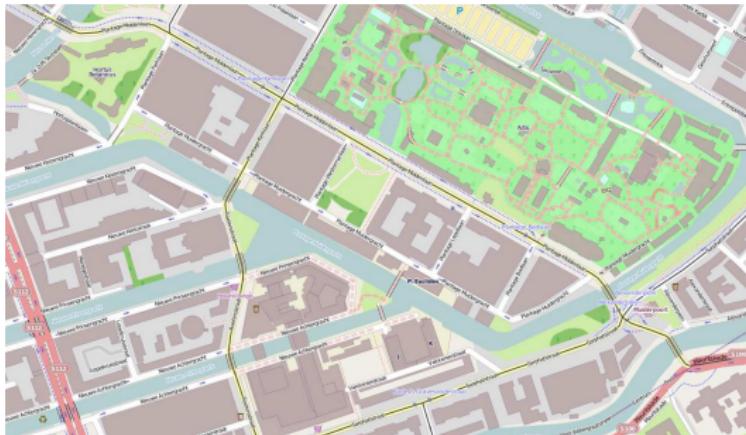
Overview

- ▶ Create (top view) 2D model of the scene using *Openstreetmap*



- ▶ Align 2D model with the scene using *FIT3D toolbox*
- ▶ Transform the 2D model to a 3D model by extending the walls

Extract 2D model



Align 2D model

► *FIT3D toolbox*



(a)



Align 2D model

- ▶ *FIT3D toolbox*

- ▶ Input: sequence of images that contain different views of the building



(c)



Align 2D model

- ▶ *FIT3D toolbox*

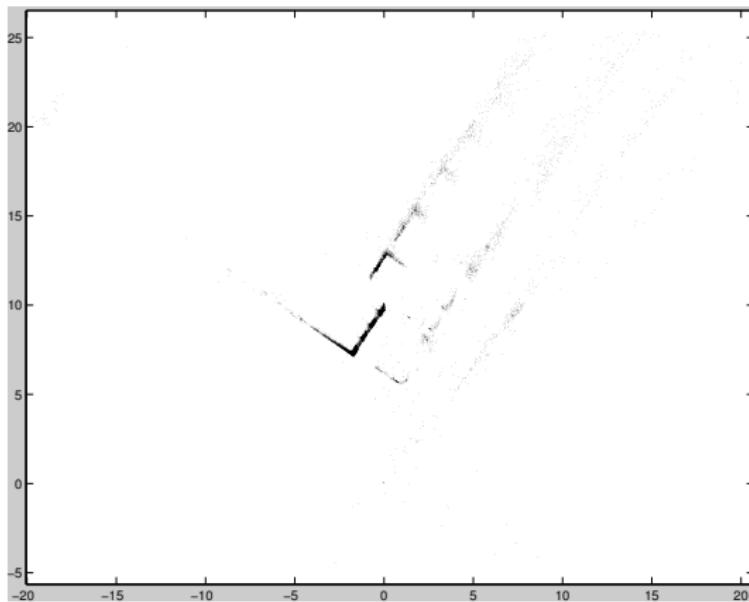
- ▶ Input: sequence of images that contain different views of the building
- ▶ Output: a 3D point cloud of the building



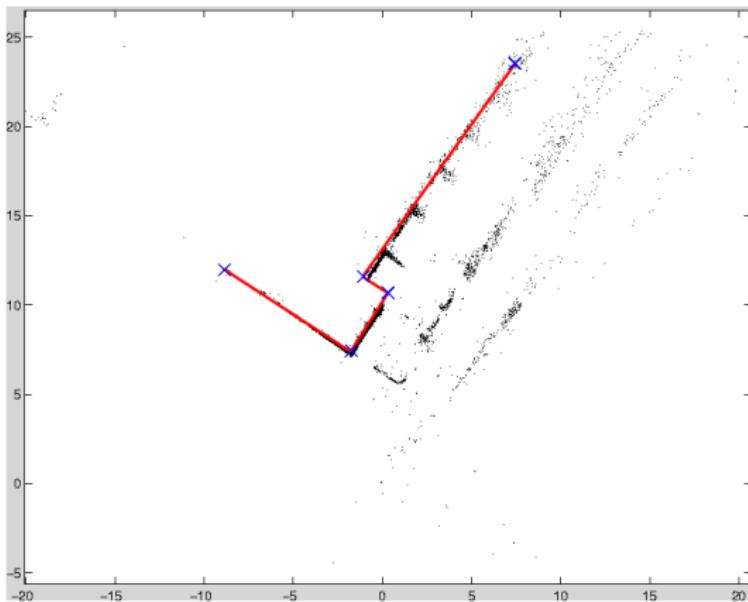
(e)



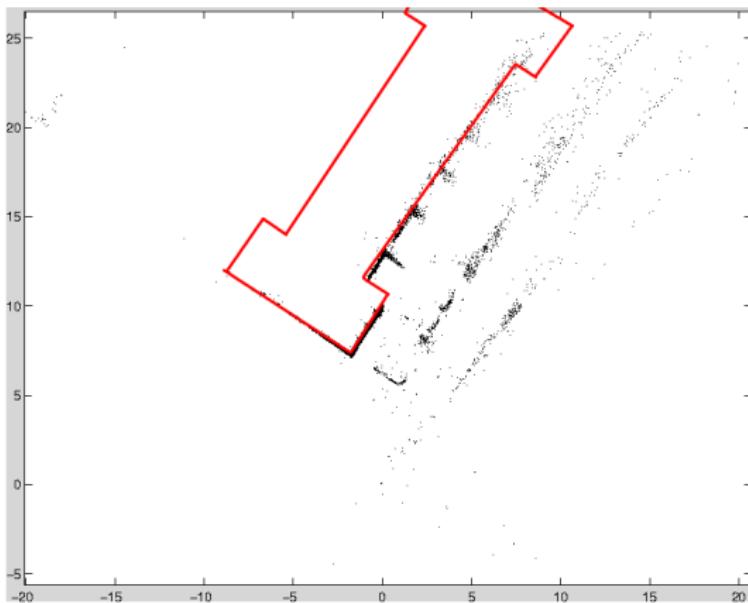
Align 2D model



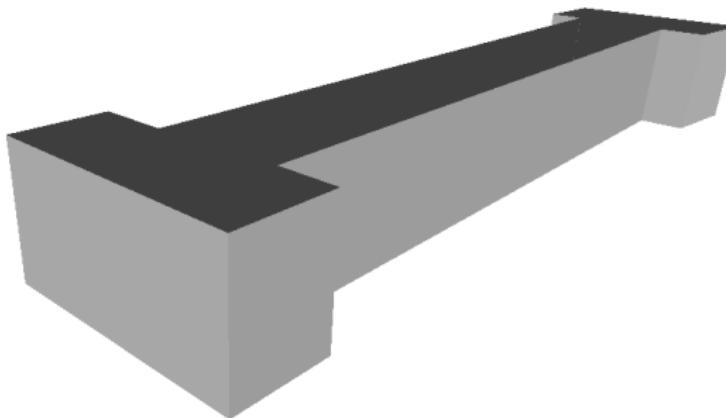
Align 2D model



Align 2D model

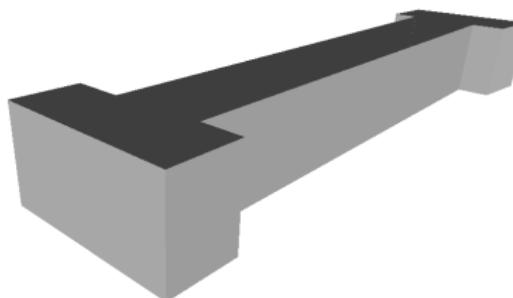


Results



Wall height estimation

- ▶ Wall heights of 3D model are not accurate

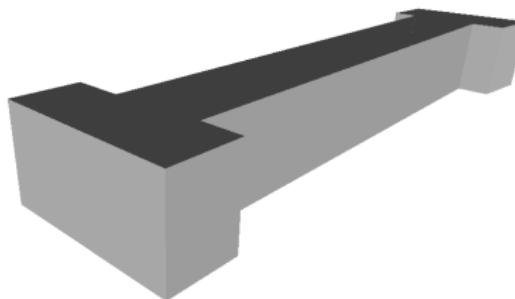


(g)



Wall height estimation

- ▶ Wall heights of 3D model are not accurate



(i)



Assumptions

Straight lines in the skyline are likely to come from the building contour Flat roof assumption - if building contour is equal to upper side of building walls

Extracting line segments

- ▶ Output of skyline detector



Extracting line segments

- ▶ Output of skyline detector
 - ▶ Hough transform

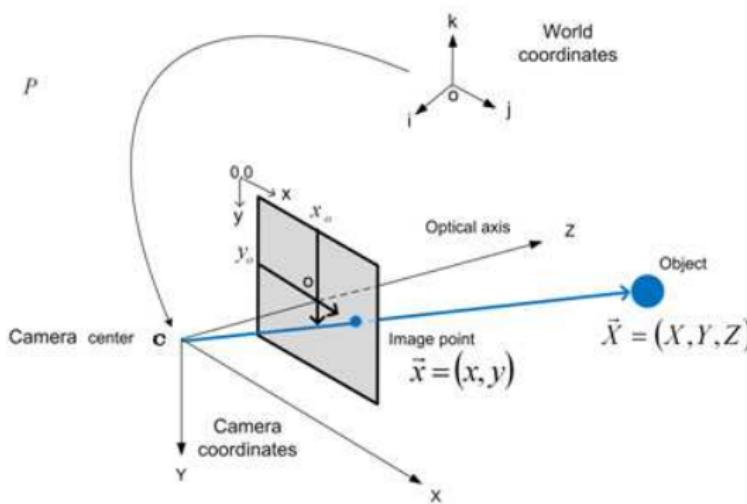


Project to the 3D model

- ▶ Estimate wall heights

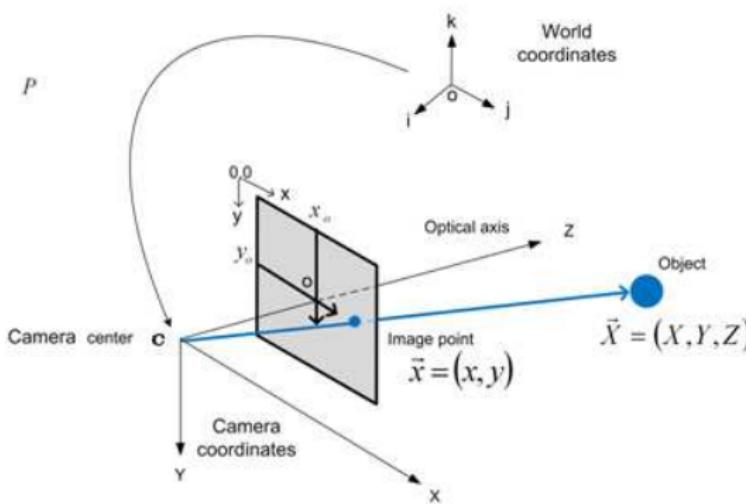
Project to the 3D model

- ▶ Estimate wall heights
- ▶ project line segments to specific walls of 3D model

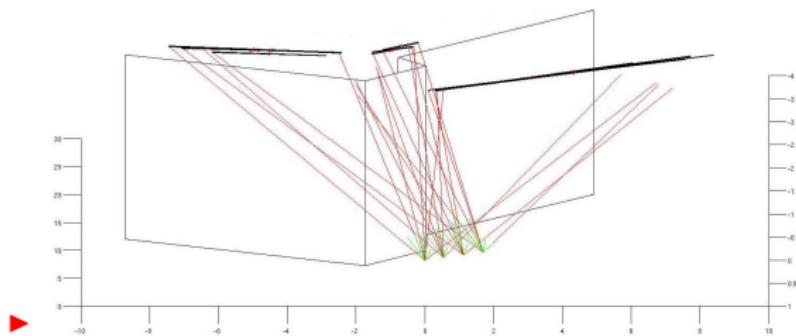


Project to the 3D model

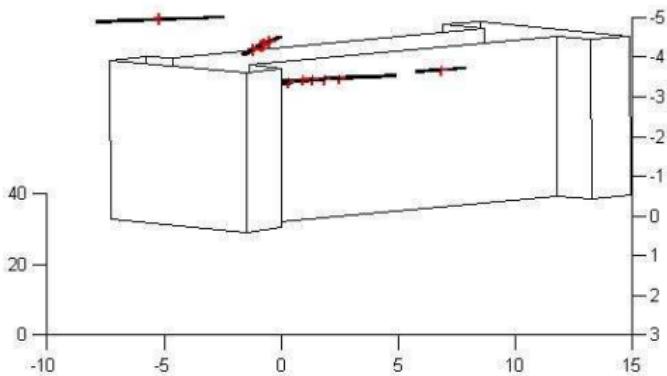
- ▶ Estimate wall heights
- ▶ project line segments to specific walls of 3D model



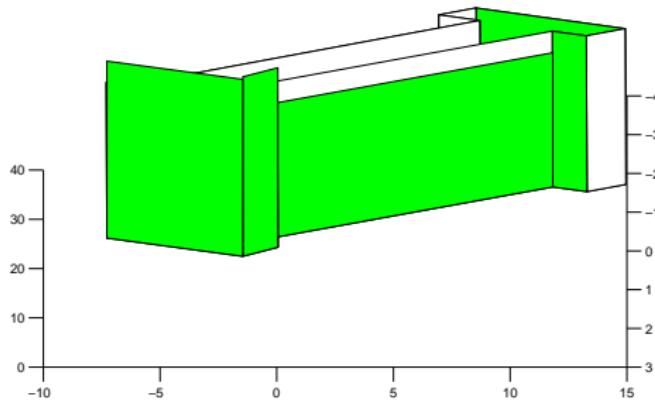
Results 1/3



Results 2/3



Results 3/3



Improved 3D model 0.6

Future research

Overview

Outline Window detection

- ▶ Method I: Connected corner approach

Outline Window detection

- ▶ Method I: Connected corner approach
 - ▶ invariant to viewing direction

Outline Window detection

- ▶ Method I: Connected corner approach
 - ▶ invariant to viewing direction
- ▶ Facade rectification

Outline Window detection

- ▶ Method I: Connected corner approach
 - ▶ invariant to viewing direction
- ▶ Facade rectification
- ▶ Method II: Histogram based approach

Outline Window detection

- ▶ Method I: Connected corner approach
 - ▶ invariant to viewing direction
- ▶ Facade rectification
- ▶ Method II: Histogram based approach
 - ▶ rectified facades

Outline Window detection

- ▶ Method I: Connected corner approach
 - ▶ invariant to viewing direction
- ▶ Facade rectification
- ▶ Method II: Histogram based approach
 - ▶ rectified facades
 - ▶ uses **Histograms of Houghlines**

Method I: Connected corner approach

Situation

- ▶ Window frames

Situation

- ▶ Window frames
- ▶ Difference color window frame, color glass

Situation

- ▶ Window frames
- ▶ Difference color window frame, color glass
- ▶ Produce edges in horizontal and vertical direction

The idea

- ▶ Connected corner

The idea

- ▶ Connected corner
- ▶ *"horizontal and vertical edges that come from the same (sub)window frame share a corner"*

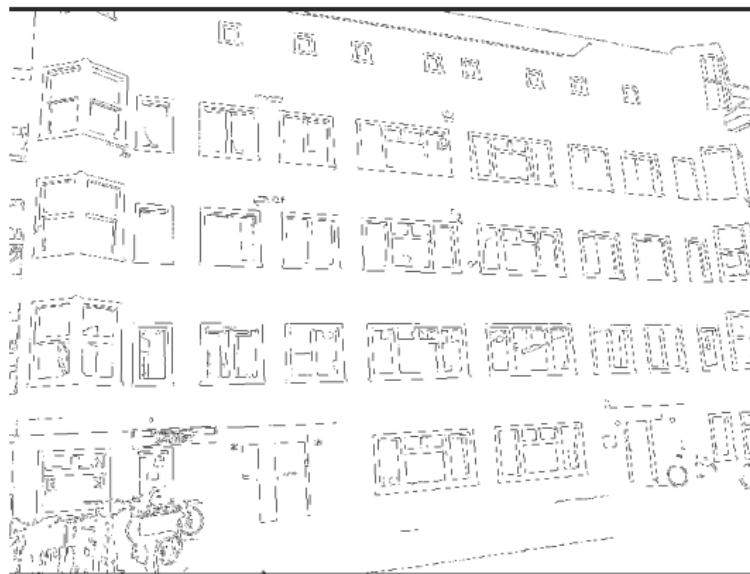
Edge detection and Houghline extraction

- ▶ Canny edge detector
- ▶ Two groups of straight lines (Houghlines)
 - ▶ Horizontal, $\theta = [-30..0..30)$ degrees
 - ▶ Vertical, $\theta = [80..90..100)$ degrees
- ▶ Why the use of angle ranges?
 - ▶ Camera not exactly upright
 - ▶ Facade view contains an angle, perspective distortion

Original

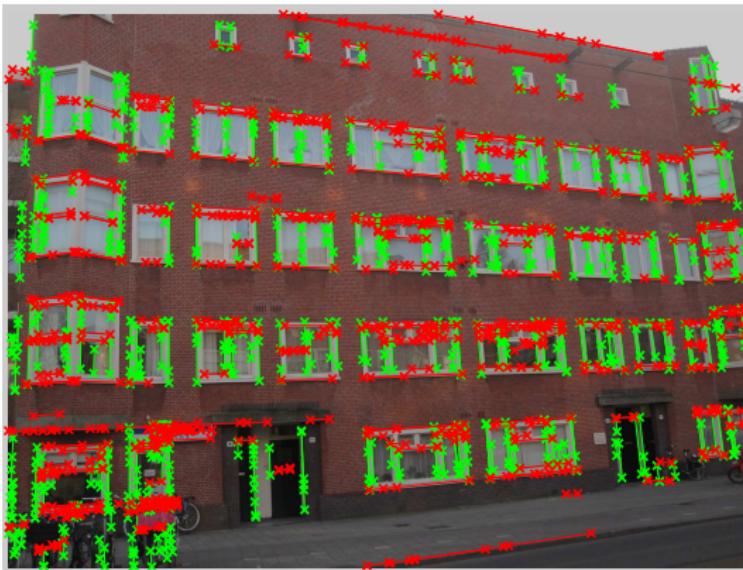


Edge detection



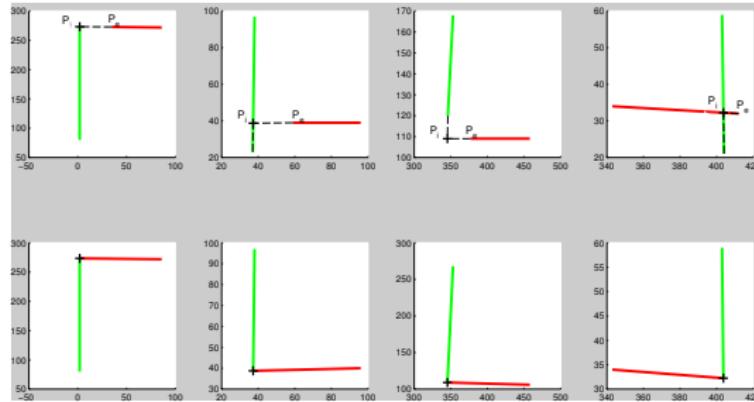
Edge detection0.45

Result of θ constrained Hough transform



Connected corner

- ▶ Connected corner:a horizontal and vertical edge that share the same corner e.g. L
 - ▶ Algorithm: If line segments endpoints are close enough a connected corner is formed
 - ▶ Tolerate gab or extension



Connected Corners



Window area extraction

- ▶ Mirror from diagonal through endpoints
- ▶ L shape -& Quadrangle window area

Results



Conclusion

- ▶ The skyline detection algorithm
 - ▶ is simple and has a low complexity
 - ▶ works well under the assumption skyline is upper edge
 - ▶ can provide a set of hypothesis which should be evaluated using additional features

Future research

- ▶ L-shapes, U-shapes
- ▶ analysis of substructure of windows
 - ▶ define a contained in relations
 - ▶ cluster connected corner on location and length
 - ▶ maximum intercluster distance correlates with size subwindow
 - ▶ assume nr of subwindows to estimate size

Method II: window detection

- ▶ Assumes that the windows are
 - ▶ orthogonal
 - ▶ aligned

Aligned but not orthogonal



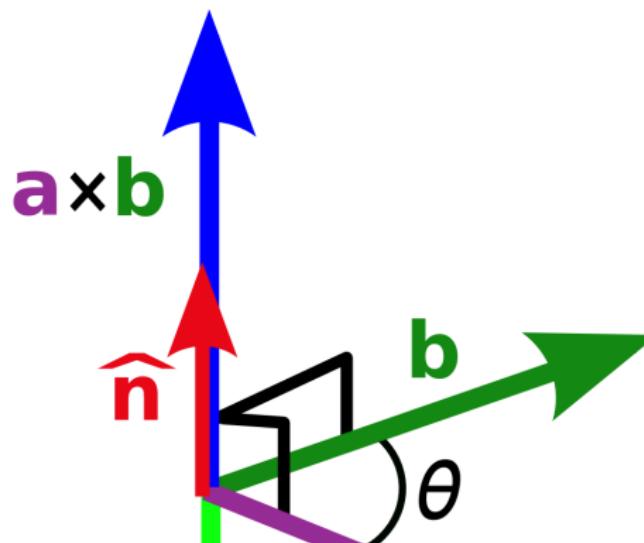
Rectified facade



Dataset: Anne1, Rectified image0.45

Façade rectification

- ▶ 3D model gives plane that corresponds to wall
- ▶ wall produces a normal vector b
- ▶ camera's heading, \vec{a}
- ▶ rotation matrix R is calculated and applied



Unrectified facade



Rectified facade



Dataset: Anne1, Rectified image0.45

Façade rectification



Façade rectification



Extracting the window alignment

- ▶ Window alignment line
 - ▶ "*A horizontal or vertical line that aligns multiple windows*"
- ▶ Alignment lines provide grid of blocks
- ▶ Window non-window areas

Window alignment lines example

Introduction

Skylinedetection
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Interactive demo
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Façade rectification



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Questions

[Questions](#)

osgviewer demo of 3d point cloud and images demo of matlab

Questions

progje

Questions

Questions?