

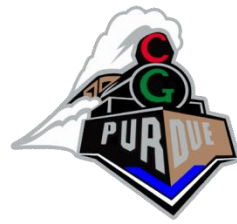


# A Brief Primer on Inverse Procedural Modeling

CS334

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# Recall: Procedural Modeling



- Apply algorithms for producing objects and scenes
- The rules may either be embedded into the algorithm, configurable by parameters, or externally provided

# #1: Inverse Procedural Modeling by Automatic Generation of L-systems



*O. Šťava, B. Beneš, R. Měch\*, D. Aliaga, P. Krištof*

2D Vector Image

Analysis

L-system

Modifications



$R(m) \rightarrow$

$A[-(\alpha) f(d) *(s) - (\beta) R(m-1)]$

$[+(\alpha') f(d') *(s') + (\beta') R(m-1)]$

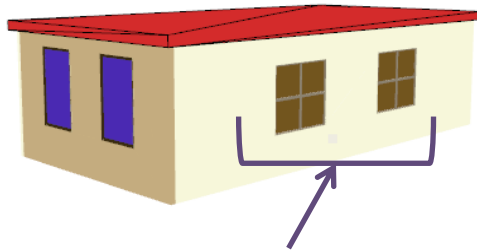
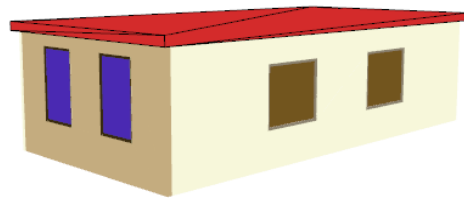


# #2: Inverse 3D Procedural Buildings



I. Demir, B. Benes, D. Aliaga

## Triangle Soup

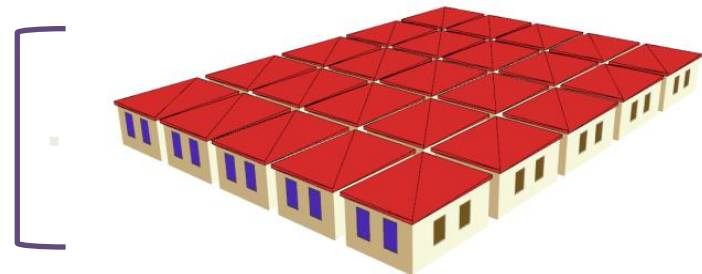


```
Rule R3(A) = {  
    ...  
    R1(subdivide(2,1,2,D));  
    R1(subdivide(2,1,2,F));  
}
```

## Grammar

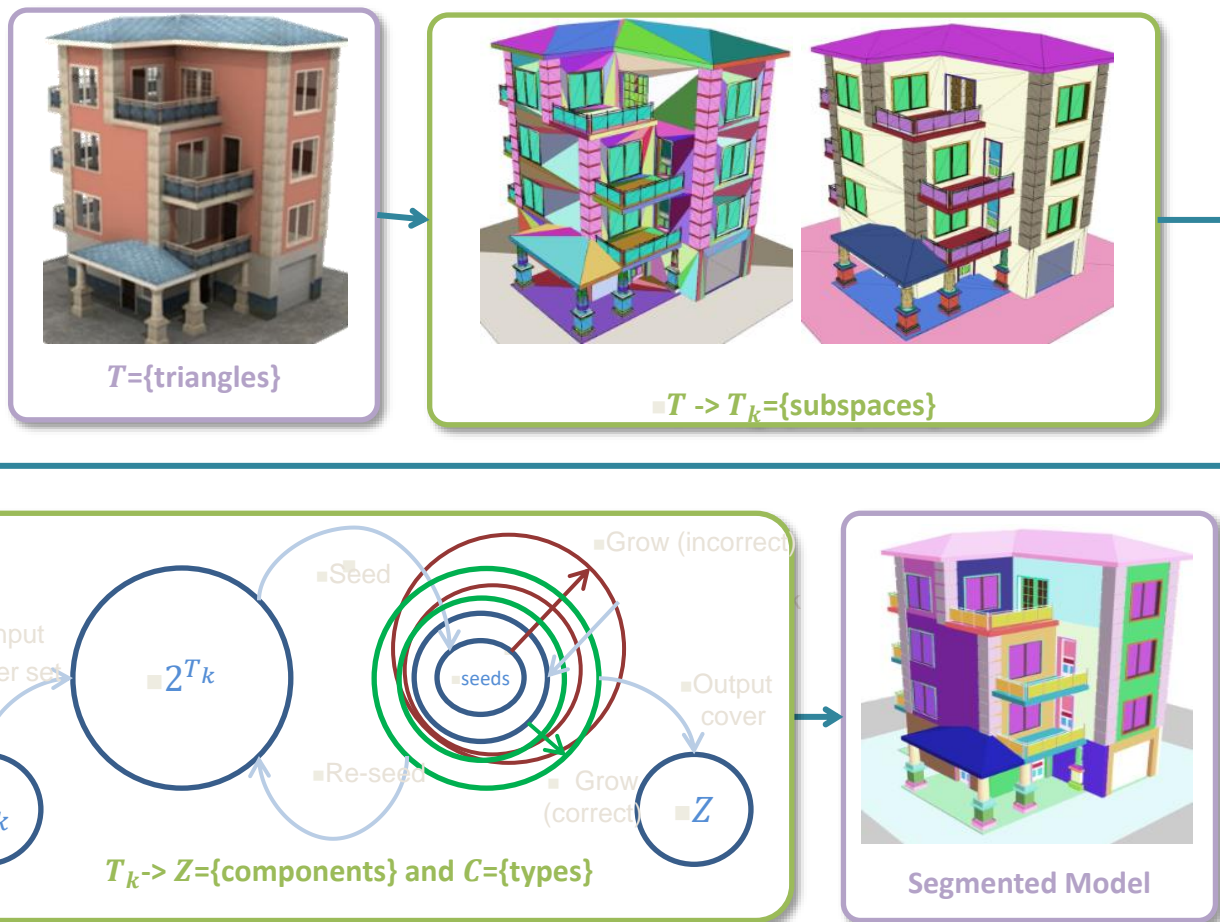
```
Rule Building(S) = {  
    // CREATE ENTIRE BUILDING  
    a = split(S, 0.0, 0.0, 0.80, 4) // roof terminal  
    c = split(S, 1.0, 1.0, 0.01, 5) // floor terminal  
    B = split(S, 1.0, 1.0, 0.80, 5) // wall bbox  
    D = split(B, 1.0, 0.1, 1.00, 5) // front wall bbox  
    E = split(B, 0.0, 0.9, 0.00, 4) // back wall bbox  
    F = split(B, 0.1, 1.0, 1.00, 5) // left wall bbox  
    G = split(B, 0.9, 0.0, 0.00, 4) // right wall bbox  
    R3(D); R3(E); // front/back rule  
    R4(F); R4(G); // left/right rule  
}  
  
Rule R3(A) = {  
    // CREATE FRONT/BACK WALL  
    b = split(A, 0.0, 0.0, 0.00, 4) // wall terminal  
    C = split(A, 0.4, 1.0, 0.75, 5)  
    D = split(C, 0.6, 0.3, 0.00, 4) // left window bbox_  
    E = split(A, 0.6, 1.0, 0.75, 6)  
    F = split(E, 0.3, 1.0, 0.30, 1) // right window  
    R1(D); R1(F); // window rule  
}  
  
Rule R1(A) = {  
    // perform splits for frame and window  
}  
[...and add'l text for R2 and R4]
```

```
Rule NewBuilding(S) = {  
    Building(subdivide(5,5,1,S));  
}  
  
Rule Building(S) = {  
    Z = split(S, 0.9, 0.9, 1.0, 5) // inset  
    a = split(Z, 0.0, 0.0, 0.8, 4) // same  
    ...  
}
```



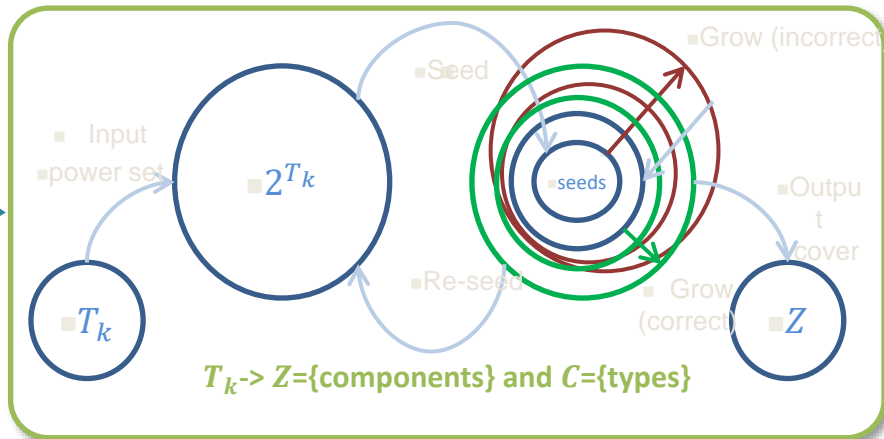
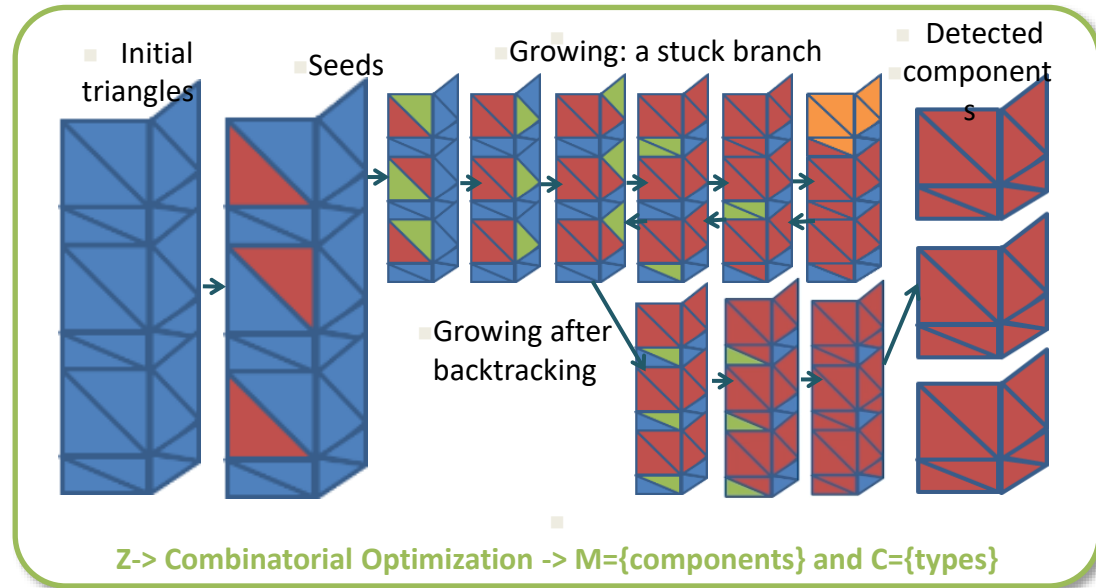


# Pipeline





# Search Process

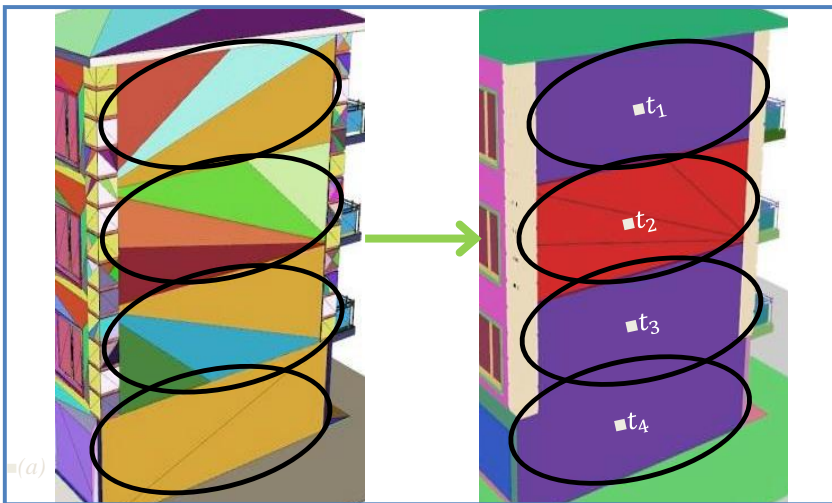


# Clustering and Components



■ Initial Triangles

■ Components









# Example Output

- Automatic





# #3: Photograph to Proc. Model

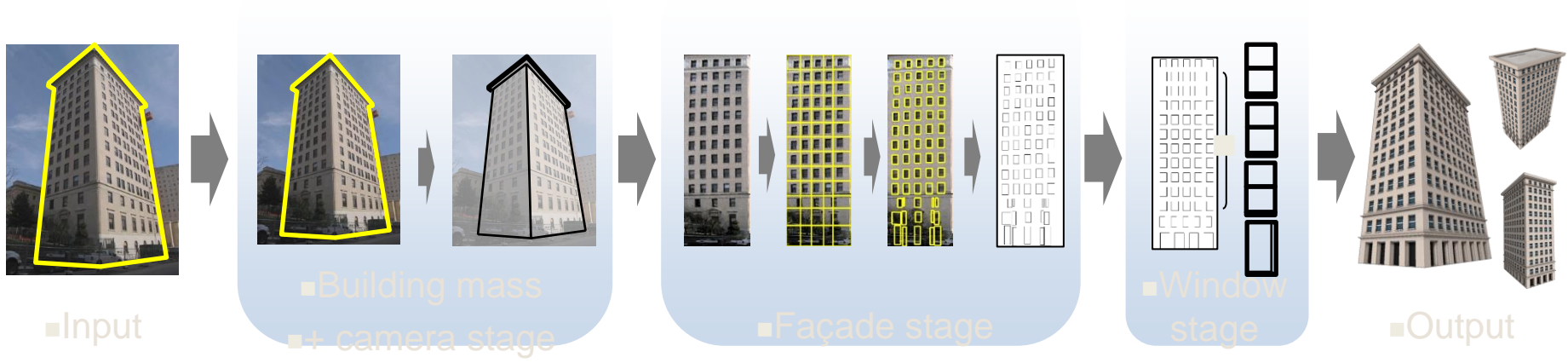
*G. Nishida, A. Bousseau, D. Aliaga*

- Given an image of a building and its contour, generate a 3D procedural model similar to the input.





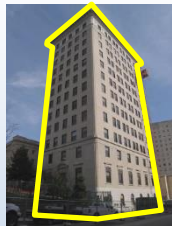
# System Pipeline



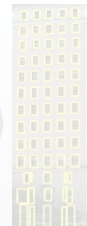
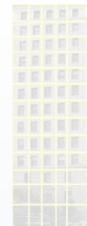
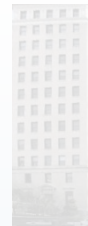
# Building Mass + Camera Stage



Input



Building mass  
+ camera stage



Facade stage



Window stage

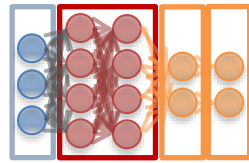


Output

# Building Mass + Camera Stage



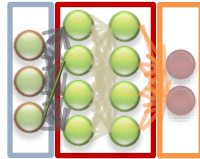
■ Target Building  
+ Silhouette



■ Building mass  
recognition CNN



■ Refinement  
■ by  
optimization



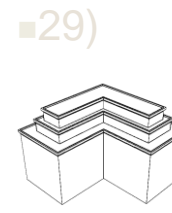
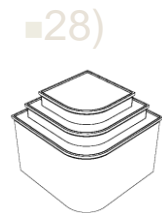
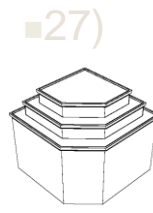
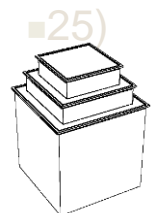
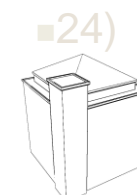
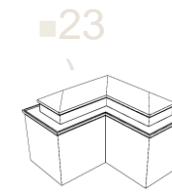
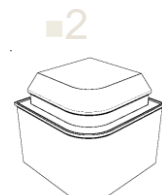
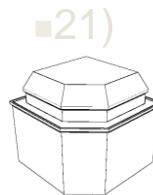
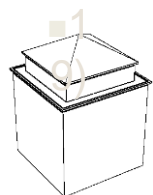
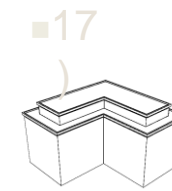
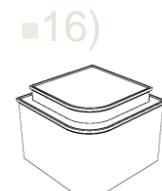
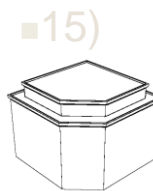
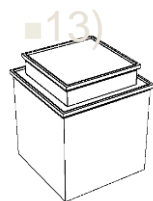
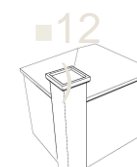
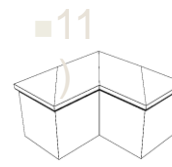
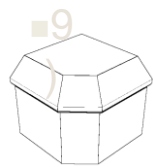
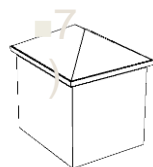
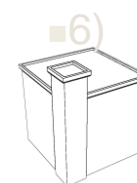
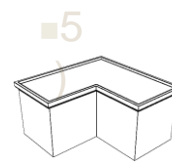
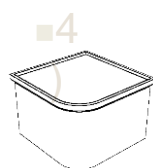
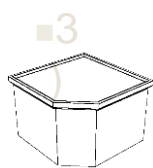
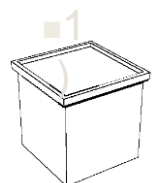
■ Building mass  
parameter  
estimation CNN



■ Camera parameters  
■ + building mass

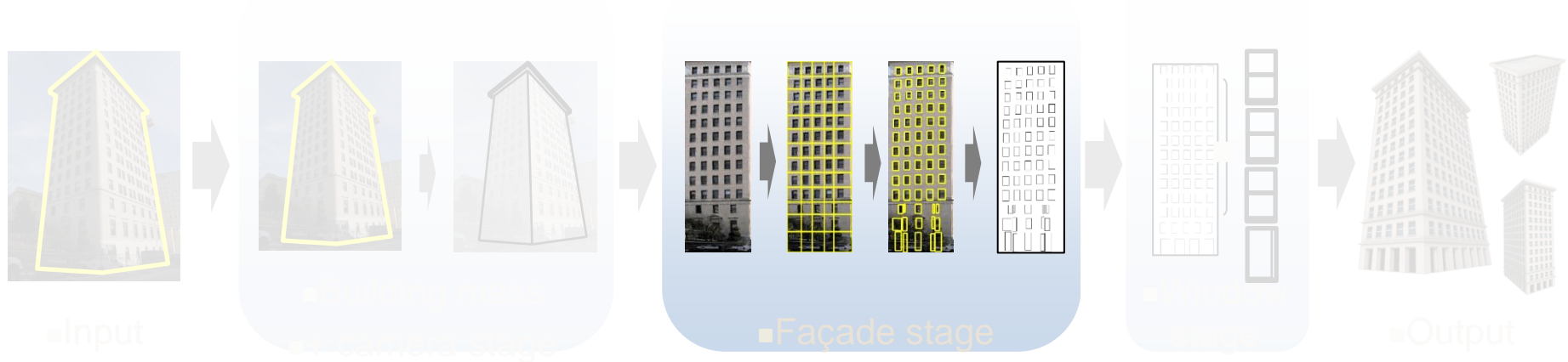


# Building Mass Grammar





# Façade Stage

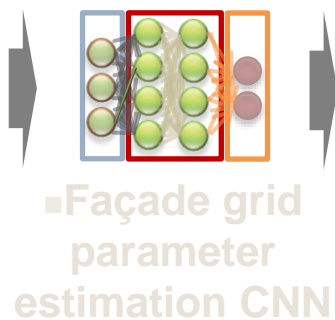




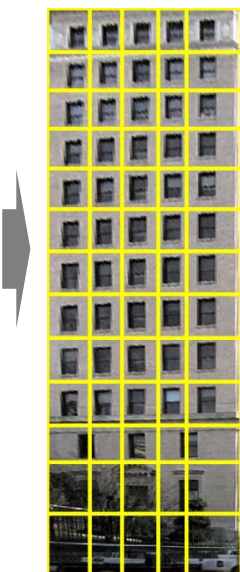
# Façade Simplification



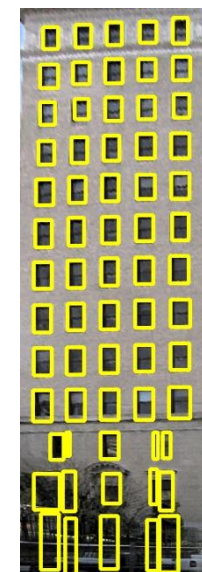
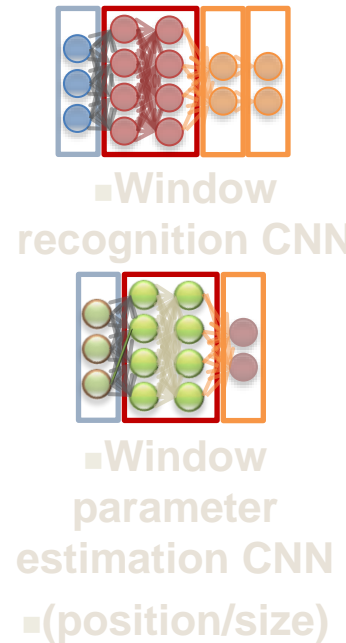
■ Facade



■ Image-based refinement



■ Subdivision

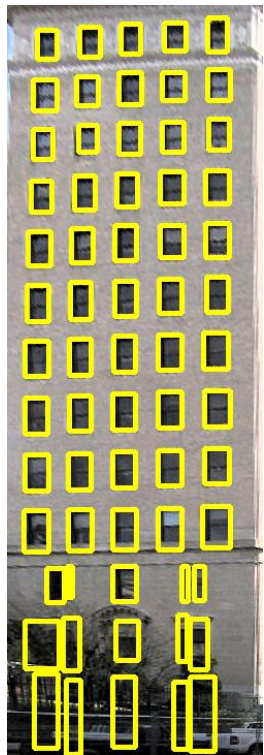


■ Detected windows

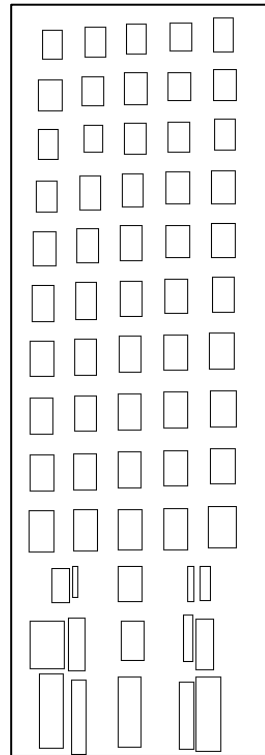




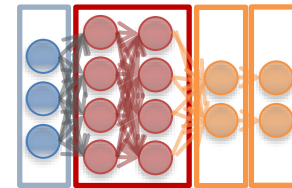
# Façade Grammar Generation



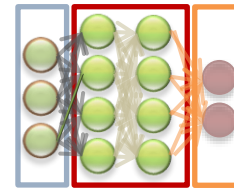
■ Facade



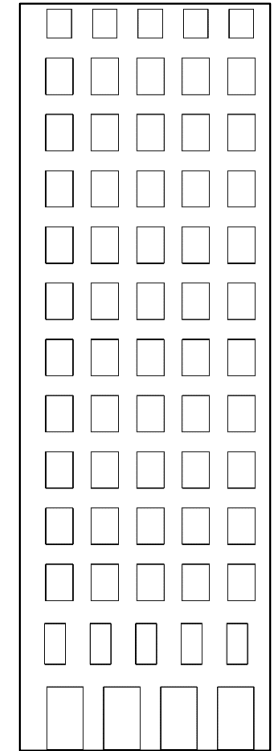
■ Simplified facade



■ Façade recognition CNN



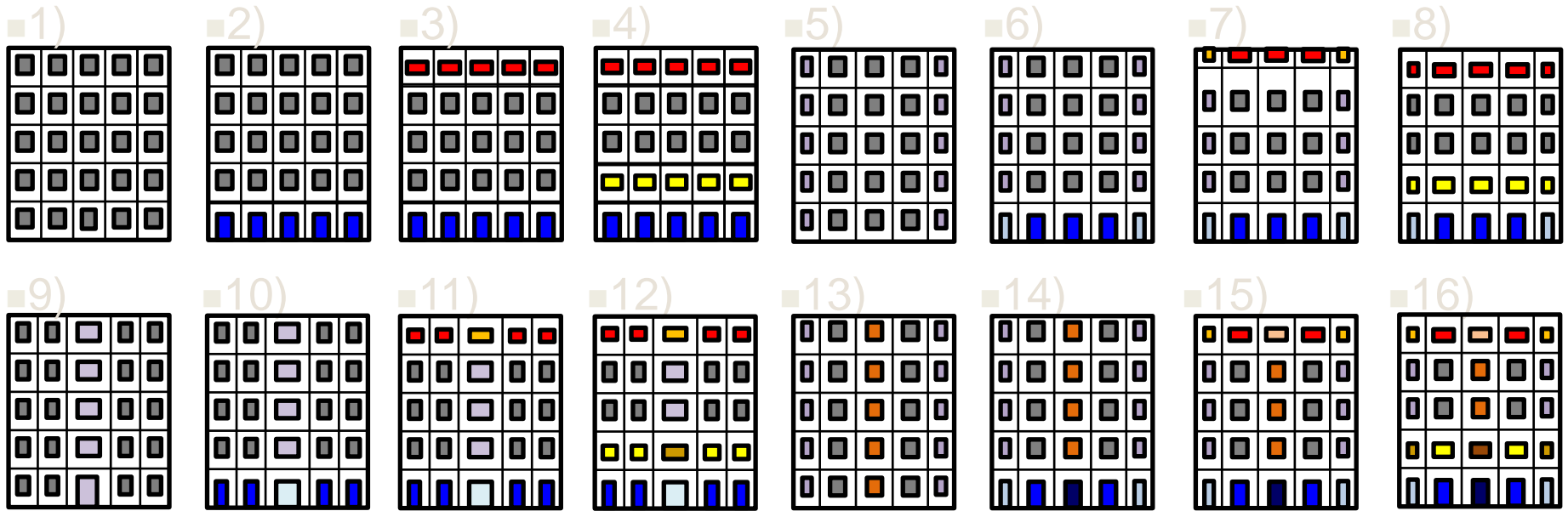
■ Façade parameter estimation CNN



■ Generated Facade



# Façade Grammar



- The same color denotes the same non-terminal.



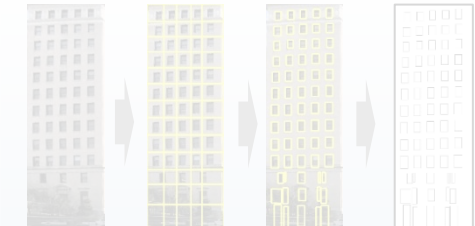
# Window Stage



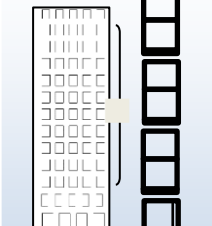
Input



Building mass  
camera stage



Facade stage



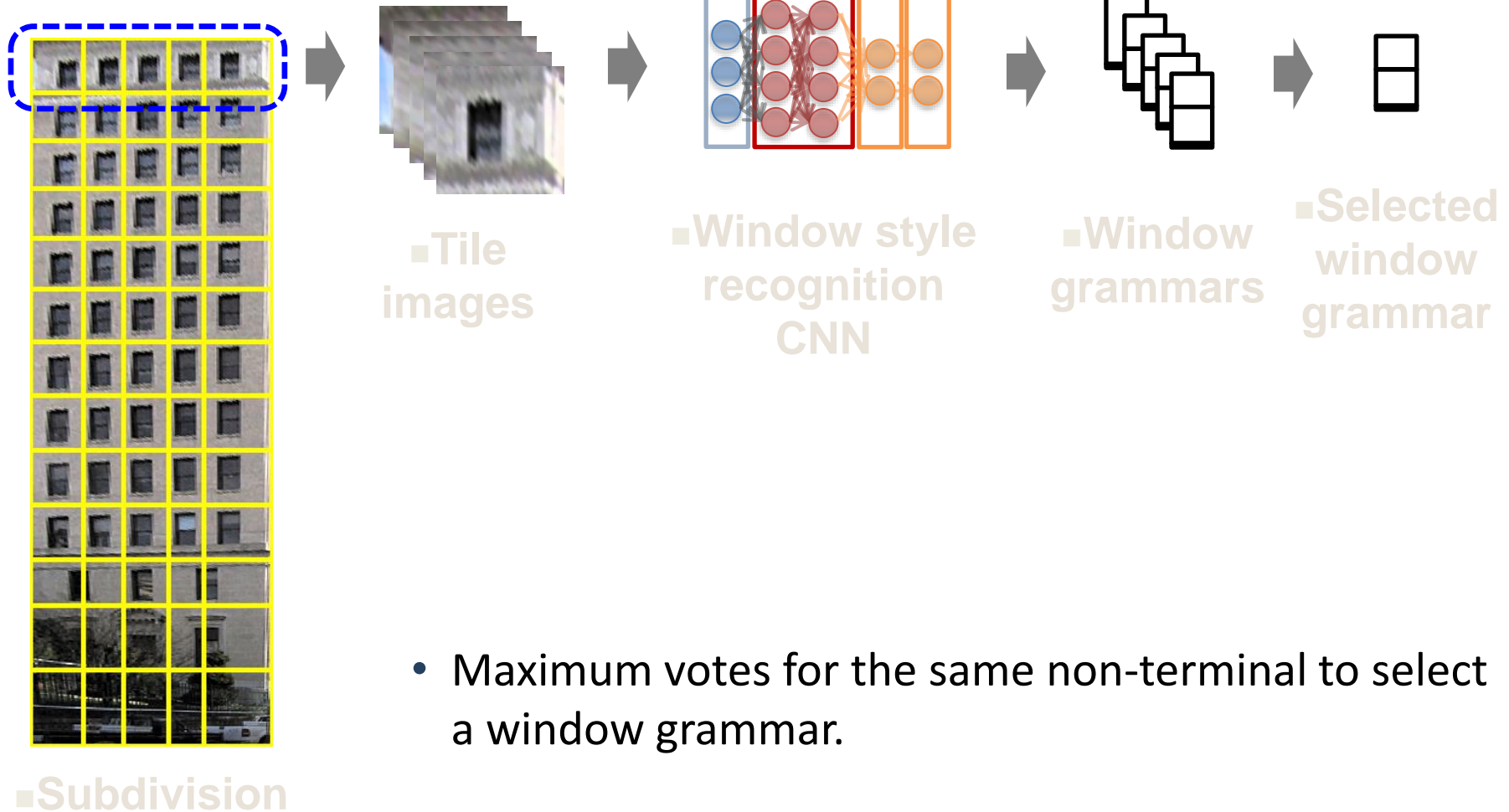
Window stage



Output

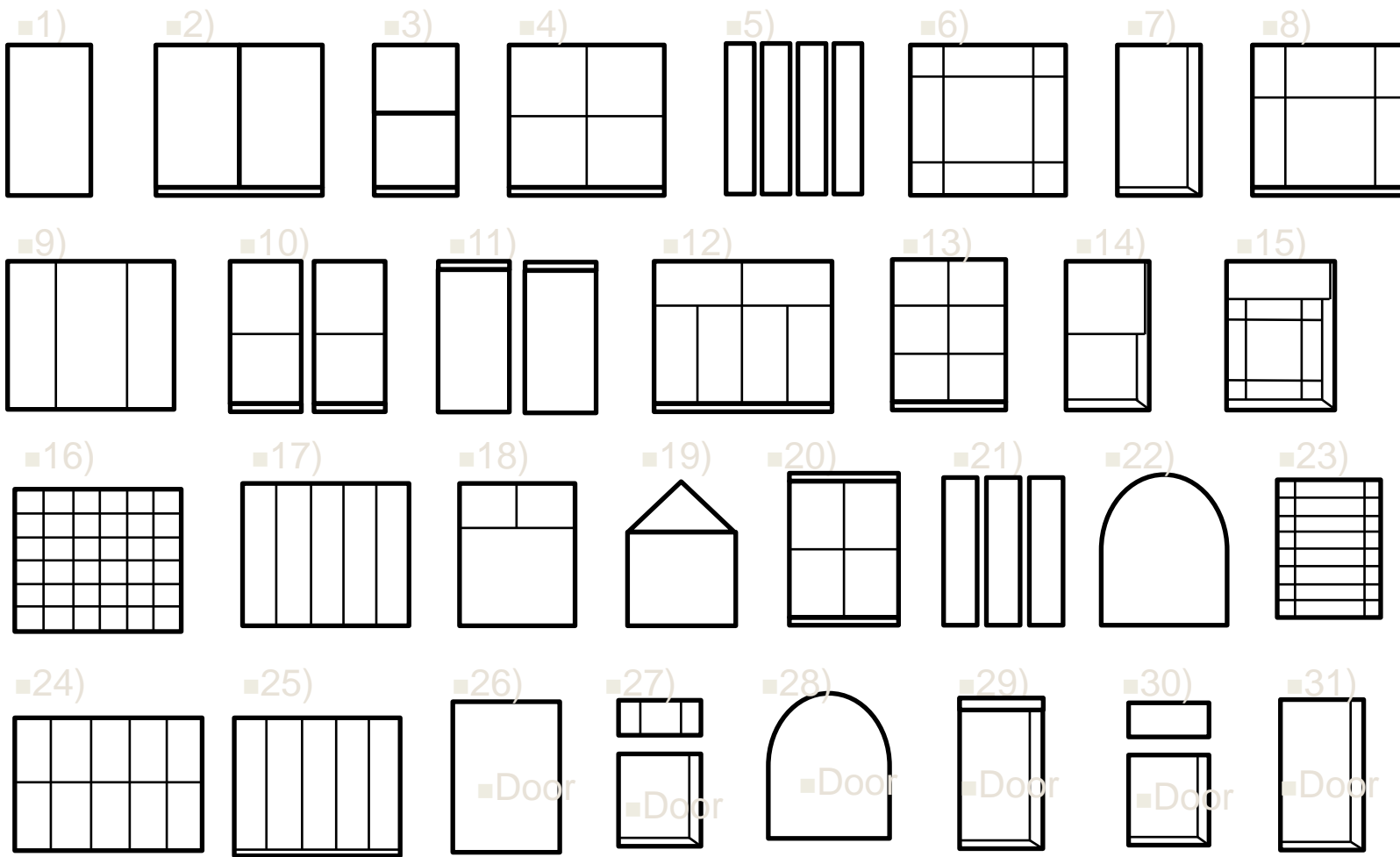


# Window Style Recognition





# Window Grammar



# Photo to 3D Results





# Aerial Images

- Still works but camera parameter estimation is less accurate due to the weaker perspective of the images.

