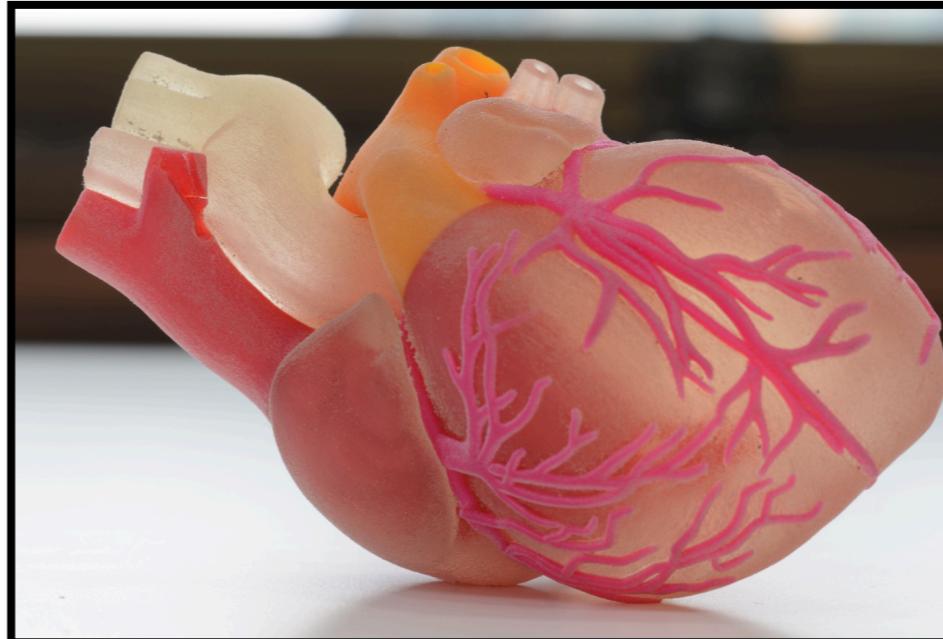


Functional Programming for Compiling and Decompiling Computer-Aided Design



Chandrakana Nandi, James R. Wilcox, Pavel Panchekha, Taylor Blau,
Dan Grossman, Zachary Tatlock
ICFP 2018

The 3D Printing Revolution



Forbes Billionaires Innovation

No Donor Required: 5 Body Parts You Can Make With 3-D Printers

Broke a Glass? Someday You Might 3-D-Print a New One

A pretzel made with a new 3-D printing technique that uses fused silica glass. NeptunLab/KIT

Catching Up to 3D Printing

Design
By ALICE RAWSTHORN JULY 21, 2013

The fairings for this Energica electric motorcycle were made with 3D-printed pieces from Windform. Windform/CRP Group

| SHORT FILM SHOWCASE |

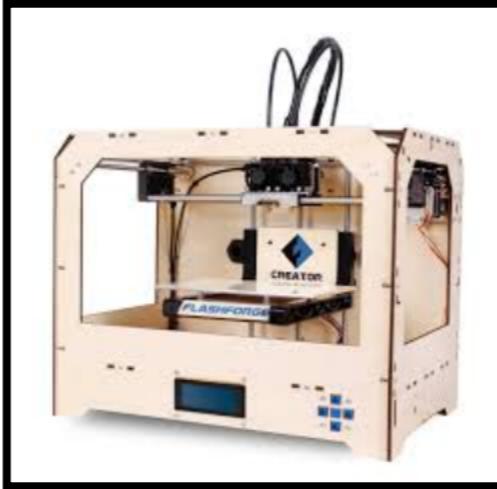
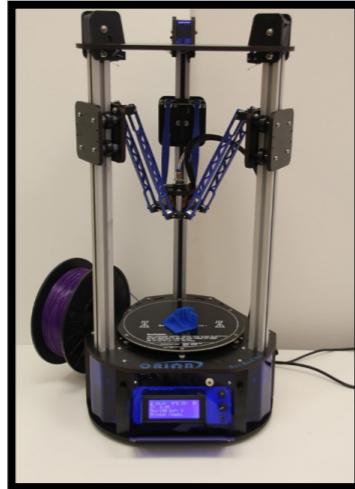
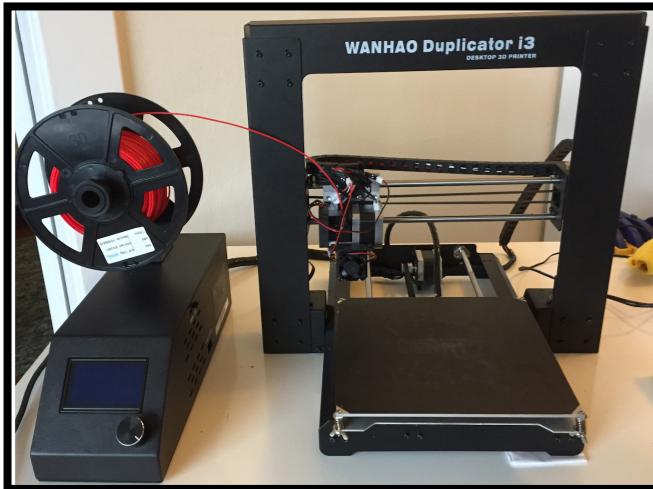
How 3-D-Printed Prosthetic Hands Are Changing These Kids' Lives

f t g+

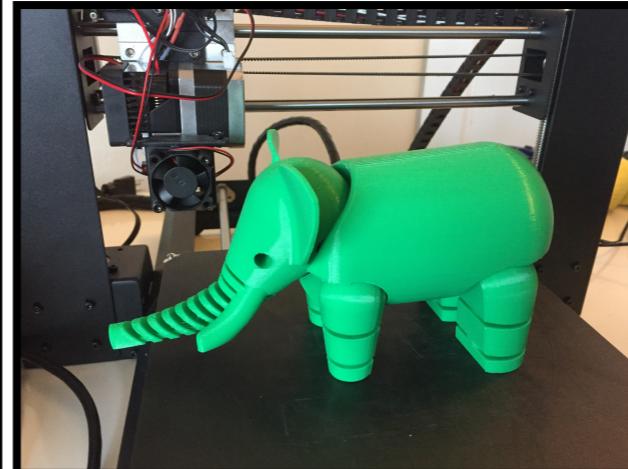
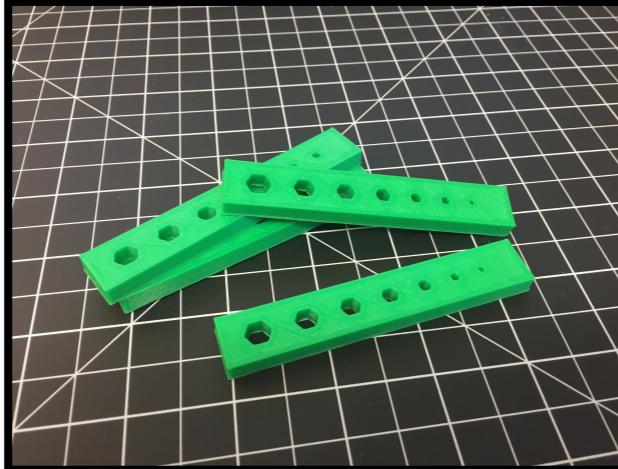
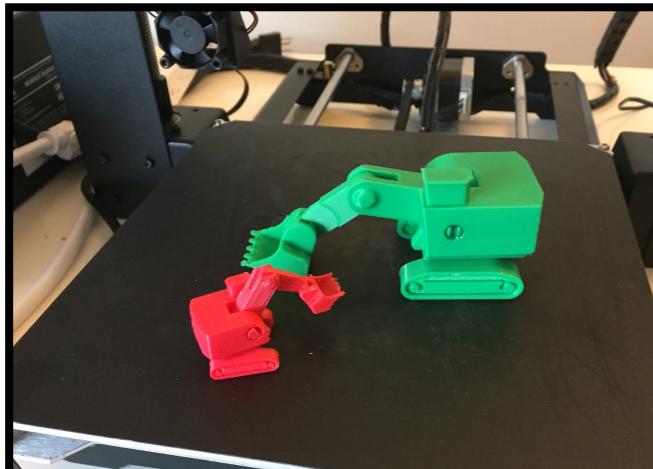
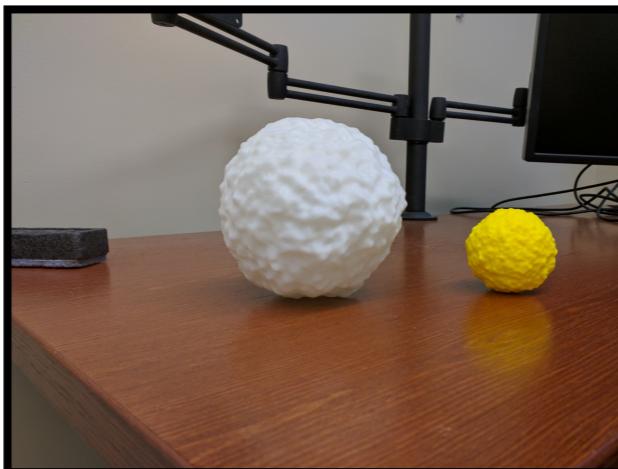
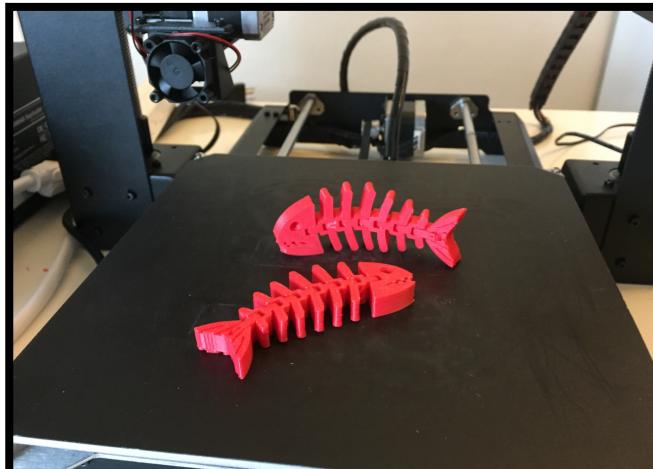
ENABLING THE FUTURE
A Global Network Of Passionate Volunteers Using 3D Printing To Give The World A "Helping Hand."

3D-printed prosthetic limbs: the next revolution in medicine

Democratized Fabrication



PLSE printed!

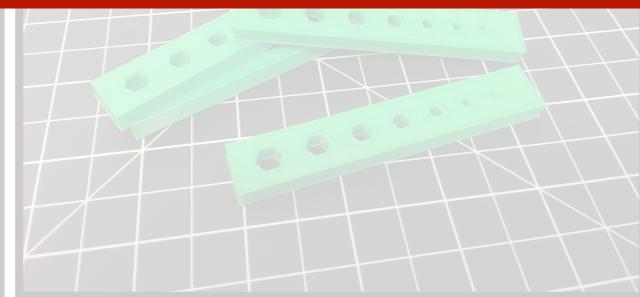
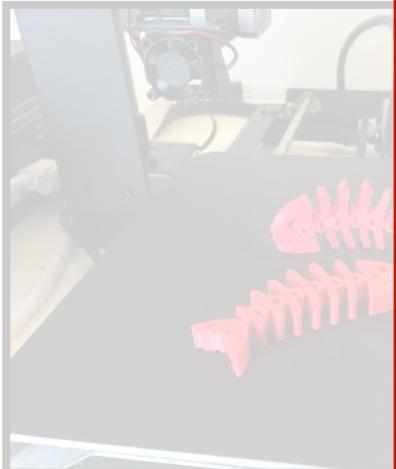
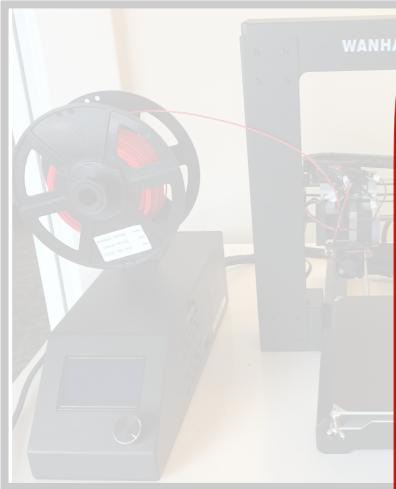


Hardware cost has gone down!

Democratized Fabrication

Design tools challenges

- steep learning curve
- lack of specifications
- expensive



printed!

hardware
just has
done
down!

Democratized Fabrication

Design tools challenges

- steep learning curve
- lack of specifications
- expensive

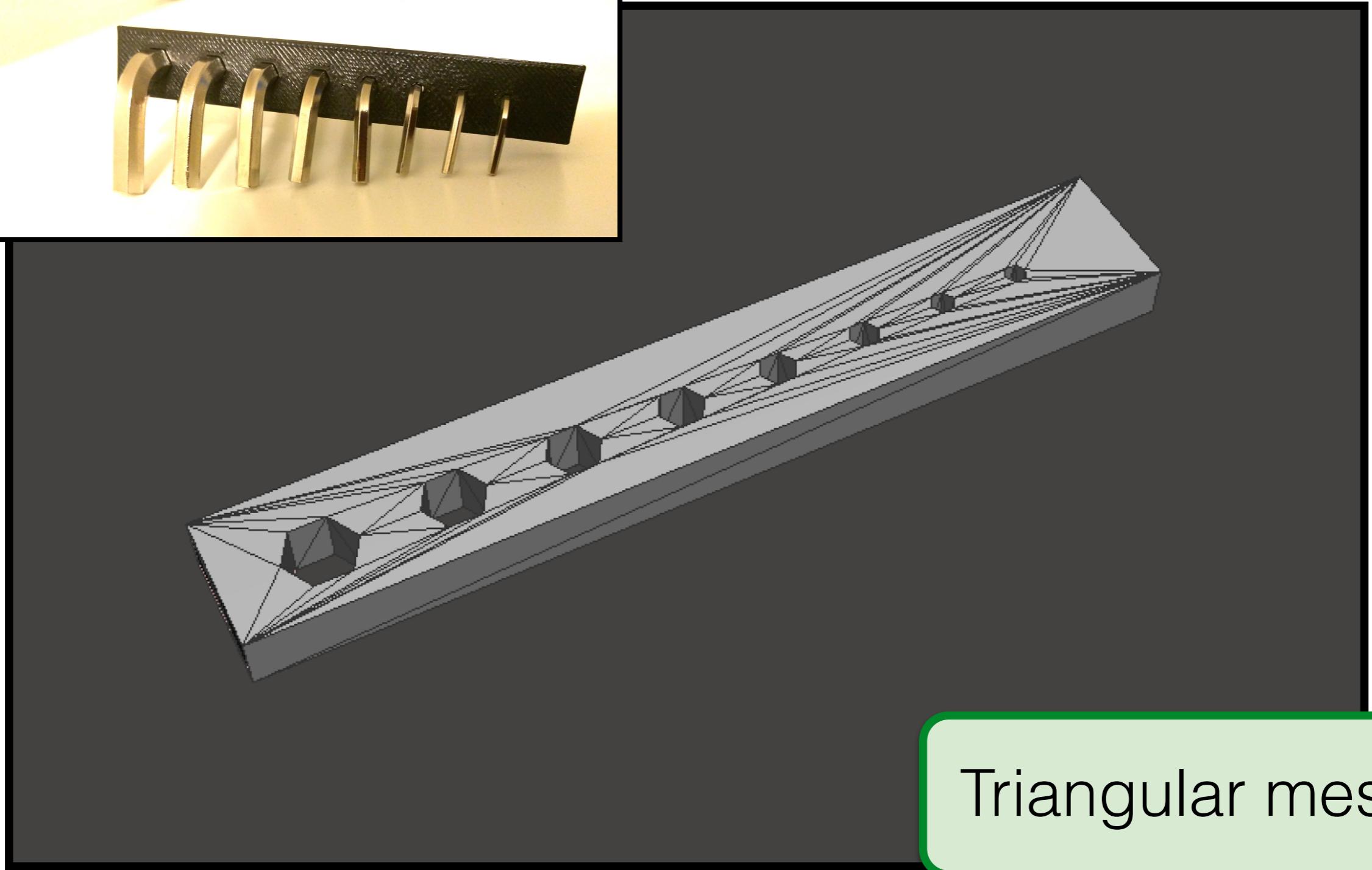
Thingiverse



GRAB**CAD**

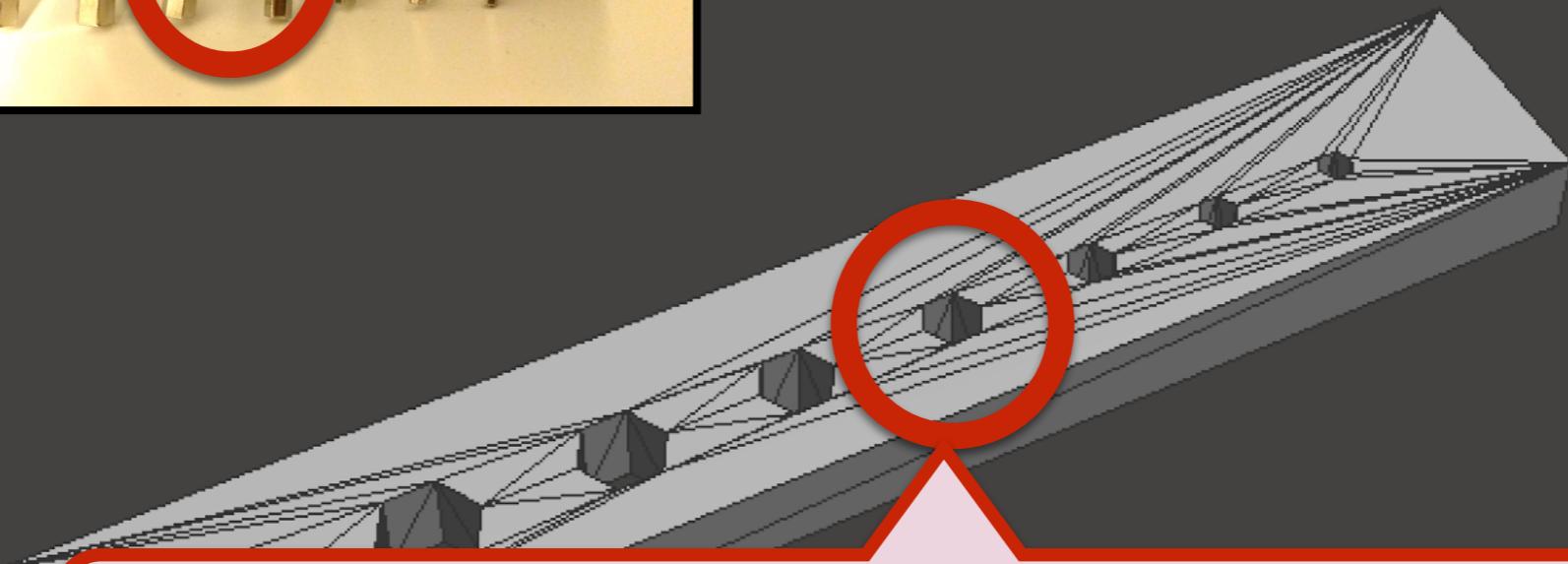
Online repositories

A mesh for a hex holder



Triangular mesh

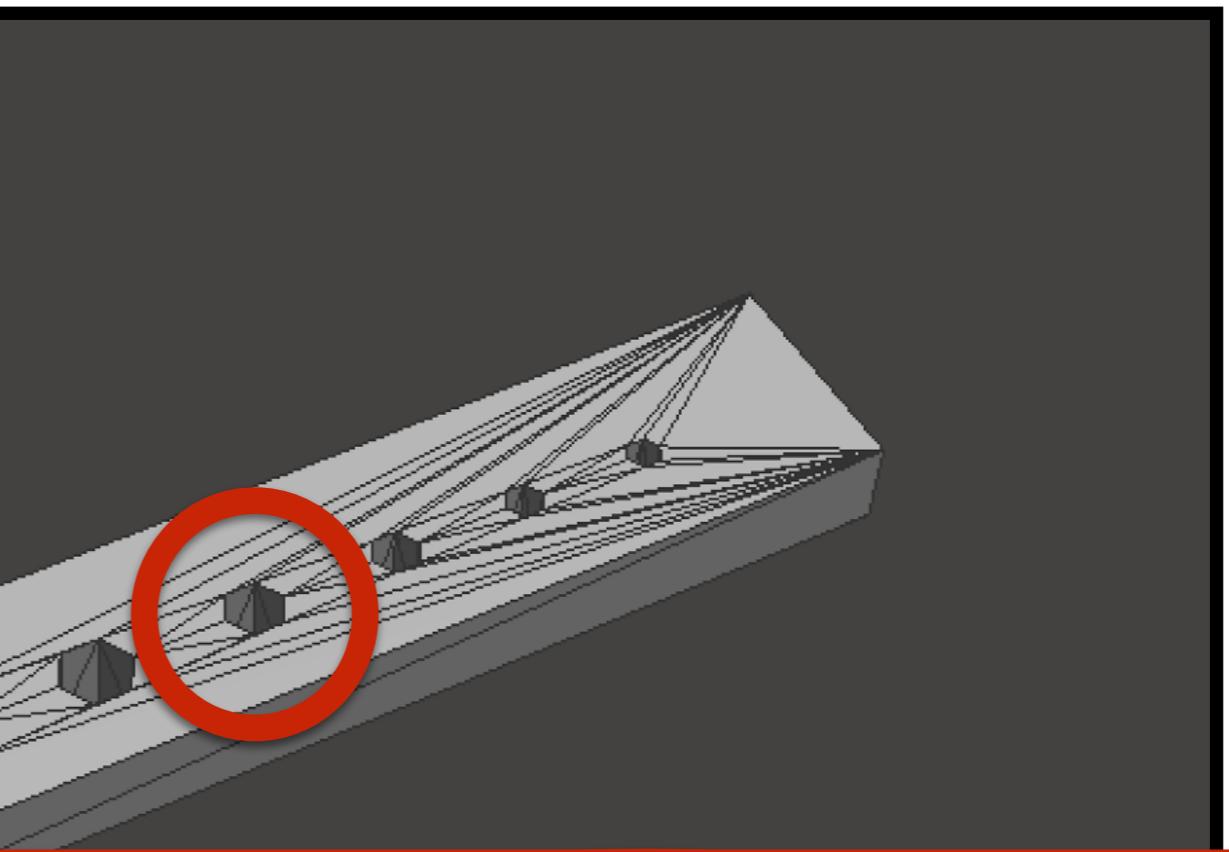
A mesh for a hex holder



Bent wrench not parallel to the rest :(

Need to rotate the fifth hole

A mesh for a hex holder

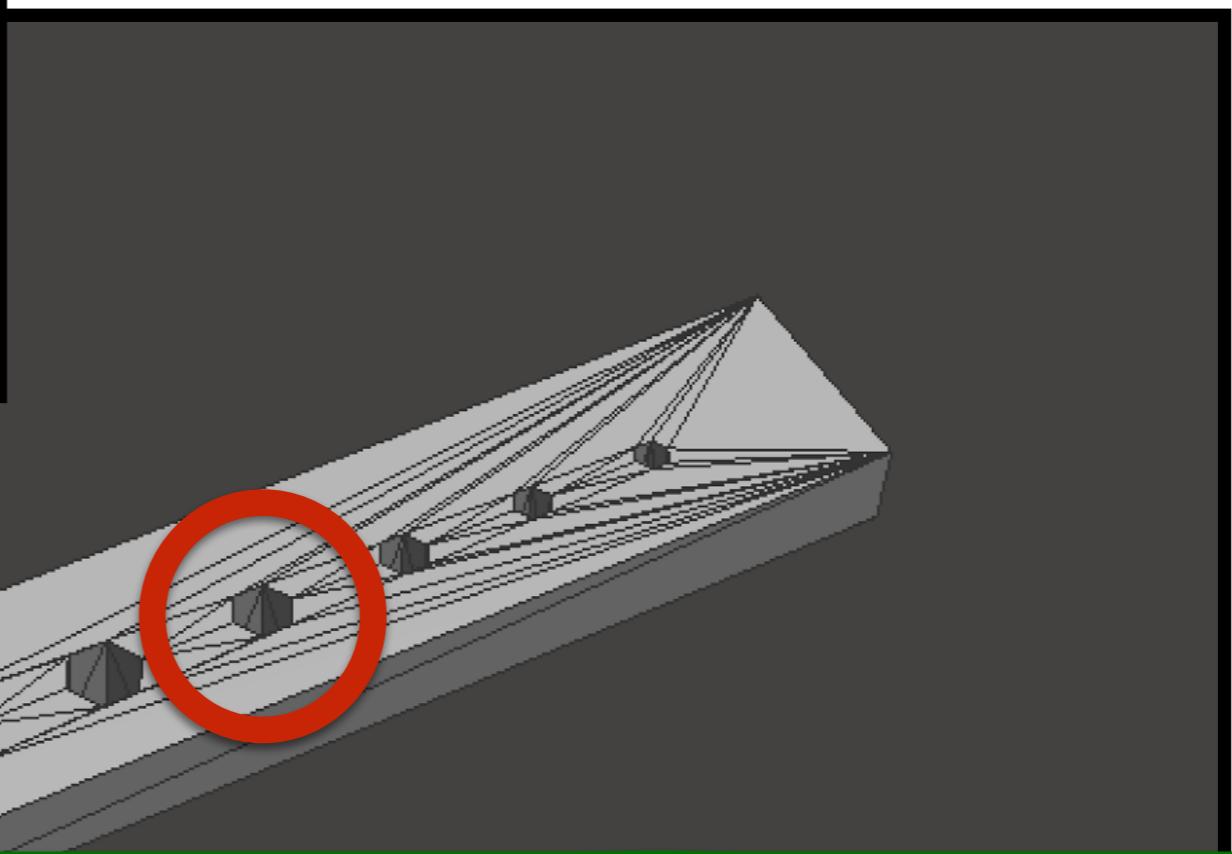


Simple mesh editing broke model

No abstraction

Move around the vertices manually

A mesh for a hex holder

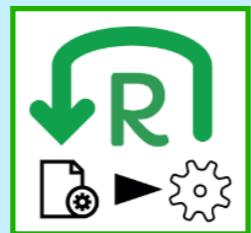


CAD (Computer Aided Design) editing is easier
Higher level of abstraction
Easier to visualize outcome

A mesh for a hex holder



Automatically infer CAD from Mesh!

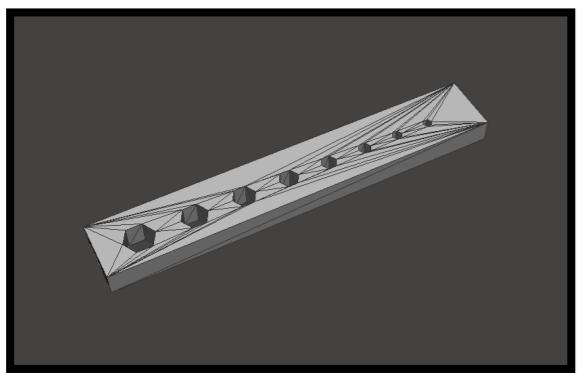


: *mesh → cad*

Higher level of abstraction

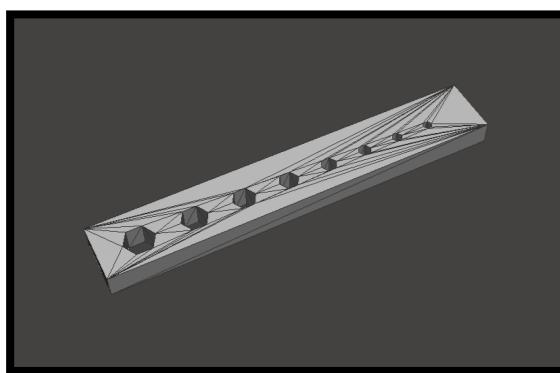
Easier to visualize outcome

Mesh

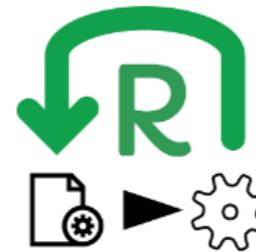


1600 LOC

Mesh



1600 LOC



difference (

scale (97.0, 25.0, 5.0) cube

trans (49.0, 13.0, 2.5) (

scale (7.0, 6.06, 5.0) (

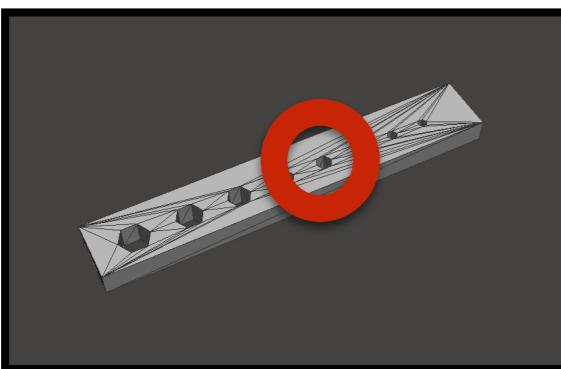
polyhedron 6))

...

)

80 LOC

Mesh



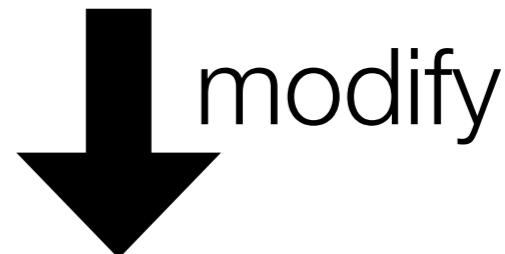
1600 LOC



Rotating by 35 degrees solved the problem!

```
difference (  
    scale (97.0, 25.0, 5.0) cube  
  
    trans (49.0, 13.0, 2.5) (  
        scale (7.0, 6.06, 5.0) (  
            polyhedron 6 ))  
  
    ...  
)
```

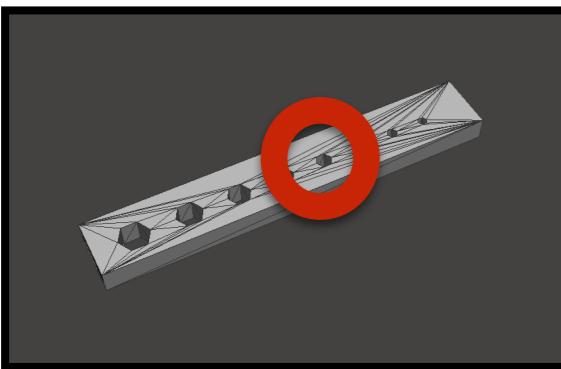
80 LOC



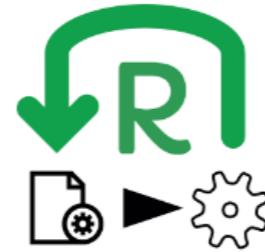
```
difference (  
    scale (97.0, 25.0, 5.0) cube  
  
    trans (49.0, 13.0, 2.5) (  
        scale (7.0, 6.06, 5.0) (  
            rotateZ (35.0)  
            polyhedron 6 )))  
  
    ...  
)
```



Mesh



1600 LOC



difference (

scale (97.0, 25.0, 5.0) cube

trans (49.0, 13.0, 2.5) (

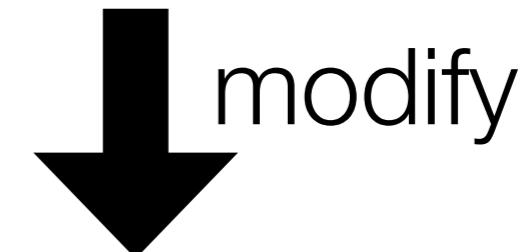
scale (7.0, 6.06, 5.0) (

polyhedron 6))

...

)

80 LOC



Rotating by 35 degrees solved the problem!



print

success

difference (

scale (97.0, 25.0, 5.0) cube

trans (49.0, 13.0, 2.5) (

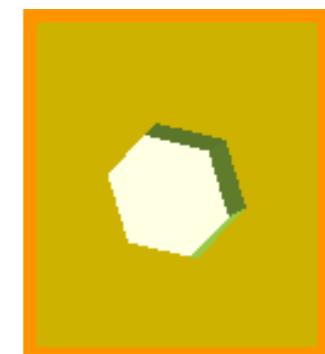
scale (7.0, 6.06, 5.0) (

rotateZ (35.0)

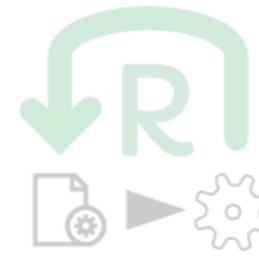
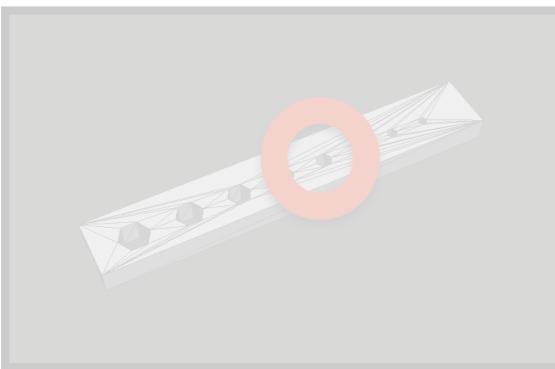
polyhedron 6)))

...

)



Mesh



difference (

scale (97.0, 25.0, 5.0) cube

trans (49.0, 13.0, 2.5) (

scale (7.0, 6.06, 5.0) (

polyhedron 6))

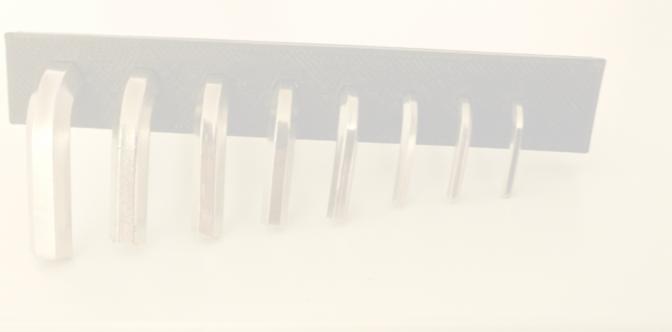
10

OC

Automatically infer CAD from Mesh!



: *mesh* → *cad*



print



trans (49.0, 13.0, 2.5) (

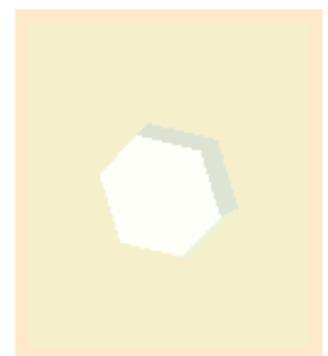
scale (7.0, 6.06, 5.0) (

rotateZ (35.0)

polyhedron 6)))

...
)

success



How?



Key insight: view the computational
fabrication pipeline as a compiler

How?



Key insight: view the computational fabrication pipeline as a compiler

PL foundations applied to computational fabrication to provide *clarity* and *usefulness*

Clarity

Denotational semantics, inductive definitions

Proof of correctness of a compiler from CAD to mesh

Usefulness

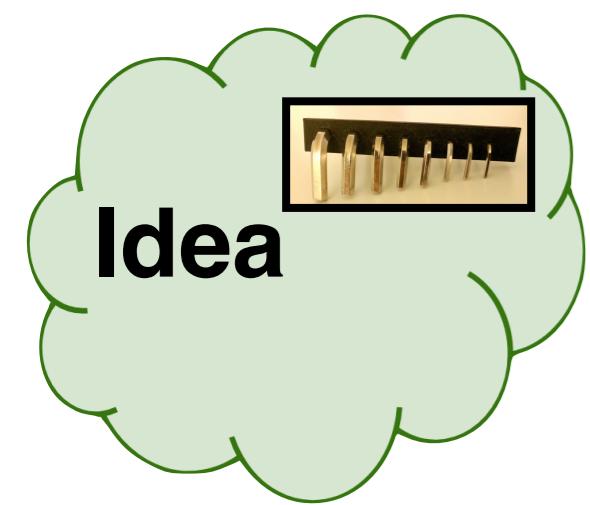
Program synthesis to reverse engineer CAD from mesh

Talk Outline

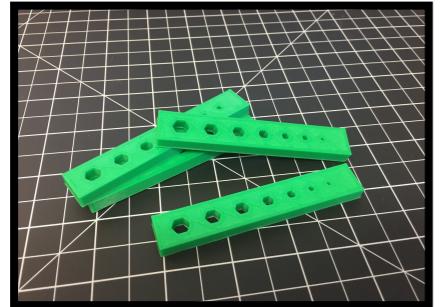
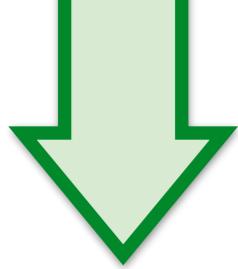
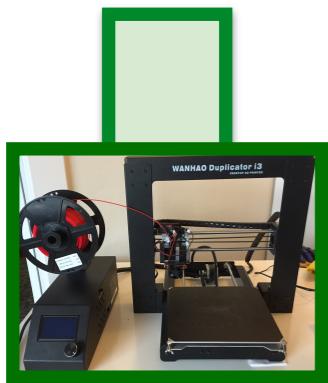
- 3D Printing Workflow
- *Clarity* achieved by applying FP to fabrication
- *Usefulness*: the first decompiler from mesh to CAD

Talk Outline

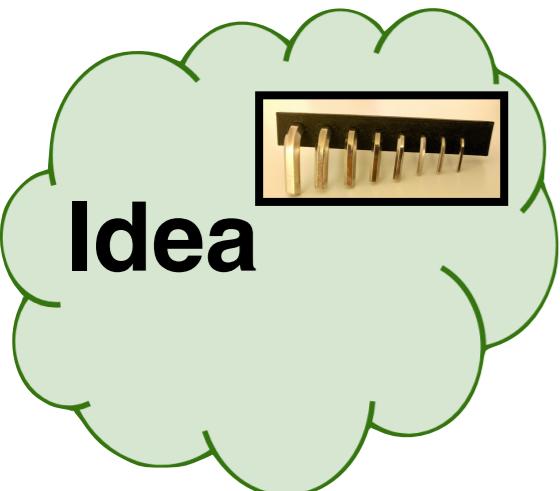
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Idea

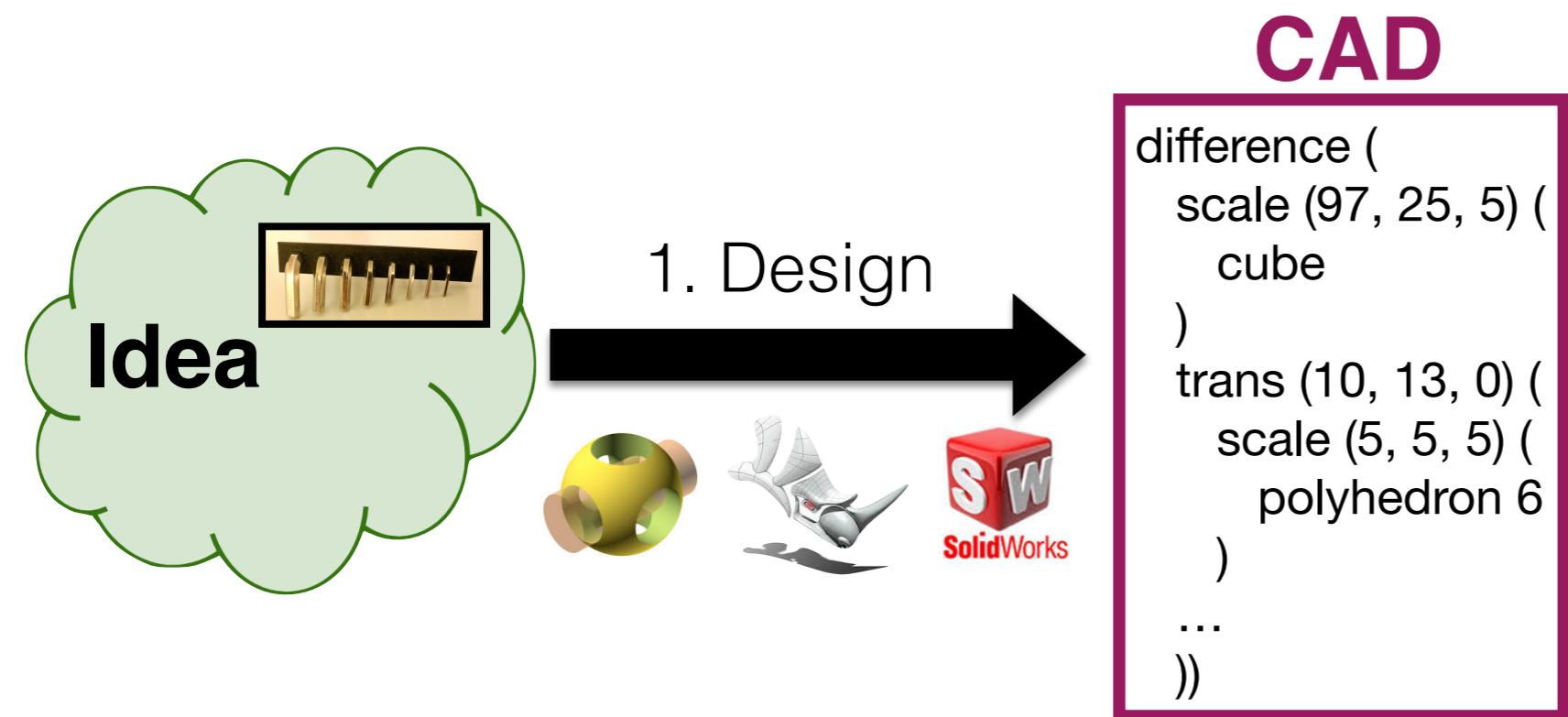


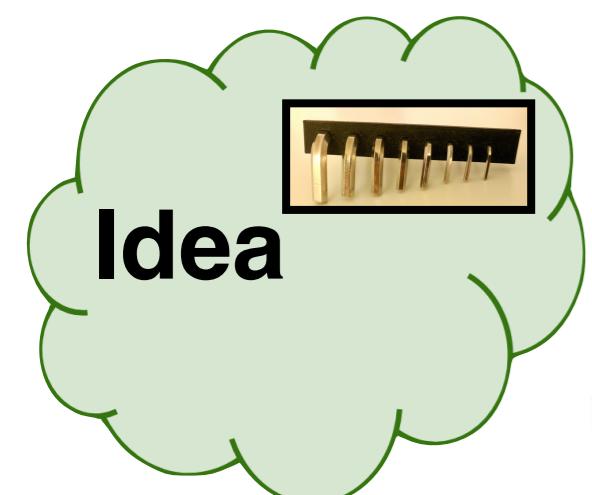
3D printing workflow



Idea

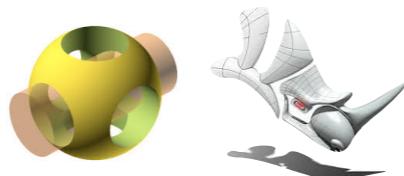






Idea

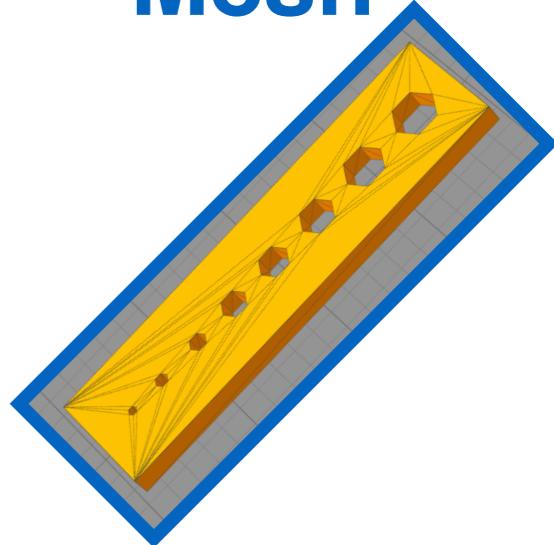
1. Design



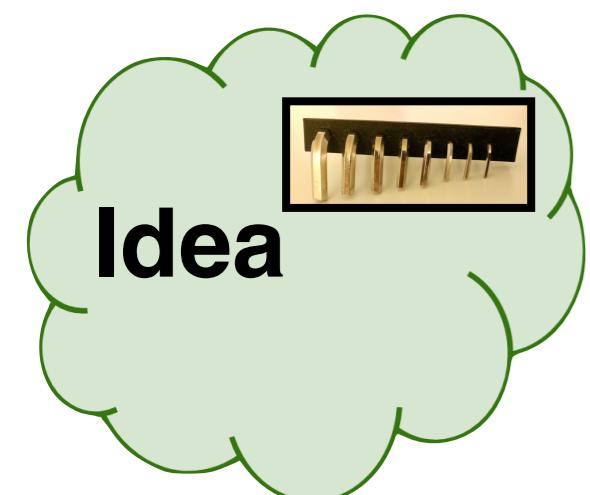
CAD

```
difference (   
    scale (97, 25, 5) (   
        cube  
    )  
    trans (10, 13, 0) (   
        scale (5, 5, 5) (   
            polyhedron 6  
        )  
        ...  
    ))
```

2. Compile



Mesh



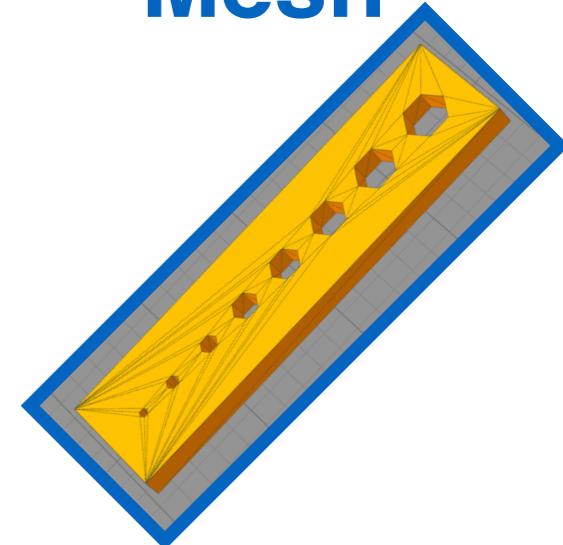
1. Design



CAD

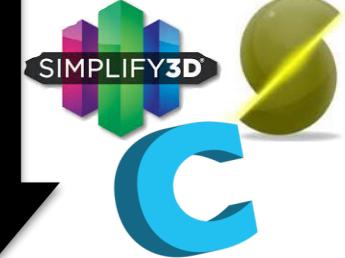
```
difference (
    scale (97, 25, 5) (
        cube
    )
    trans (10, 13, 0) (
        scale (5, 5, 5) (
            polyhedron 6
        )
    ...
))
```

Mesh



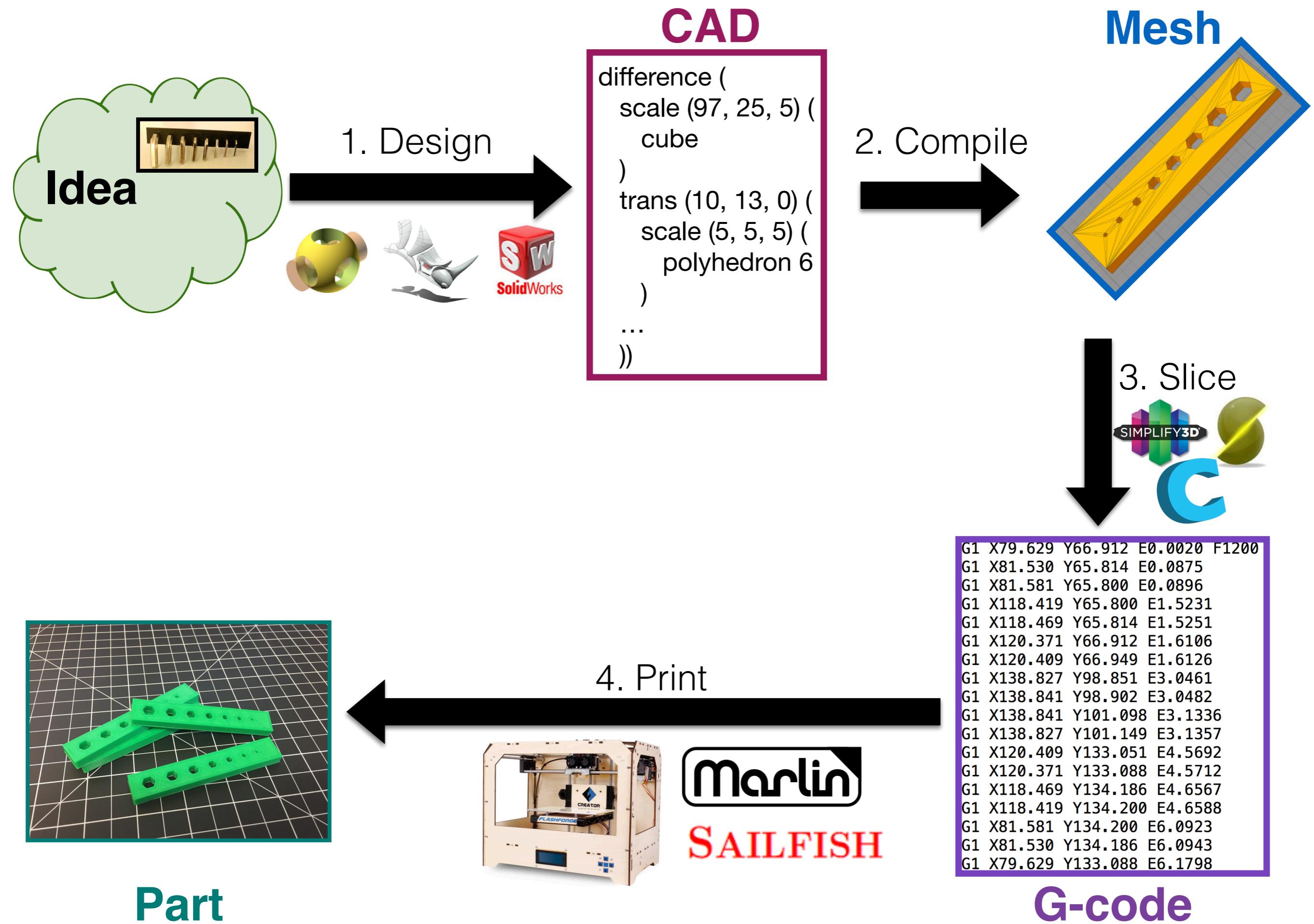
2. Compile

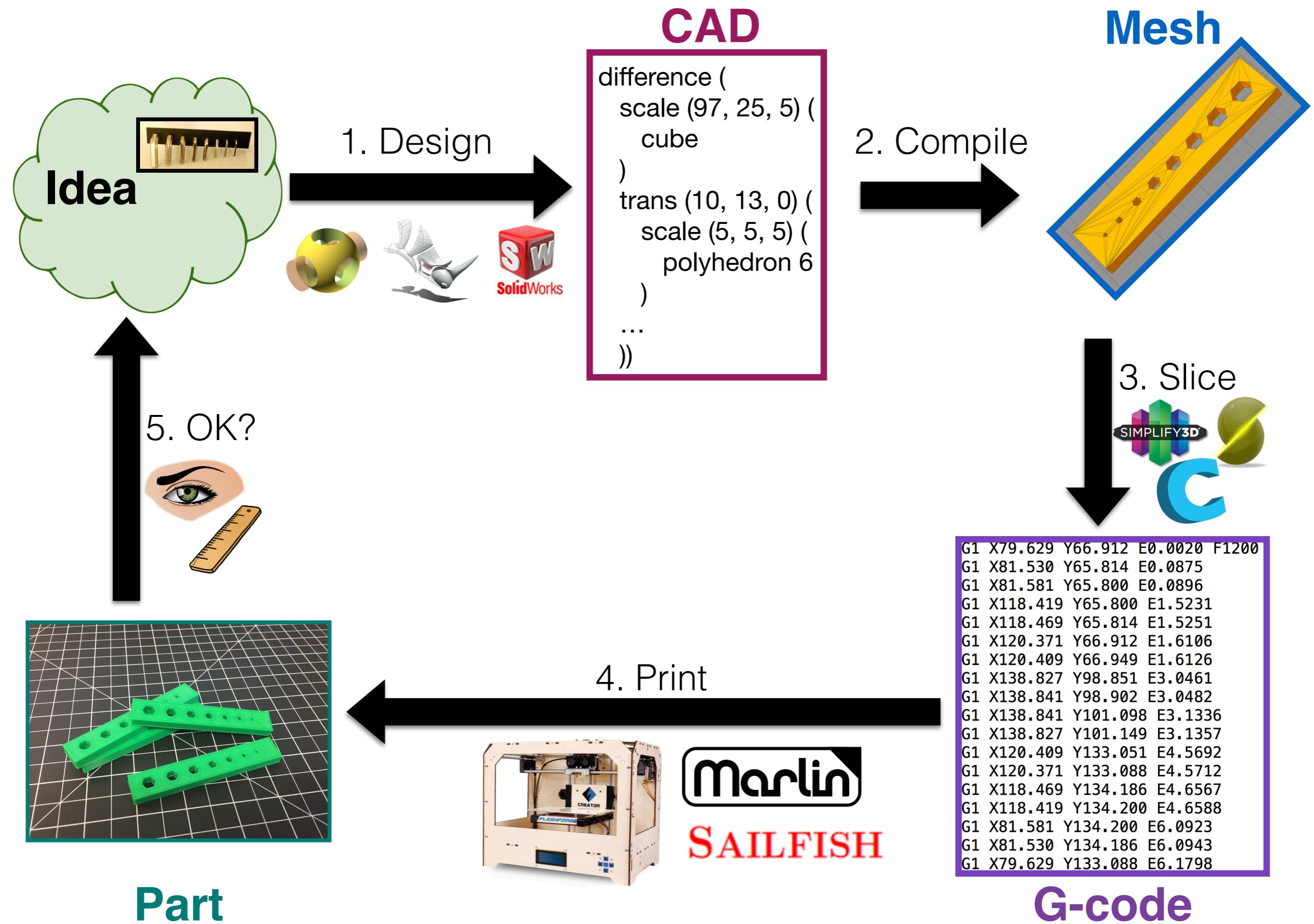
3. Slice

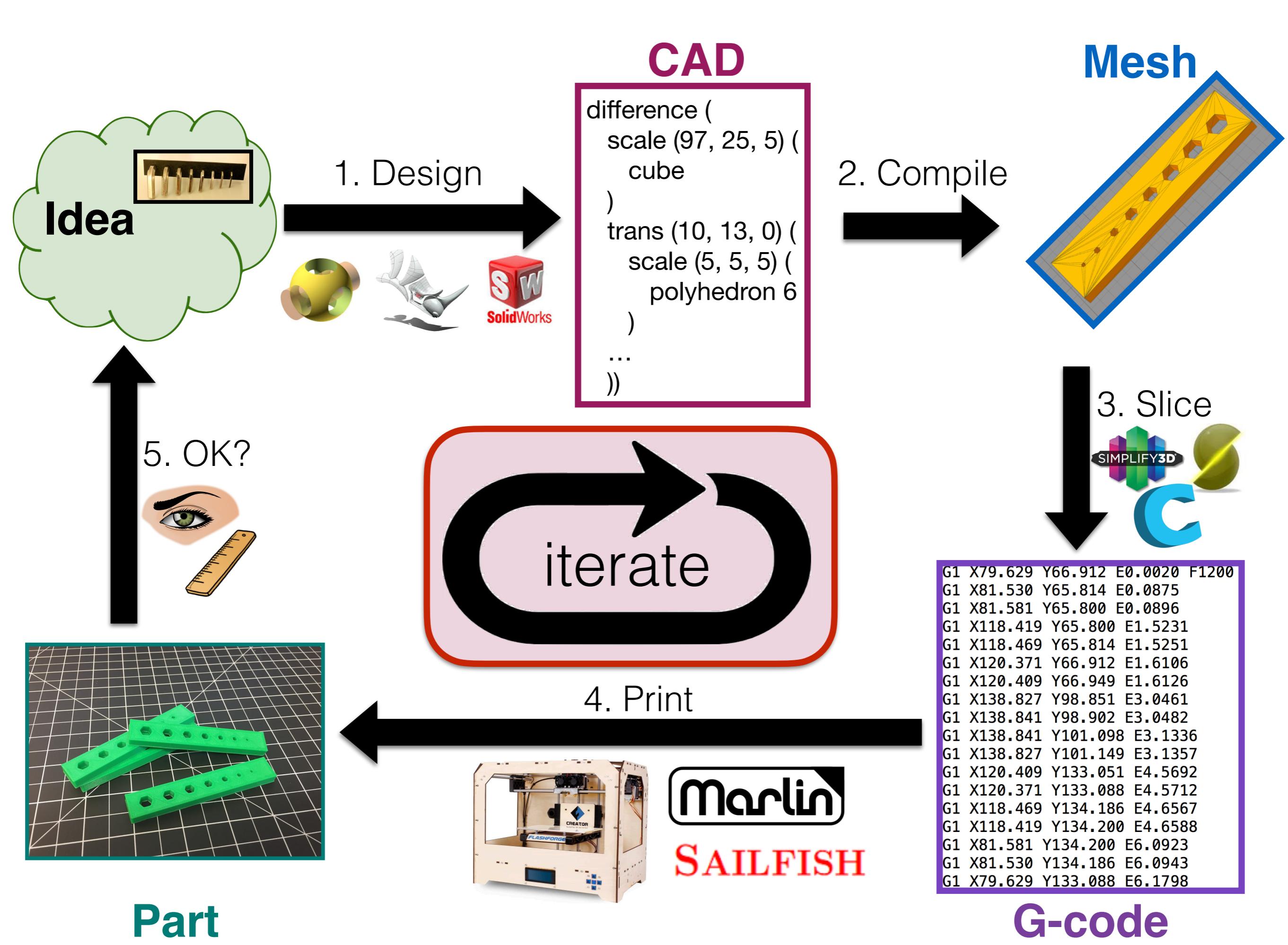


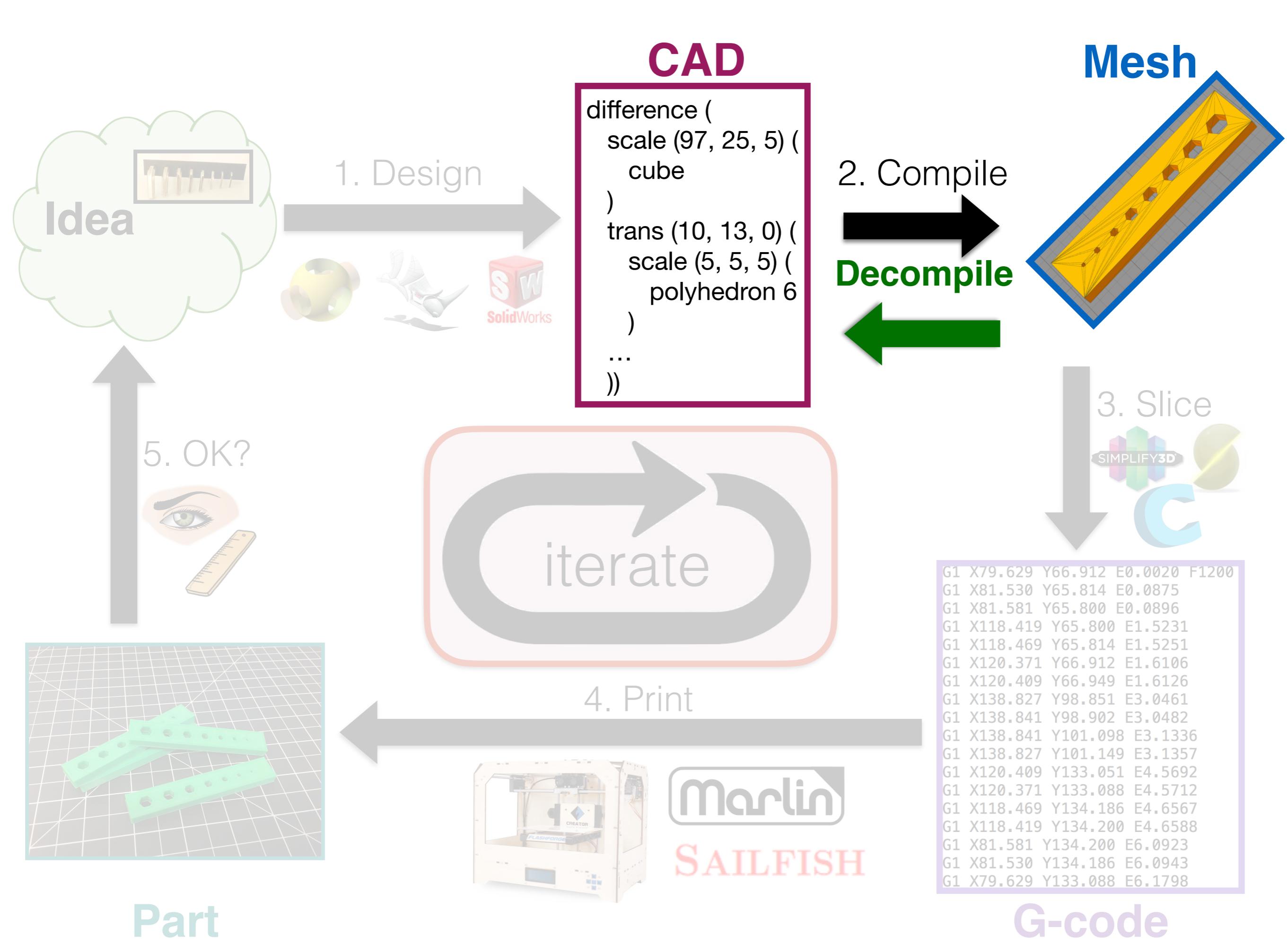
```
G1 X79.629 Y66.912 E0.0020 F1200
G1 X81.530 Y65.814 E0.0875
G1 X81.581 Y65.800 E0.0896
G1 X118.419 Y65.800 E1.5231
G1 X118.469 Y65.814 E1.5251
G1 X120.371 Y66.912 E1.6106
G1 X120.409 Y66.949 E1.6126
G1 X138.827 Y98.851 E3.0461
G1 X138.841 Y98.902 E3.0482
G1 X138.841 Y101.098 E3.1336
G1 X138.827 Y101.149 E3.1357
G1 X120.409 Y133.051 E4.5692
G1 X120.371 Y133.088 E4.5712
G1 X118.469 Y134.186 E4.6567
G1 X118.419 Y134.200 E4.6588
G1 X81.581 Y134.200 E6.0923
G1 X81.530 Y134.186 E6.0943
G1 X79.629 Y133.088 E6.1798
```

G-code









Talk Outline

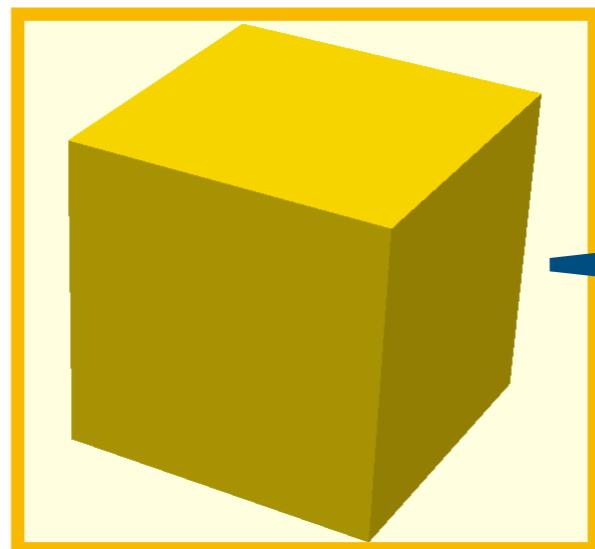
- 3D Printing Workflow
- *Clarity* achieved by applying FP to fabrication
- *Usefulness*: the first decompiler from mesh to CAD

Talk Outline

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 - Inductive compiler definition
 - Proof of correctness for compiler
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cube

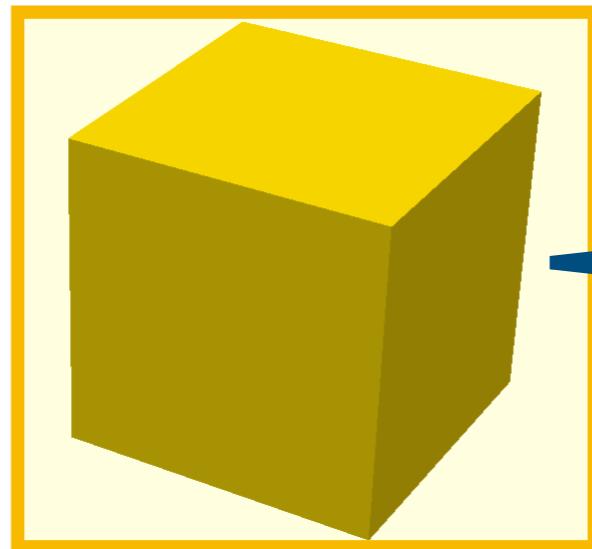
CAD



3D primitive
representing a
cube of unit
length

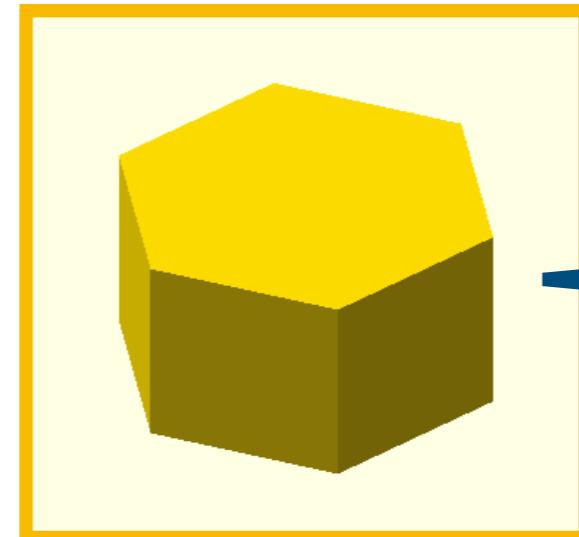
CAD

cube



3D primitive
representing a
cube of unit
length

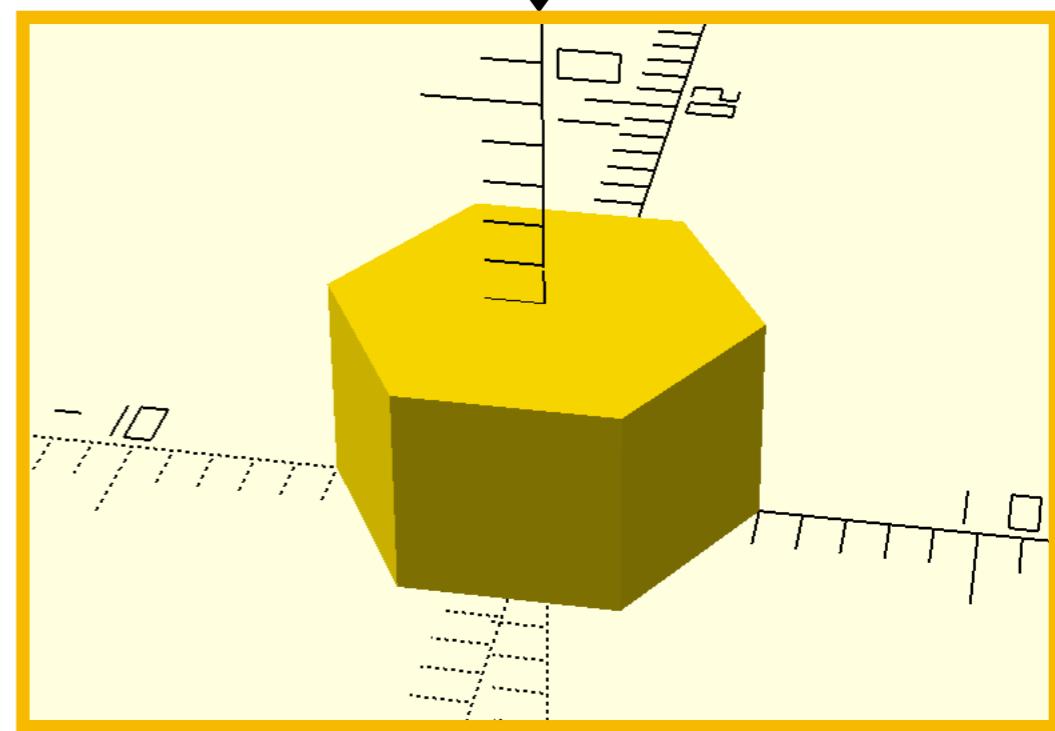
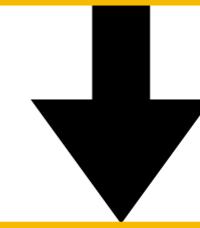
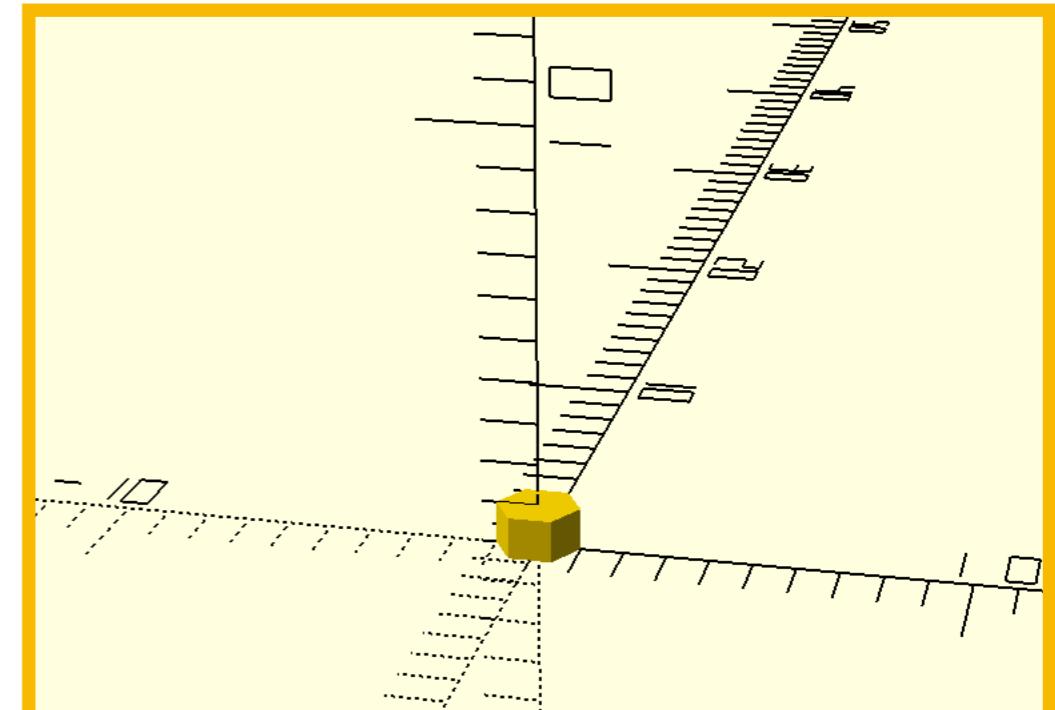
polyhedron 6



3D primitive
representing a
hexagonal
prism

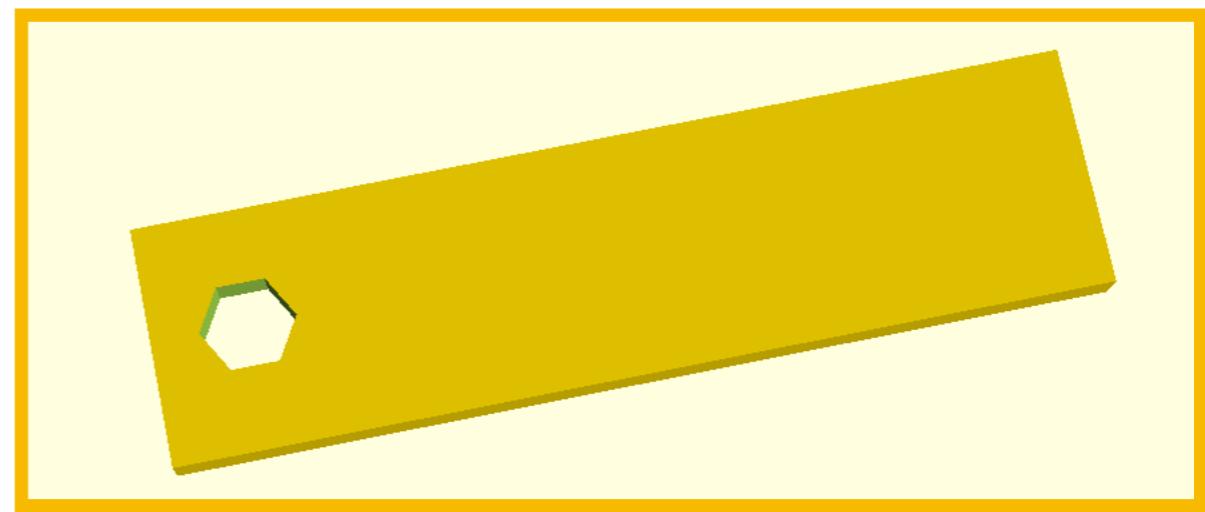
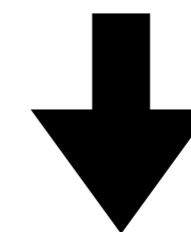
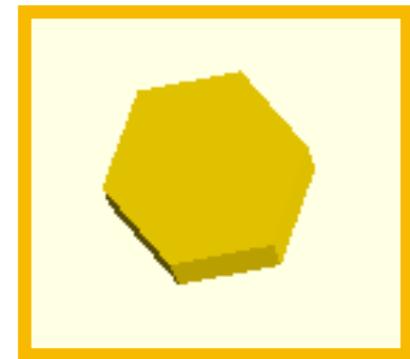
CAD

scale (5, 5, 5) polyhedron 6



CAD

```
difference (  
    scale (97, 25, 5) (  
        cube  
)  
    trans (10, 13, 0) (  
        scale (5, 5, 5) (  
            polyhedron 6  
)  
)
```



CAD

rotateX
rotateY
rotateZ
translation
scale

$c ::=$ *Empty*
Cube
Polyhedron \mathbb{N}
Affine $\mathbb{R}^{3 \times 3}$ \mathbb{R}^3 c
Binop op c c

$op ::=$ *Union*
Difference
Intersection

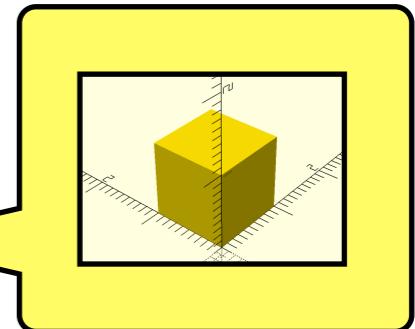
Linear transformation
matrix: $\mathbb{R}^{3 \times 3}$
Vector: \mathbb{R}^3

CAD: Denotational semantics

$\llbracket c \rrbracket_{cad} : \{all\ points\ inside\ c\}$

$\llbracket Empty \rrbracket_{cad} = \{\}$

$\llbracket Cube \rrbracket_{cad} = \{(0, 1)^3\}$

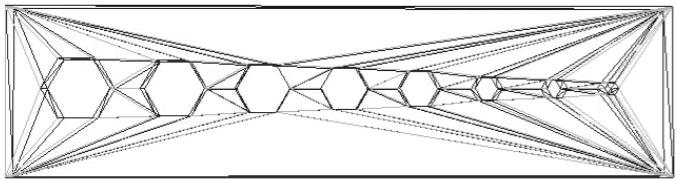


$\llbracket Affine\ p\ q\ c \rrbracket_{cad} = \{pv + q | v \in \llbracket c \rrbracket_{cad}\}$

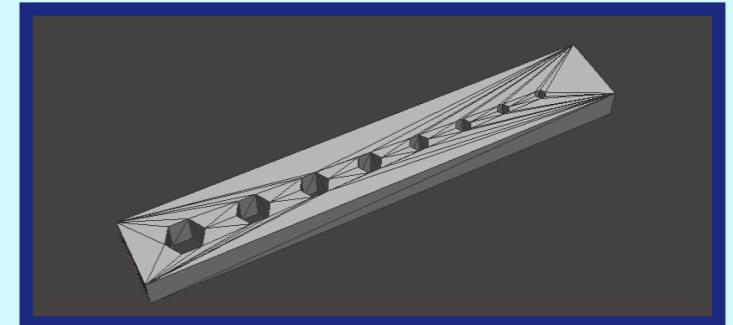
$\llbracket Binop\ Union\ c_1\ c_2 \rrbracket_{cad} = \llbracket c_1 \rrbracket_{cad} \cup \llbracket c_2 \rrbracket_{cad}$

Regular opens

Mesh



List of faces

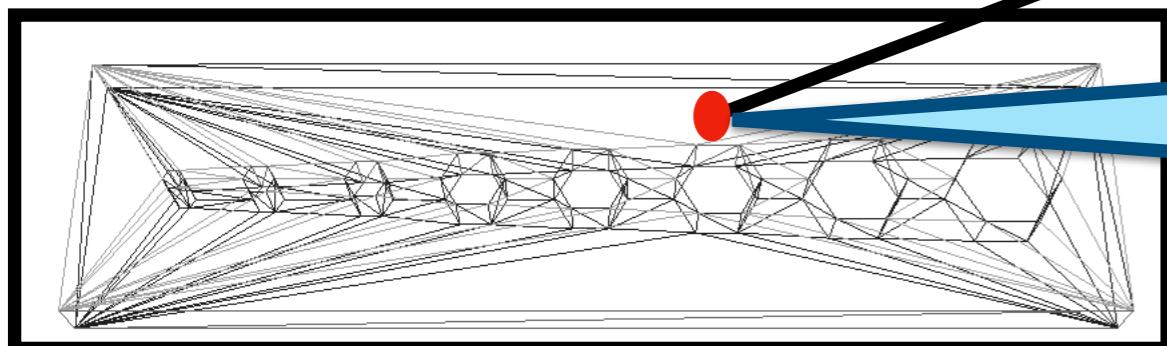


A face is a triangular plane

Convenient for geometric operations
CAD tool agnostic
Standard format for 3D models
Widely shared in online repositories

Mesh: Denotational semantics

$\llbracket m \rrbracket_{mesh} : \{all\ points\ inside\ m\}$



pt is inside m iff a ray starting at pt crosses an **odd** number of faces of m

Key insight: view the computational fabrication pipeline as a compiler

CAD is based on *solid* geometry, mesh is based on *surface* geometry

We need tools that relate these two different representations



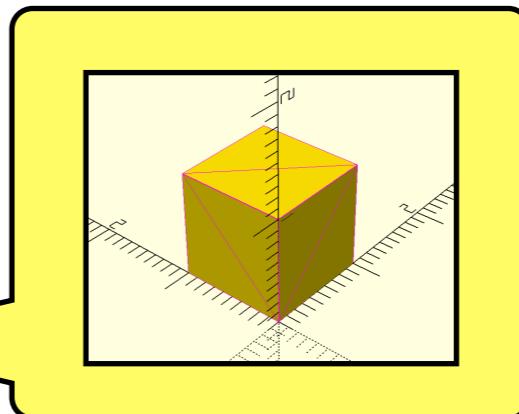
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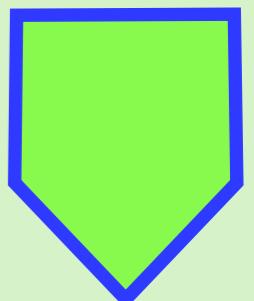
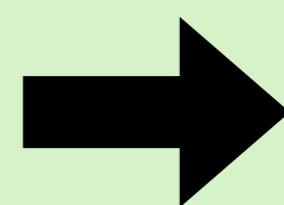
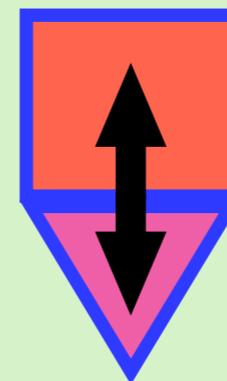
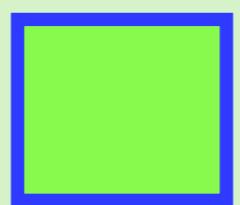
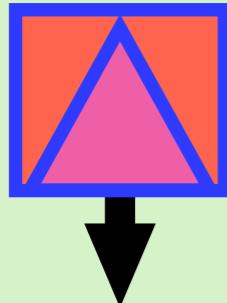
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 - Inductive compiler definition
 - Proof of correctness for compiler
- *Usefulness*: the first decompiler from mesh to CAD

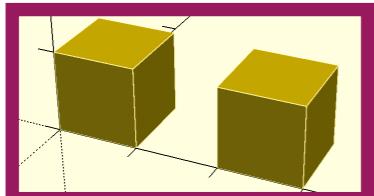
Compiling CAD to mesh

$$\text{compile} : c \rightarrow m$$
$$\text{compile cube} = m_{\text{cube}}$$

$$\text{compile } (\text{Affine } p \ q \ c) = \text{map}_{\text{vertex}}(\lambda v. pv + q) \ (\text{compile } c)$$
$$\text{compile } (\text{Binop } \cup \ c_1 \ c_2) = \text{meshBinop}(\cup) \ (\text{compile}(c_1), \text{compile}(c_2))$$

Regular opens at mesh level too: check normals!

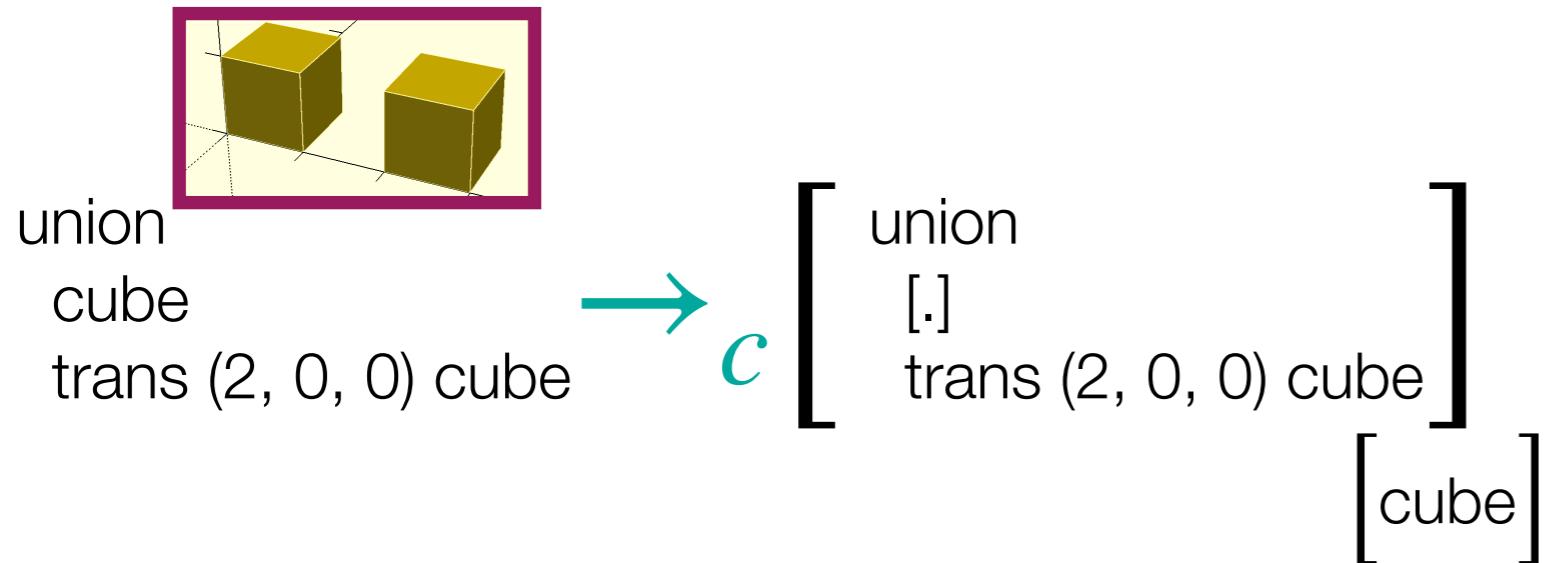


Compiler on an example

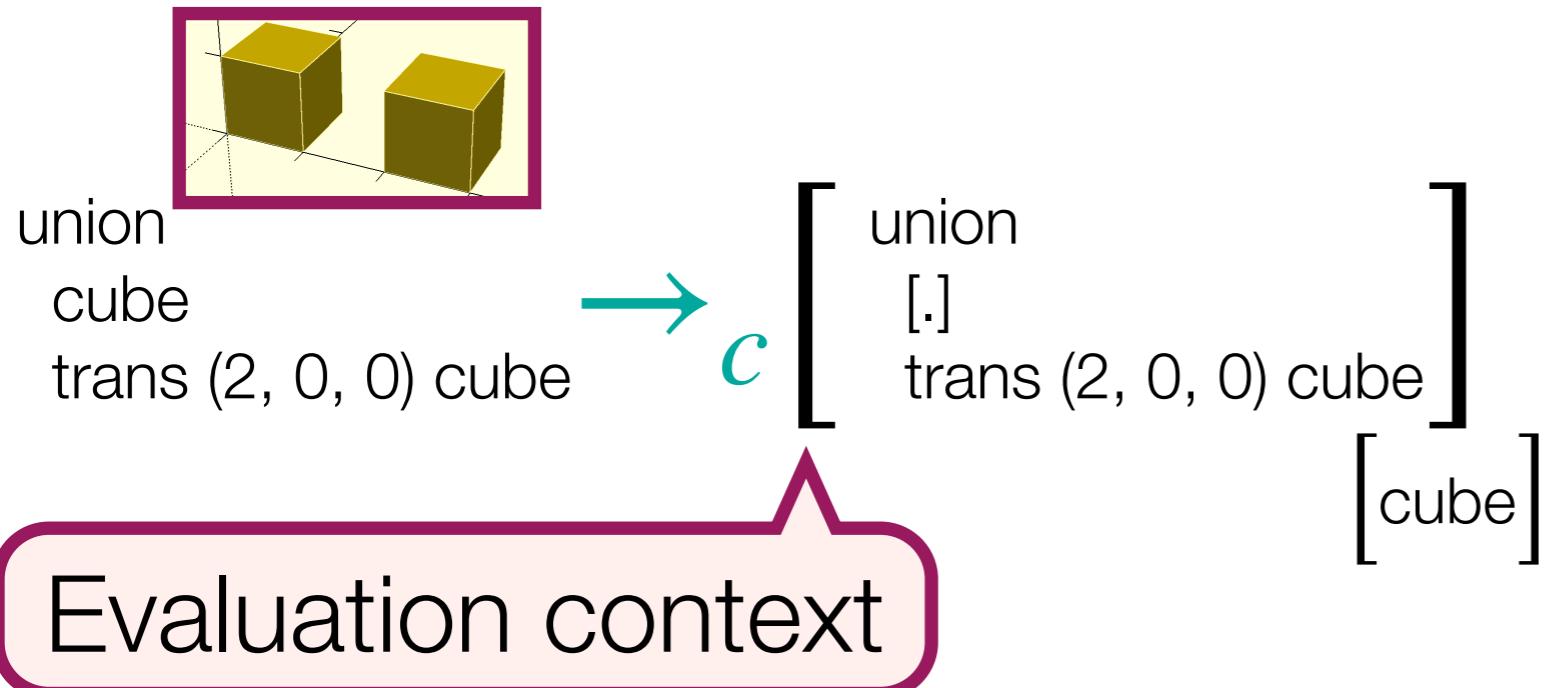


union
cube
trans (2, 0, 0) cube

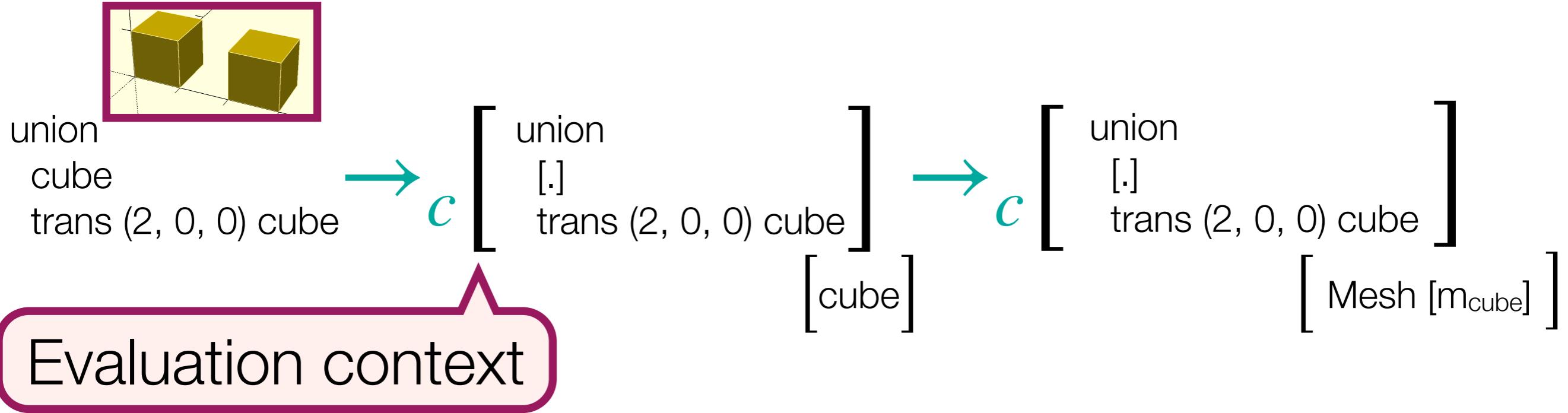
Compiler on an example



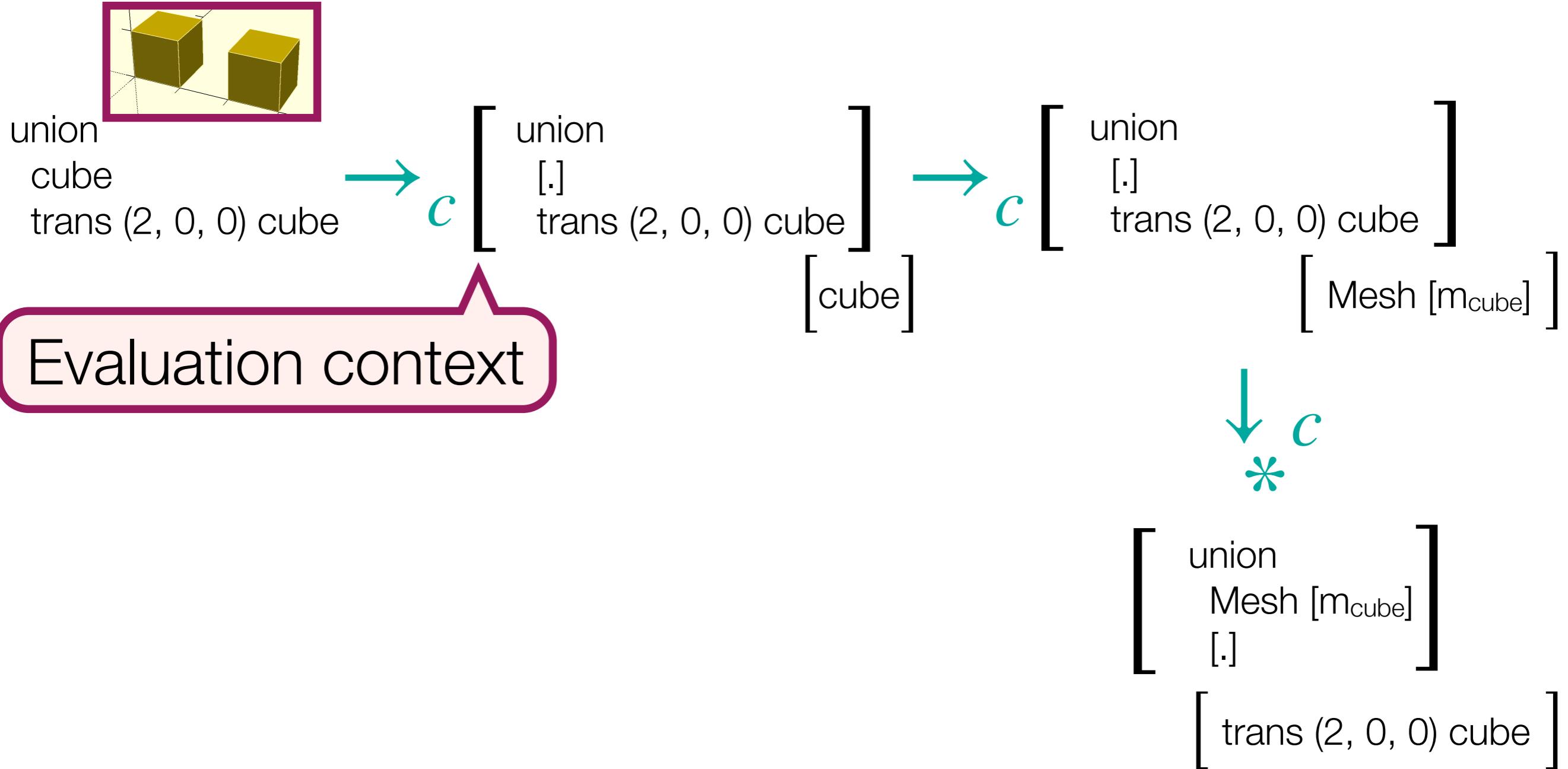
Compiler on an example



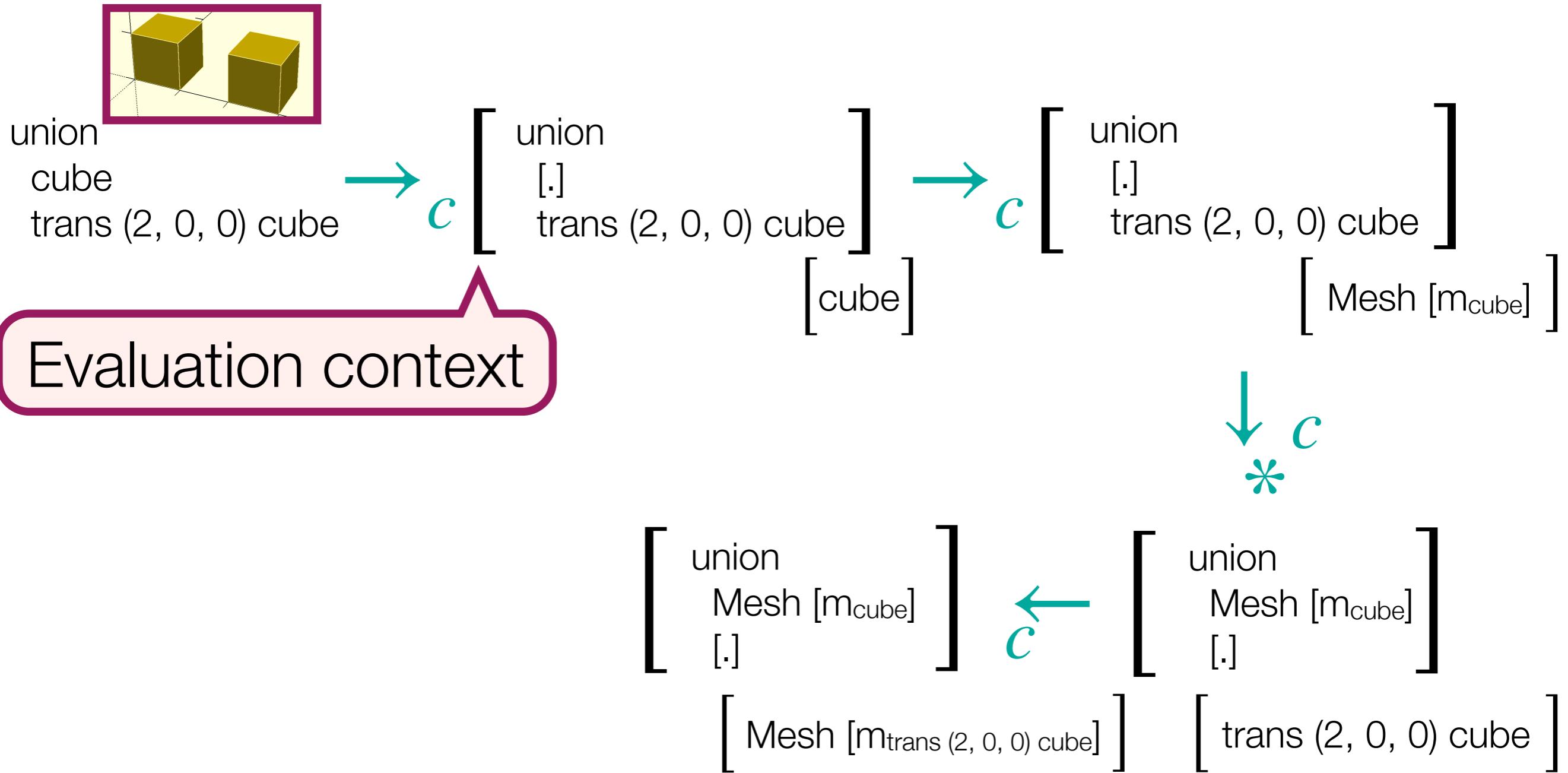
Compiler on an example



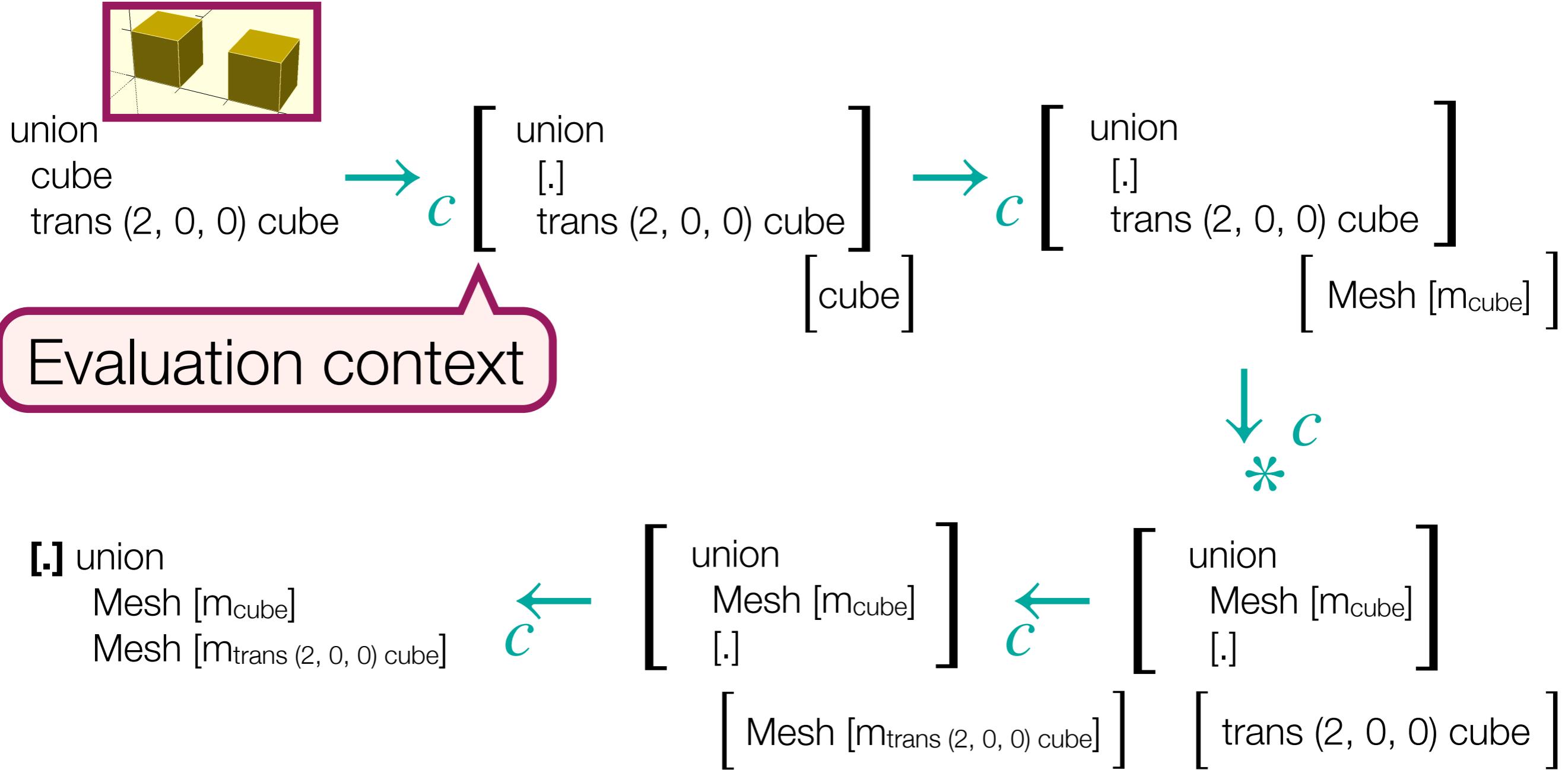
Compiler on an example



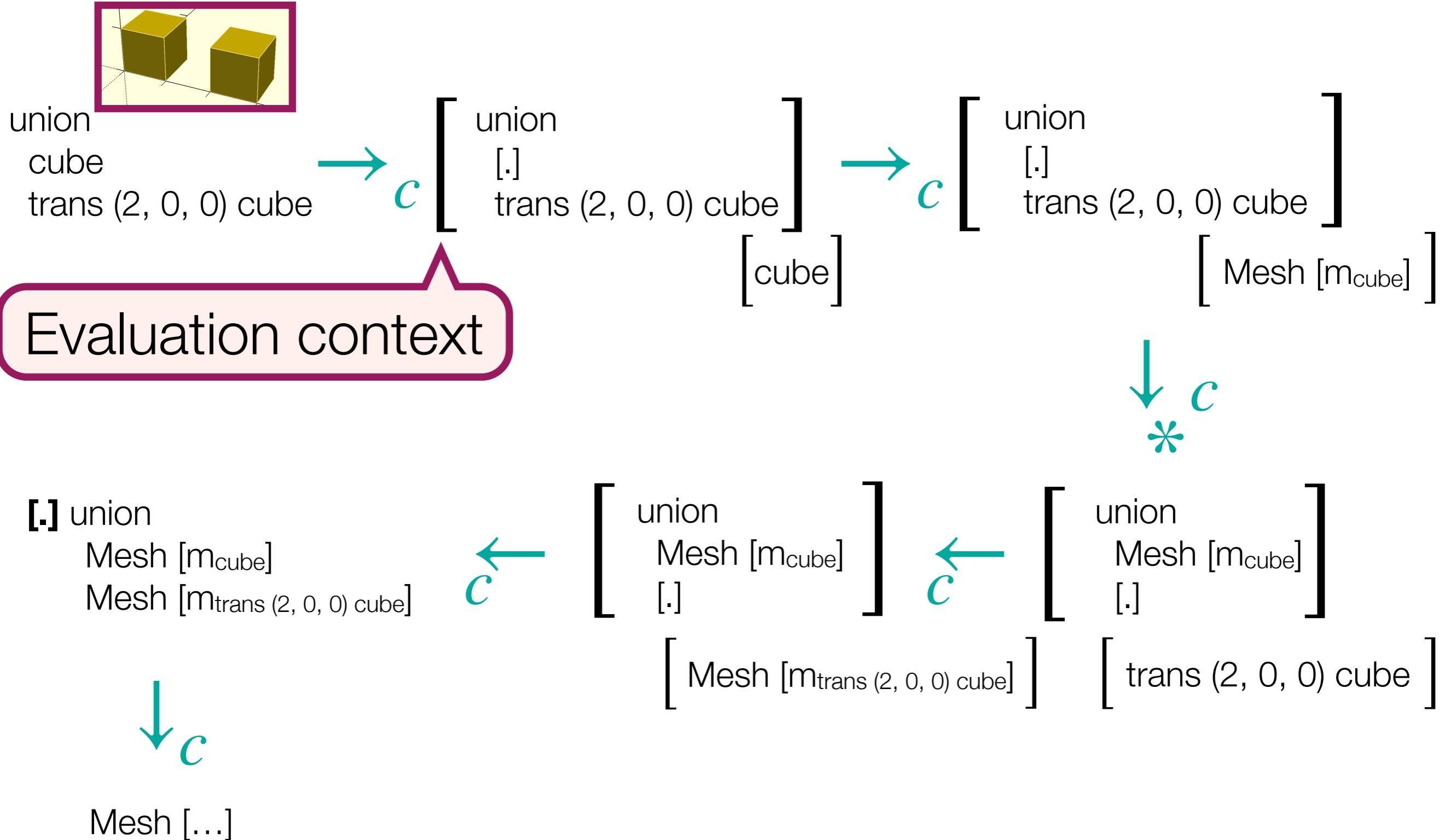
Compiler on an example



Compiler on an example

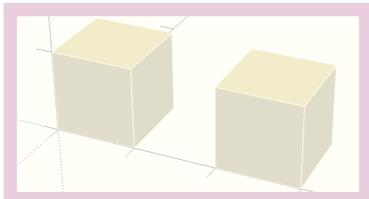


Compiler on an example

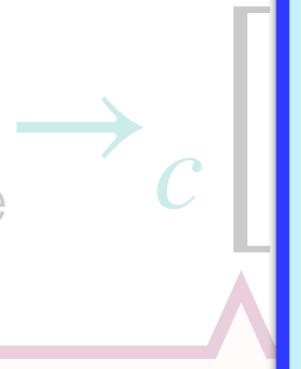


Compiler on an example

union cube



trans (2, 0, 0) cube



Evaluation context

[.] union

Mesh [m_{cube}]

Mesh [m_{trans (2, 0, 0) cube}]



Mesh [...]

TRICKY when faces overlap!

Need to split meshes w.r.t one another to resolve overlaps

Need to determine which faces from *compile*(c_1) and *compile*(c_2) to keep in the final mesh

Talk Outline

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Compiler Proof

$$Thm : \forall e, [\text{compile } e]_{mesh} = [e]_{cad}$$

Proof: By induction on e

- Case Primitives: ...
- Case Affine Transformations: ...
- Case Union:

Compiler Proof

$Thm : \forall e, [\![\text{compile } e]\!]_{mesh} = [\![e]\!]_{cad}$

Proof: By induction on e

- Case Primitives: ...
- Case Affine Transformations: ...
- Case Union:

Union lemma

$[\![\text{meshBinop } (\text{Union}) (m_1, m_2)]\!]_{mesh} = [\![m_1]\!]_{mesh} \cup [\![m_2]\!]_{mesh}$

Compiler Proof

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Union lemma

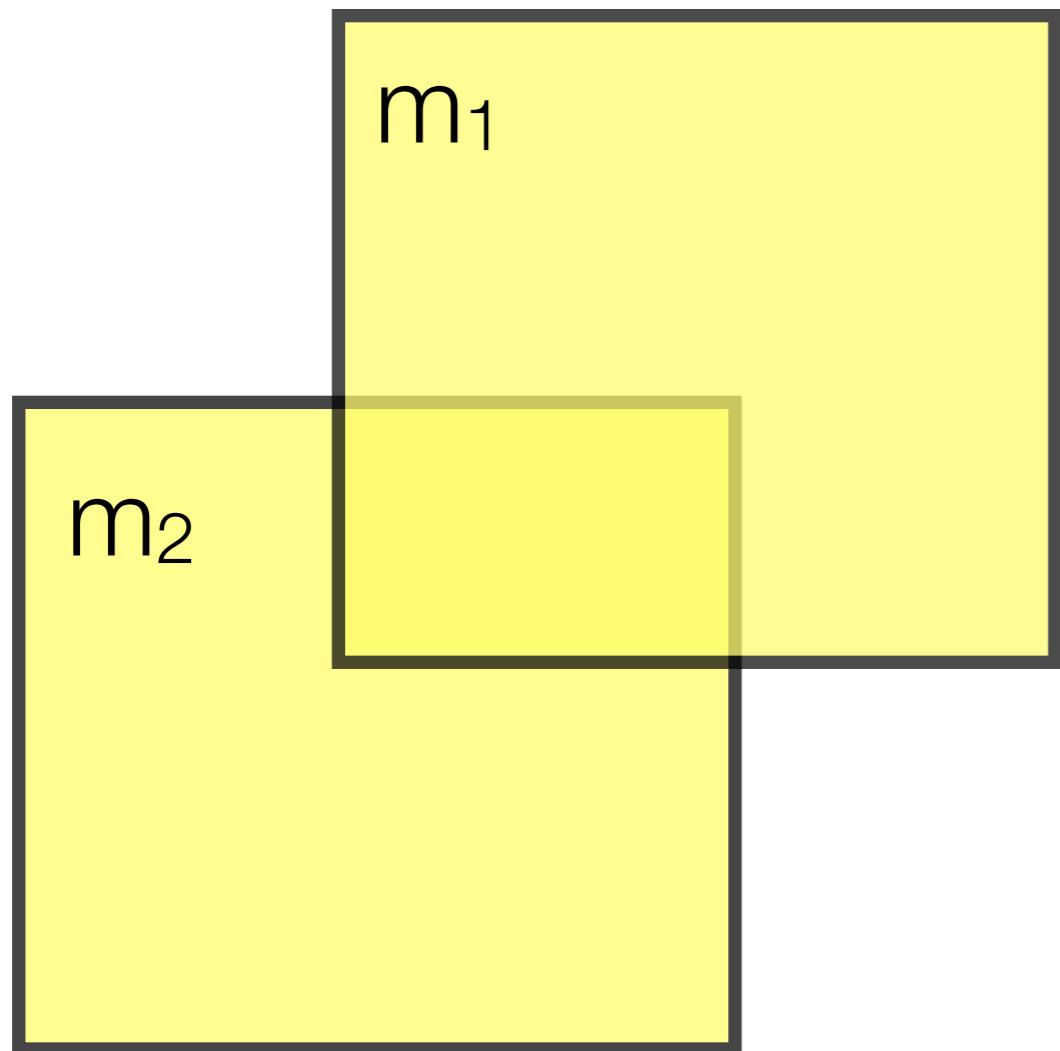
$[\![\text{meshBinop (Union)} (m_1, m_2)]\!]_{mesh} = [\![m_1]\!]_{mesh} \cup [\![m_2]\!]_{mesh}$

$\text{let } m_3 = mBop (\text{Union}) (m_1, m_2)$

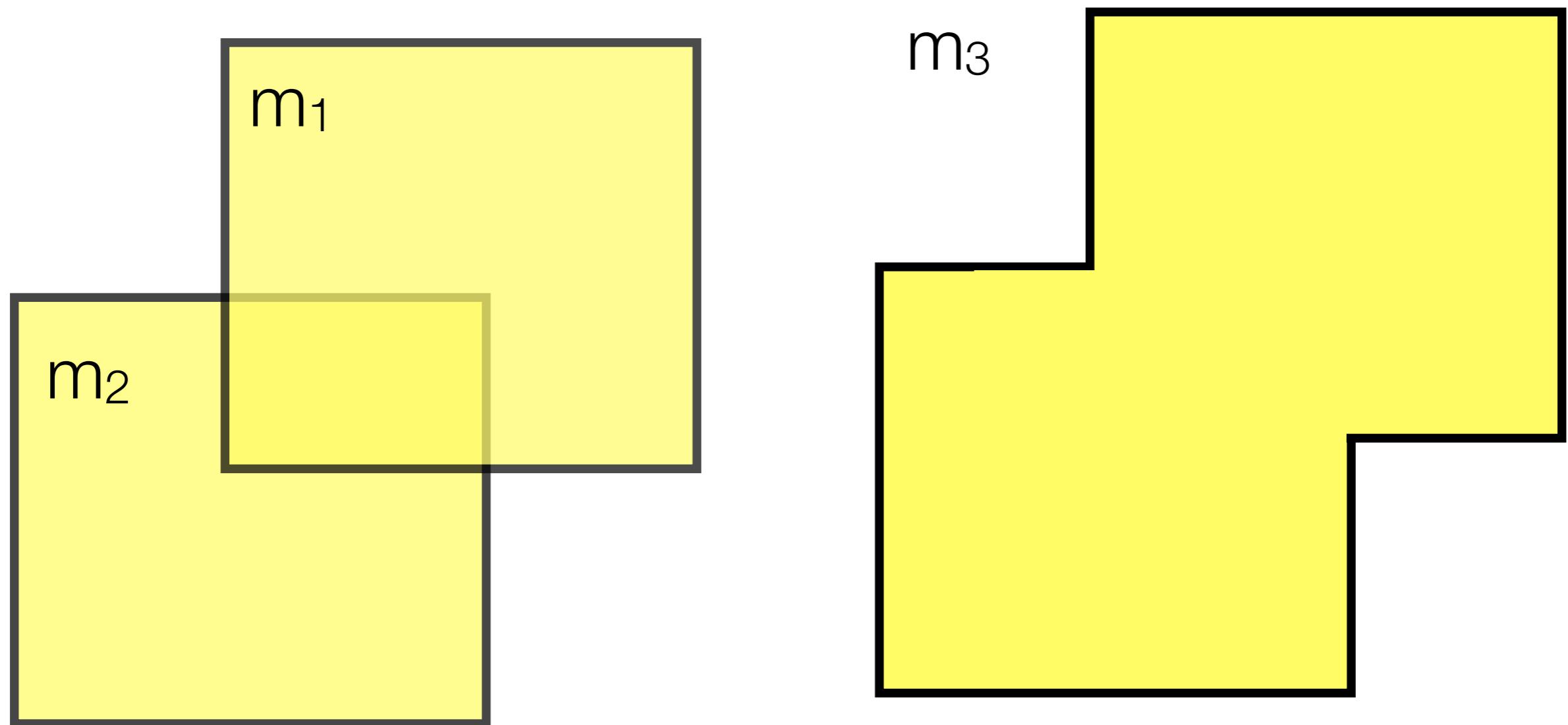
$pt \in [\![m_3]\!]_{mesh} \iff pt \in [\![m_1]\!]_{mesh} \cup [\![m_2]\!]_{mesh}$

Use Ray casting

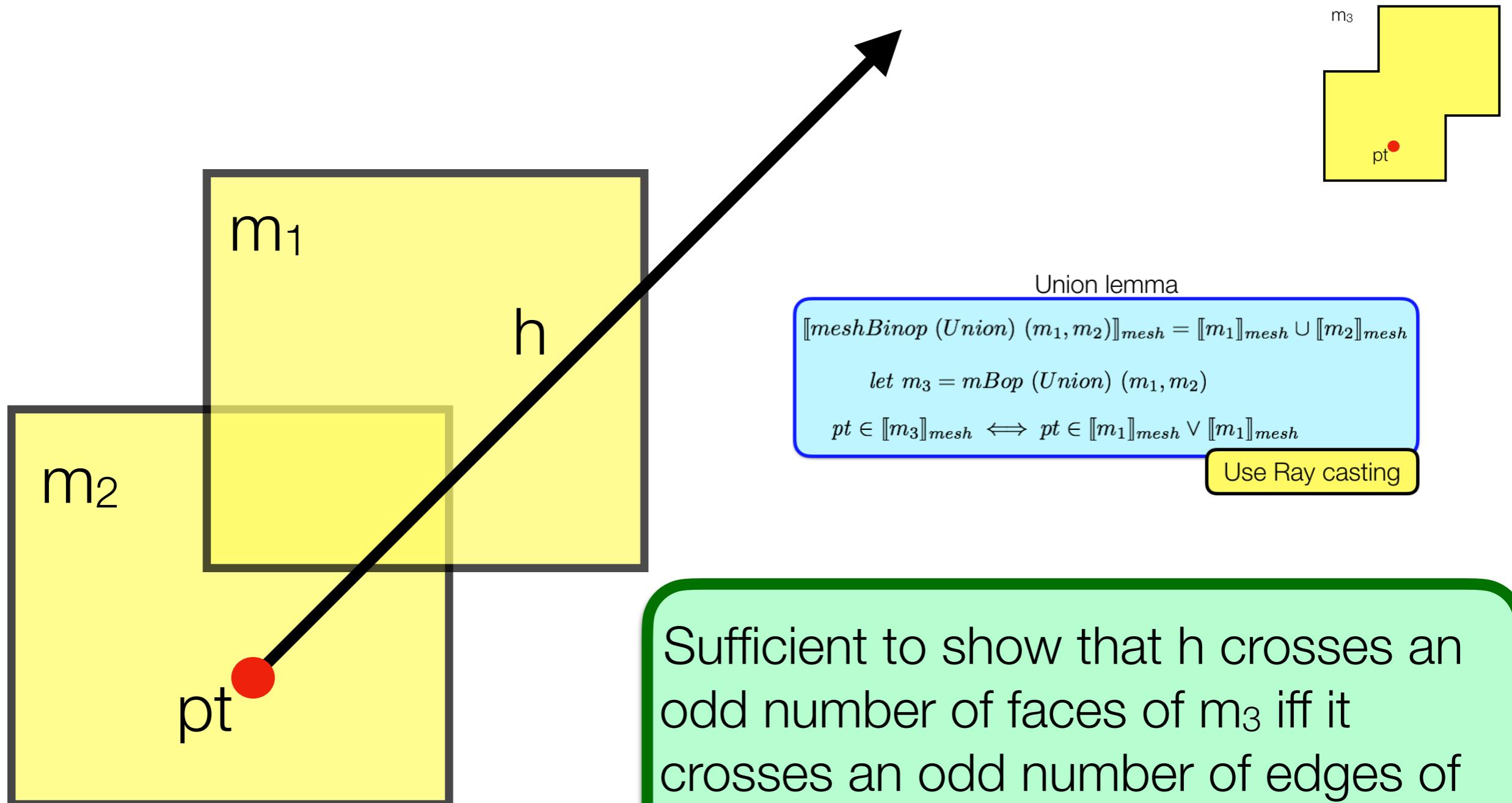
Case: overlapping meshes



Case: overlapping meshes

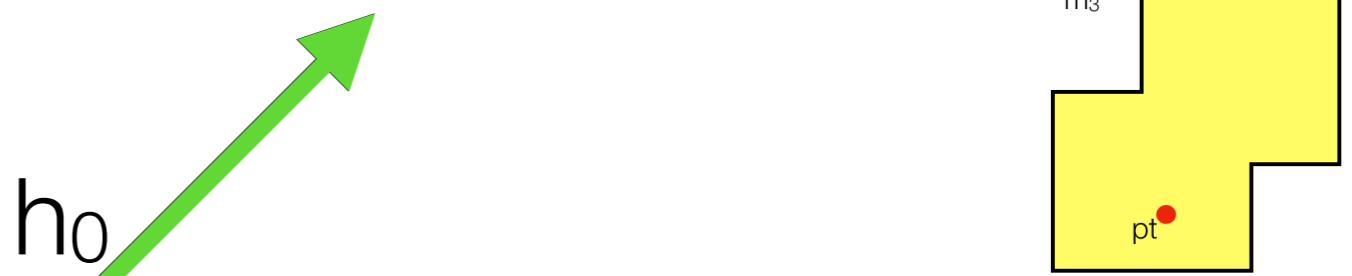
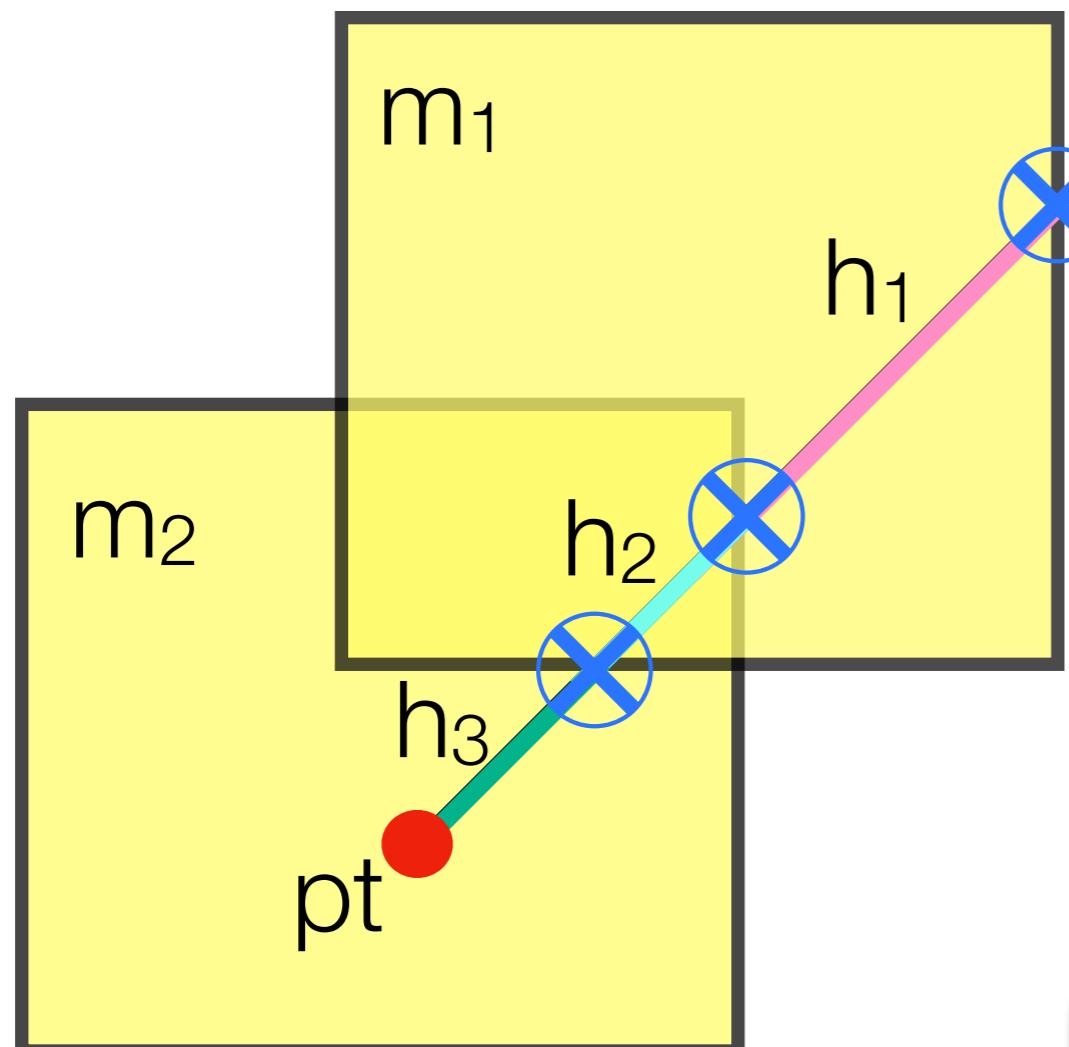


Case: overlapping meshes



Case: overlapping meshes

Divide h into 4 sub-regions



Since meshes are split,
sufficient to show that h_i
is inside m_3 iff it is inside
 m_1 or m_2

See paper for more details

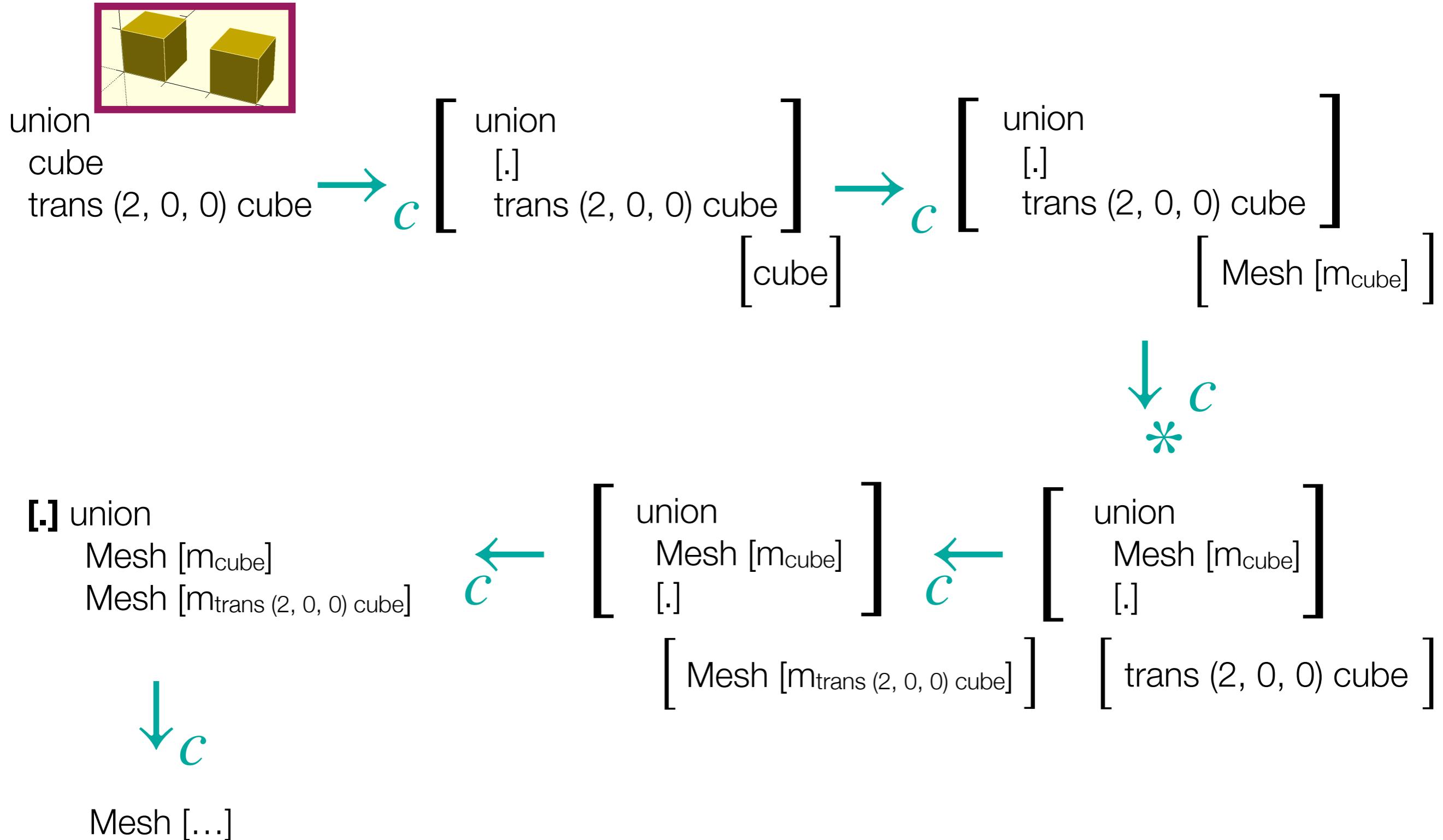
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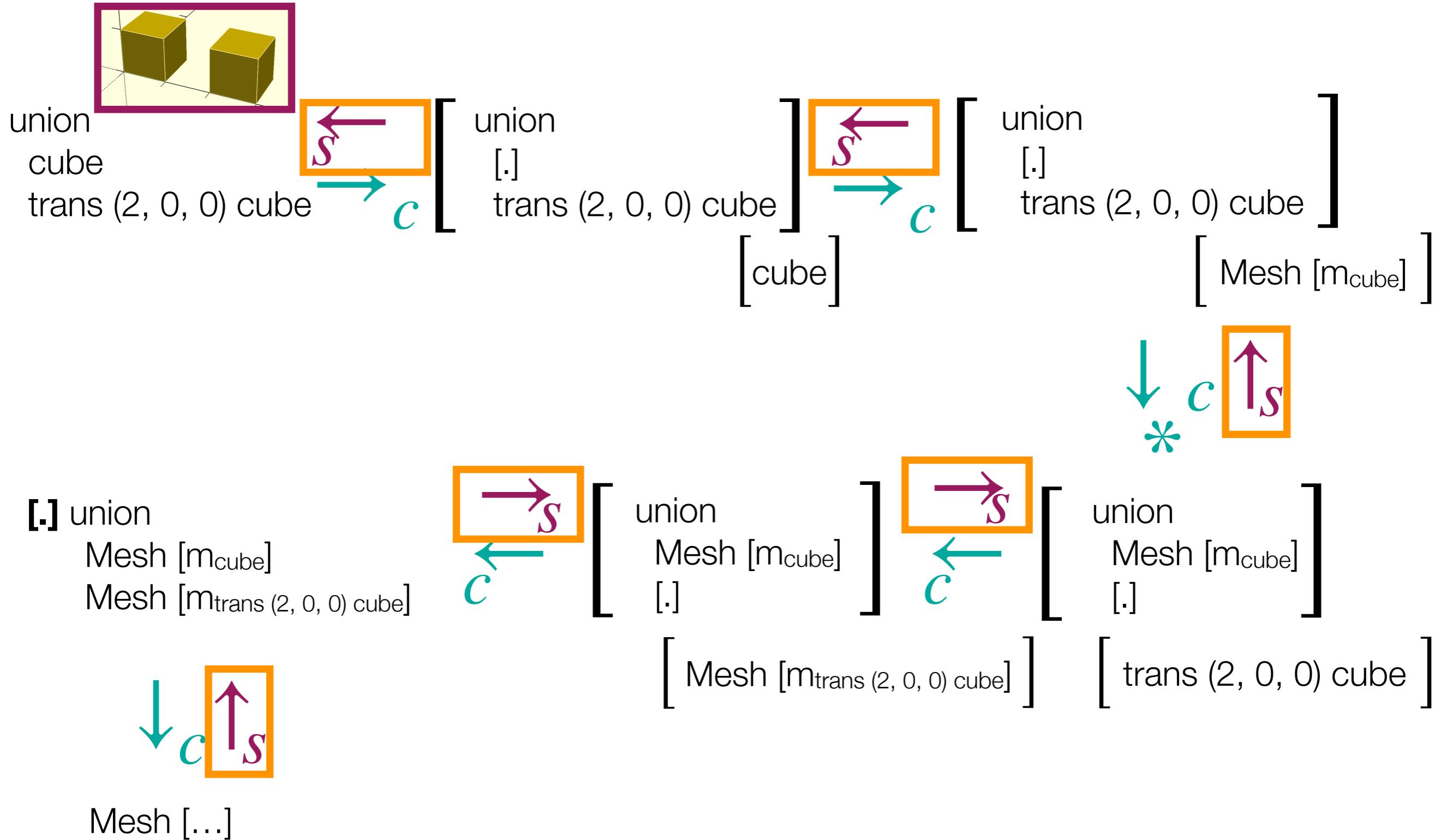
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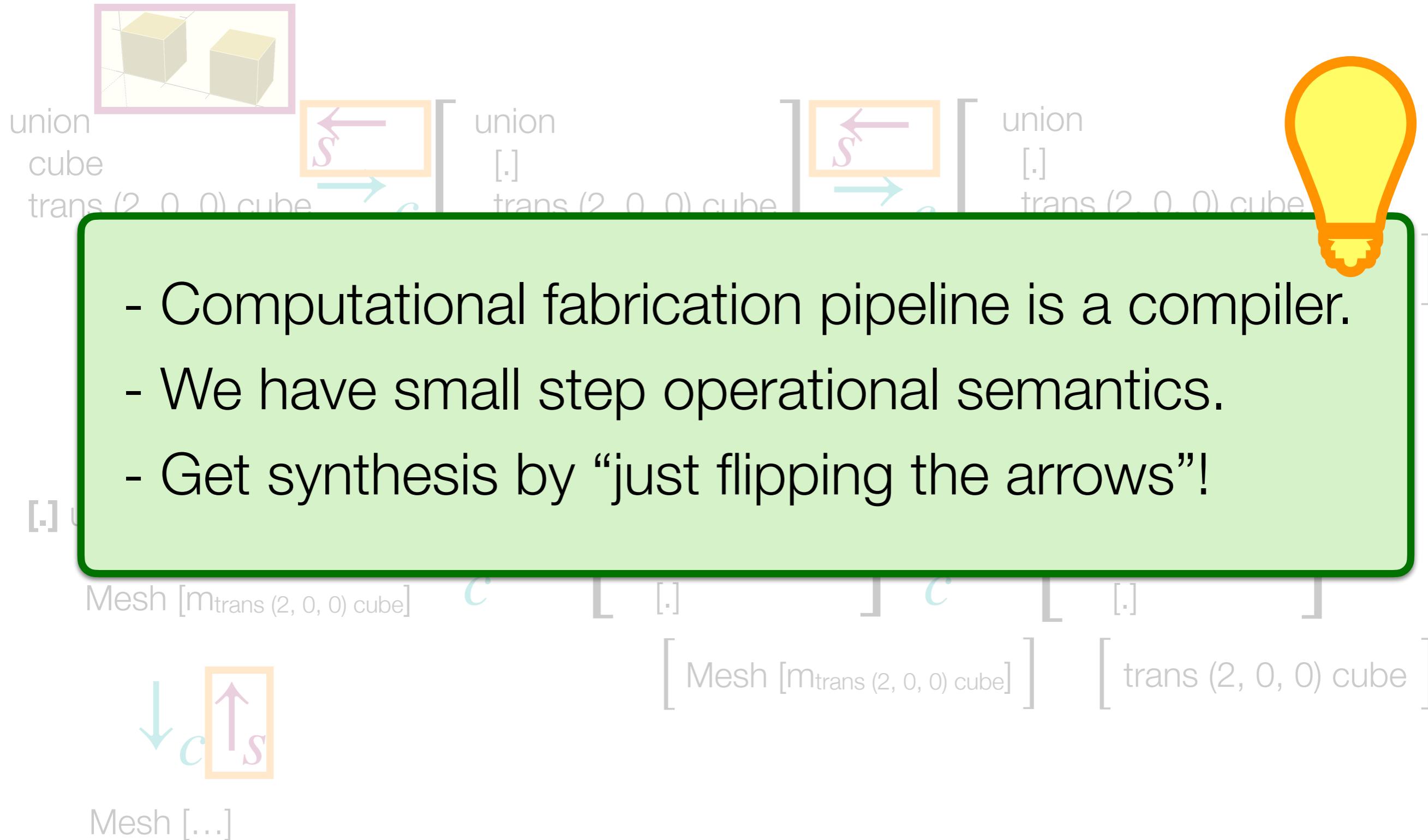
Synthesis: flip the arrows!



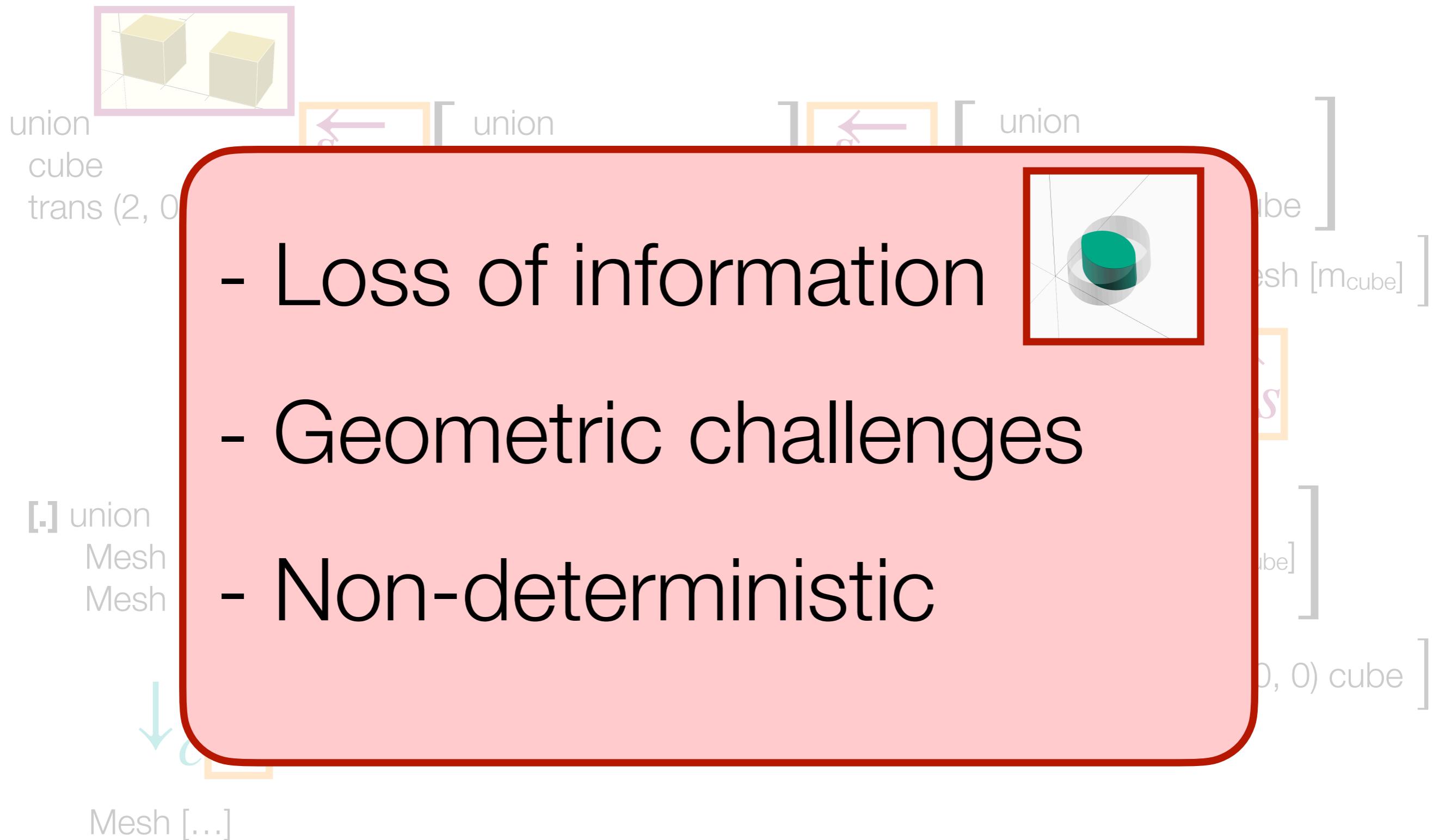
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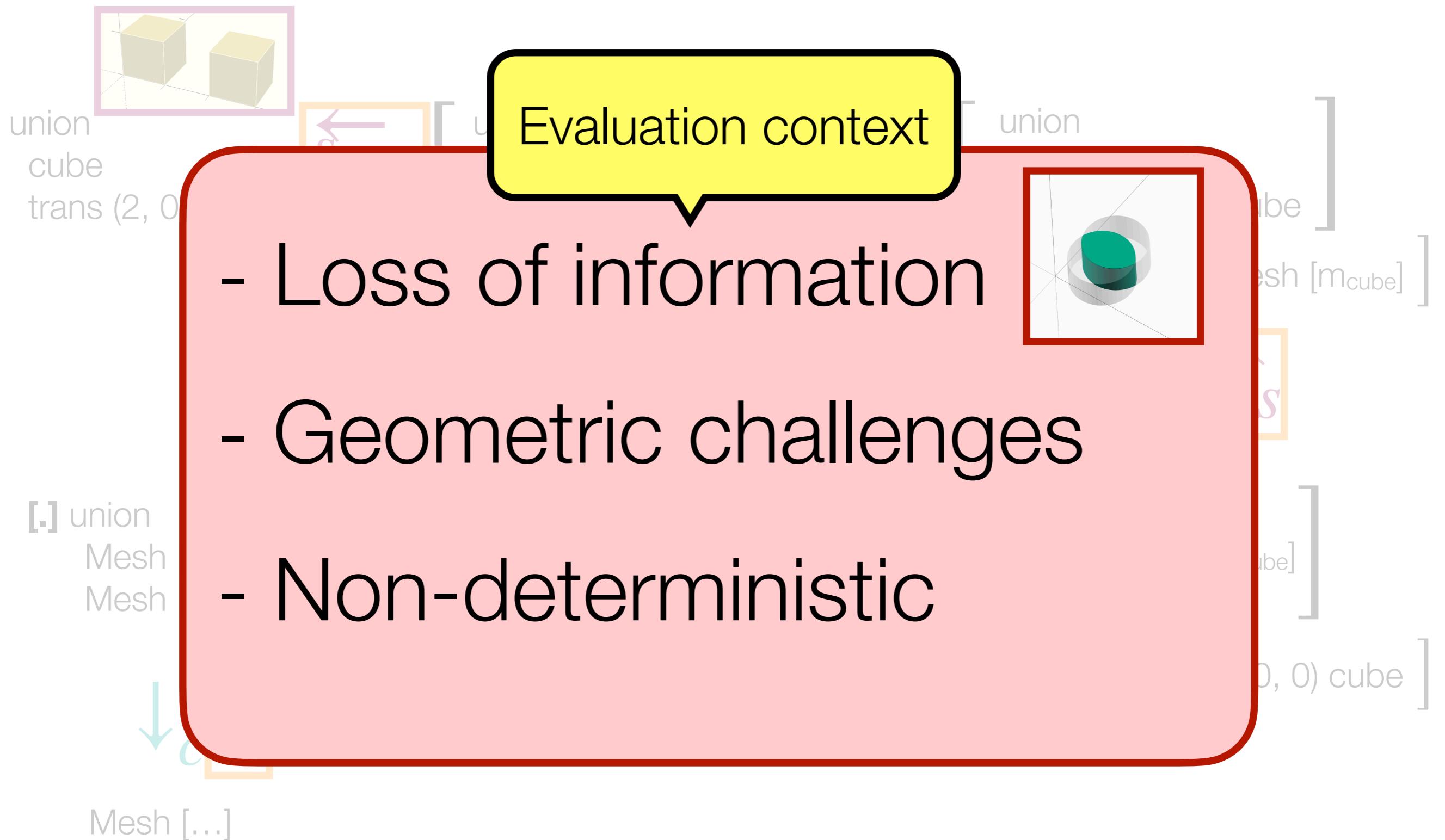
Synthesis: flip the arrows!



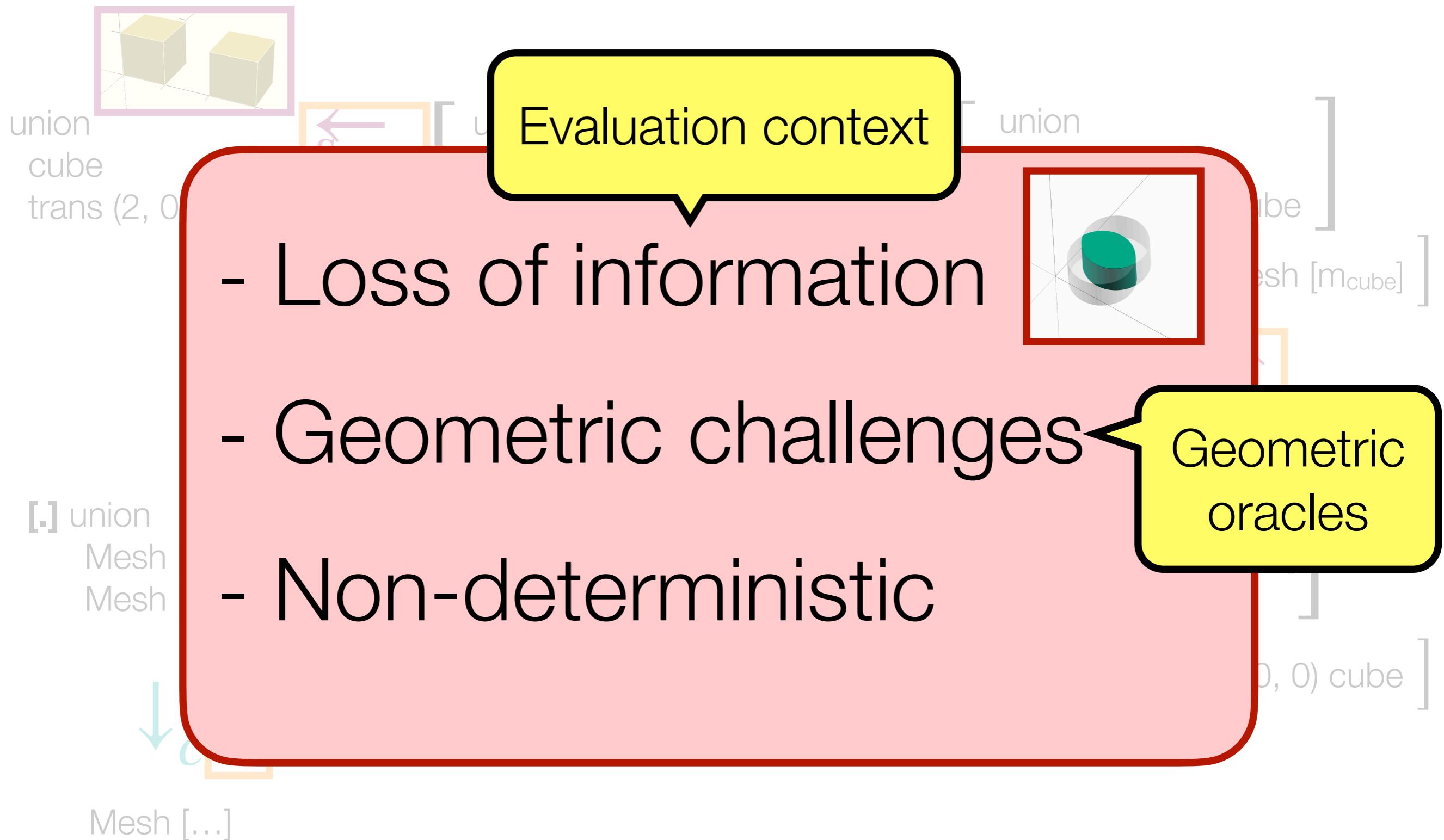
Synthesis: flip the arrows!



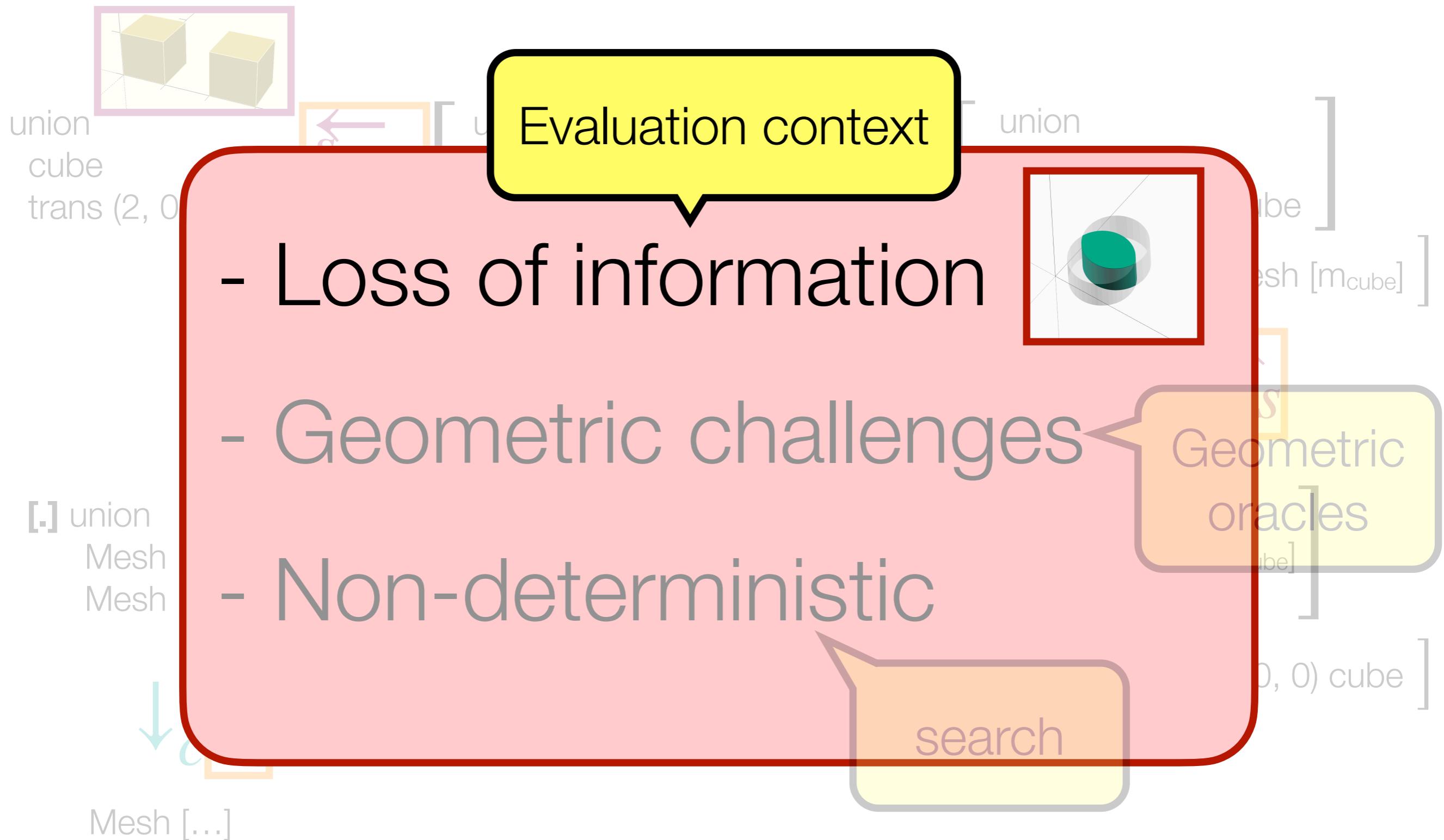
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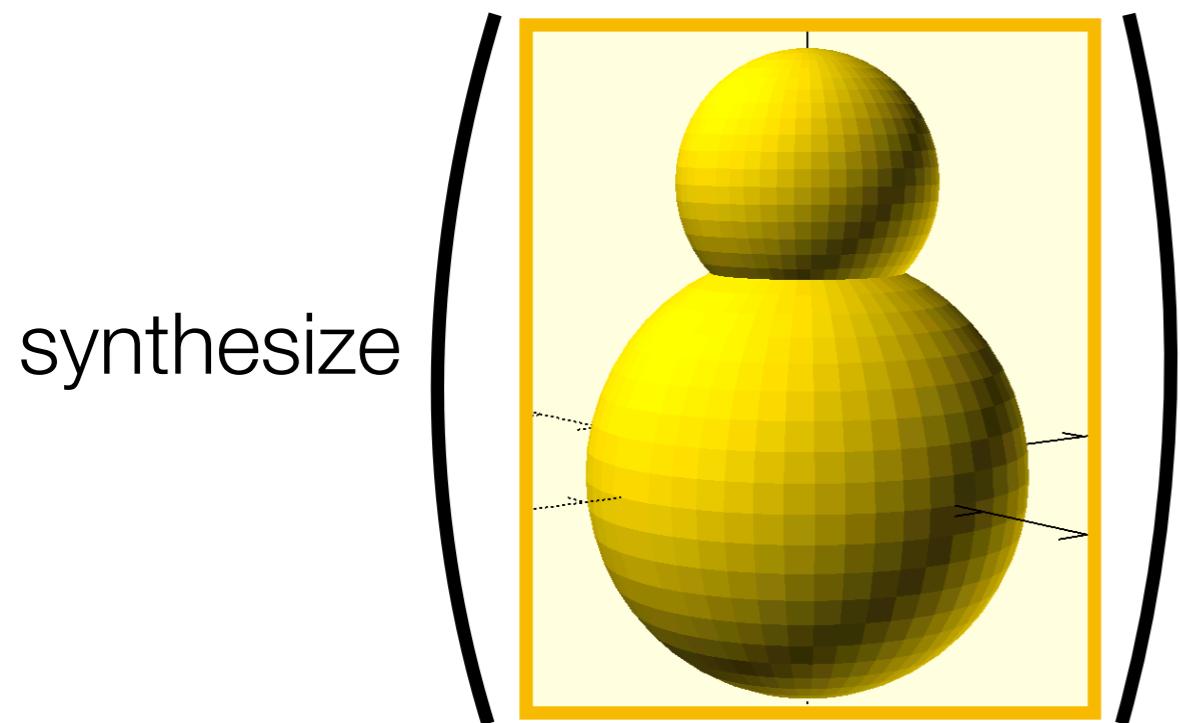
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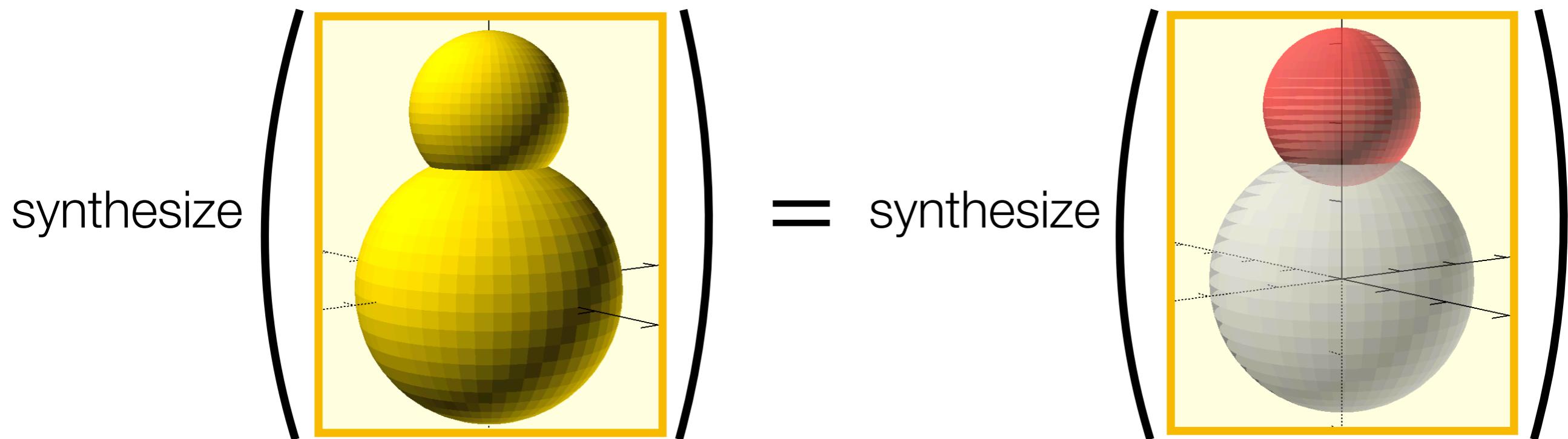
Synthesis: flip the arrows!



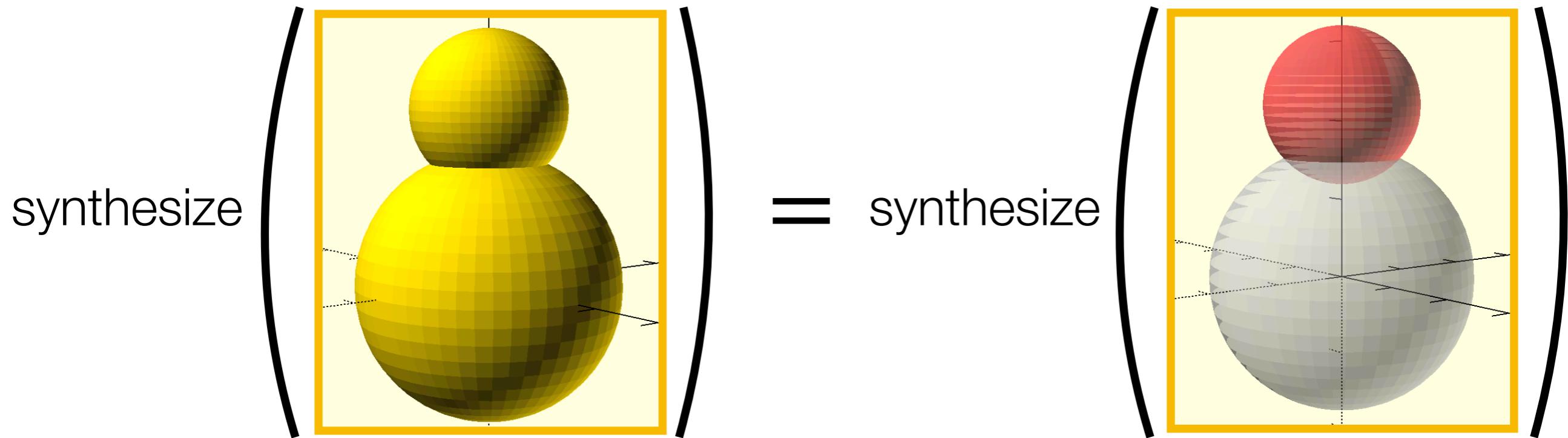
Eval context is geometric context!



Eval context is geometric context!



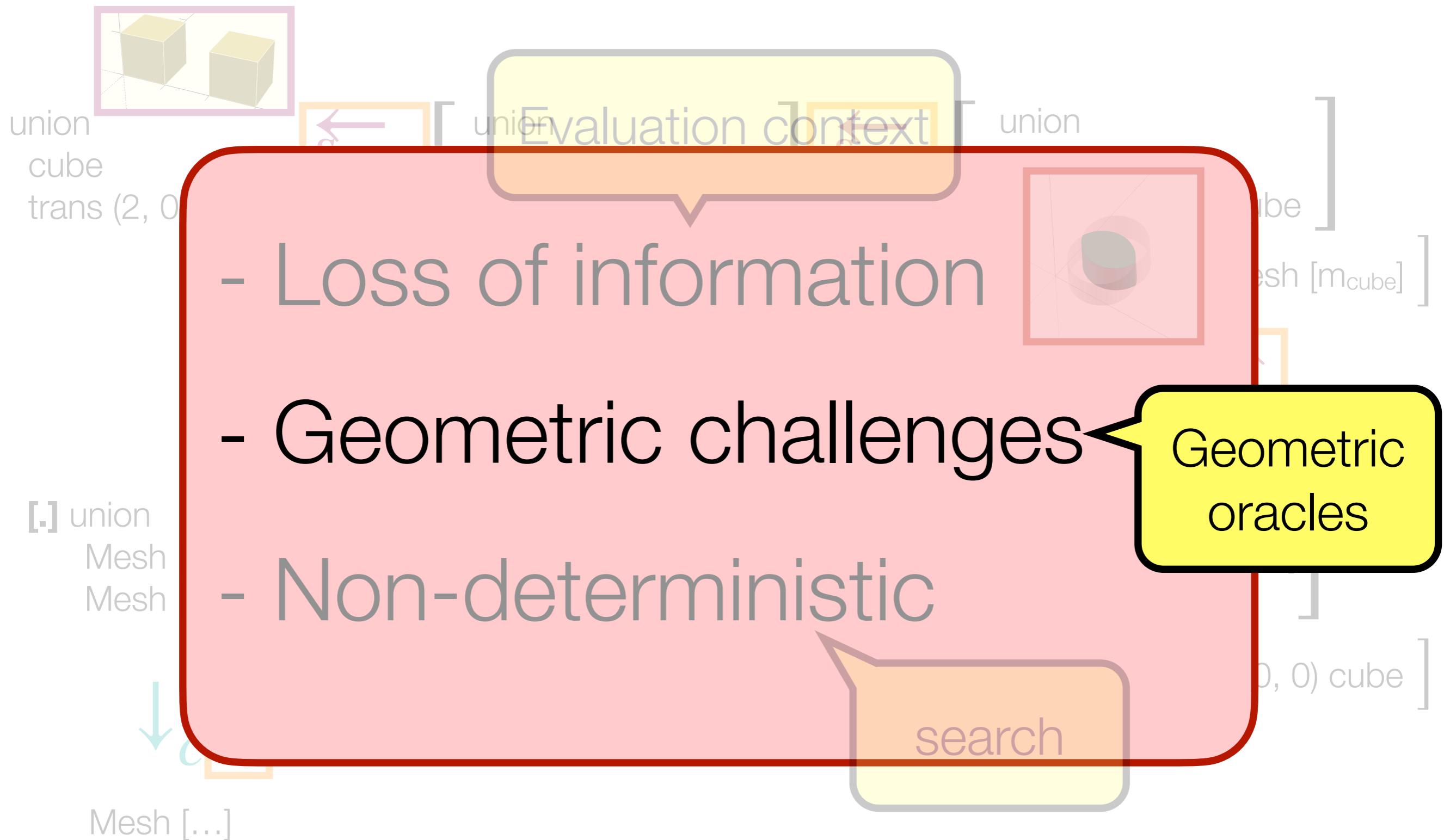
Eval context is geometric context!



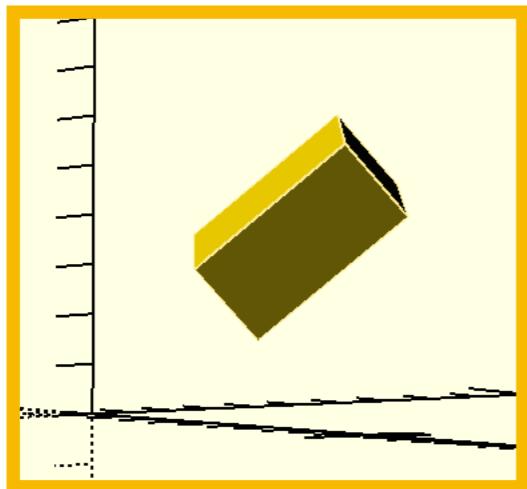
```
union  
sphere 5  
trans (0, 0, 5) sphere 3
```

In the **context** of **union**, the top can be replaced by a sphere, even though it does not match a sphere primitive

Synthesis: flip the arrows!



Oracles : Primitive Detection



$$\Omega_{prim} \rightarrow$$

cube
|> rotateX (30)
|> rotateY (45)
|> rotateZ (60)
|> scale (2, 3, 4)
|> traslate (1, 2, 3)

$$p \in \Omega_{prim}(m)$$

$$Mesh\ m \xrightarrow{\Omega} p$$

Oracles : Primitive Detection



$$\Omega_{prim} \rightarrow$$

Rotation:

Find an object coordinate system

Align it with the world's coordinates

Scale:

Scale the object down to unit dimensions

Translate:

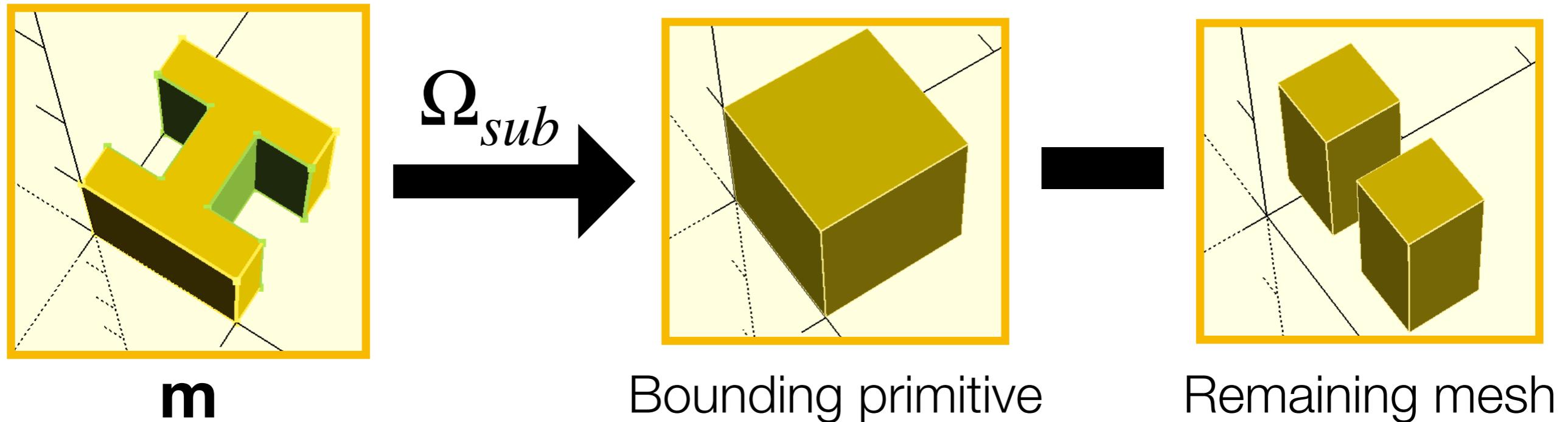
Move the object back to origin

cube

- |> rotateX (30)
- |> rotateY (45)
- |> rotateZ (60)
- |> scale (2, 3, 4)
- |> traslate (1, 2, 3)

Apply affine transformations to primitive in reverse order

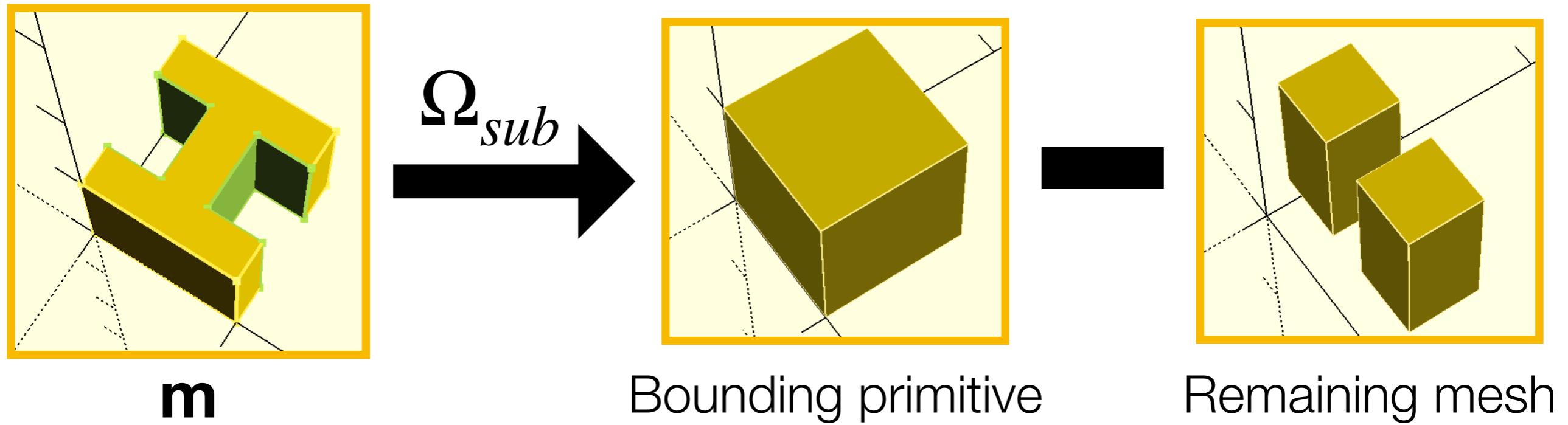
Oracles : Subtractive



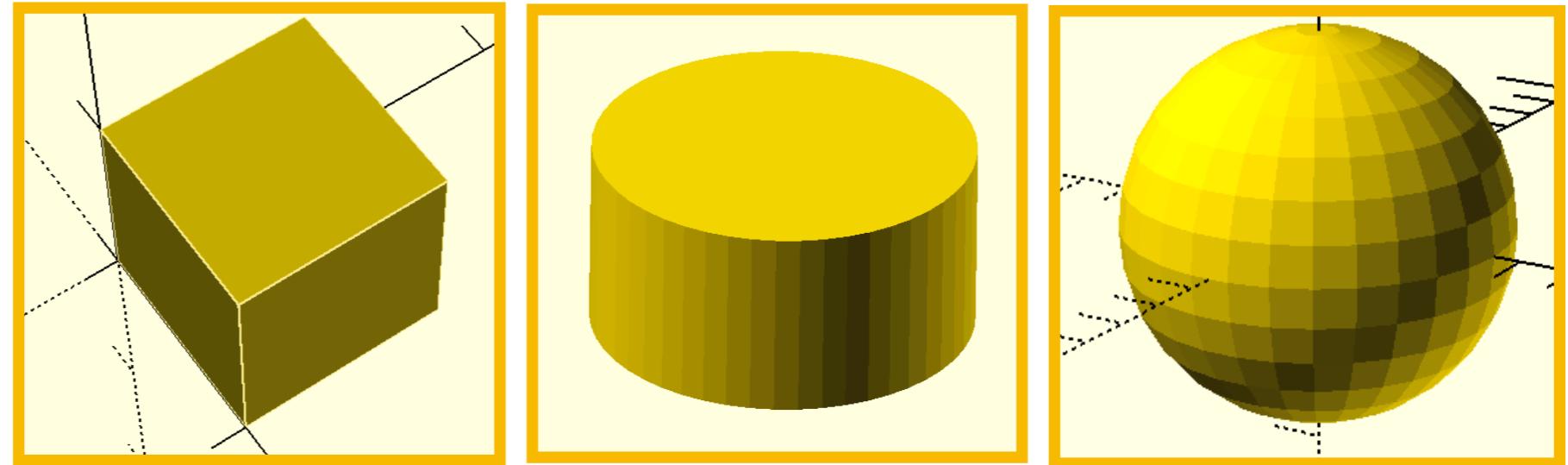
$$(m_1, m_2) \in \Omega_{sub}(m)$$

Mesh m $\rightarrow_{\Omega} \text{Binop Diff} (\text{Mesh } m_1) (\text{Mesh } m_2)$

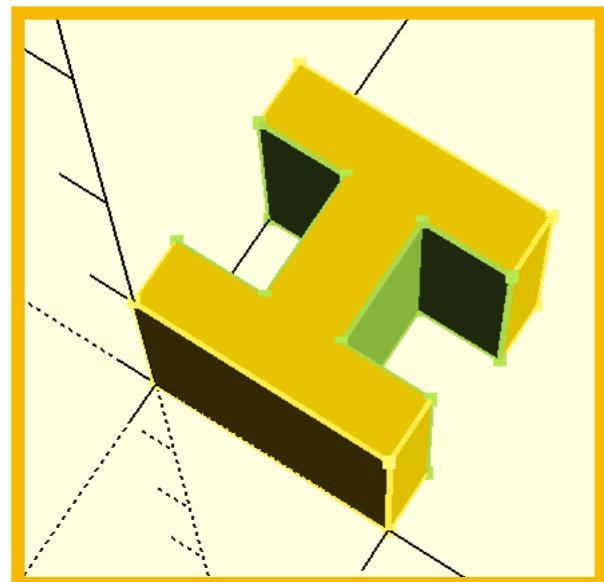
Oracles : Subtractive



Many possible bounding primitives

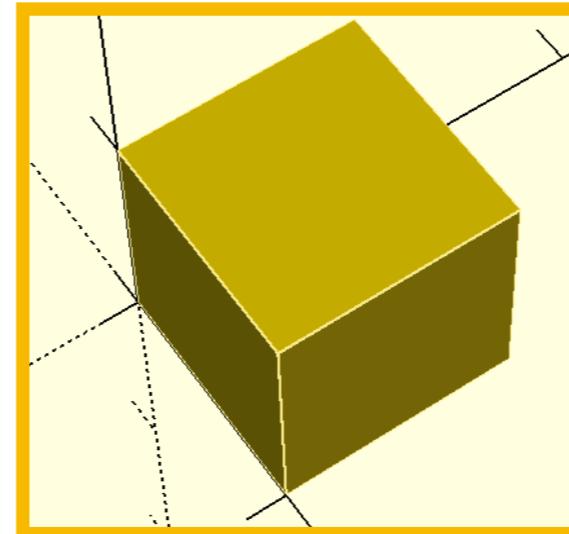


Oracles : Subtractive

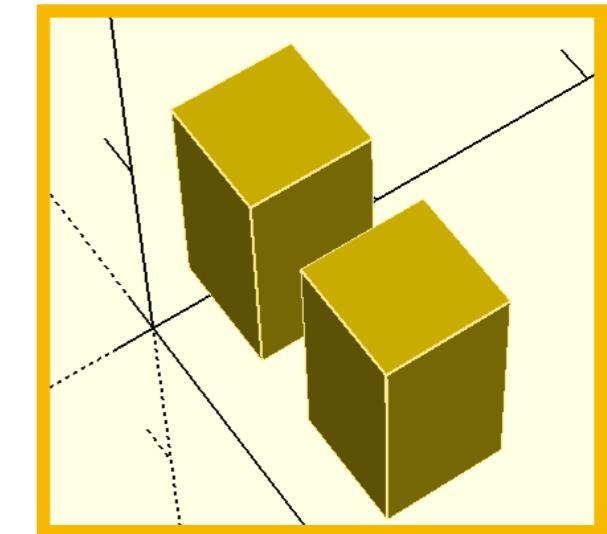


m

$$\Omega_{sub} \rightarrow$$

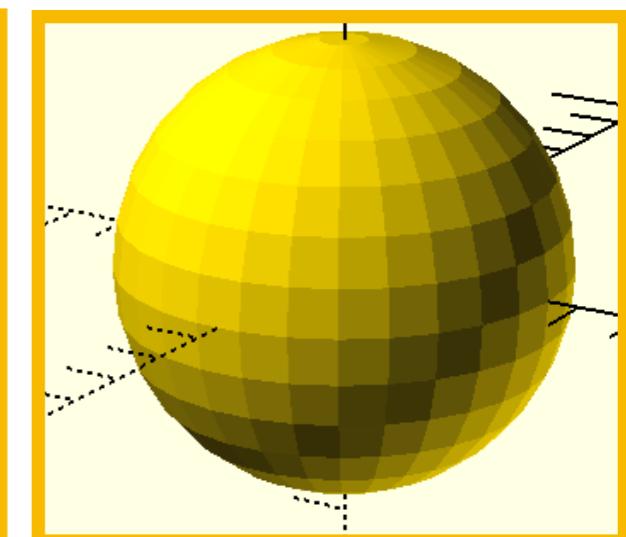
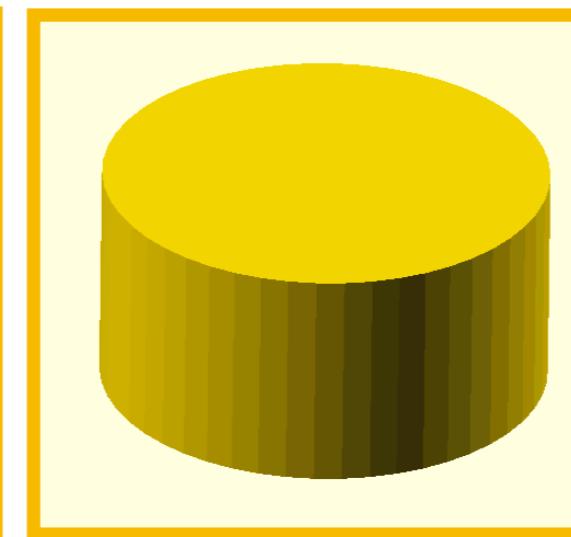
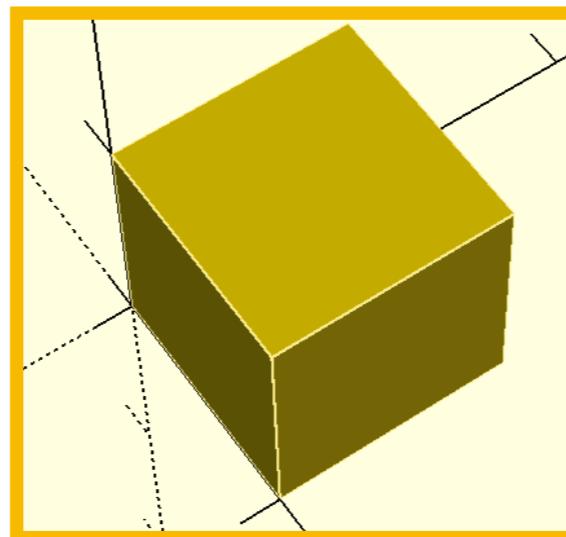


Bounding primitive

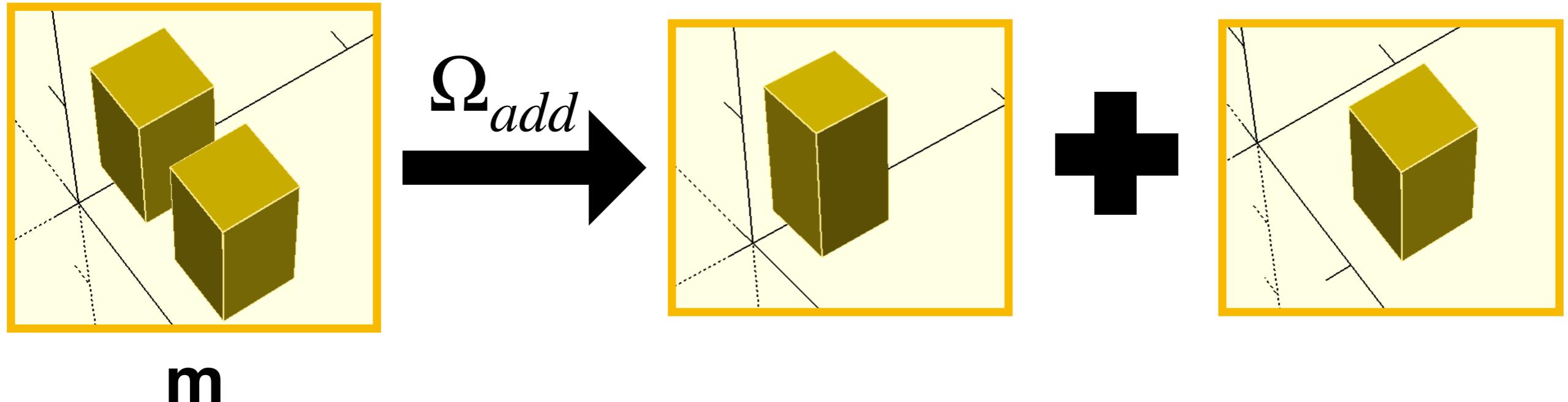


Remaining mesh

$p_{best} = \operatorname{argmin}_p$
volume of
 $\operatorname{difference}(p, m)$



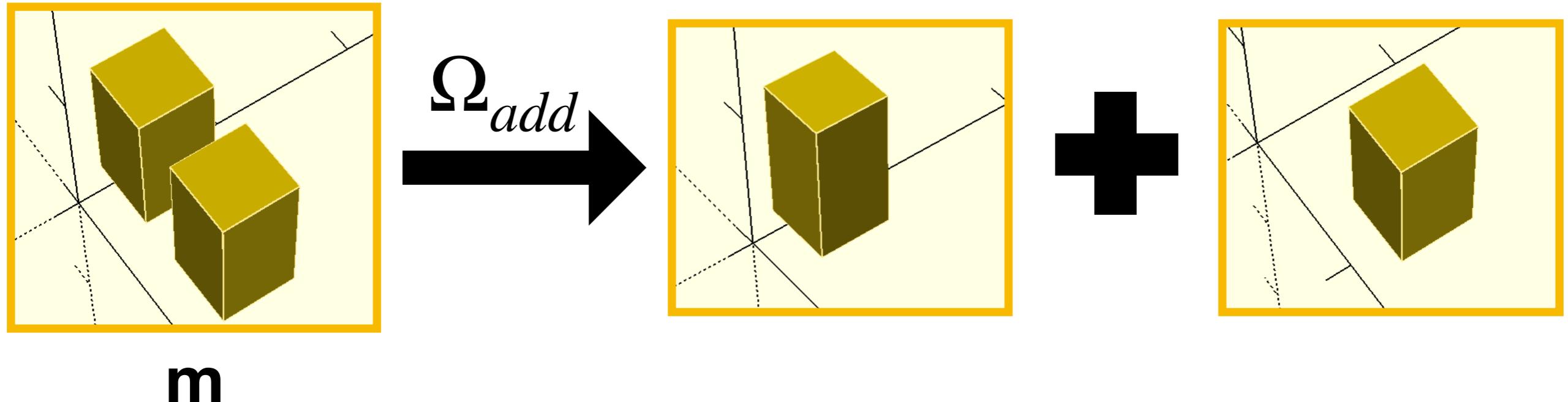
Oracles : Additive



$$(m_1, m_2) \in \Omega_{add}(m)$$

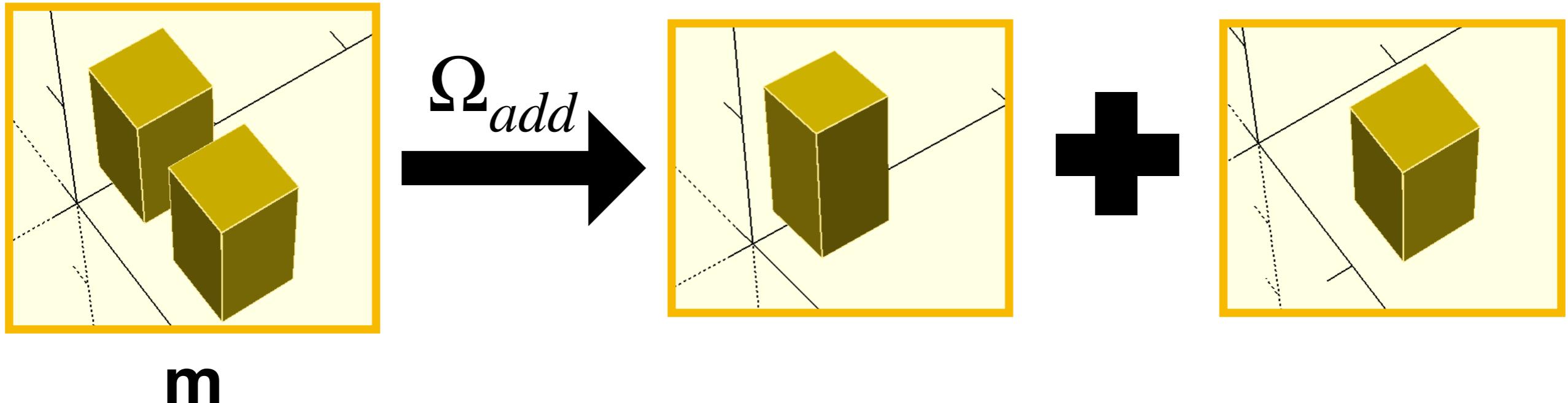
Mesh $m \rightarrow_{\Omega} \text{Binop Union} (\text{Mesh } m_1) (\text{Mesh } m_2)$

Oracles : Additive



Infinite ways to
split a mesh!

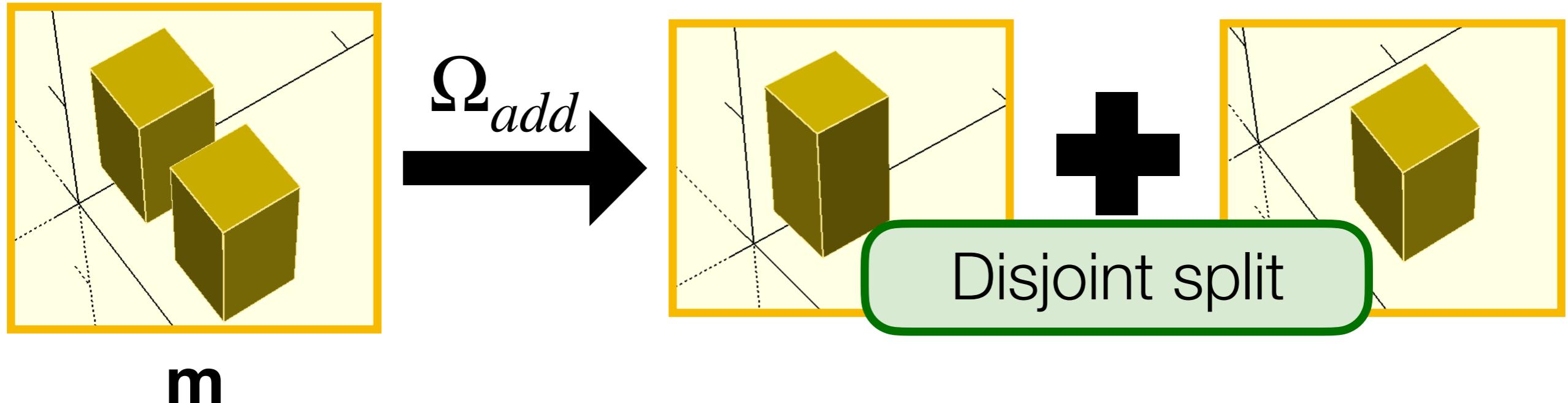
Oracles : Additive



Infinite ways to
split a mesh!

Disjoint splits
Convex splits

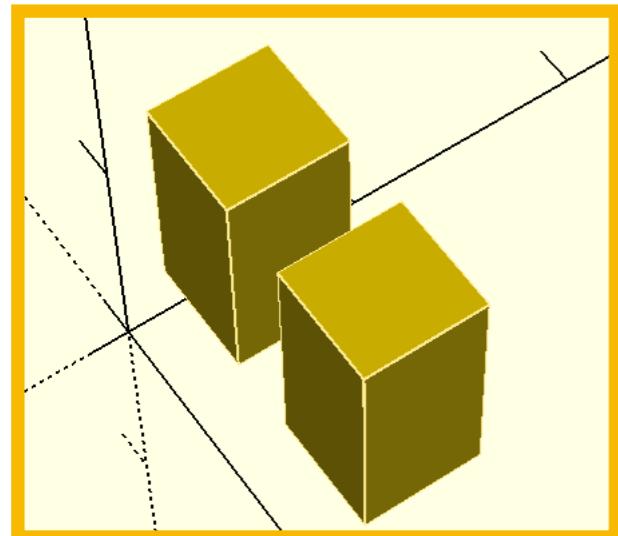
Oracles : Additive



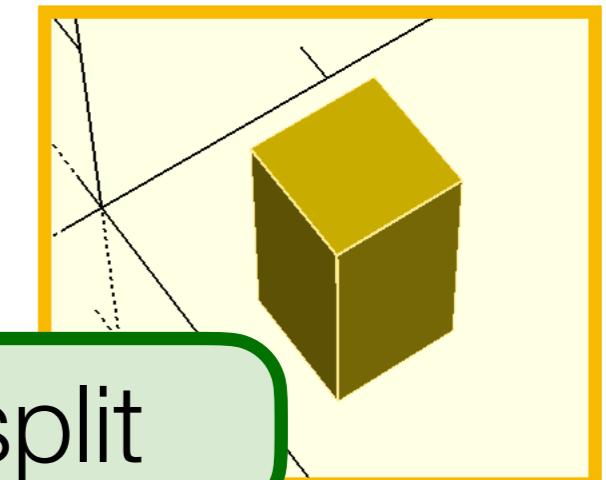
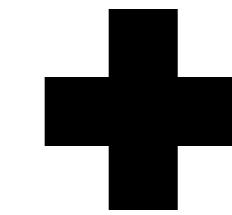
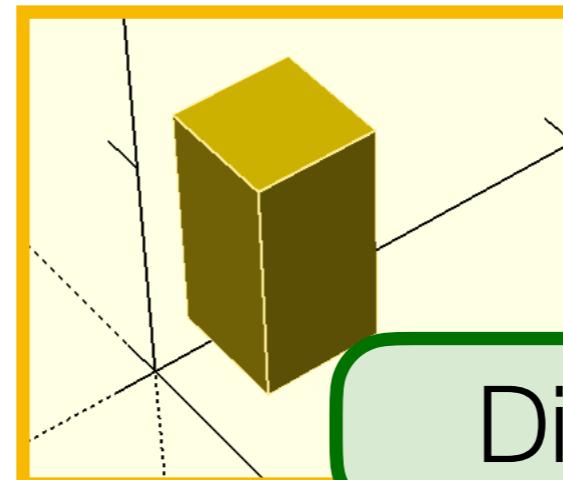
Infinite ways to
split a mesh!

Disjoint splits
Convex splits

Oracles : Additive



Ω_{add} →

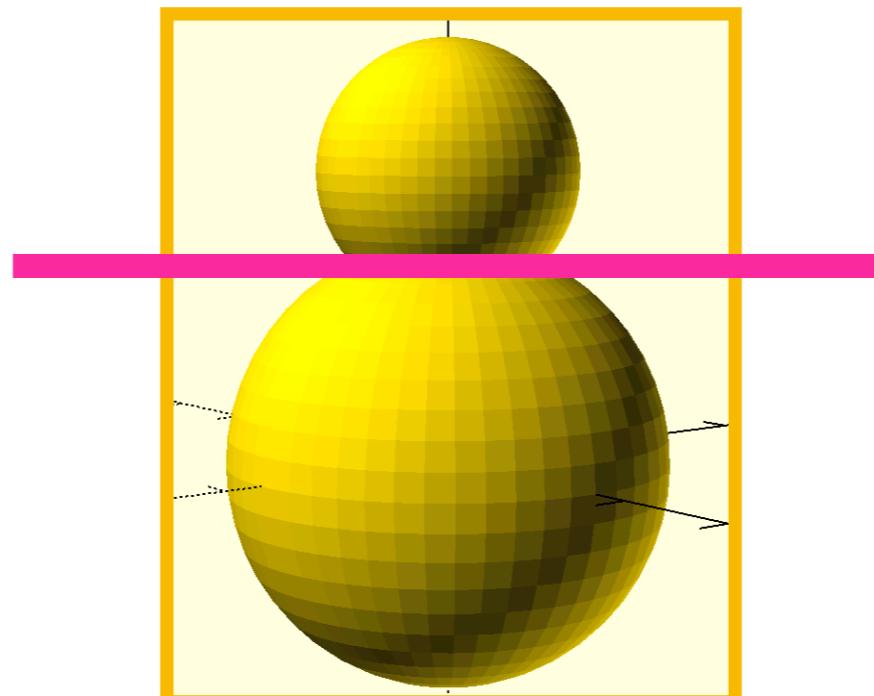


Disjoint split

m

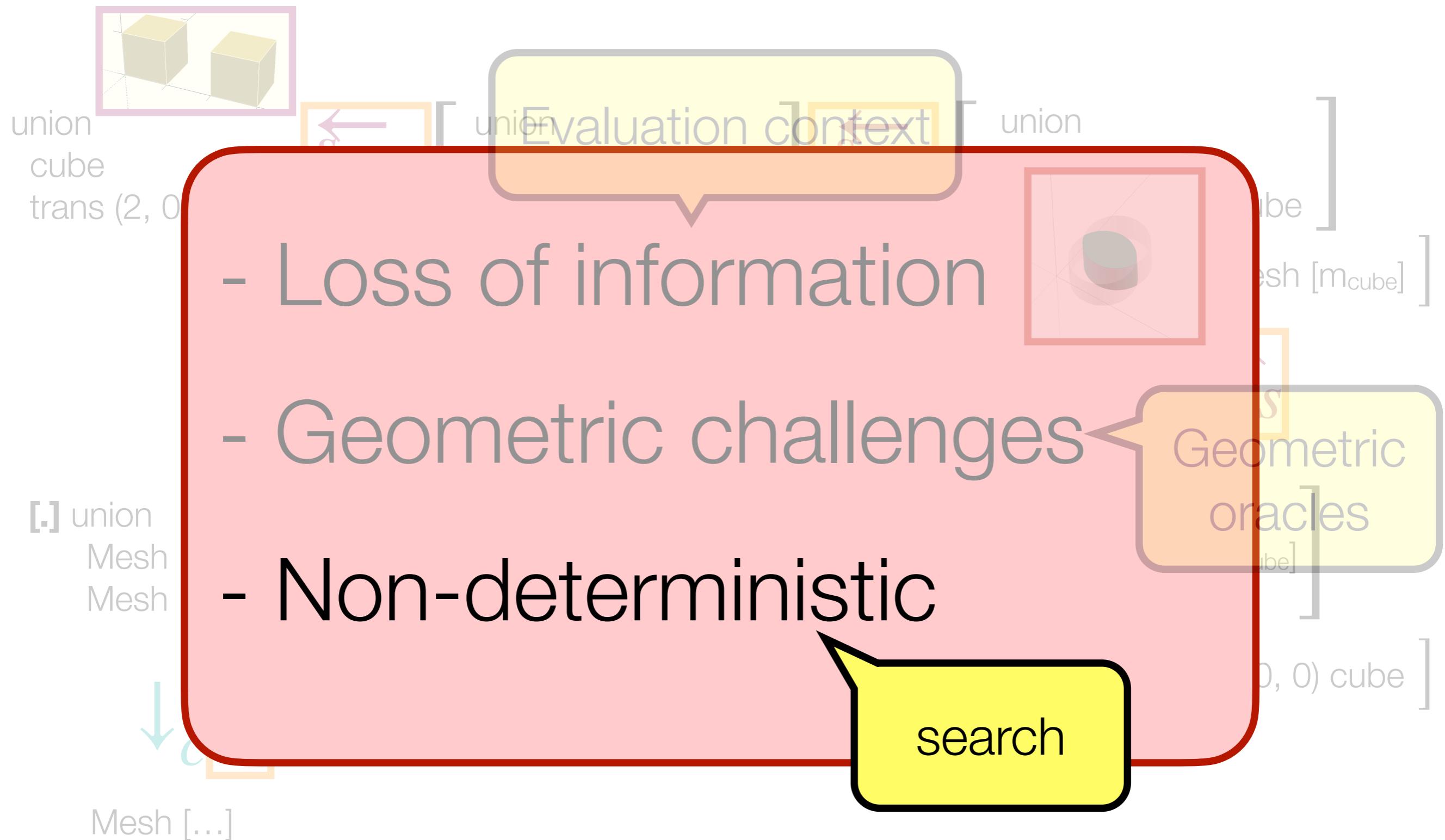
Infinite ways to split a mesh!

Disjoint splits
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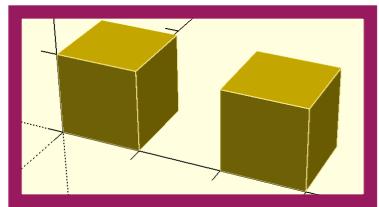
Convex split:
Split mesh along plane where convexity changes

Synthesis: flip the arrows!

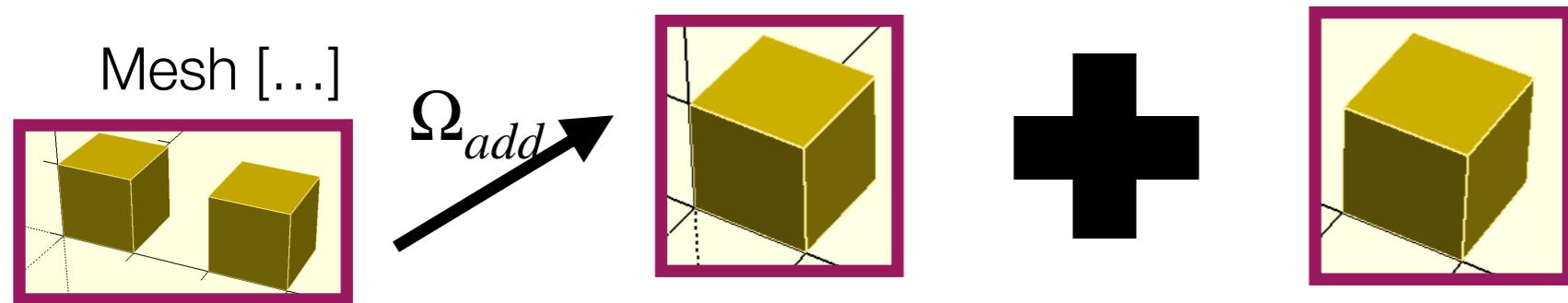


Synthesis: try all three steps

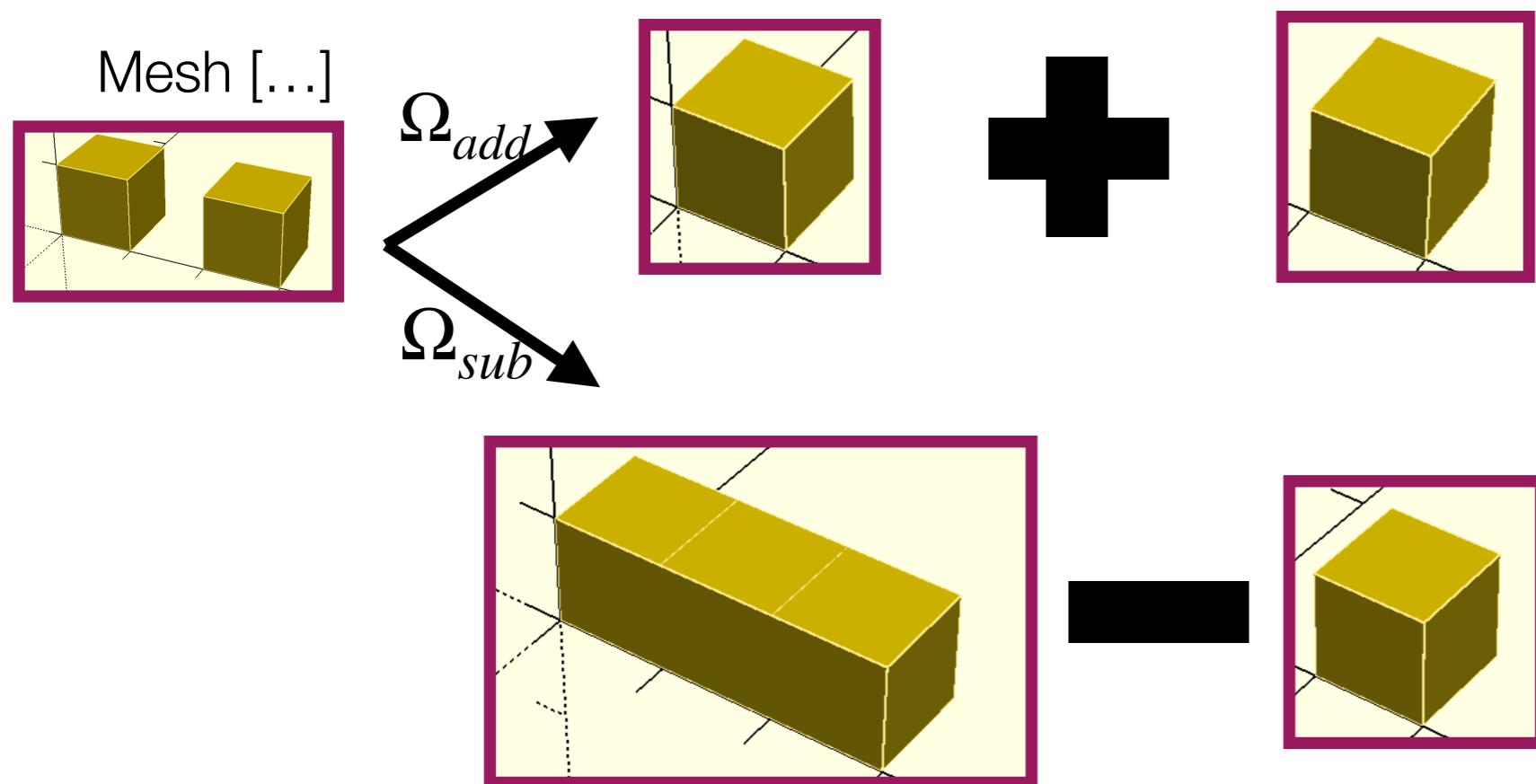
Mesh [...]



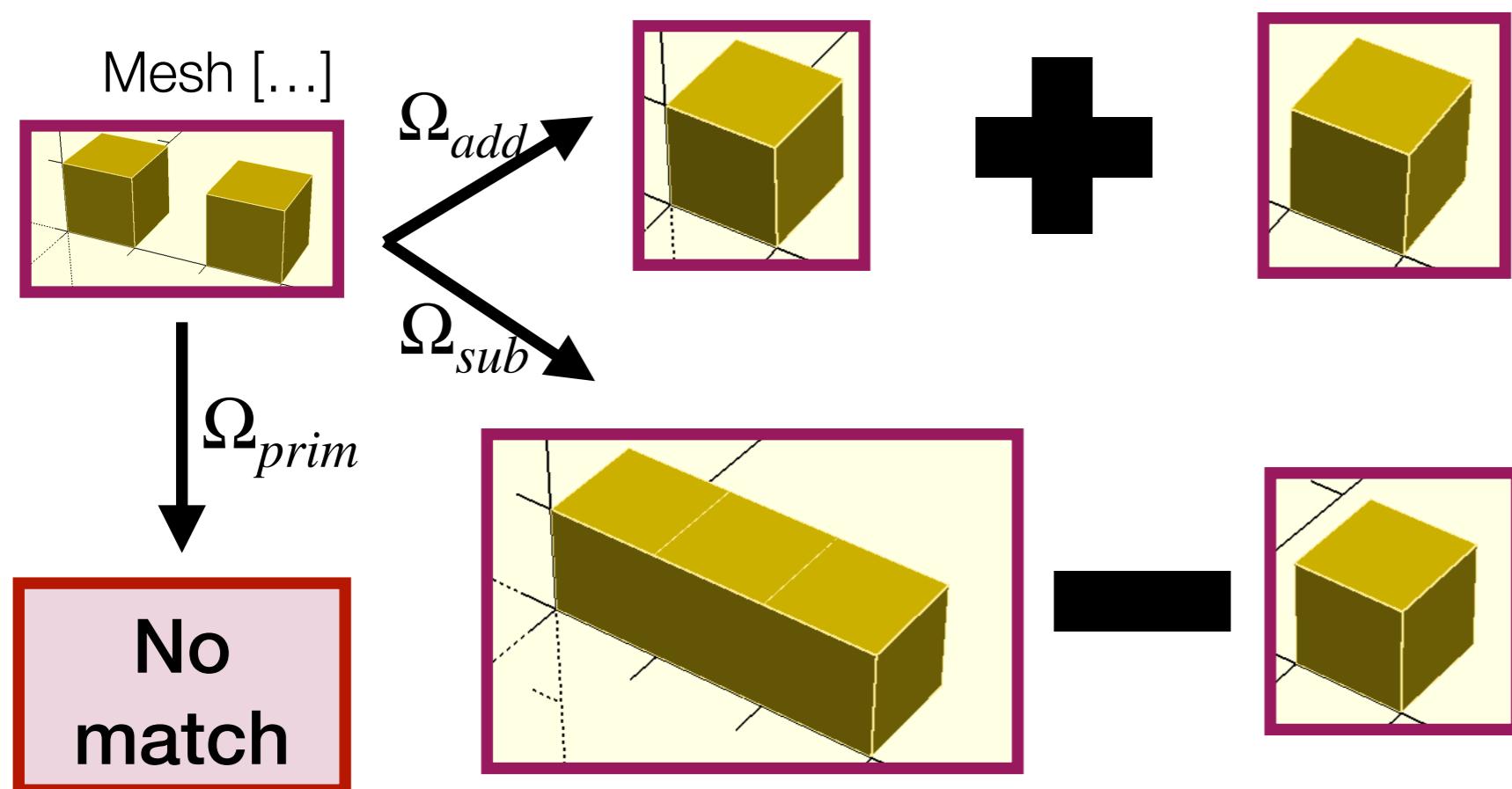
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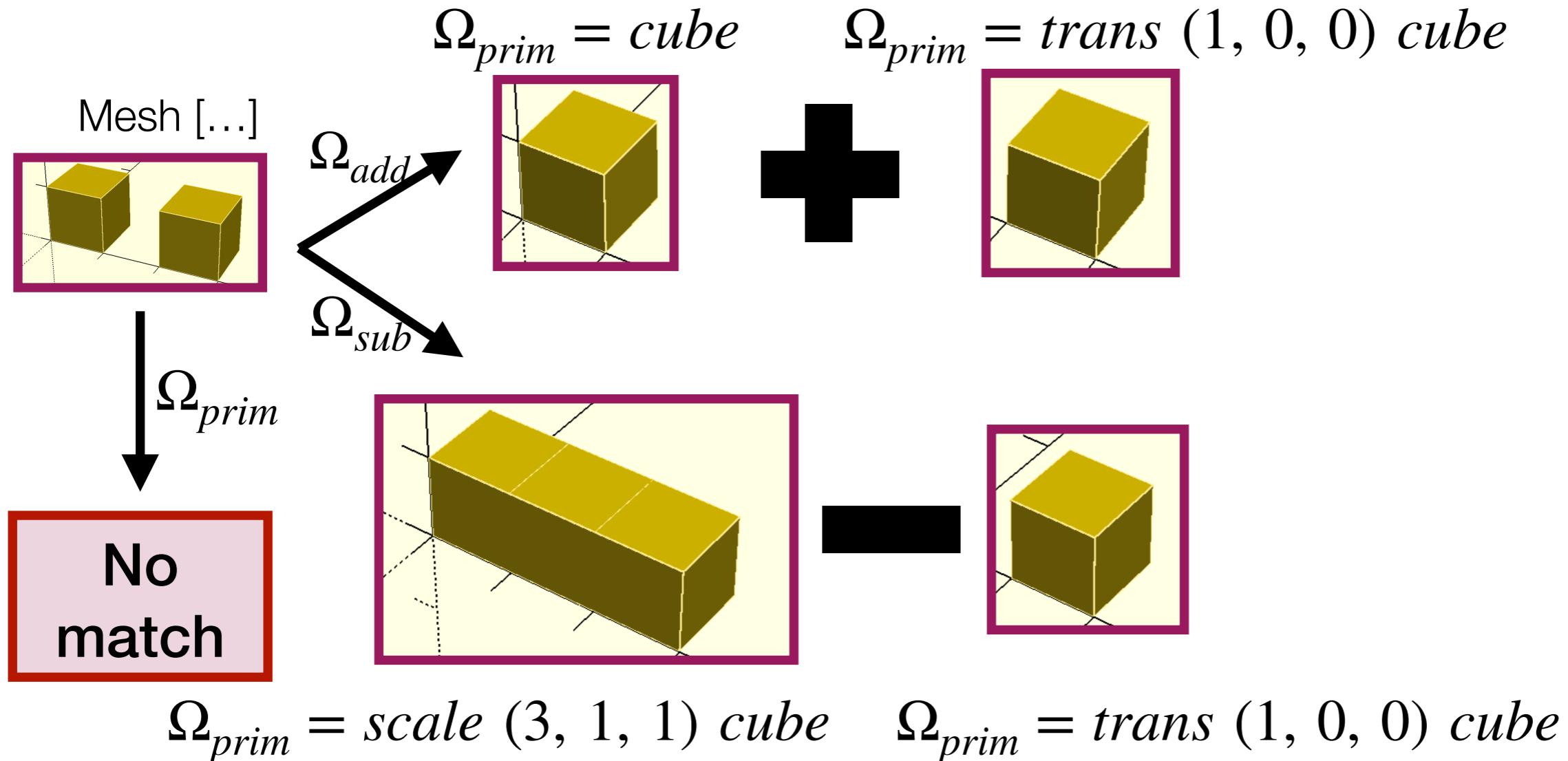
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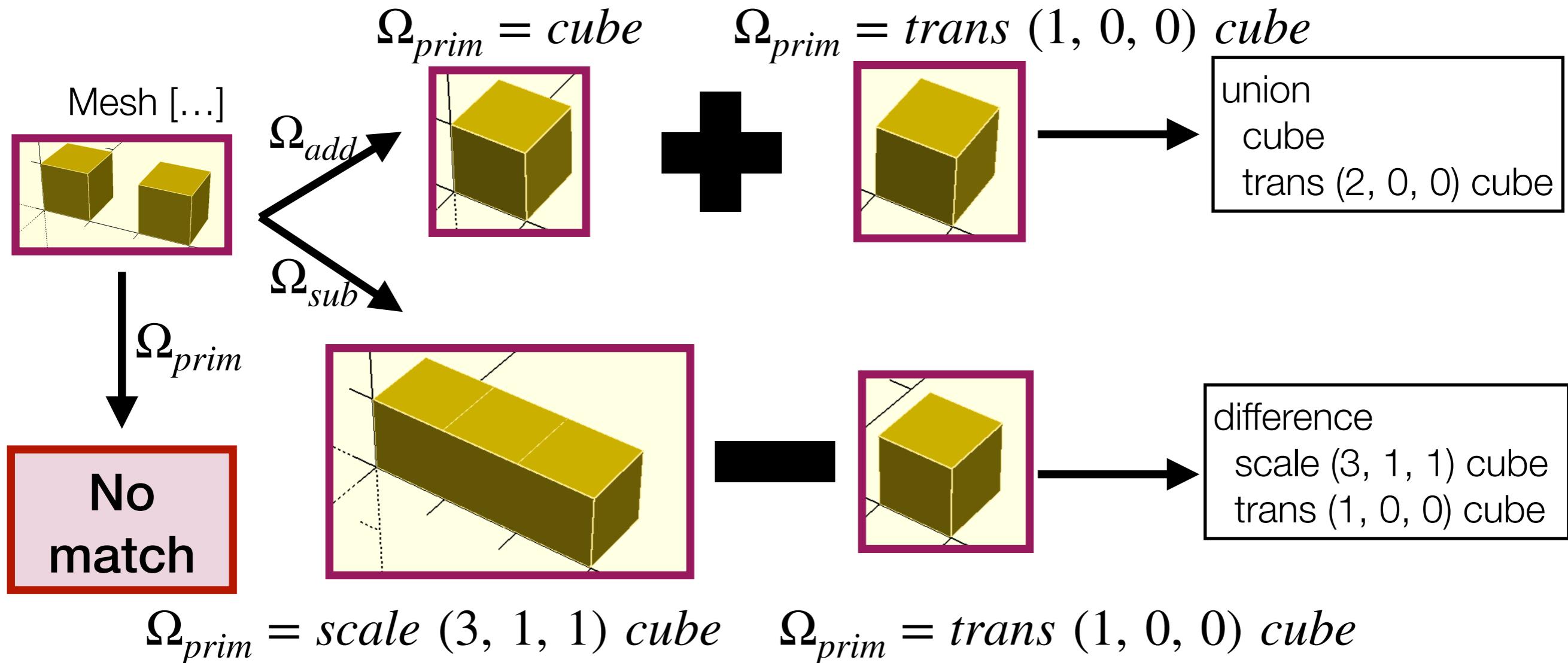
Synthesis: try all three steps



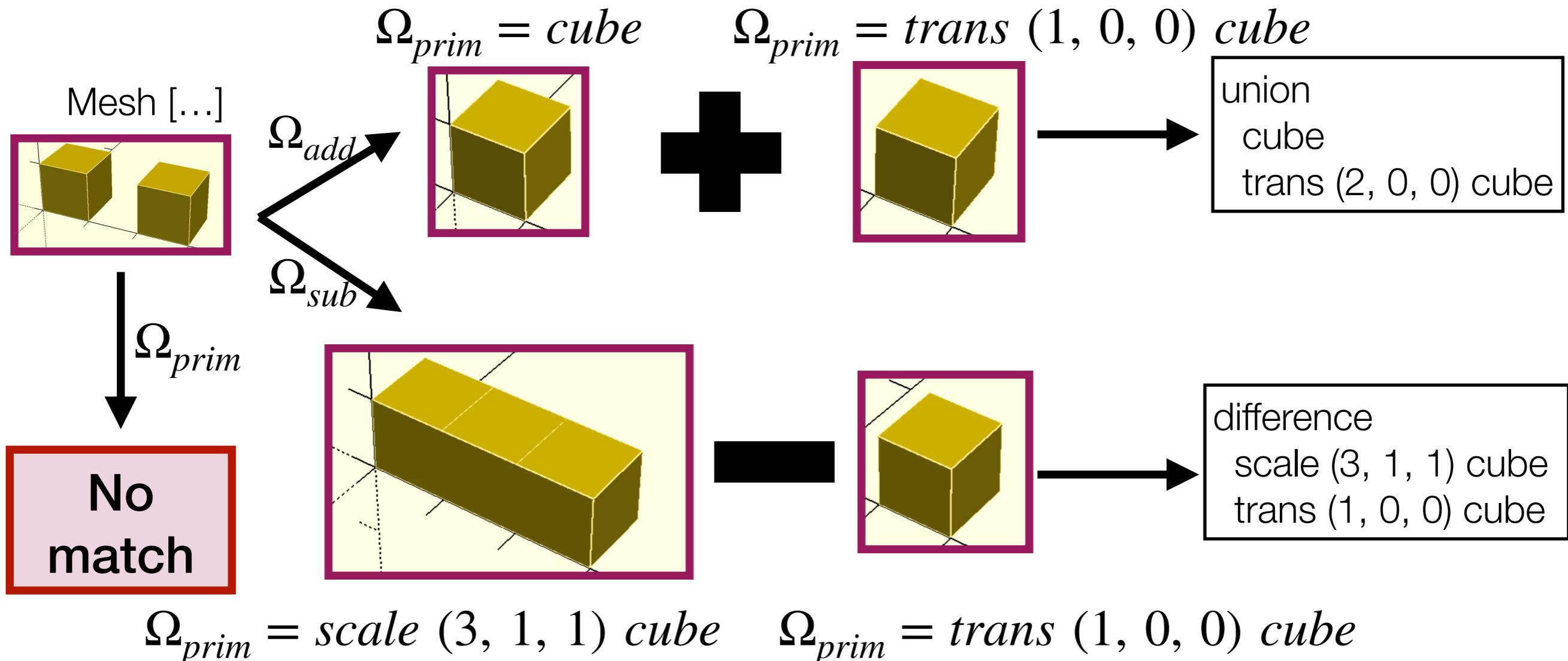
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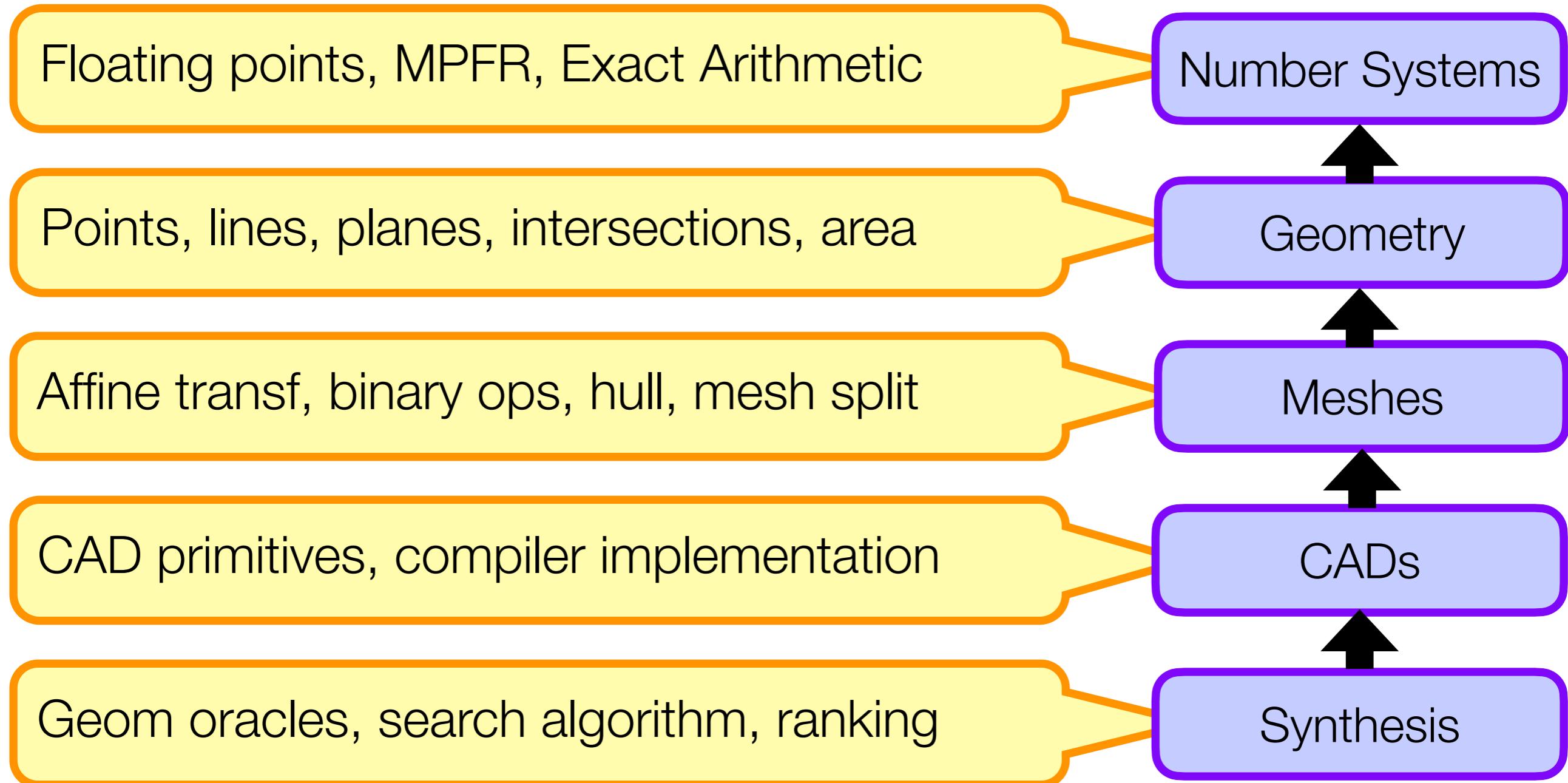
Synthesis: try all three steps



Pick best based on
ranking function

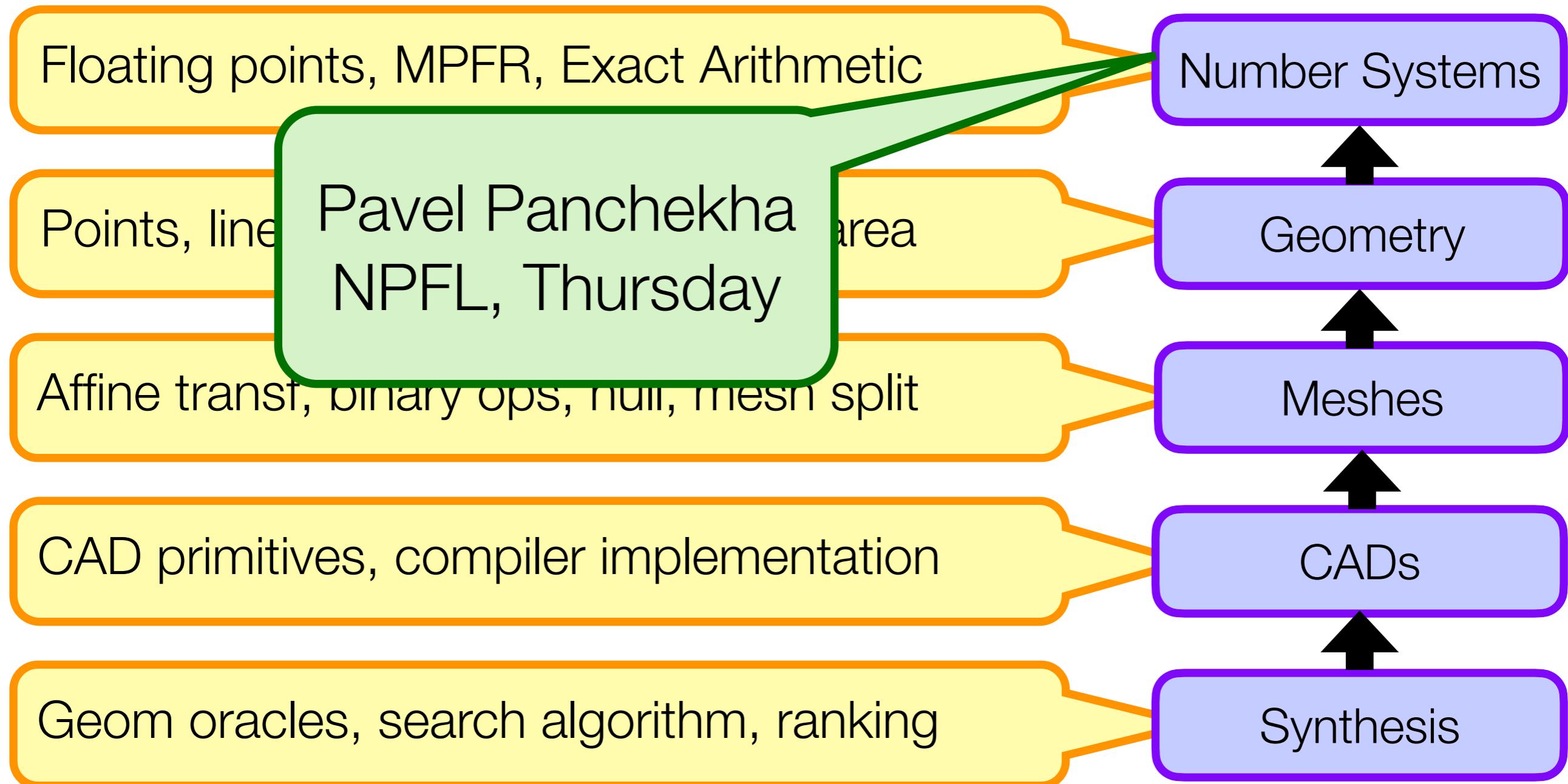
Implementations in OCaml

25,000 LOC: Supports 1D, 2D, 3D CAD & Mesh



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ICFP (our design)

Thingiverse

Hexagonal Candle Holder

Ultimate 22 Hex-Wrench Holder

40mm Cube Test Object

25mm Calibration with Empty Top

Measuring Cylinder

Basic Box with Lid

Modular Memory Holder (USB)

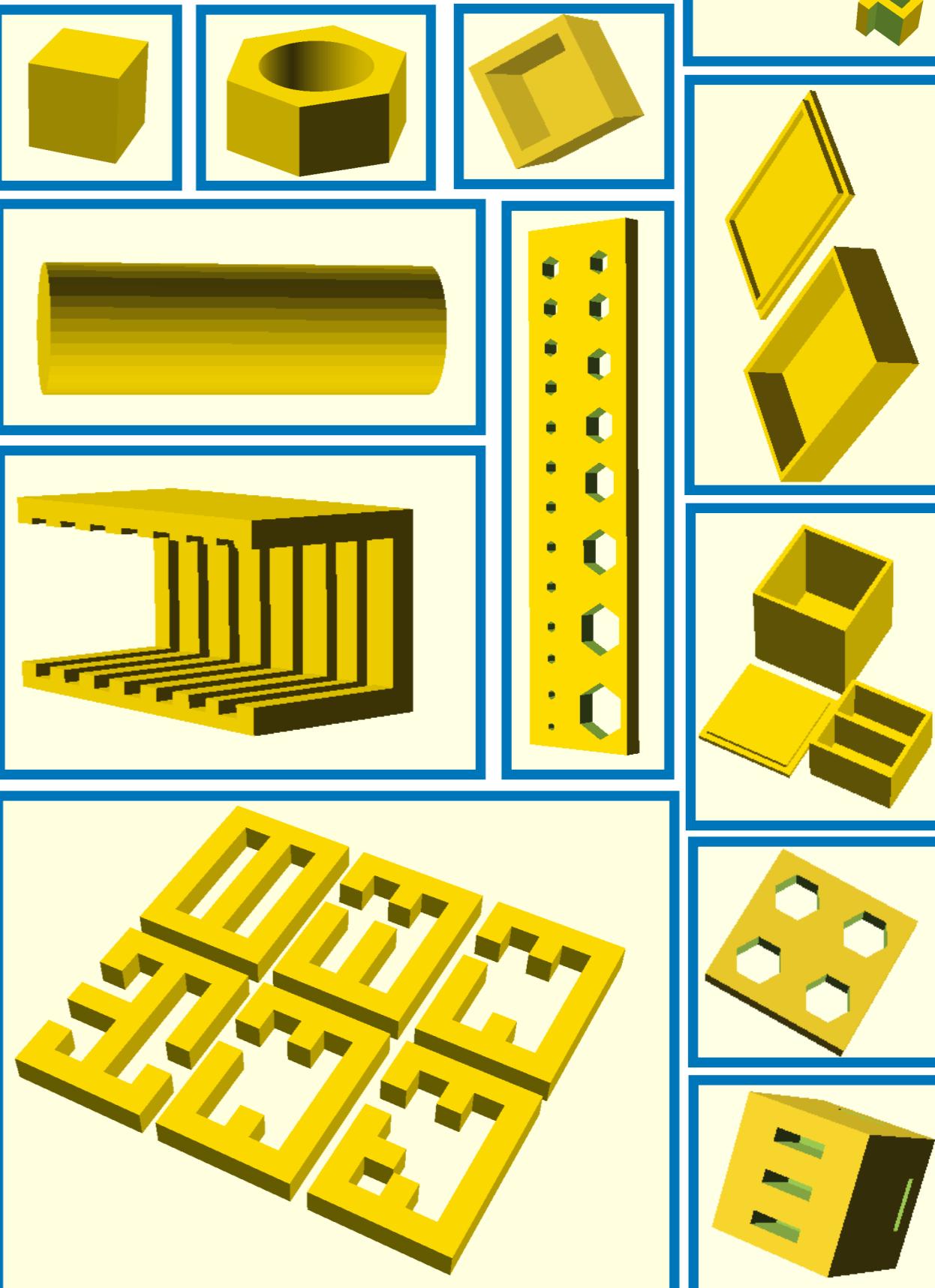
Circle Cell Block Generator

Jewelry Box with Inlay

SD Card Rack

Gordian knot 3D Puzzle

Results



Conclusions

Functional PL for fabrication (3D printing)

Clarity: semantics and compiler correctness

Usefulness: the first decompiler from mesh to CAD

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Check out our web IDE! – Adam Anderson
<http://reincarnate.uwplse.org/>

<https://github.com/uwplse/reincarnate-aec>