# CAD-driven pattern recognition in reverse engineered models 

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## Reverse Engineering


S. Gauthier et al. Analysis of digitized 3D mesh curvature histograms for reverse engineering. Computers in Industry, 2017.

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## Beautification

F. Langbein. Beautification of reverse engineered geometric models. PhD thesis, Cardiff University, 2003.
C. Gao et al.. Local topological beautification of reverse engineered models. Computer-Aided Design, 2004.
I. Kovács et al.. Applying geometric constraints for perfecting CAD models in reverse engineering. Graphical Models, 2015.
S. Oesau et al.. Planar shape detection and regularization in tandem. Computer Graphics Forum, 2016.
J. Chen and H. Feng. Idealization of scanning-derived triangle mesh models of prismatic engineering parts. International Journal on Interactive Design and Manufacturing (IJIDeM), 2017.

Y. Li et al.. Globfit: Consistently fitting primitives by discovering global relations. ACM Transactions on Graphics (TOG), 2011.

## $\Rightarrow$ based on geometric relationships between primitives

S. Gauthier et al. Orientation Beautification of Reverse Engineered Models. GRAPP/VISIGRAPP, 2017.

## CAD-driven Beautification


H. Vilmart et al.. From CAD assemblies toward knowledge-based assemblies using an intrinsic knowledge-based assembly model. Computer-Aided Design and Applications, 2018.
$\Rightarrow$ but beautification may also be based on CAD knowledge:

- Feature: fixed subset of primitives (screw/nut) $\rightarrow$ alignment, dimension constraints...
- Pattern: repetition of features (circular repetition) $\rightarrow$ position, dimension constraints...


## Step 1: Construction of a Relationship Graph



Graph:

- node = primitive
- edge $=$ relationship


Neighborhood

## Primitive parameters:

- orientations
- dimensions
- positions


Plane:

- position ( $x, y, z$ )
- orientation ( $a, b, c$ )


Sphere:

- position ( $x, y, z$ )
- radius $r$


Cylinder:

- position ( $x, y, z$ )
- orientation ( $a, b, c$ )
- radius $r$


Cone:

- position ( $x, y, z$ )
- orientation ( $a, b, c$ )
- angle $\alpha$

Set of primitives+parameters and the neighborhood relationships.

## Step 1: Construction of a Relationship Graph



Primitive parameters:

- orientations
- dimensions
- positions

Tolerances:

- angle
- dimension
- distance

Relationships:

- angle between orientations
- difference between dimensions
- distance between positions

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- node $=$ primitive
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Neighborhood


Parallelism


Similar dimensions


Orthogonality


Tangency
$\rightarrow$ Relationship Graph: geometric relations between each pair of primitives (up to some tolerances).

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## Relationship Graph



Neighborhood Parallelism Orthogonality
Coplanarity
:
$\rightarrow$ Relationship Graph: geometric relations between each pair of primitives (up to some tolerances).

## Step 2: Feature Recognition

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## Step 3: Pattern Recognition

1) A Feature is then defined by its Sub-Graph type and some parameters (based on primitives constituting it).
2) Define a Feature Graph based on the recognized Features (types+parameters) in the Relationship Graph.
3) Based on this Feature Graph, recognize recursively a Pattern of 2 similar Features (same type and parameters (up to some tolerances)).


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Degree 1


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Degree 2


Feature parameters=axis+radius

## Step 3: Pattern Recognition

4) If several Patterns are possible, select the optimal one according to some rules.


Pattern selection:


Selected pattern
(1) maximize the total number of grouped Features;

Selection rules:
(2) minimize the degree;

3 maximize the number of Features in Sub-patterns;
(4) minimize the distance between the two Features/Sub-patterns.

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Once features and patterns have been recognized:

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The axes of the two cylinders are aligned within the Feature.

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## Application to Beautification

Once features and patterns have been recognized:

1) Feature: relative regularization of all the primitive parameters based on the constraints of the Relationship Subgraph.
Definition of Feature parameters= common parameters.
2) Pattern = global regularization of the Feature parameters.


Feature parameters = position+orientation of the common axis.
The 3 axes are positioned in the same plane and equidistant.

## Lego bar



3D mesh of a Lego bar with a structured-light scanner (accuracy $\approx 100 \mu \mathrm{~m}$ ).

## Lego bar



Planes: 5
Cylinders: 11

Detection of primitives and parameters
Plane: position+orientation Cylinder: position+orientation+radius

## Lego bar



- Feature 1: 2 concentric cylinders (violet+yellow)
- Feature 2: cylinder (pink)

Feature beautification $\longrightarrow$ concentric cylinder axes are aligned.

## Lego bar



- Pattern 1:4× Feature 1
- Pattern 2: $3 \times$ Feature 2
$\longrightarrow$ Feature axes are aligned and made equidistant.


## Lego bar



- Pattern 1: $4 \times$ Feature 1
- Pattern 2: $3 \times$ Feature 2
$\longrightarrow$ Feature axes are aligned and made equidistant.
$\longrightarrow$ Feature radii are equalized inside a Pattern.


## Lego bar



Can be compared with the CAD model for control.

## Clamp connector



341 primitives (planes, cylinders, cones).

## Clamp connector

## Degree 0



8 Features "counterbore".

## Clamp connector

## Degree 1



Sub-pattern of 2 Features.

## Clamp connector

## Degree 2



Sub-pattern of 2 Sub-patterns of 2 Features.

## Clamp connector

## Degree 3



Pattern of 2 Sub-patterns of 2 Sub-patterns of 2 Features?

## Clamp connector



$$
\begin{array}{r}
R^{3}\left(R^{2}\left(R^{1}\left(p_{1}^{0}, p_{2}^{0}\right), R^{1}\left(p_{3}^{0}, p_{4}^{0}\right)\right),\right. \\
\left.R^{2}\left(R^{1}\left(p_{5}^{0}, p_{6}^{0}\right), R^{1}\left(p_{7}^{0}, p_{8}^{0}\right)\right)\right)
\end{array}
$$

Introduction of a new mirror-type Pattern rule
$\rightarrow$ Sub-patterns of opposite orientation.

## Perspectives

Recognize more types of Features and more configurations of Patterns.

M. Pauly et al.. Discovering structural regularity in 3D geometry. ACM Transactions on graphics, 2008.
Q. Wang and X. Yu. Ontology based automatic feature recognition framework. Computers in Industry, 2014.

## Perspectives

## Formulate hypotheses to infer primitives.



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Formulate hypotheses to infer primitives.


## Thank you

## Some questions?



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Silvère Gauthier, W. Puech, R. Bénière, G. Subsol, CAD-driven pattern recognition in reverse engineered models, 2019


CAW

