### Overview

- The problem comparing shapes.
- Skeletons or "Shock Graphs".
- Application of Edit distance here.
- Edit distance algorithm.

Problem: Comparing Shapes

Simple closed curves in a plane, i.e no holes.

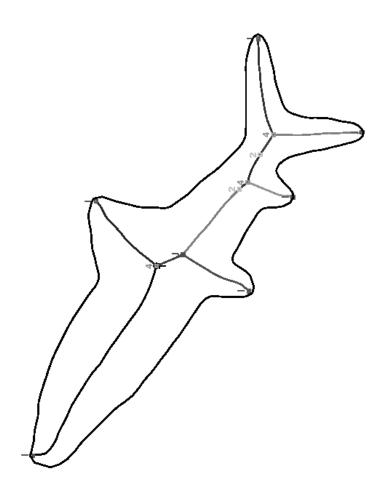
General Approach:

- Represent a shape by its "skeleton", a graph.
   (Vision community has techniques for doing so.)
- 2. Compare the skeletons using edit distance.

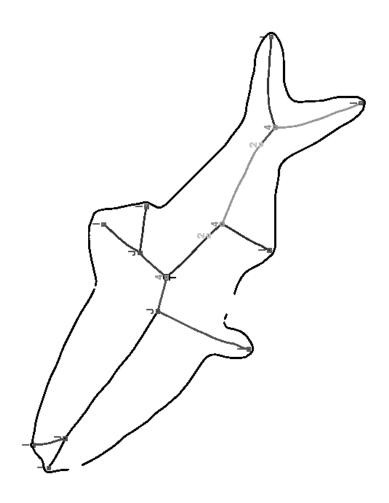
# Shock Graphs

- Shock Graphs are constructed from the *locus of* centers of maximal circles at least bitangent to the boundary.
- Convert into a combinatorial object.
   Now the arcs of this graph have attributes like:
  - Radius the distance from the boundary.
  - Velocity rate of change of radius.

# Shock Graph example



# Shock Graph example (2)



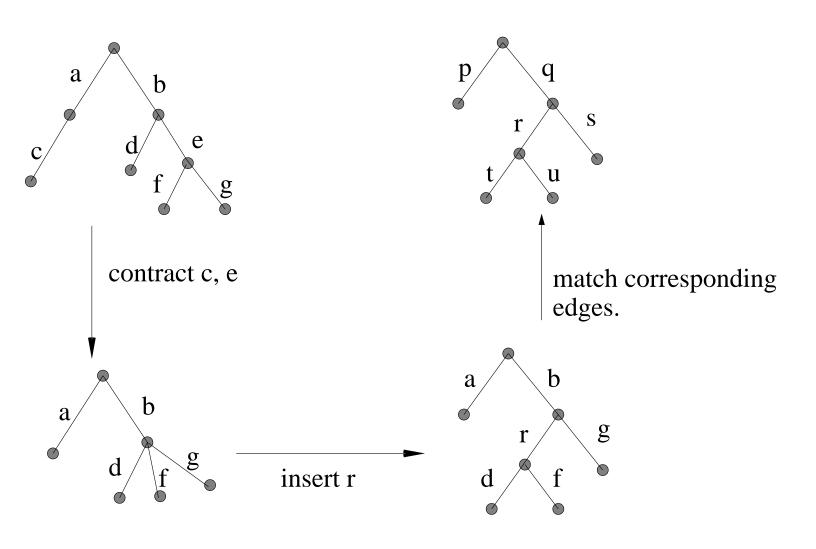
### Edit Distance

- Observation: These graphs are trees if the shapes are *simple* and *closed*.
- Idea: Use tree edit distance to compare shapes.

Edit distance between two trees  $T_1$  and  $T_2$  is the minimum cost of a sequence of "edit operations" that takes tree  $T_1$  to tree  $T_2$ .

Traditionally, edit operations are *Edge insertion*, *Edge deletion*, *Matching an edge in*  $T_1$  *to one in*  $T_2$ .

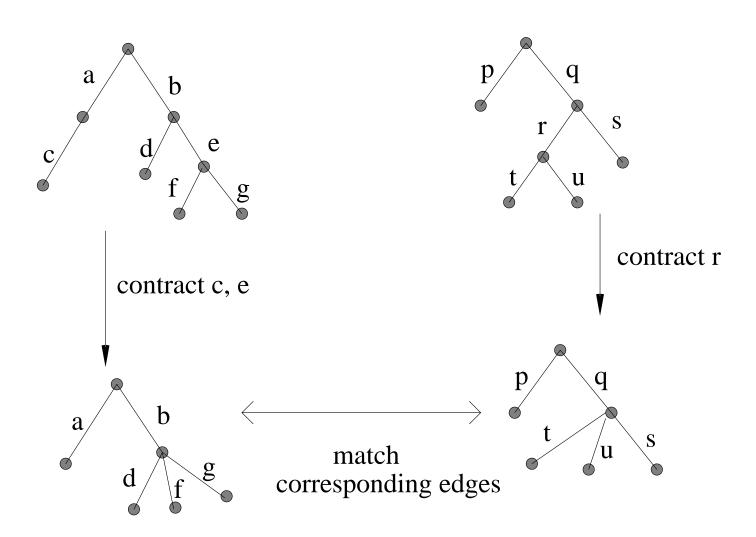
# Example of an edit sequence



### Tree Edit Distance - contd

An alternative (equivalent) definition which we will use: Edit distance is the minimum cost of separately transforming the two input trees into a common tree.

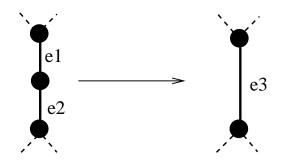
We now don't need the insert (or uncontract) operation.



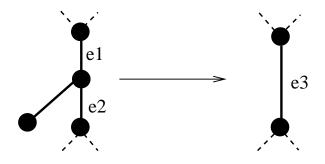
# The twist in our problem

We require a more general set of edit operations.

Merge: Combine two edges with a common endpoint (of degree two) into a single edge.



Prune: If common endpoint has degree three, merge is still allowed. The subtree rooted at the other incident edge is *pruned* off.



Considered natural and essential edit operations by the vision researchers (Kimia and Sharvit).

### **Problem Definition**

Input: Two trees  $T_1$  and  $T_2$ 

Output: The Minimum cost sequence of

- (1) merges, prunes
- (2) contracts and
  - (3) relabelings

that transform the two input trees into a common tree.

Restriction on contract (related to vision application):
An edge can be contracted only if both its endpoints have degree greater than or equal to three.

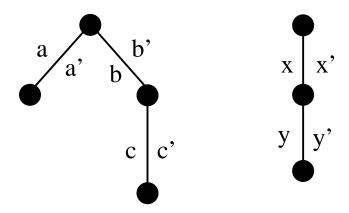
### Basic Tree Edit distance

Earlier work: Zhang and Shasha's algorithm for tree edit distance with edit operations set = { edge contract, edge relabeling}.

Basic idea: Dynamic Programming

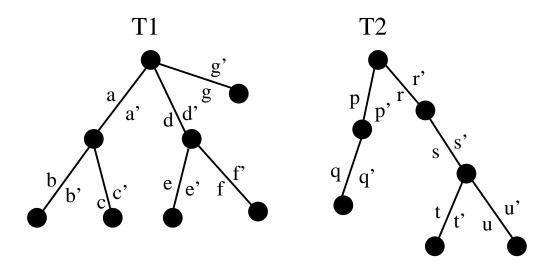
We give here our version of their algorithm, which is based on *Euler strings*.

# **Euler String:**

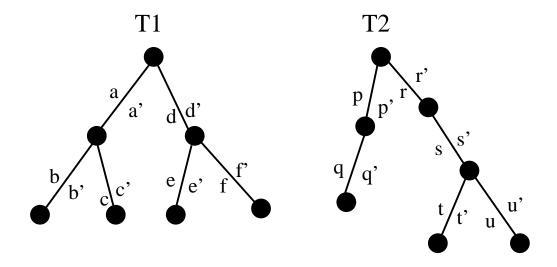


Left: aa'bcc'b' Right: xyy'x'

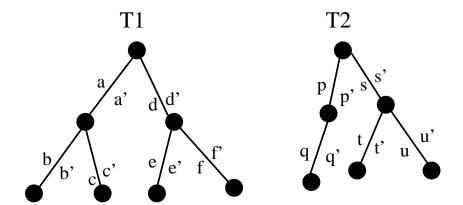
Let's look at an edit sequence on a pair of trees and see how it affects the corresponding euler strings.



Original Pair of trees.  $(a \dots g', p \dots r')$ .

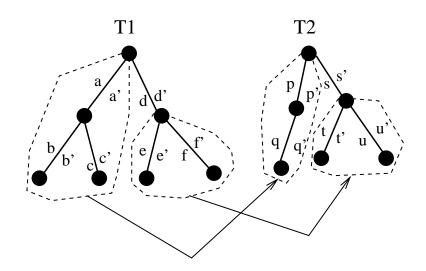


After contract g' on left  $(a \dots d', p \dots r')$ .



Contract r' on right  $(a \dots d', pqq'p'stt'uu's')$ . T2's euler string can also be written as  $(pqq'p' \quad \mathbf{r} \quad stt'uu's')$ , so that

(1) it is a substring of p cdots r'. (2) it still does not contain r (dart r' is absent)



Match d' to s'. This leads to two subproblems:

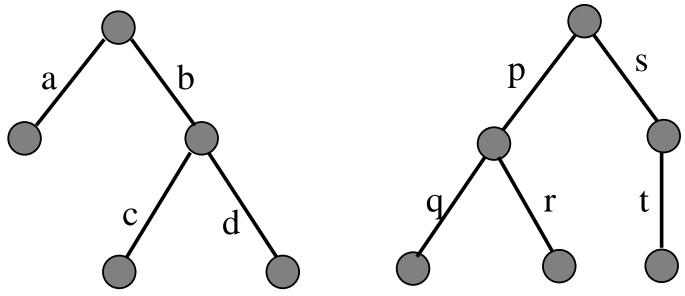
(1) 
$$(a ... a', p ... p')$$
.

(2) 
$$(e ... f', t ... u')$$
.

# Algorithm for basic tree edit distance

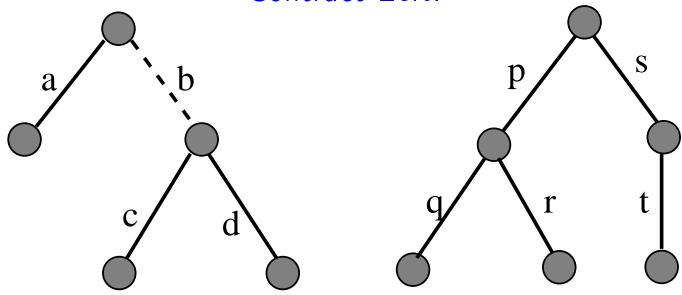
- Dynamic programming on set of all possible pairs of Euler strings of  $T_1$  and  $T_2$ .
- A subproblem is  $(s_1, s_2)$  where  $s_i$  is a substring of the Euler string of  $T_i$ .
- Cost of a subproblem can be computed from the costs of a few other "smaller" subproblems, shown overleaf.
- What could happen to the rightmost edges  $(e_1, e_2)$  of the Euler strings in the optimal edit sequence?
  - (1)  $e_1$  gets contracted
  - (2)  $e_2$  gets contracted
  - (3)  $e_1$  gets matched to  $e_2$

# Initial Subproblem:



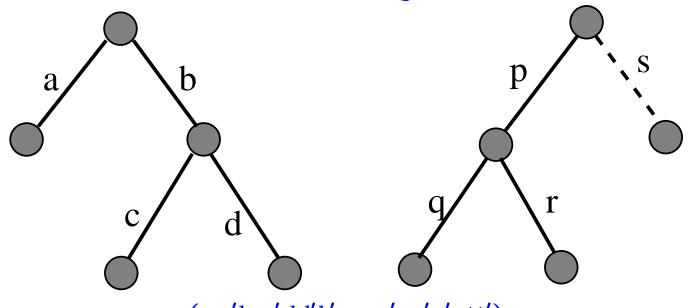
(aa'bcc'dd'b', pqq'rr'p'stt's')

# Contract Left:



(aa'bcc'dd', pqq'rr'p'stt's')

# Contract Right:



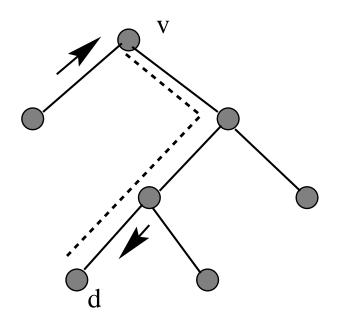
# (aa'bcc'dd'b', pqq'rr'p'stt')

# Match b to s: a c d c (aa', pqq'rr'p') and (cc'dd', tt')

# Algorithm with merge and prune

- Each half of our subproblems has just one merged edge.
- formed by merging consecutive edges on root-leaf path
- Represent it using one extra parameter,  $\boldsymbol{v}$  in each half of the subproblem.

We merge a path into a single edge. v is the top of the path.



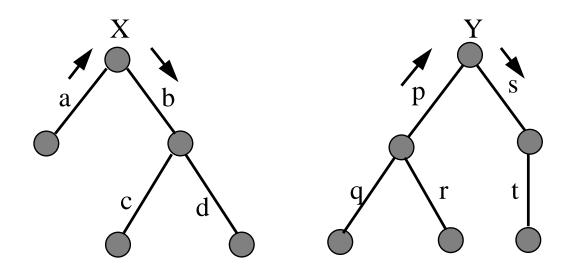
The arrows show the start and end of the Euler string. The path from d to v (dotted lines) is merged into a single edge.

# Algorithm for merge and prune - continued

Again look at all possible operations on the rightmost edges.

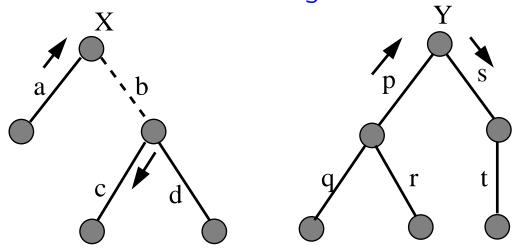
- contract the merged edge in  $T_{
  m 1}$
- contract the merged edge in  $T_2$
- further merge the edge in  $T_1$  with its descendant
- further merge the edge in  $T_2$  with its descendant
- match the two merged edges

Initial Subproblem - Arrows denote the start and endpoints of the Euler string. X and Y are the top of the merged edges.



(aa'bcc'dd'b', X, pqq'rr'p'stt's', Y)

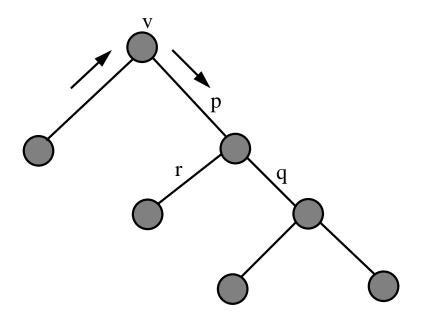
Subproblem for Left Tree merge down with left child.



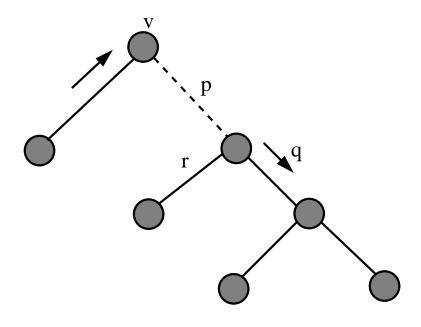
(aa'bcc', X, pqq'rr'p'stt's', Y)

# Problem with pruning away left child

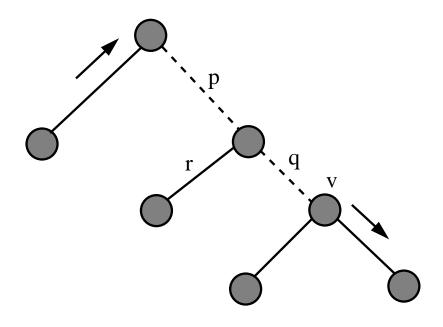
# The Initial Half Subproblem



After merging p with q (pruning our r)



# After contracting q



In this subproblem it's now ambiguous whether r was pruned out or not.

The same sub-problem could have been reached by contracting p and q separately!

### The Fix

If you want to merge a few edges and then contract the result, then do it in two parts.

- (1) contract p
- (2) contract q
- (3) when you encounter r, decide whether to prune it off or not.

This imposes a condition on the cost function (refer to paper).

# Complexity

Time Complexity: number of subproblems  $O(n_1^2n_2^2d_1d_2),$  where  $n_i$  is size of  $T_i$  and  $d_i$  is the depth of  $T_i$ .

Space complexity: We don't have to store the solution to every subproblem all the time.  $O(n_1n_2)$ .

# Future work

- Empirical Evaluation of the algorithm
- Faster algorithms
- Extend to matching 3D surfaces