

Similarity and Analogy

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Similarity

- Fundamental to learning, knowledge and thought (Quine).
 - Making predictions, generating expectations
- Appraisals of representation provide a lens into internal representations/processes.
- But elusive. Goodman (1972):
 - Things can be similar in an unlimited number of ways.
 - One must specify in what respects two objects are similar, or the statement is empty.

Models of Similarity

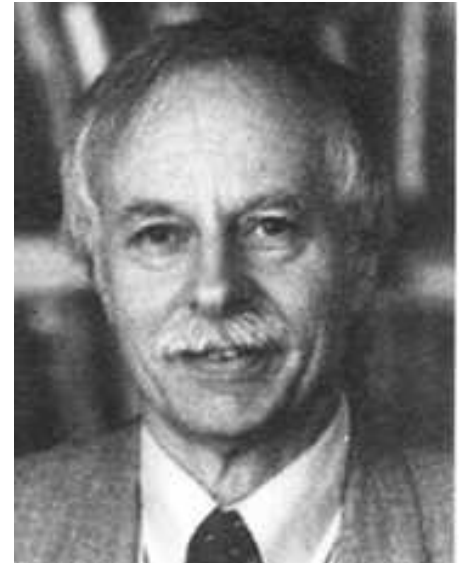
- Spatial/Geometric (Torgerson, 1958; Shepard, 1962)
- Featural (Tversky, 1977)
- Structural (Gentner, 1983)

As we go through these, look for:

- Representational Assumptions
- Algorithms

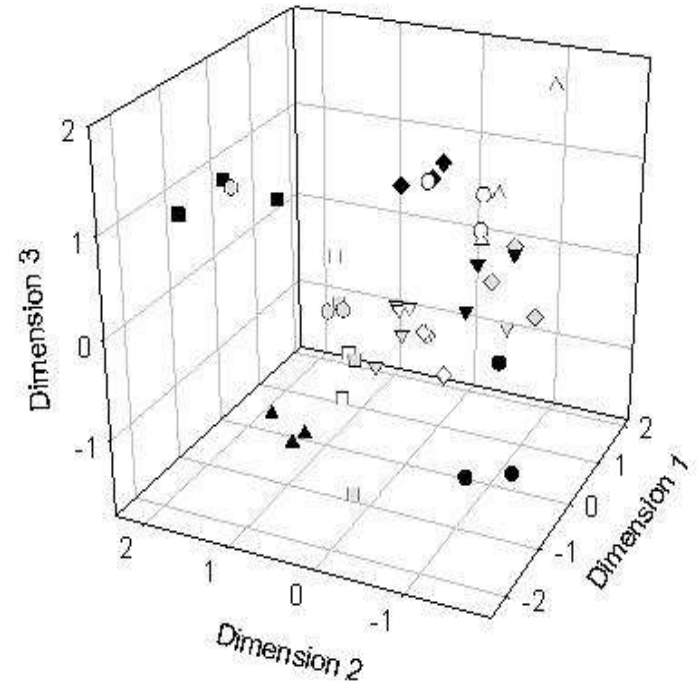
Spatial/Geometric Models

- Objects represented by points in a n-dimensional space.
- Dissimilarity = distance between the two objects in this space.
- Distance metric = Euclidean (integral stimulus dimensions), city-block (separable).



Geometric Models – II

- Where do the dimensions come from?
 - MDS (Multidimensional Scaling): Constructs the “underlying psychological scales” from subject's pairwise similarity ratings.



Problems with Geometric Models

- Minimality: $D(A,B) \geq D(A,A) = 0$
 - The letter “S” is more similar to itself than “W” is to itself (Podgorny and Garner, 1979)
 - M is more often recognised as H than M (Gilmore et al, 1979)
- Symmetry: $D(A,B) = D(B,A)$
 - North Korea is more similar to China than the other way around.
- The Triangle Inequality: $D(A,B) + D(B,C) \geq D(A,C)$

where $D(A,B)$ is interpreted as the dissimilarity between items A and B.

Featural Models

- Contrast Model (Tversky, 1977)
 - Entities represented by a set of features
 - Similarity a weighted combination of common and distinctive features
 - No restriction on what's a feature, e.g., Red, Symmetric, Useful, Pretty.

$$\begin{aligned} S(A,B) = & \quad q * f(A \text{ int } B) \\ & + a * f(A - B) \\ & - b * f(B - A) \end{aligned}$$



Featural Models - II

- Solves the problems with geometric models
- Explains how two things can be very similar and different at the same time.
 - East Germany and W Germany more similar/different than Ceylon and Nepal.
- Influential idea, spread to fields like speech perception, pattern recognition, categorization, artificial intelligence (case-based reasoning).

Problems with Featural Models

- Entities, stories, etc. **not** an unstructured grab bag of features.
 - Above(circle, triangle) not the same as Above (triangle, circle).
 - X is a part of Y
 - X causes Y

