

### **List of Papers referred to construct the Taxonomy in QUESTO:**

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4. Visual Integration of Data and Model Space in Ensemble Learning, Bruno Schneider Dominik Jäckle, Florian Stoffel, Daniel Keim Alexandra Diehl Johannes Fuchs, VDS 2017
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19. A Visual Interaction Framework for Dimensionality Reduction Based Data Exploration, Marco Cavallo, Çağatay Demiralp, CHI 2018
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