

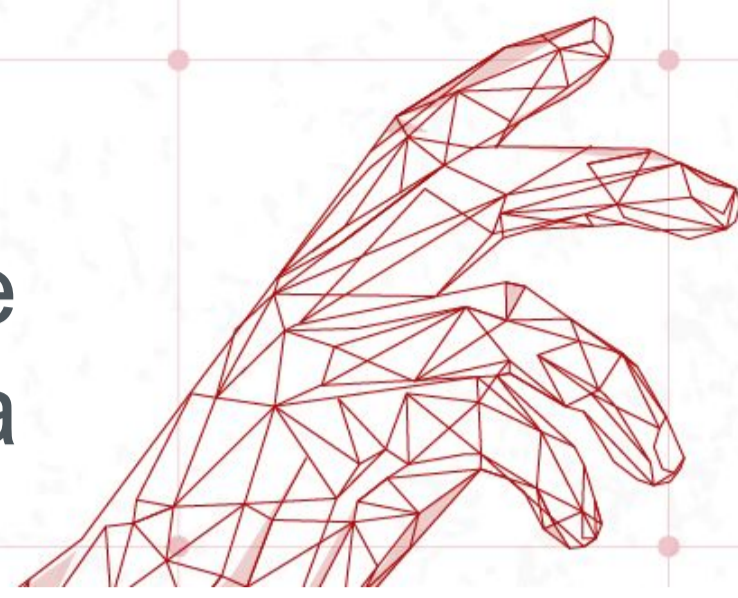
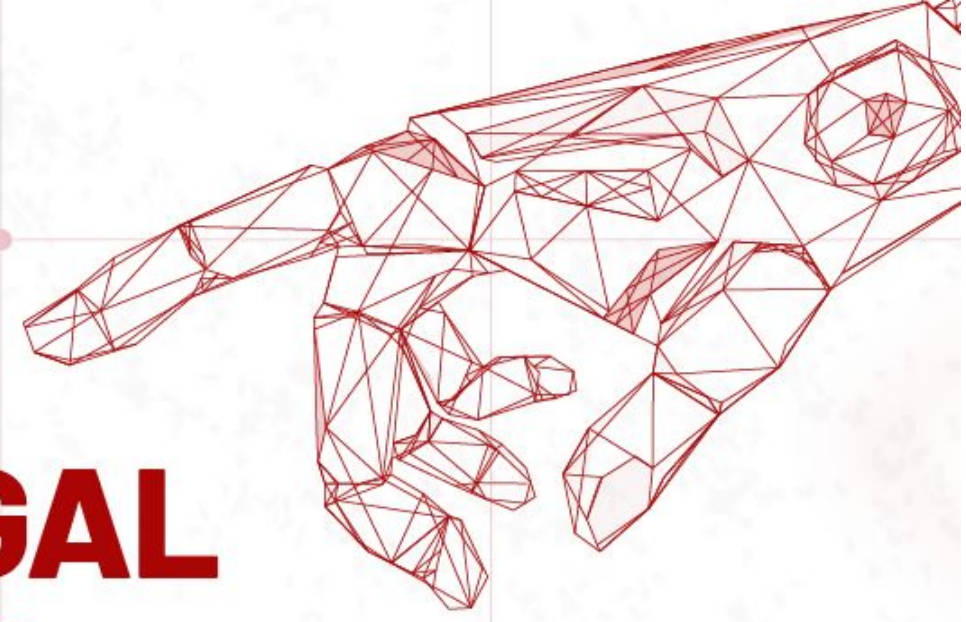
Hyperbolic Representations for Hierarchical Learning

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NEW FRONTIERS IN TECH



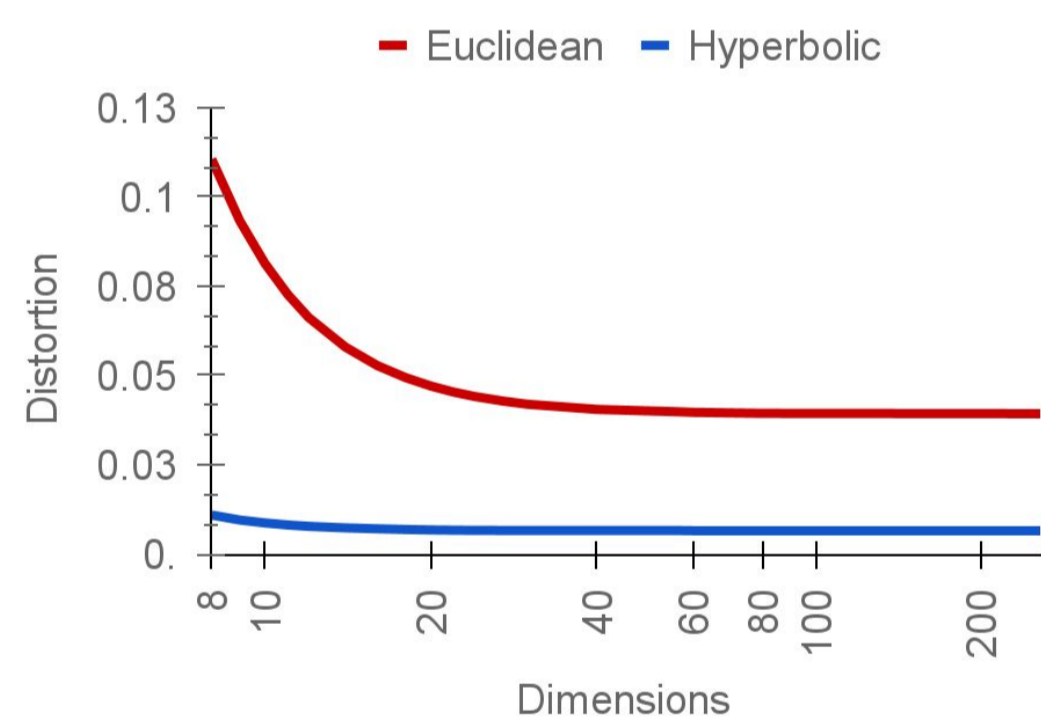
Introduction

Most of the data we collect from the world around is implicitly structured via latent hierarchical relationships. Consider the example of a fashion catalog. A *cardigan* and a *jacket* are intuitively more closely related than a *cardigan* and a *skirt*. Implicitly, we assume the existence of a parent class, which we may call *upper body garments*, from which *skirt* does not inherit from. Due to their *tree-ness*, hierarchies and hierarchy-bound datasets are amenable to low-dimensional and highly informative representations in hyperbolic space, which may be thought of as a continuous version of a tree.

In this work, carried out within iFetch, we show that, leveraging the taxonomy of a fashion catalog to supervise an hyperbolic classifier improves the top-1 classification accuracy. As a byproduct, we create representations that are faithful to the underlying hierarchy and thus, more interpretable than Euclidean alternatives.

Results

How much do different representation spaces distort the hierarchy tree? (smaller is better)



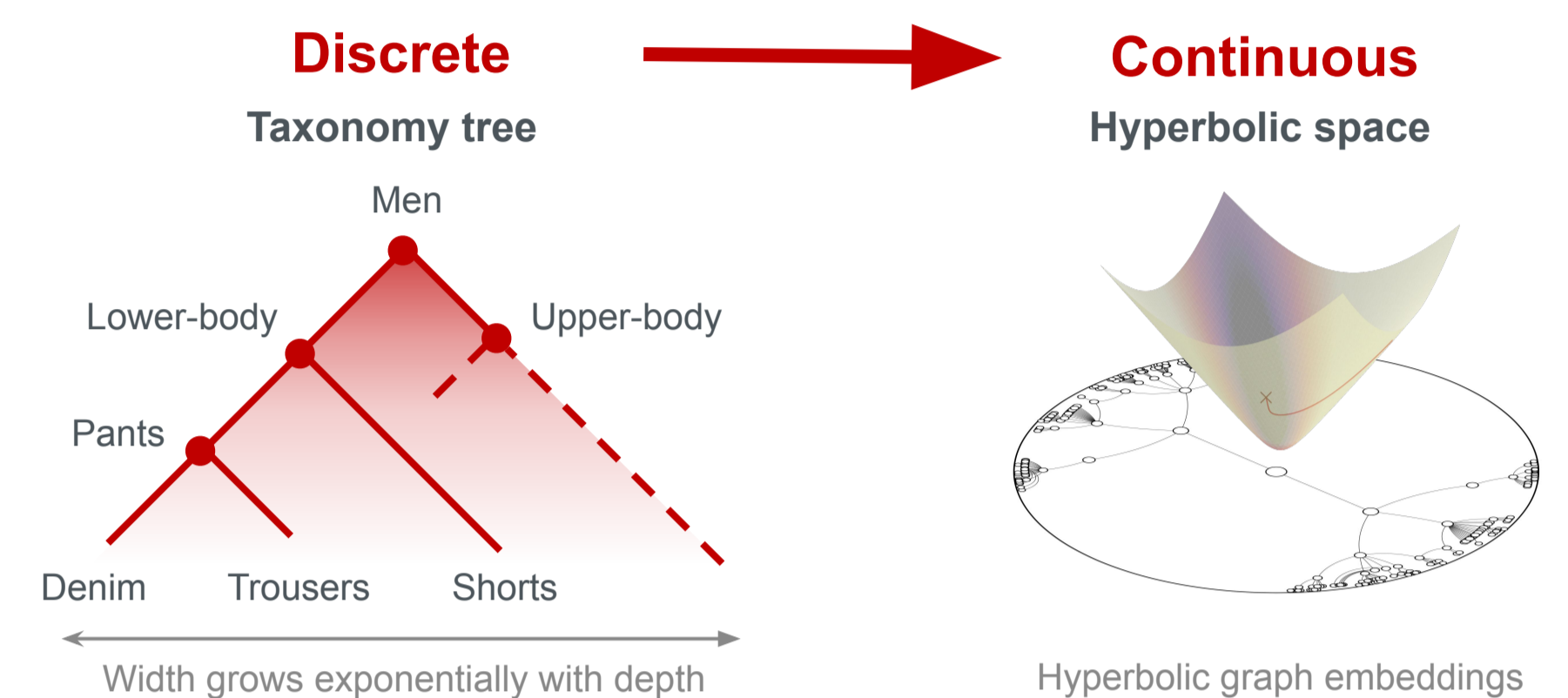
DeepFashion dataset (in shop item classification)

	Test accuracy (%)
Pre-trained CLIP ViT-B/32	71.7
Fine-tuned 128d Resnet-50	72.3
128d Hyperbolic classifier	79.3

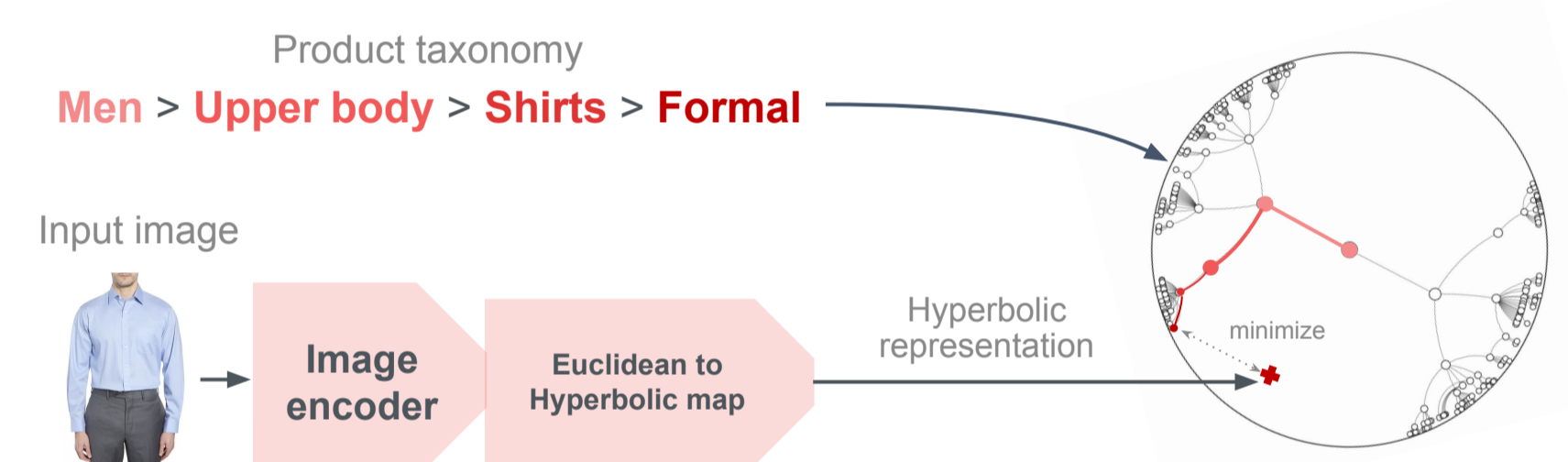
- MEN/Denim
- MEN/Jackets_Vests
- MEN/Pants
- MEN/Shirts_Polos
- MEN/Shorts
- MEN/Suiting
- MEN/Sweaters
- MEN/Sweatshirts_Hoodies
- MEN/Tees_Tanks
- WOMEN/Blouses_Shirts
- WOMEN/Cardigans
- WOMEN/Denim
- WOMEN/Dresses
- WOMEN/Graphic_Tees
- WOMEN/Jackets_Coats
- WOMEN/Leggings
- WOMEN/Pants
- WOMEN/Rompers_Jumpsuits
- WOMEN/Shorts
- WOMEN/Skirts
- WOMEN/Sweaters
- WOMEN/Sweatshirts_Hoodies
- WOMEN/Tees_Tanks

Model

1) The taxonomy is embedded in hyperbolic space



2) The taxonomy embeddings supervise the encoder



Representation space - 2D UMAP projections

128-d Hyperbolic classifier (ours)

512-d CLIP ViT-B/32



Conclusions

- Hyperbolic space - representation of datasets and thus, product catalogs, that is **faithful to the underlying data hierarchy**.
- Underlying data structure may be captured with **less dimensions**.
- On-going research on hyperbolic representations for fashion product **classification** and **retrieval**.

Acknowledgements

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