# Predictable Dual-view Hashing

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# Integrate information from different modalities

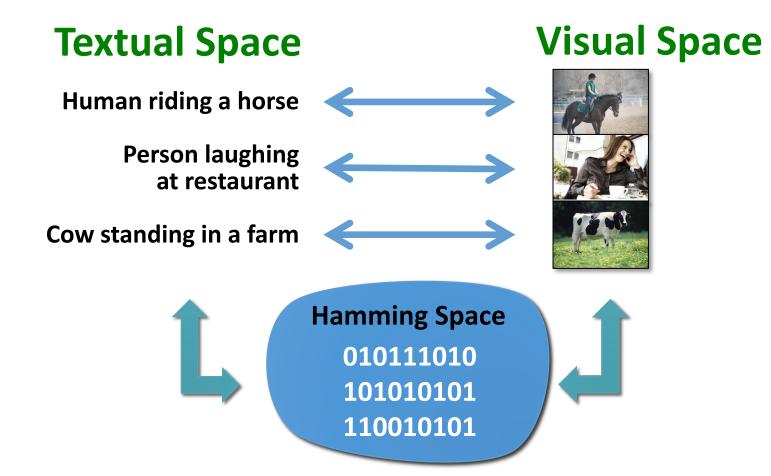
Text - Image

Human Riding Horse

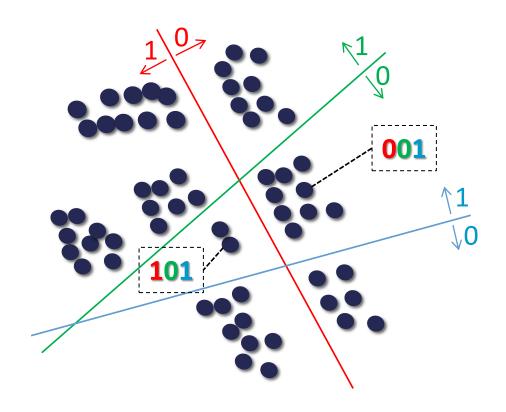
Sound - Text



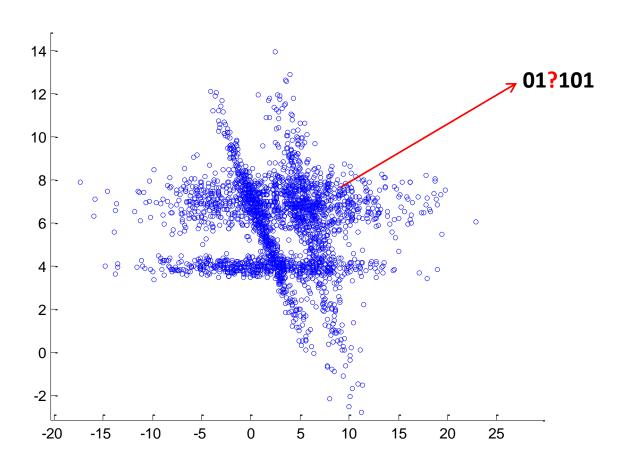
# **Dual-View Hashing**

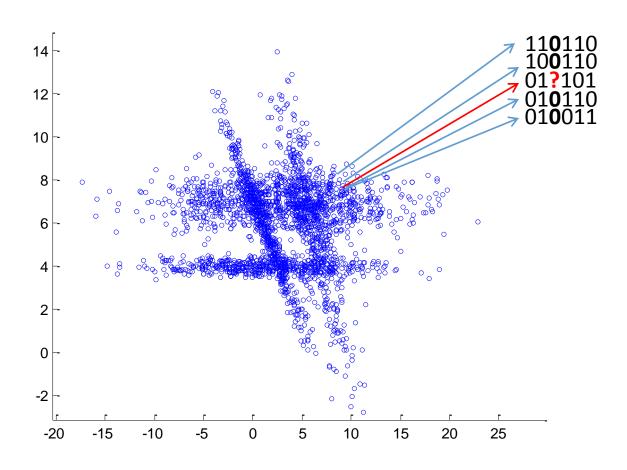


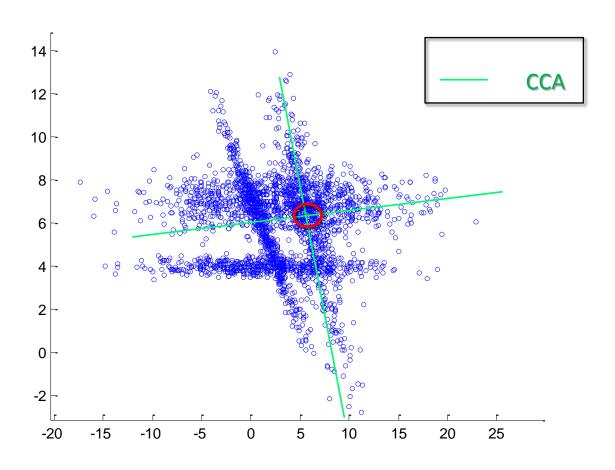
# Binary code assignments with splits

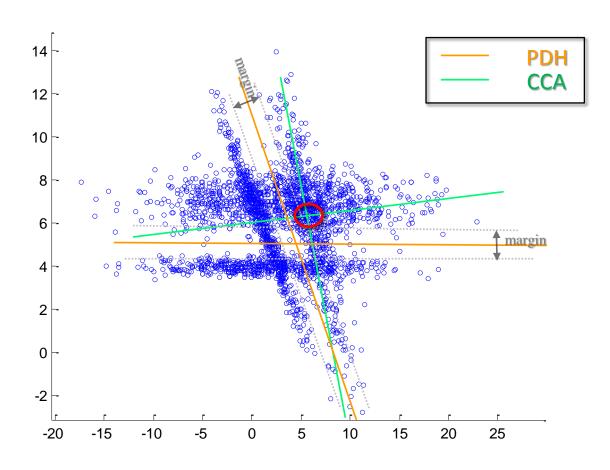


$$B = \operatorname{sgn}(W^T X)$$









## **Optimization**

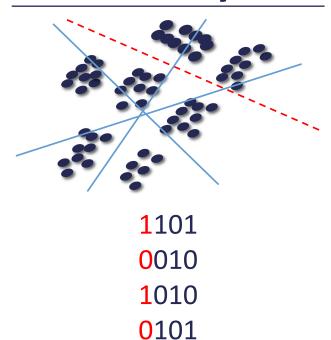
$$\min_{W_{\mathcal{V}}, W_{\mathcal{T}}, \xi_{\mathcal{V}}, \xi_{\mathcal{T}}} \|B_{\mathcal{T}} B_{\mathcal{T}}^{T} - I\|_{2}^{2} + \|B_{\mathcal{V}} B_{\mathcal{V}}^{T} - I\|_{2}^{2} 
+ \sum \|w_{\mathcal{V}i}\| + \sum \|w_{\mathcal{T}i}\| + C_{1} \sum \xi_{\mathcal{V}} + C_{2} \sum \xi_{\mathcal{T}} 
\text{s.t.}$$

$$B_{\mathcal{T}} = \operatorname{sgn}(W_{\mathcal{T}}^{T} X_{\mathcal{T}}), 
B_{\mathcal{V}} = \operatorname{sgn}(W_{\mathcal{V}}^{T} X_{\mathcal{V}}), 
B_{\mathcal{V}}^{ij}(w_{\mathcal{V}i}^{T} X_{\mathcal{V}}^{j}) \ge 1 - \xi_{\mathcal{V}}^{ij} \quad \forall i, j, 
B_{\mathcal{V}}^{ij}(w_{\mathcal{T}i}^{T} X_{\mathcal{T}}^{j}) \ge 1 - \xi_{\mathcal{T}}^{ij} \quad \forall i, j.$$

Solved by a block coordinate descent algorithm

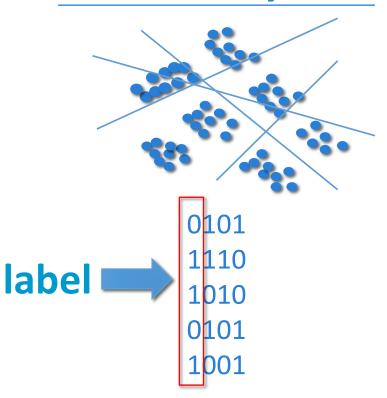
## Predictable dual-view hashing





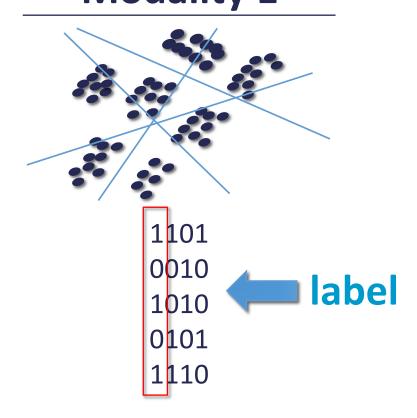
**1110** 

#### **Modality 2**

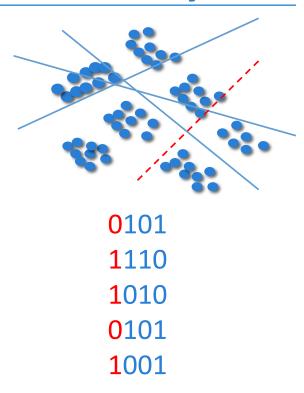


# Predictable dual-view hashing

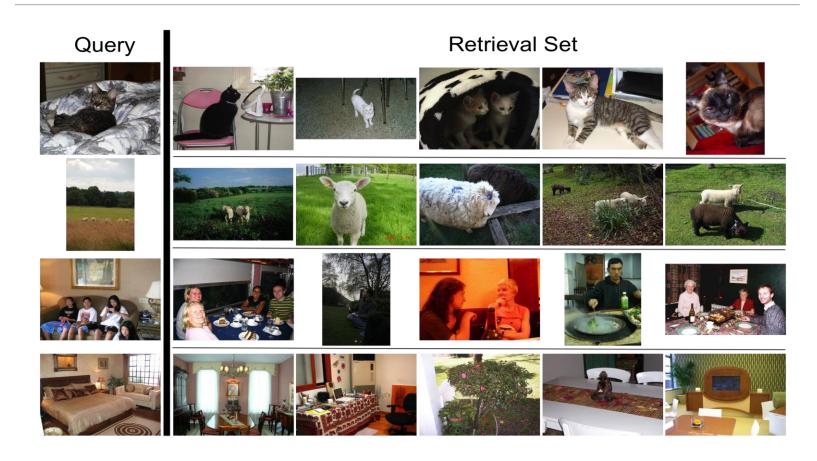
## **Modality 1**



#### **Modality 2**



# Image → image (with 32 bits)



# Text → Image (with 32 bits)

Bike riding in a field











Cows standing in a village











Laptop placed on the table











Persons standing in a room











Plane flying on the air



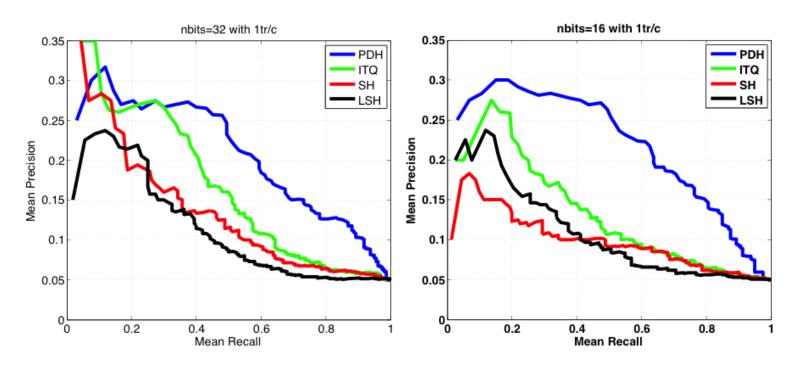








# **Image Retrieval**



Pascal Sentence [Farhadi et al]

Sun Attribute [Peterson et al]

# Thank you

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