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# Perceptive Context

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# Perceptive Context

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Awareness of the User -- Visual Conversation Cues:

*Interfaces (kiosks, agents, robots...) are currently **blind** to users...machines should be aware of presence, pose, expression, and non-verbal dialog cues...*

Awareness of the Environment -- Perceptive Devices:

*Mobile devices (cellphones, PDAs, laptops) bring computing and communications with us wherever we go, but they are **blind** to their environment...they should be able to see things of interest in the environment just as we do...*

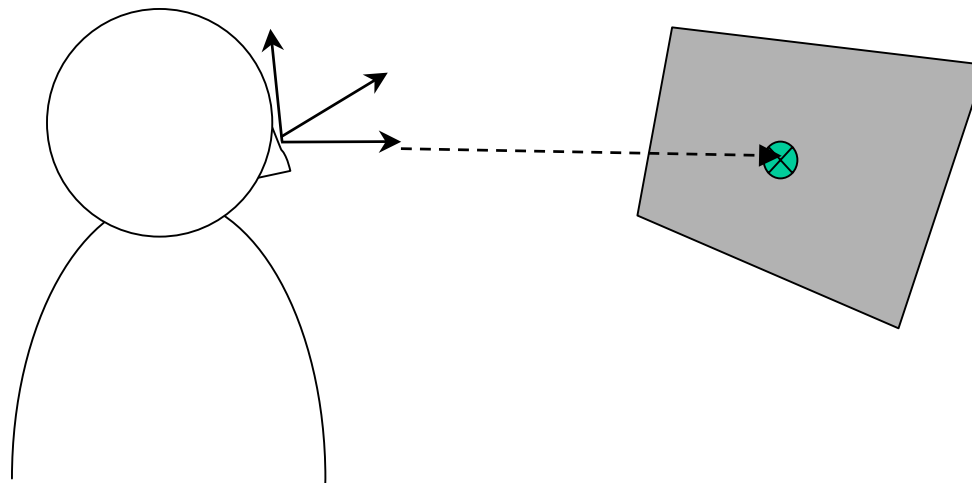
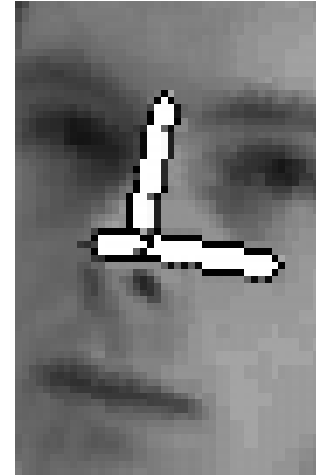
# Today

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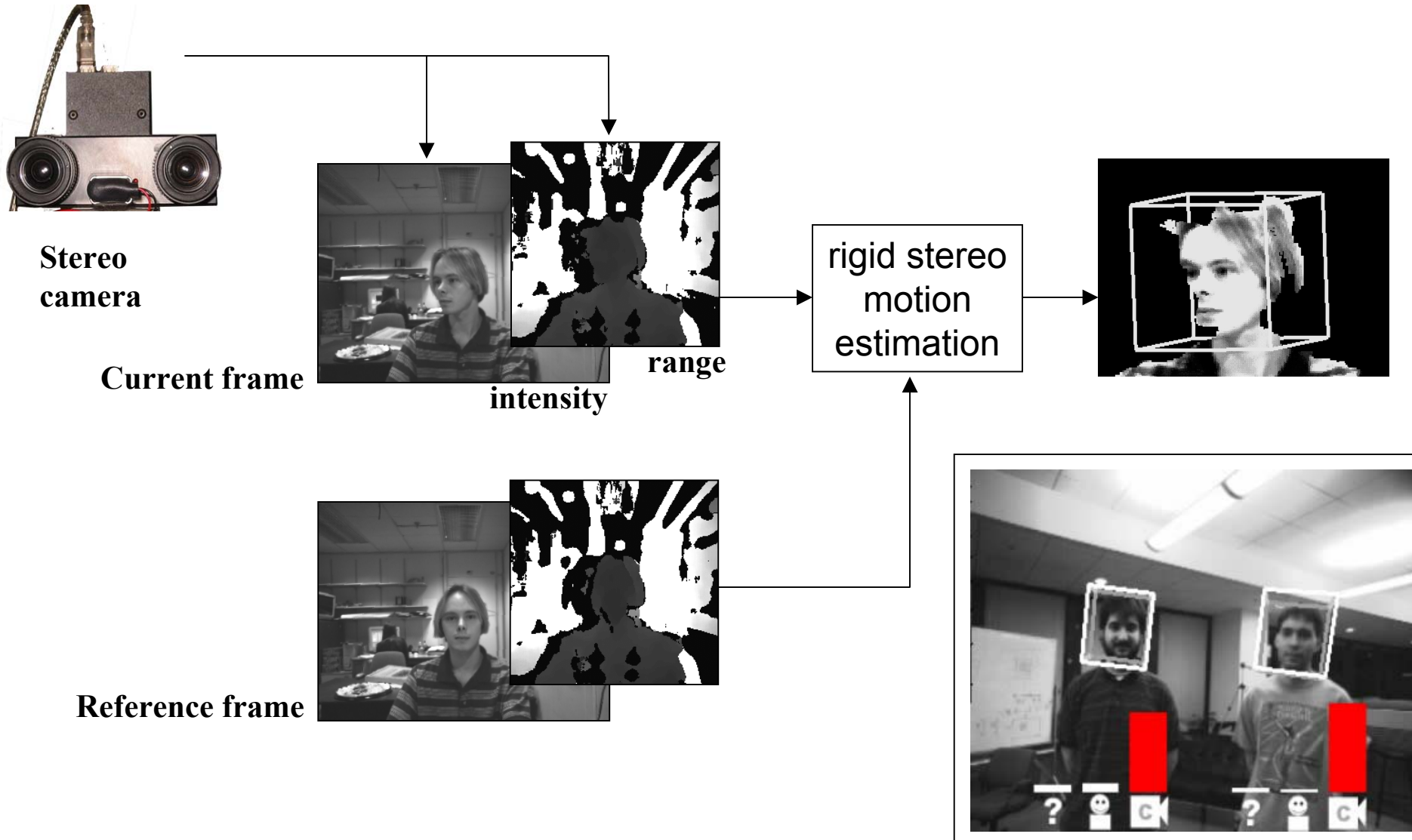
- Visually aware conversational interfaces (“*read my body language!*”)
  - head modeling and pose estimation
  - articulated body tracking
- Mobile devices that can see their environment (“*what’s that thing there?*”)
  - mobile location specification
  - image-based mobile web browsing

# Head modeling and pose tracking

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# 3D Head Pose Tracker



# Face aware interfaces

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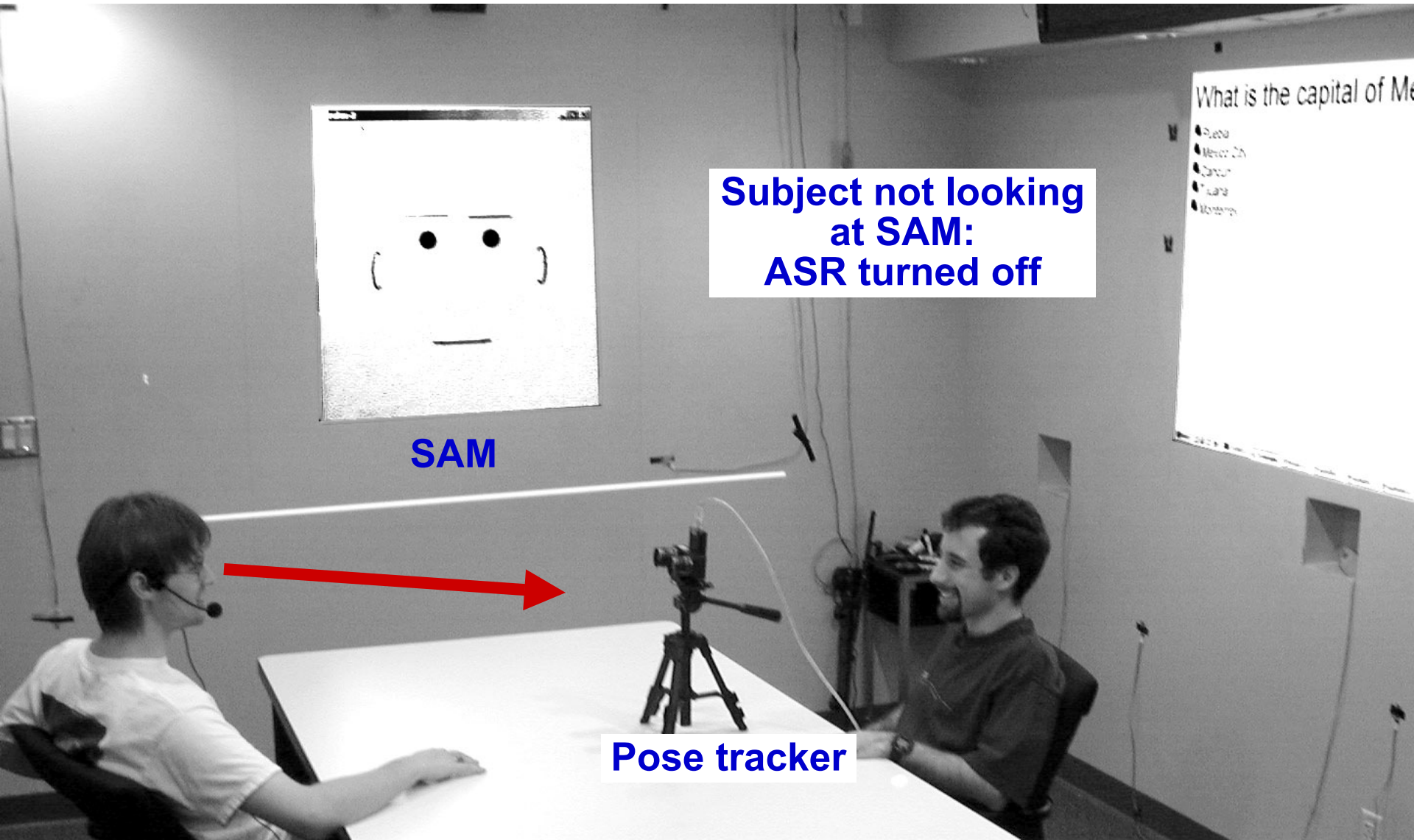
- Agent should know when it's being attended to
- Turn-taking discourse cues: who is talking to whom?
- Model attention of user
- Agreement: head nod and shake gestures
- Grounding: shared physical reference

# Face cursor

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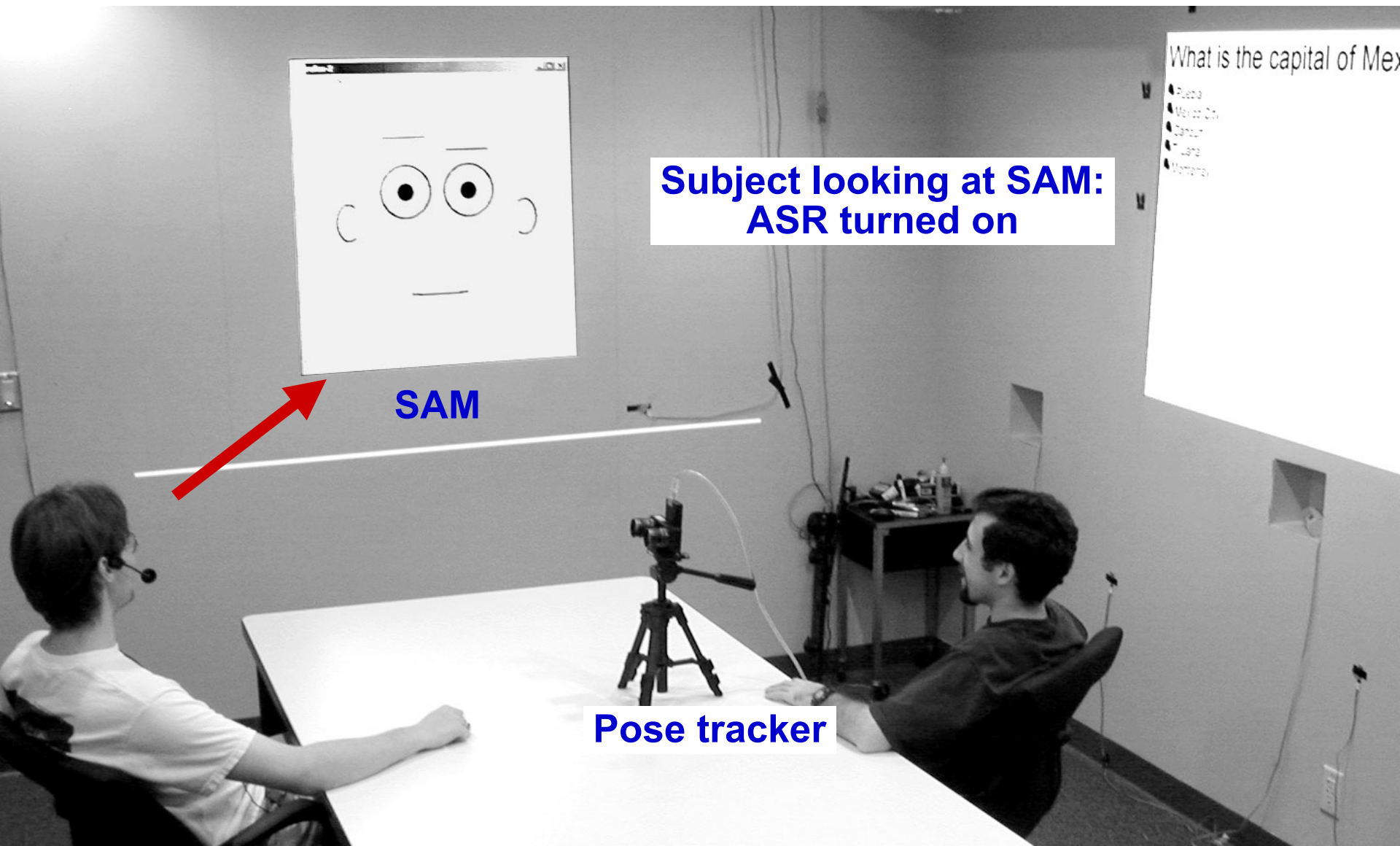


# Face-responsive agent

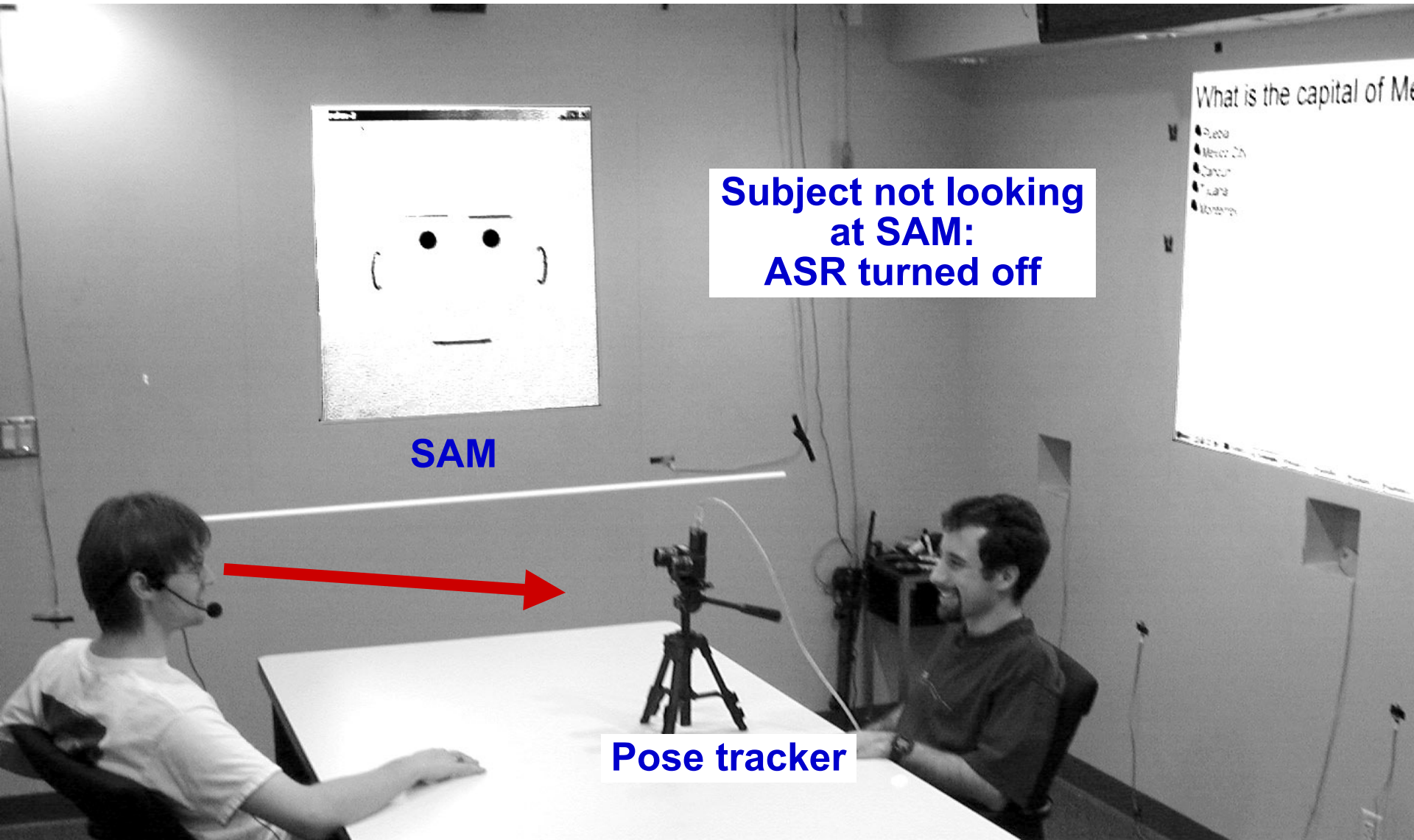




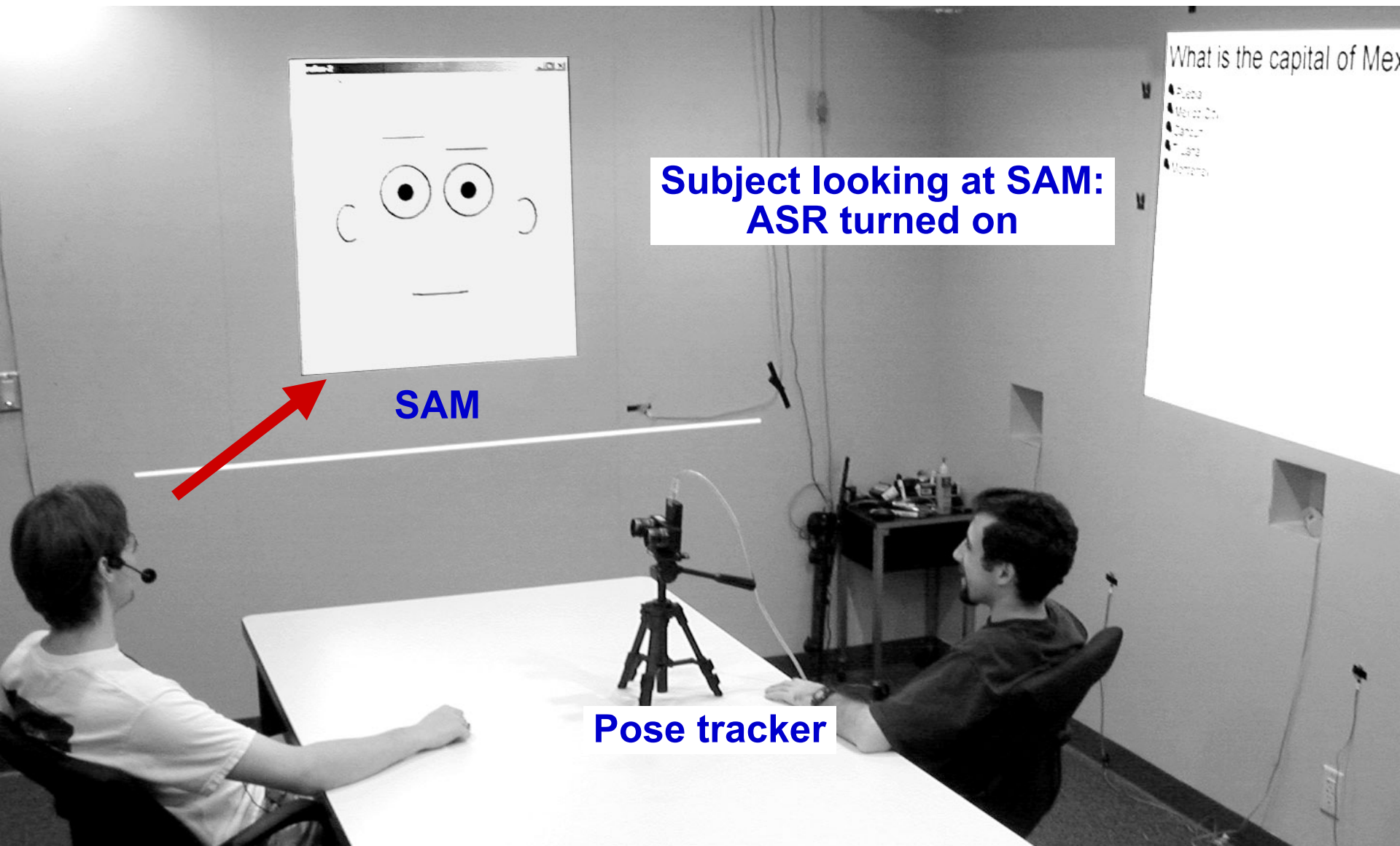
# Face-responsive agent



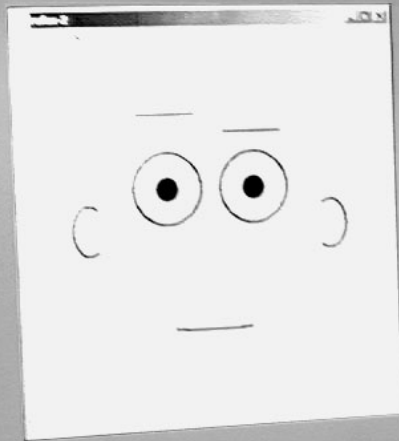
# Face-responsive agent



# Face-responsive agent



# Face-responsive agent



**SAM**

**Subject looking at SAM:  
ASR turned on**

What is the capital of Mex

- Puebla
- Mexico City
- Cancun
- Guadalajara
- Monterrey

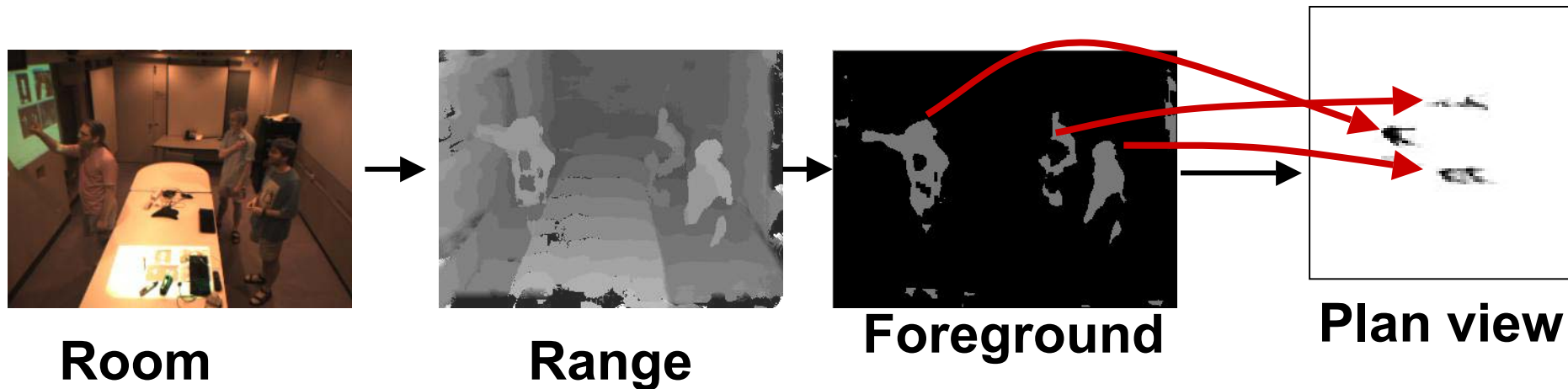
- General conversational turn-taking
- Agreement (Nod/Shake)
- Grounding / Object reference...

# Room tracking for Location Context

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Location is an important cue for pervasive computing applications...

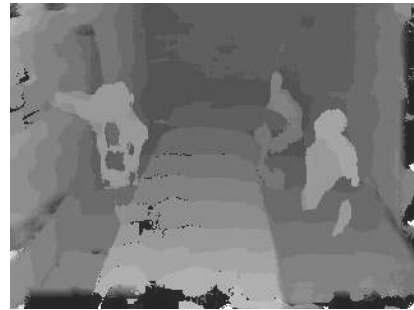
- Location context should provide a finer scale cue than room-ID, but more abstract than 3-space position and orientation.
- Regions (“zones”) should be learned from observing actual user behavior.



# Learning activity zones



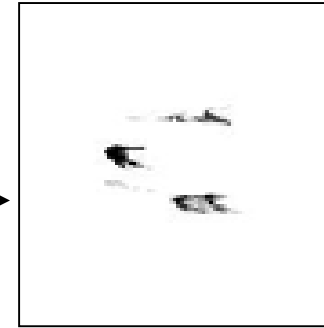
**Room**



**Range**



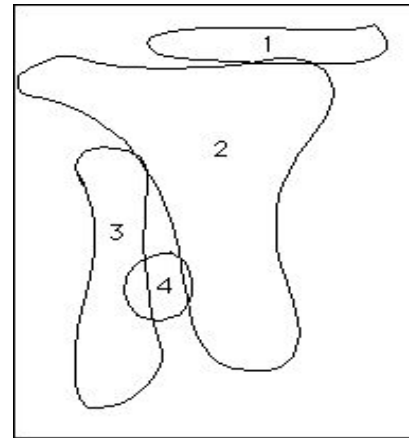
**Foreground**



**Plan view**



**Motion Clustering**



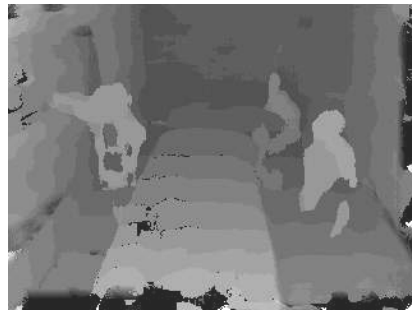
**Activity zones**

***Zone map formed from observing user behavior***

# Using activity zones



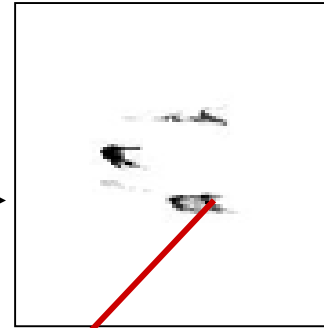
Room



Range



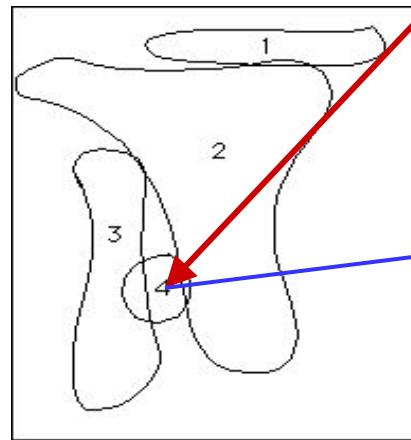
Foreground



Plan view



Activity zones

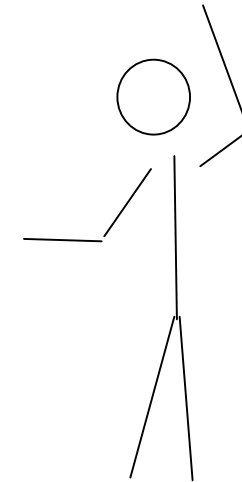
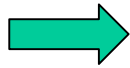
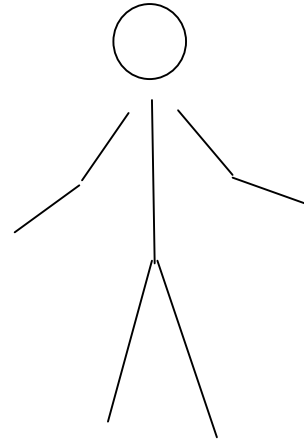


zone 4  
prefs

**Current zone determines  
application context**

# Articulated pose sensing

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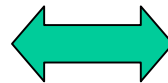


# Model-based Approach

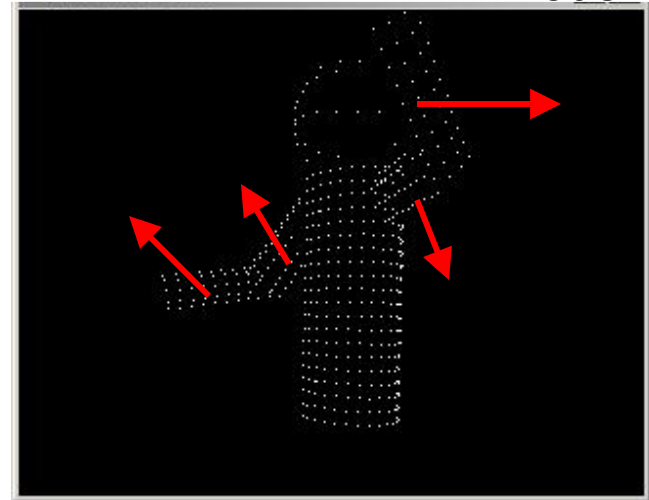
depth image



ICP with  
articulation  
constraint



model



1. Find closest points
2. Update poses
3. Constrain...



# Interactive Wall

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**gesture  
+ play**

# Multimodal studio

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# Articulated Pose from a single image?

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Model based approach difficult with more impoverished observations:

- contours
- edge features
- texture
- (noisy stereo...)

hard to fit a single image reliably!

➤ *Example-based learning paradigm*

# Example-based matching

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- Match 2-D features against large corpus of 2-D to 3-D example mappings
- Fast hashing for approximate nearest neighbor search
- Feature selection using paired classification problem
- Data collection: use motion capture data, or exploit synthetic (but realistic) models

# Parameter sensitive hashing

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Input image



Compute features



Find similar examples



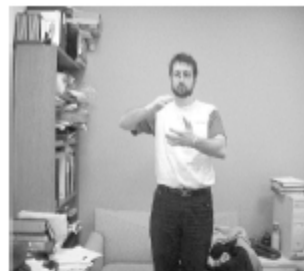
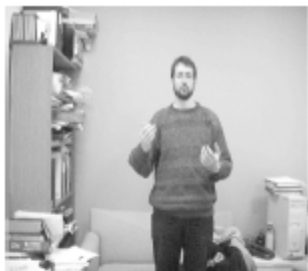
Robust LWR



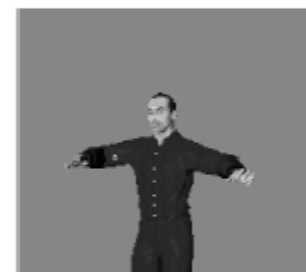
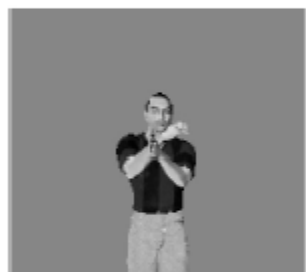
# 2D->3D with Parameter sensitive hashing

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INPUT



TOP MATCH



RLWR



# Today

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# Physical awareness

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How can device be aware of what user is looking at?

**User**

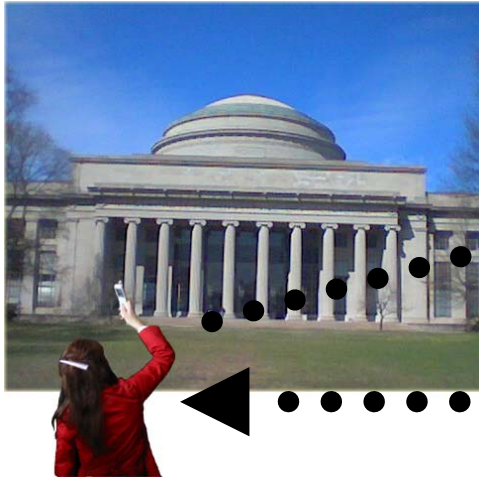


# Physical awareness

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Asking a friend, “What’s this?”

User



What is this?

MIT Dome

Human Expert

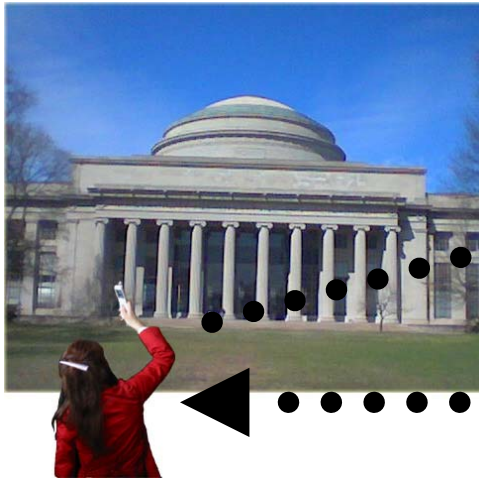


# IDeixis

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Instead, use CBIR (Content-based Image Retrieval) system:

User



What is this?

[http://mit.edu/..](http://mit.edu/)

CBIR System



# CBIR: Content-based Image Retrieval

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- Use image (or video) query to database.
- For place recognition, many current matching methods can be successful
  - PCA
  - Global orientation histograms [Torralba et al.]
  - Local features (Affine-invariant detectors/descriptors [Schmid], SIFT [Lowe], etc.)

*... where to get the database?*

# The Web

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- Many location images can be found on the web

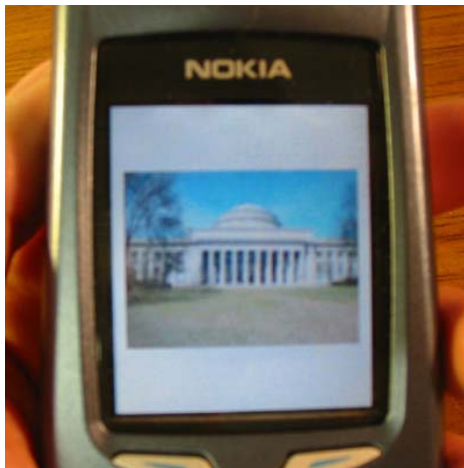


# First Prototype

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1. Take an Image



2. Send image via MMS



3. View search result (matching location images)



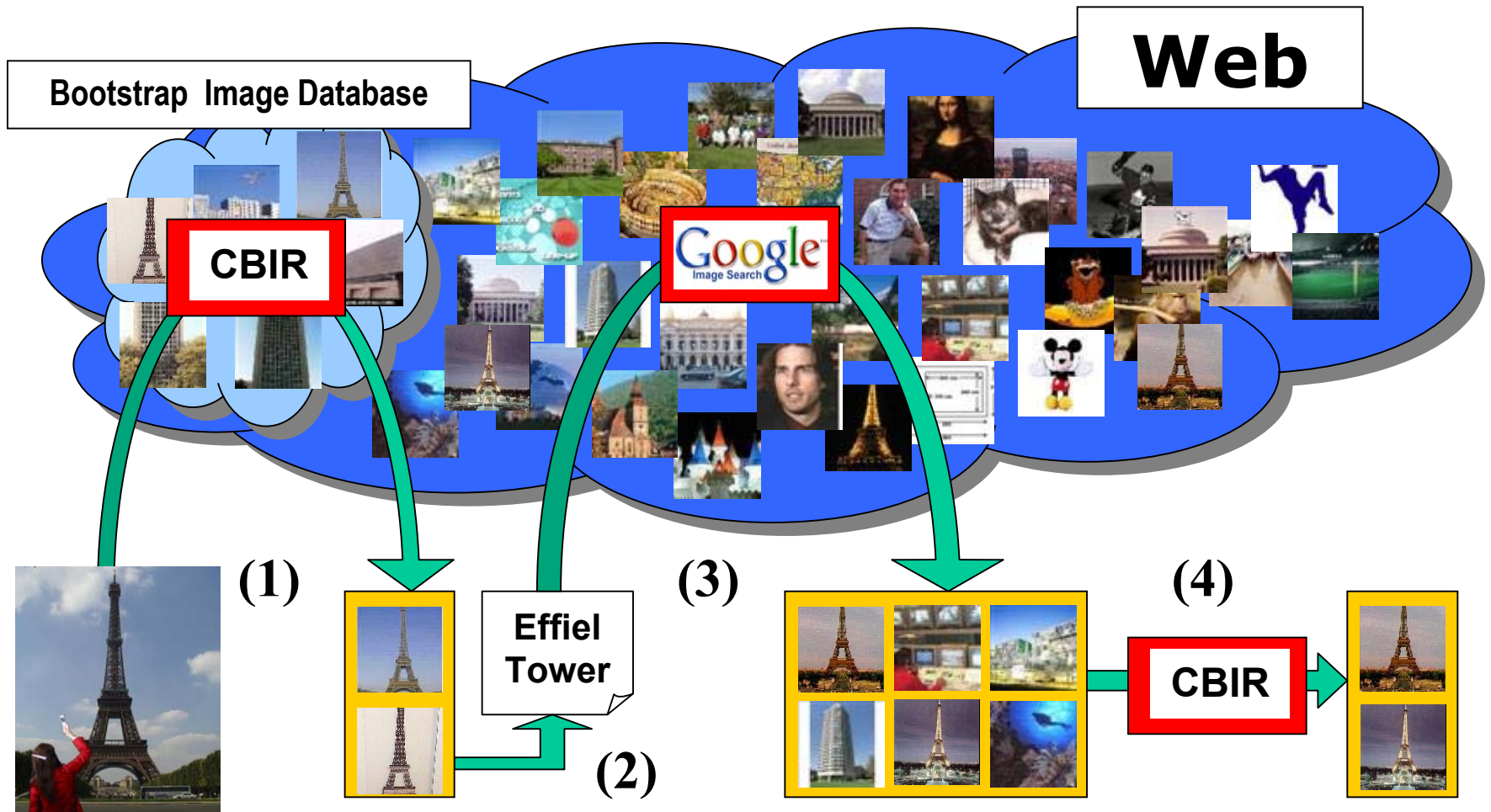
4. Browse a relevant webpage

# Images -> keywords (-> images)

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- Hard to compile an image database of entire web!
- But given matches in subset of web:
  - Extract salient keywords
  - Keyword-based image search
  - Apply content-based filter to keyword-matched pages
- And/or allow direct keyword search
- Weighted term/bigram frequency sufficient for early experiments...

# Bootstrap image web search





# Advantages

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- Recognizing distant location (by taking photo)
- Infrastructure free (by using the web)
- Large-scale image-based web search (by bootstrapping keywords)
  
- With advances in segmentation, can apply to many other object recognition problems
  - mobile signs
  - appliance
  - product packaging

# Visual Interfaces and Devices

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# Acknowledgements

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& many others...

END

