### Cloud-Enabled Humanoid Robots

#### James Kuffner

# The Robotics Institute Carnegie Mellon University



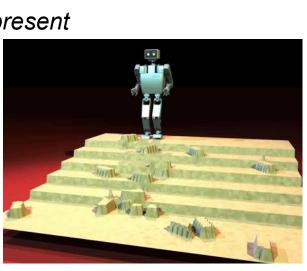
(currently working at Google Research)

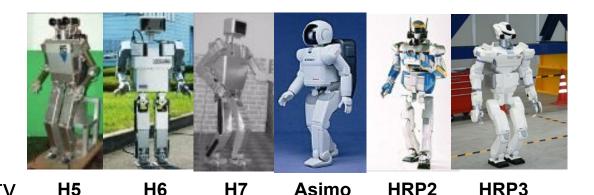


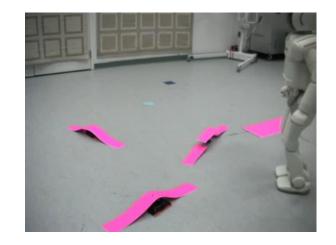


### **Humanoid Motion Planning (1995-2010)**

- Stanford University 1995-1999
- University of Tokyo JSK Lab 1999-2001
- Carnegie Mellon University
   The Robotics Institute
   2001-present
- Digital Human Research Center (AIST) 2001-present







### Self-driving Automobiles

#### The New York Times

#### **Science**

WORLD U.S. N.Y. / REGION BUSINESS TECHNOLOGY SCIENCE HEALTH SPORTS OPINION

SMARTER THAN YOU THINK

#### Google Cars Drive Themselves, in Traffic



Ramin Rahimian for The New York Times

Dmitri Dolgov, a Google engineer, in a self-driving car parked in Silicon Valley after a road test.

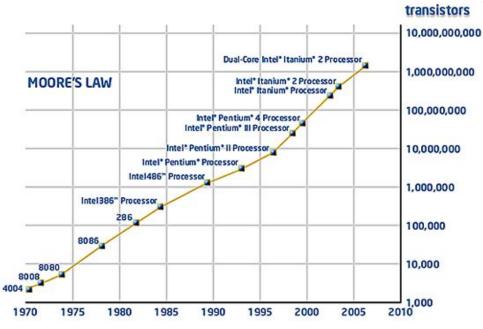
By JOHN MARKOFF

Published: October 9, 2010

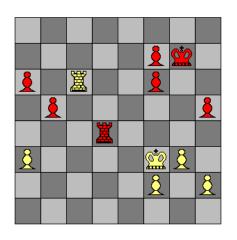
MOUNTAIN VIEW, Calif. — Anyone driving the twists of Highway 1 between San Francisco and Los Angeles recently may have glimpsed a <u>Toyota Prius</u> with a curious funnel-like cylinder on the roof. Harder to notice was that the person at the wheel was not actually driving.

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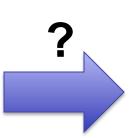
# Search-based Artificial Intelligence









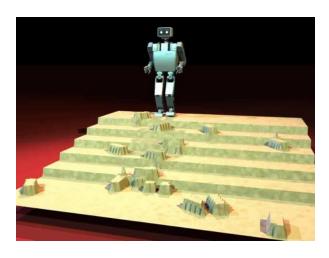




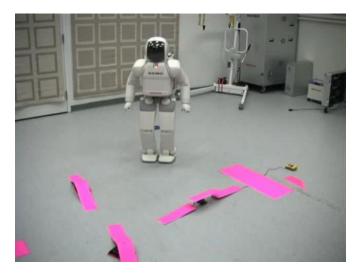
# Autonomous Humanoid Navigation: "Footstep Planning" (2000-2009)







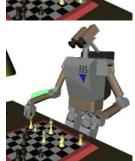


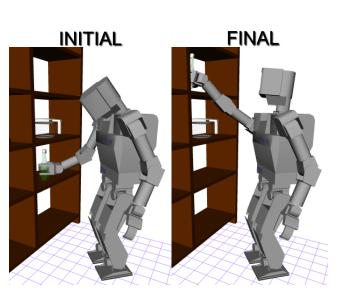


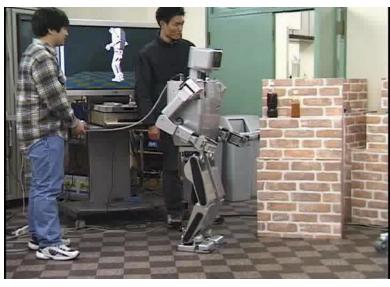
James Kuffner (Google) - Humanoids2010 Workshop "What's Next" - Cloud-Enabled Humanoid Robots

# Autonomous Grasping & Manipulation (2000-2010)











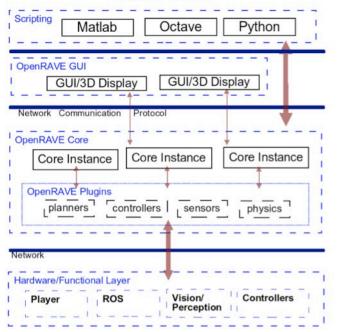


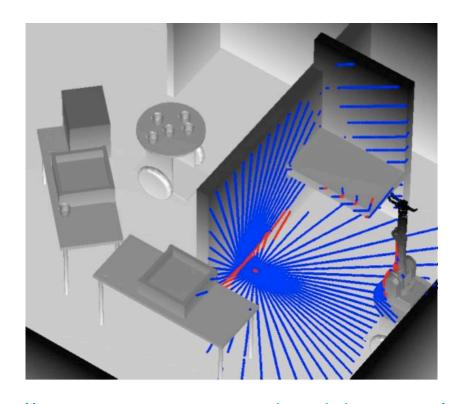


# OpenRAVE: Open-source Robotics and Animation Virtual Environment



#### **OpenRAVE**



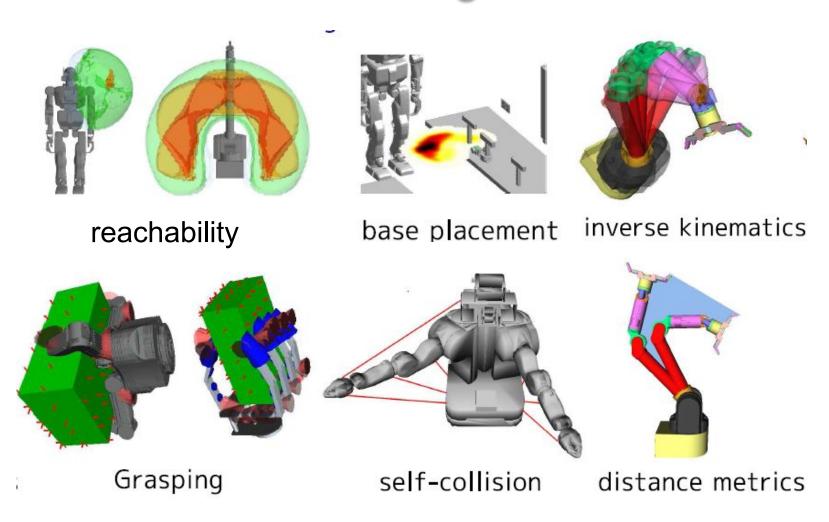


http://openrave.programmingvision.com/
- OR -

http://www.sourceforge.net/

keyword: "openrave"

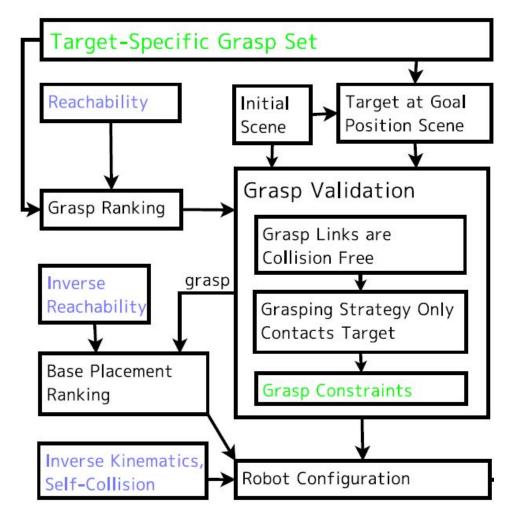
### Robot Knowledge Database

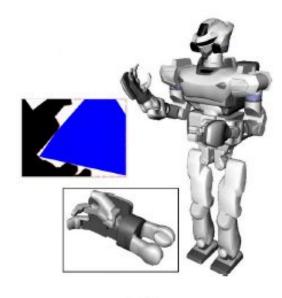


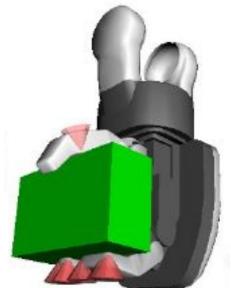
CMU PhD thesis: Rosen Diankov

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### Grasp Configuration Sampler

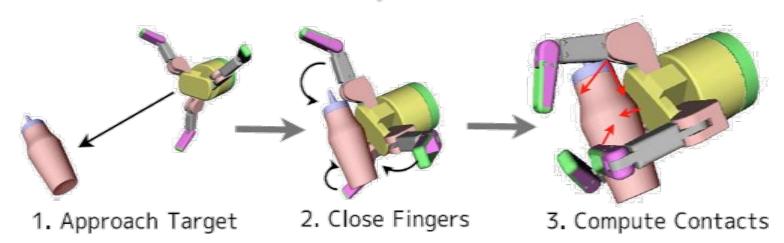


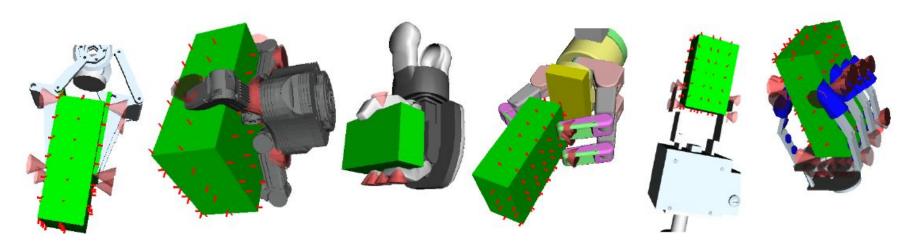




CMU PhD thesis: Rosen Diankov

### **Stable Grasp Generation**

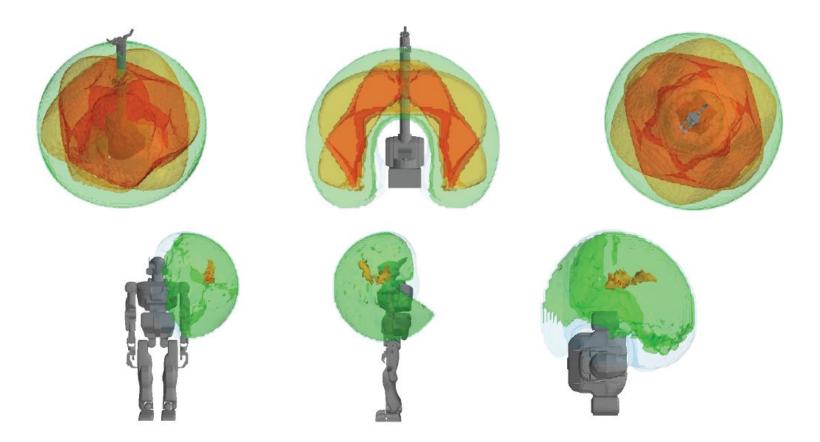




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## Precomputed Reachability

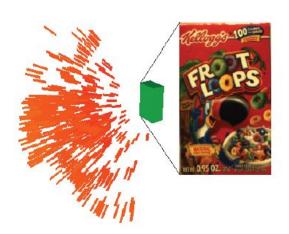
Given the robot's position, where can the arm reach?

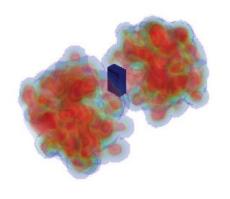


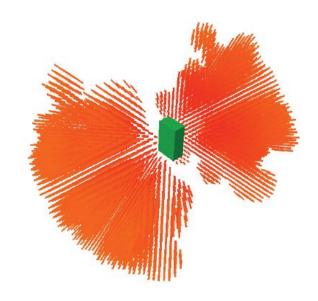
### Object-Specific 6D Pose Extraction



Modeling Object Pose Error



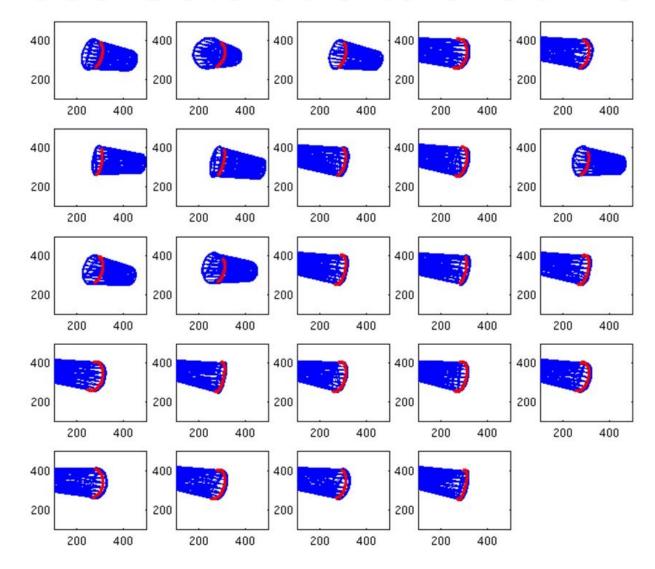




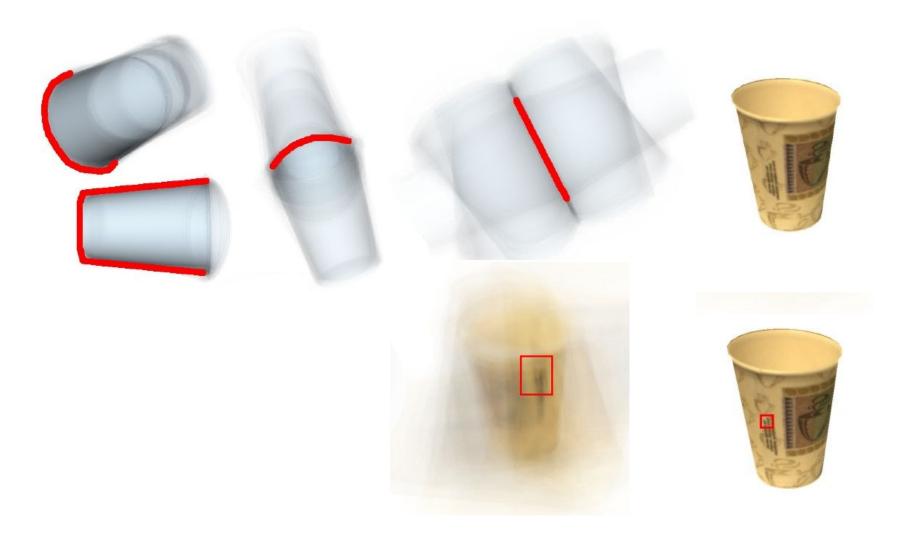
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### Pose Sets due to a Curve



### Mean Images of Induced Pose Sets

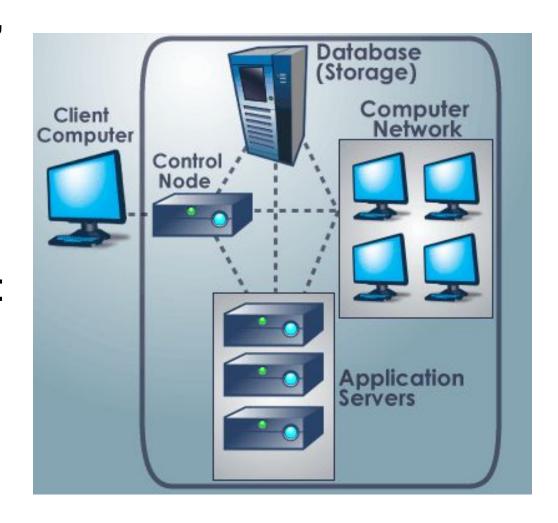


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# **Cloud Computing**

- Documents "live"
   in the cloud
   (backed up and
   accessible anywhere)
- Netbook
- Supercomputing:

   (Heavy CPU or data-intensive processing handled by distributed network)



# Today's Headline News

#### With Chrome OS, Google Doubles Down on the Cloud

By Michael Calore, Webmonkey ☑ December 7, 2010 | 3:23 pm | Categories: Cool Apps, Web Tech



SAN FRANCISCO — Google unveiled a beta version of its Chrome OS and an early test version of its branded netbook Tuesday morning, a big bet by the search giant to help drive computing to the cloud — and to the popular web-based services that are its bread and butter.

Google's release of the new OS, related but separate to its mobile OS Android, comes after a year of development and at a time when cloud computing — and the simpler machines that access applications on distant servers rather than running them on a hard drive — seems to have passed a sort of tipping

### "Remote-Brain" Robots

 Physical separation of Hardware (motors & sensors) and Software (high-level processes)



JSK (U.Tokyo) mini-Humanoids (1990s)

## Relationship to Teleoperation

 Human acts as the "remote-brain"

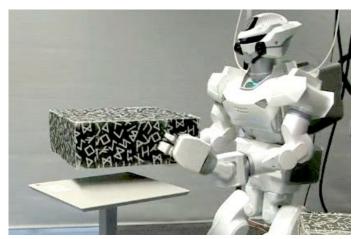
 Not suitable for all tasks

- Issues:
  - Latency
  - Data Bandwidth



NAIST-Hand I

### Cloud-Enabled Robotics







HRP3 (AIST/Kawada)

Google DataCenter

### Recent proposals:

"DAvinCi: A cloud computing framework for service robots" [ Arumugam, et. Al., ICRA 2010 ]

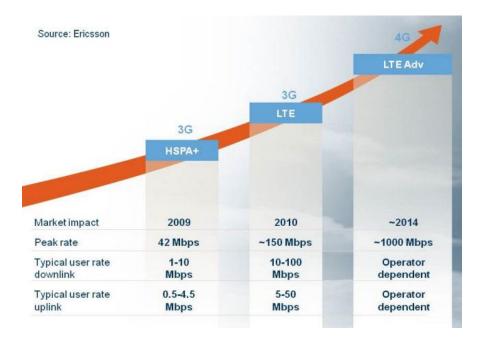
- Hadoop cluster with ROS communication infrastructure
- FastSLAM map/reduce

## **Enabling Factors**

- Wireless networking:
  - Fast
  - Reliable
  - Ubiquitous
  - Sufficient bandwidth

STANDARD	Rated maximum range (feet)	Frequency	Maximum speed
802.11a	25 to 75	5 GHz	54 mbps
802.11b	100 to 150 indoors 300 outdoors	2.4 GHz	11 mbps
802.11g	100 to 150 indoors 300 outdoors	2.4 GHz	54 mbps

(e.g: Mobile Broadband 64 kbps to 150 Mbps in 10 years = 2400x)

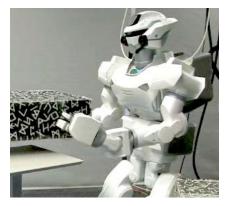


### Benefits of "Cloud Robotics"

- Provides a shared knowledge database
  - Organizes and unifies information about the world in a format usable by robots
- Offloads heavy computing tasks to the cloud
  - Cheaper, lighter, easier-to-maintain hardware (akin to desktop PC vs. a thin-client "netbook")
  - Longer battery life
  - Less need for software pushes/updates
  - CPU hardware upgrades are invisible & hassle-free
- Skill / Behavior Database
  - reusable library of "skills" or behaviors that map to perceived task requirements / complex situations.
  - Data-mining the history of all cloud-enabled robots

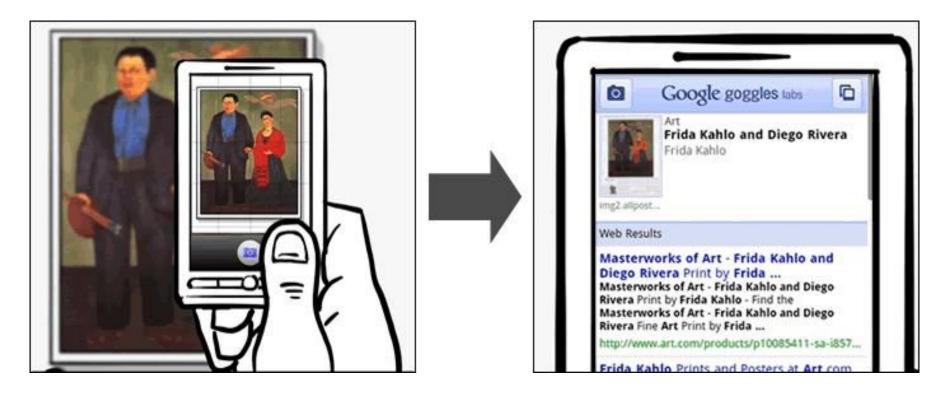






# **Example: Perception**

- Cloud-enabled Object Recognition
  - e.g. "Google Goggles"

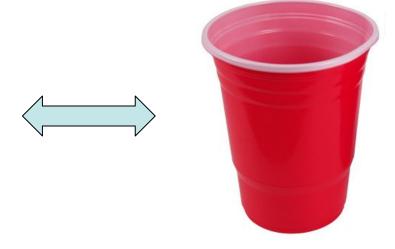


## "Robot" Goggles

- Upload image(s) → Download Semantics
  - Object name
  - 3D model, mass, materials, friction properties
  - Usage instructions (function, how to grasp, operate)
  - Context / Domain knowledge







# Example: Speech

- Recognition
- Translation
- Synthesis





Alex Waibel's group (CMU & KIT)

# http://translate.google.com/

#### Statistical Machine Translation



#### Do more with Google Translate



Stumbled across a foreign website?
Download Google Chrome, a fast and secure web browser with built-in translation.



Linguists, robots or aliens? Learn about the technology behind Google Translate and how you can help us improve.



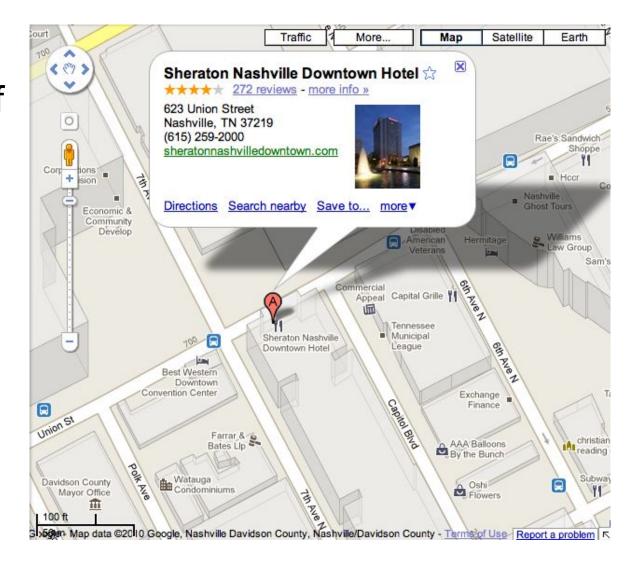
Reach an international audience. Add translated captions to your <u>YouTube videos</u>.



Wish your Norwegian fans could read your blog? Install the Google Translate Element for easy translation.

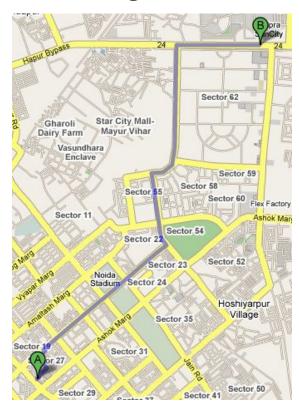
# Example: Maps & Localization

- Shared, highlydetailed maps of the world stored in the cloud
- Updates/ changes can be published and immediately used



# **Example: Planning**

### Navigation



 Difficult task or motion planning problems solved in the cloud

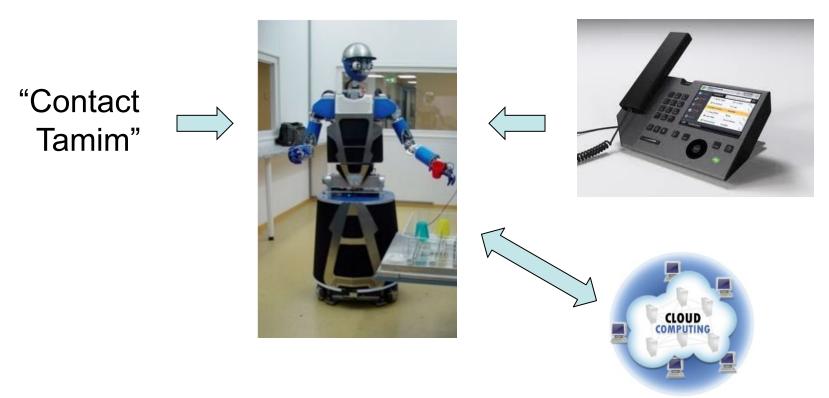
(e.g "God's Number")



- 43,252,003,274,489,856,000 positions
- 35 CPU-years used

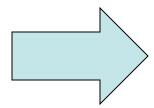
## Example: Skills

- An "App Store" for robots
- Task → Objects/Domain Info → Usage Instructions → Behaviors/Motor Skills



# "I Need a Helicopter Pilot Program..."







# Summary

- Cloud computing can enable cheaper, lighter, "smarter" robots
- The infrastructure exists and is rapidly evolving in terms of performance and accessibility



- Create a "shared knowledgebase" for robots
  - Information about the world
  - Robot experiences / history / behavior outcomes / learned skills can all be published or data mined.