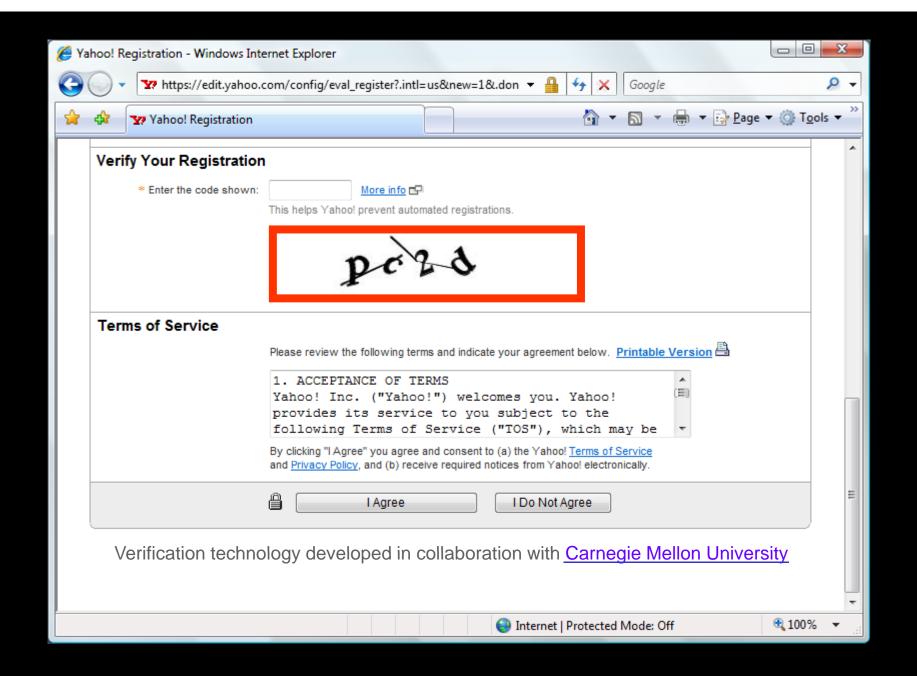
Human Computation

Luis von Ahn

Carnegie Mellon University



CAPTCHA

A program that can tell whether its user is a human or a computer



CAPTCHA

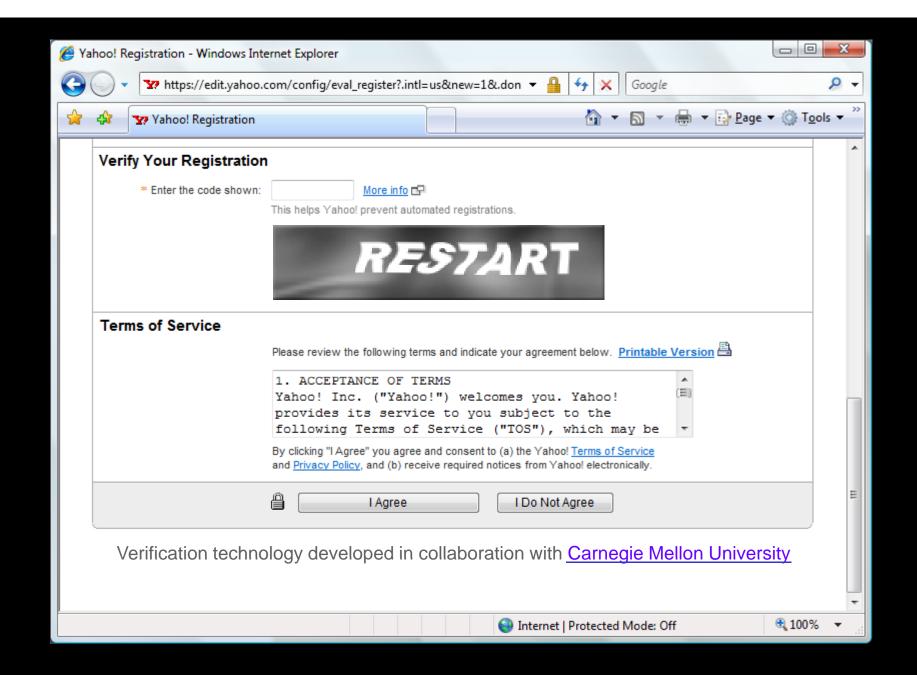
A program that can generate and grade tests that:

A. Most humans can pass

B. Current computer programs cannot pass

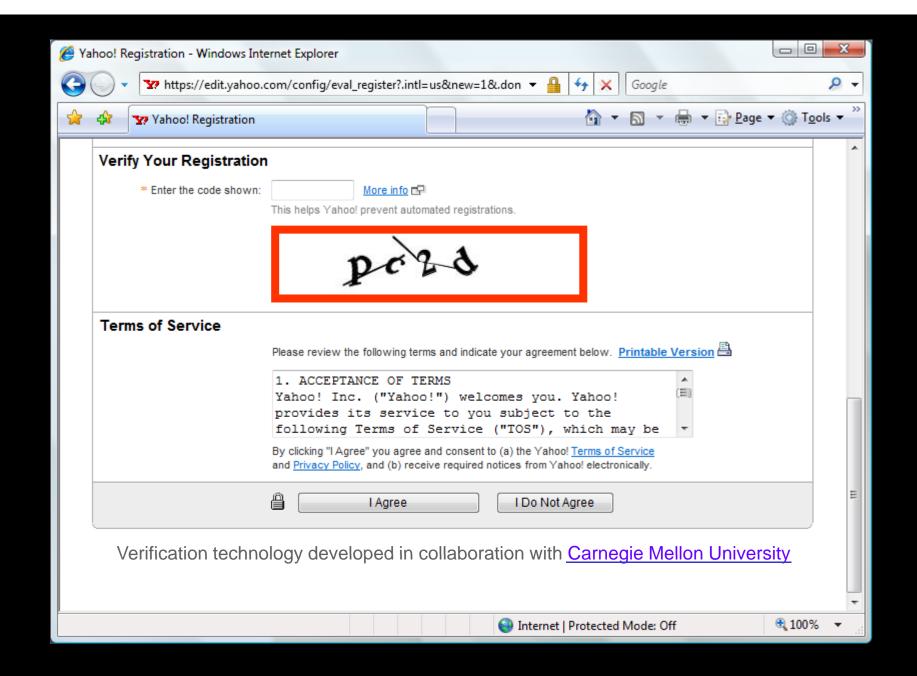


Help! I've been waiting for 20 minutes, and nothing happens"



QUICKVOTE				
Which is the best Computer Science Grad School in the US?				
Berkeley CMU Cornell	O O O	MIT Washin Stanfo		O O O
		vote		

(From www.slashdot.org)



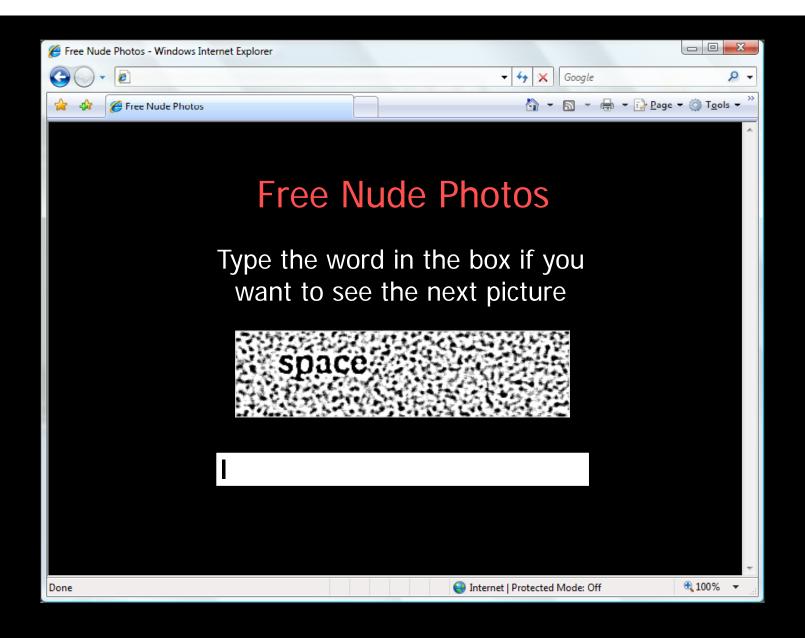
CAPTCHA Sweat Shops

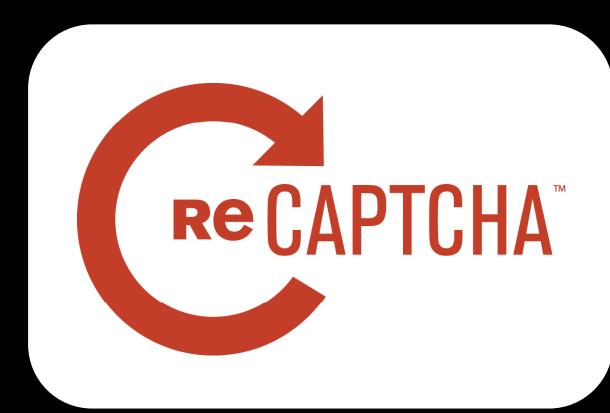
Spam companies hire humans to solve CAPTCHAs all day long

\$2.50 per hour for each human 720 captchas per hour per human

1/3 cent per account







Roughly 200 million CAPTCHAs are typed every day

10s of human time per CAPTCHA

Can we use this human effort for good?

Digitizing Books





AND MAINY OTHER PROBLEMS.
THE 18-YEAR-OLD WOMAN WAS
X-RAYED AFTER THE INCIDENT.



AND MARY OTHER PROBLEMS.

THE 18-YEAR-OLD WOMAN WAS

X-RATED AFTER THE INCIDENT.



Scanned book



Word that OCR can't read





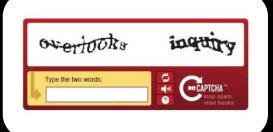
Randomly distorted image of word





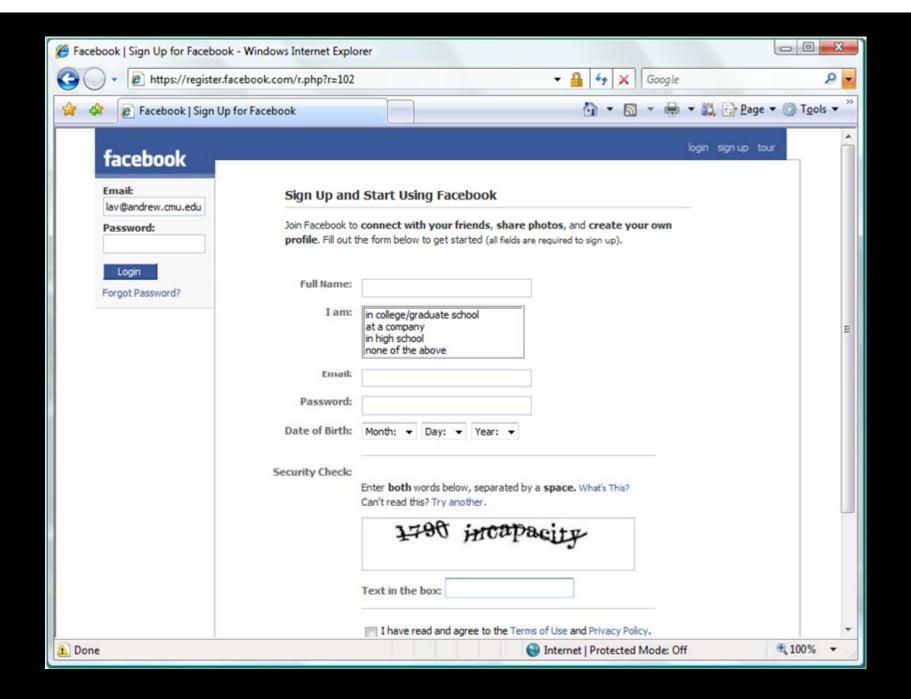
Free



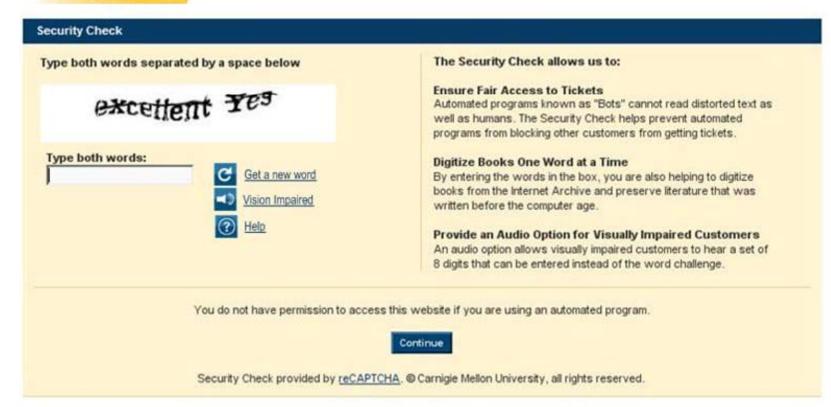


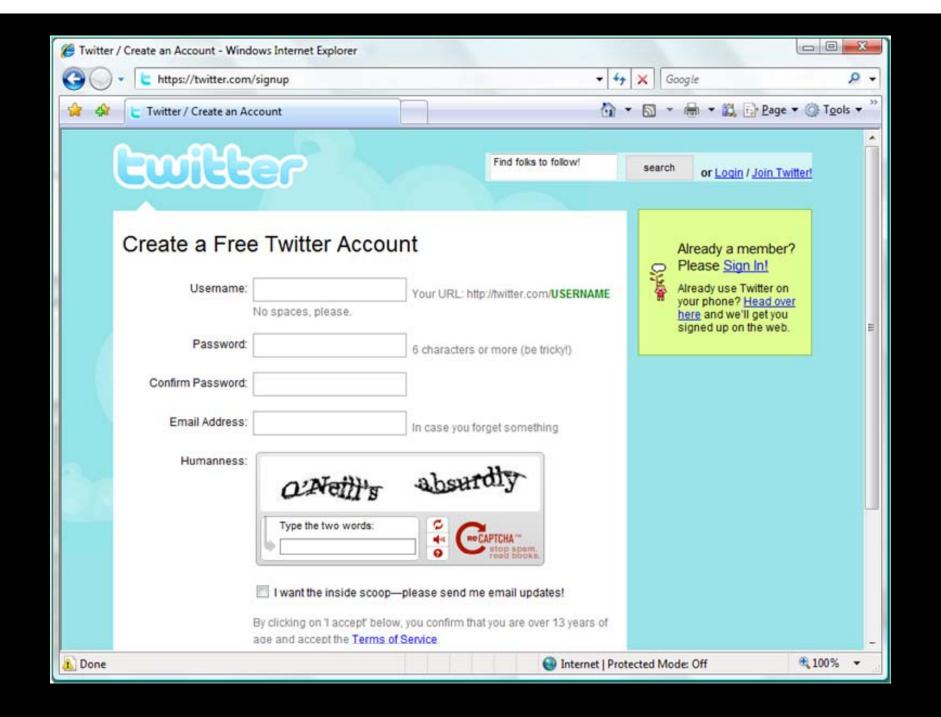


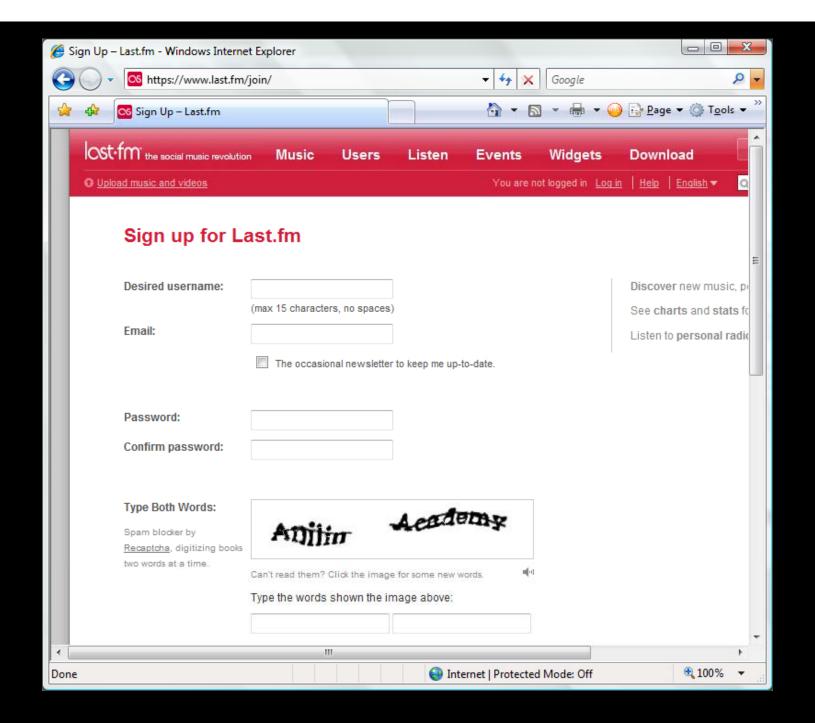
facebook



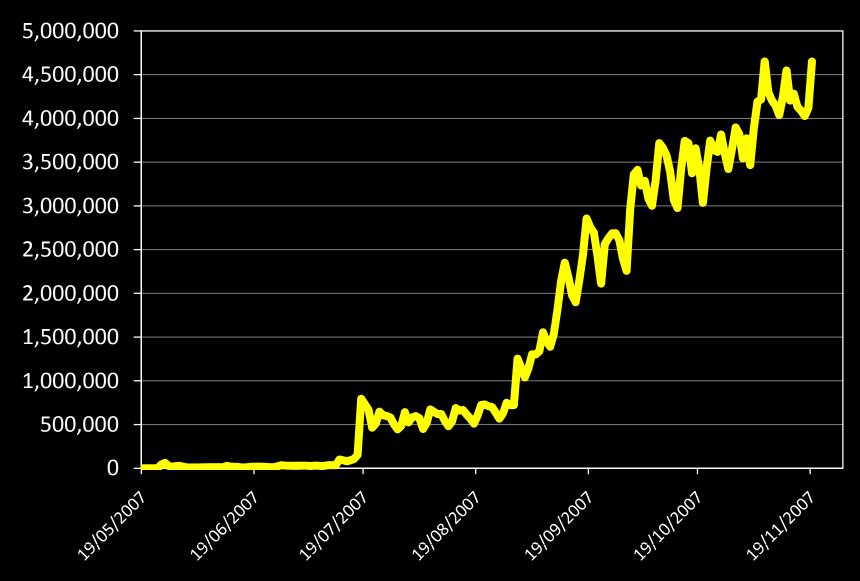


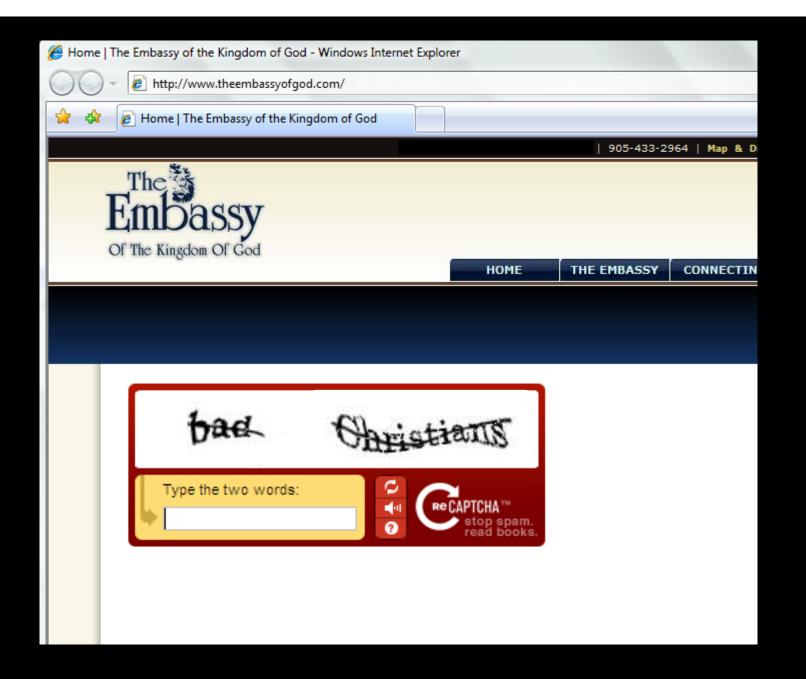


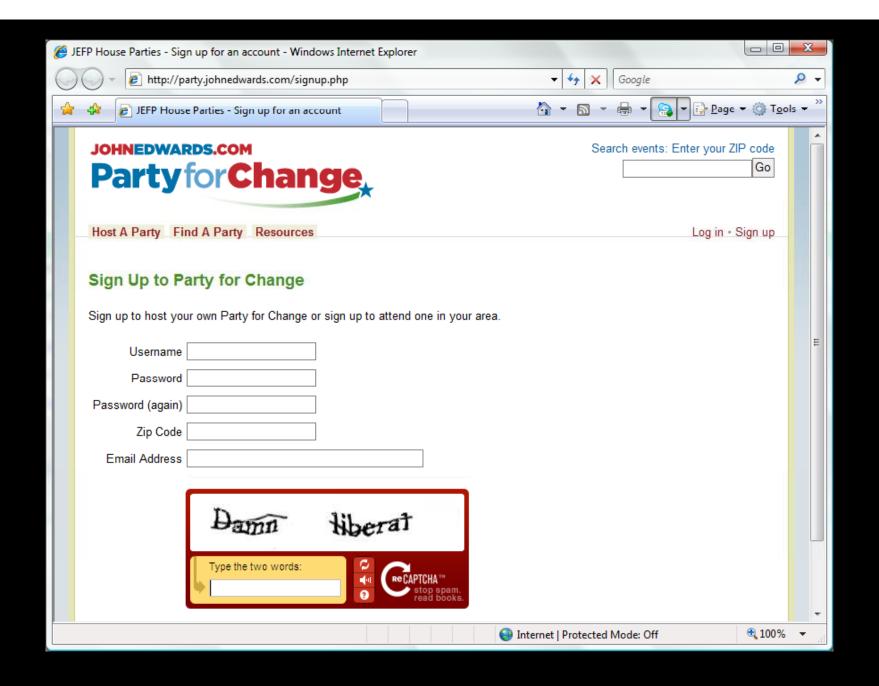




Words Digitized Per Day







Two Words Instead of One?

Typing two English words takes as long as typing 6-8 random characters

We have a guess for both words

CAPTCHA Sweat Shops

Mahiddin: Would you help us find some Captcha Project?

reCAPTCHA Support: What kind of CAPTCHA project are you looking for?

Mahiddin: We are break different type of CAPTCHA right now. We have the ability type every day many Captcha.

reCAPTCHA Support: How fast can you type?

Mahiddin: Personally I can type more than 60 WPM. But I have a big team. We can give you lot of product.

reCAPTCHA Support: Is it ok with you that the accounts are for spamming purposes?

Mahiddin: No problem, you can tell me details first.

reCAPTCHA Support: One last question: how do you deal with IP address blocking?

Please type the following paragraph:

DENMARK.

COPENHAGEN, Dec. 17-Noon.

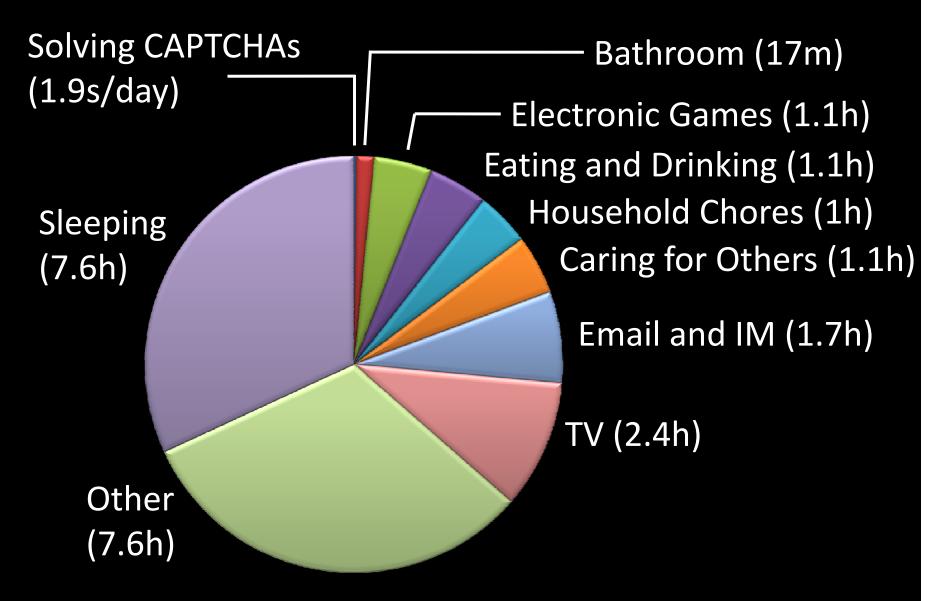
The royal palace at Friedericheberg took fire last night. The King himself directed the operations for extinguishing the fire. The whole structure was, however, destroyed.

Audio CAPTCHAs

Blind people cannot see images of distorted words

Audio CAPTCHAs can be used to transcribe recorded speech

Reusing Wasted Cycles

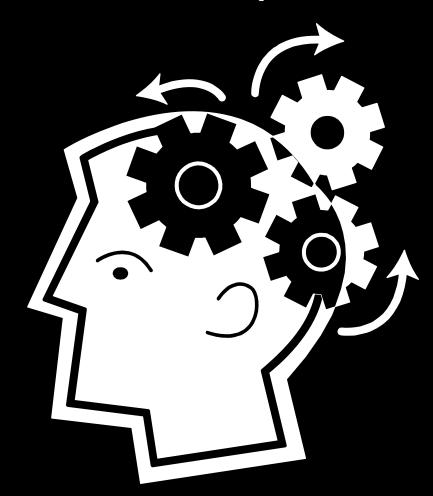


9 Billion Human-Hours of Solitaire were Played in 2003

Empire State Building 7 million human-hours (6.8 hours of solitaire)

Panama Canal 20 million human-hours (less than a day of solitaire)

Human Computation



. 美と 字印 び技す 国出のシ品 A L L A R O U N D U S I X I T I S T H E L L A R O U L D I X D 致機ま ゴ図ンは証 メ密方 H A . T . T . C R . O I HEIS THE ONE Y 0 WATCH D W R H E E A N

の植 及術文写で 感ザ絵 しォ会観美イ 力版もレ 保の 文精なフ ト社明 をに美と 字印 び技す 国出のシ品 致量をして ∞ × ∞ cl e ∞ × ½ p a p e r・c o a

15 ALLAROUND LOS 字印 び技す 国出のシ品 数量 Z III II X Y O U I S T H E R MATCH THLHYISION Y 0 3 T E L

He > H5

CANA+

0 をに美と 字印 び技す 国出のシ品・致機ま ゴ図ンは証り トラウ・ベルム GENT・TR エルエTY 致量ま ゴ図ンは証 メモアいが しょ会談美イ 力版もレ 保の 文精 レ保の 文精 尉の権 及術文 ・感ザ絵 しォ会観美イ JREAMWO は B 出の シ品 T HEIS MATTHE 1つは1日 駒の植 及術文写 5 Dune OO + mag をに美と 字印 大田 万日 八百八 八 に美と 字印 び技す 国出のシ品 TE

7 8 X @ 7 O F 2030F m = 00 + m q wine oo + in 4 17日一街9 一个 日 一次の > He & H5 > He SP H 5

0 0 - K

制の植 及術文写て 感ザ絵 しォ会観美イ カ版もレ 保の 文精なつ ト社明 をに美と 字印 び技す国出のシ品 致難ま ゴミ

HE TIS THE MATRIXIT IS ALLAROUND US W I 111 22

「 SEE 90 + SE4] ? WIND > ILE WHS 8 00 - ILE ELARDUND US ITISTHERE BC 48 8 AT

S ITISTHERE WHEN YOU WATCH ト社明 をに美と 字印 び技す 国出 TELEVISION

Labeling Images With Words



Martha

Stewart

Flowers

Super Evil

Still an open problem

Image Search On The Web Uses filenames and html text





Accessibility

Majority of the web is not fully accessible to the visually impaired

Reason: Most images don't have a

caption

Desiderata A method that can label all images on the web Fast and cheap

Using Humans Cleverly The ESP game could label all images on google in a few weeks

The ESP Game

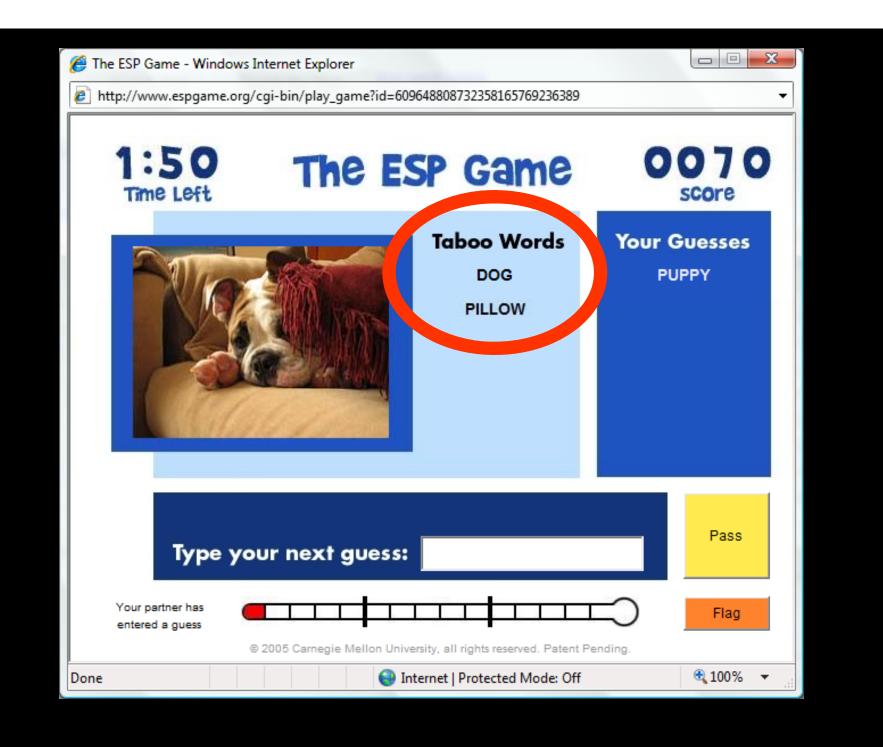
Two-player online game

Partners don't know each other and can't communicate

Object of the game: Type the same word

Only thing in common is An image





The ESP Game is Fun

50 million agreements with 200,000 players

There are many people that play over 20 hours a week

Labeling The Entire Web

5000 people playing simultaneously can label all images on Google in 2 months!

Individual games in Yahoo! and MSN average over 5,000 players at a time



Google Image Labeler

Welcome to **Google Image Labeler**, a new feature of Google Image Search that allows you to label random images to help improve the quality of Google's image search results.

Begin as Playah

Change your nickname

How does it work?



You'll be randomly paired with a partner who's online and using the feature. Over a 90-second period, you and your partner will be shown the same set of images and asked to provide as many labels as possible to describe each image you see. When your label matches your partner's label, you'll earn some points and move on to the next image until time runs out. After time expires, you can explore the images you've seen and the websites where those images were found. And we'll

show you the points you've earned throughout the session.

For example, this image can be described by the labels: bird, sky, soaring, or frigate bird.

What is required to participate?

Just an interest in helping Google improve the relevance of image search results for users like yourself.

Although you do not have to log in to your Google account to help, logging in will allow you to keep track of your points. You can also choose to provide a nickname, or you can remain anonymous.

Today's Top Pairs

1. Knaz - guest	2200
2. guest - guest	1900
asgerix - Yucker	1800
guest - fiftysix	1700
5. Karate Monkey - eGrunt	1700

All-time Top Contributors

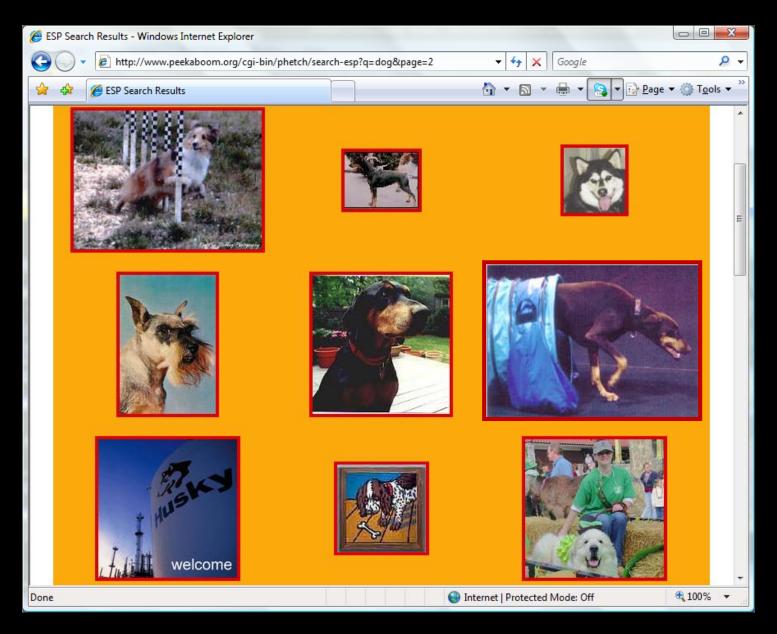
1. ChemaZ	2204200
2. khi	1676100
JoeBob	1444600
eGrunt	1340400
5. mdda123	1339600

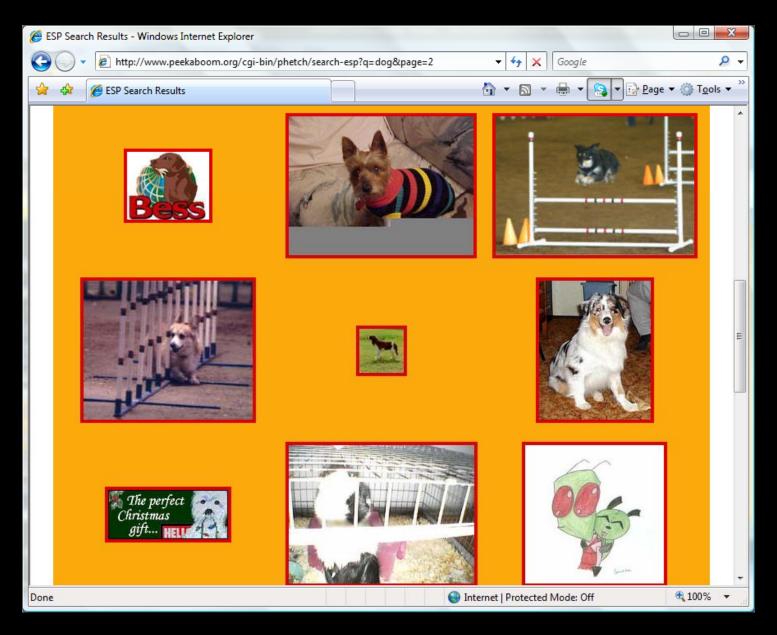
Privacy Policy - Terms of Use - Return to Google Image Search
© 2006 Google

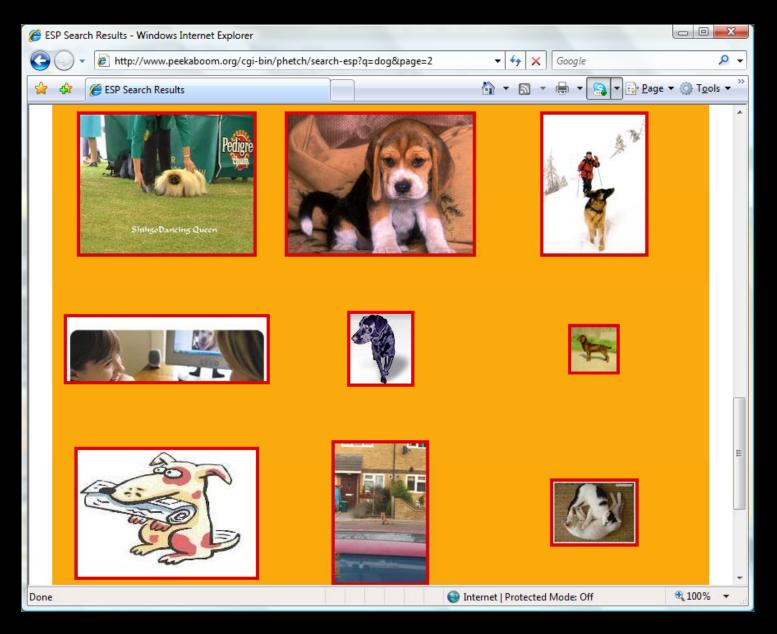
What About Cheating?

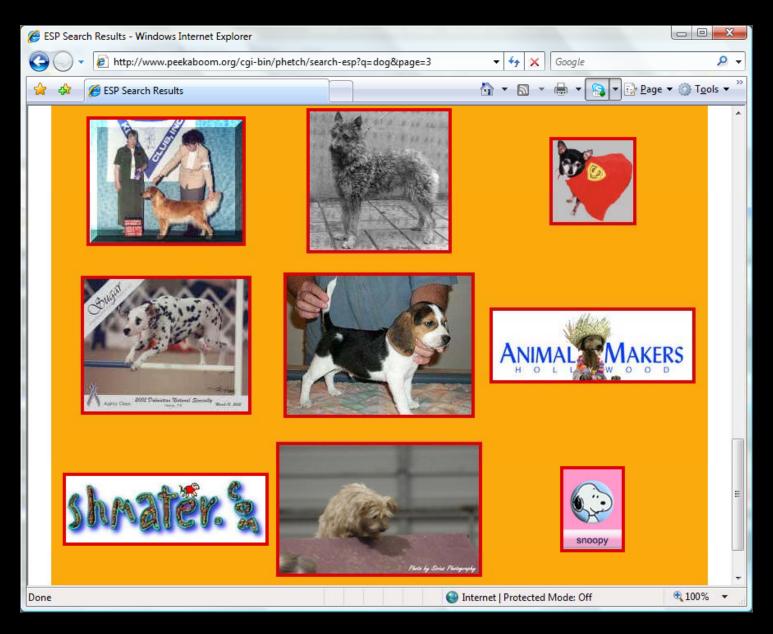
We give players test images for which we know all the common labels:

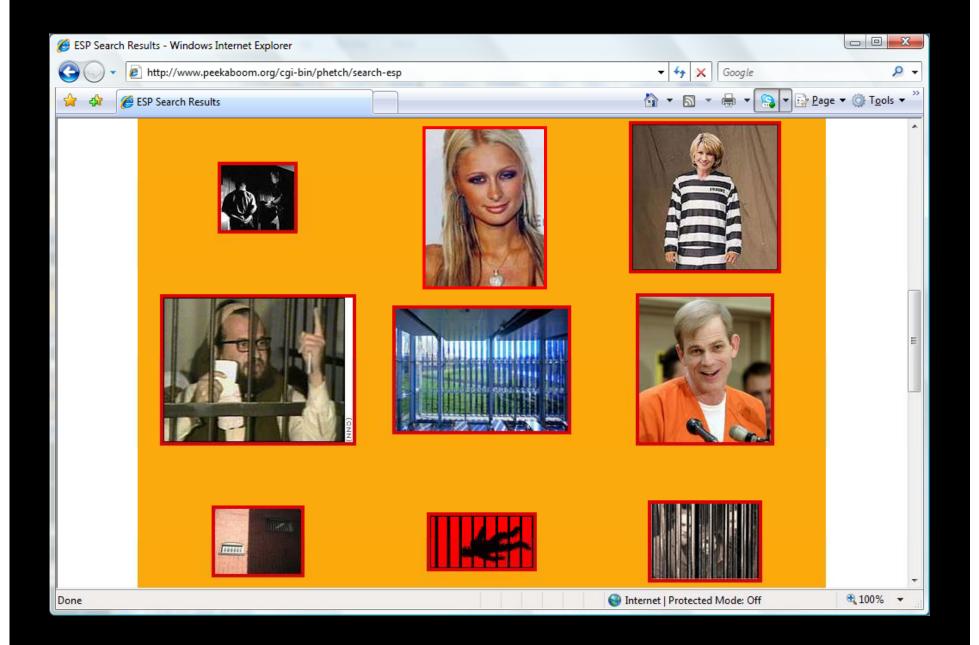
We only store a player's guesses if they successfully label the test images









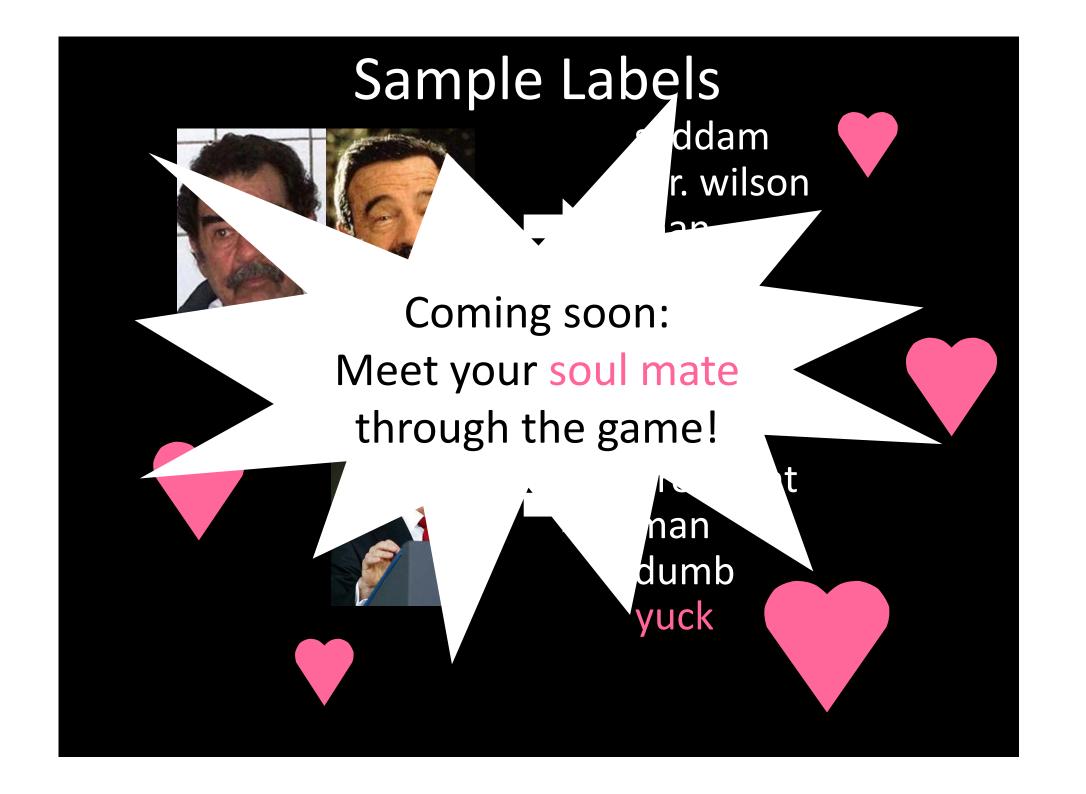


Guesses Over Time



britney than 40 hot a male crazy rehab shaved head

younger



Why do people like the ESP Game?

"

The ESP game gives its players a weird and beautiful sense of anonymous intimacy. On the one hand, you have no idea who your partner is. On the other hand, the two of you are bringing your minds together in a way that lovers would envy."

- Strangely addictive "
- It's so much fun trying to guess what others think. You have to step outside of yourself to match"
- It's fast-paced"
- It's like crack!
- Helps me learn English

Blogs

In other crowning achievements, I haven't played in at least a week, and I am still on the top ten list of players on the ESP game. Number eight if I remember correctly. God, my life is sad.

Many fascinating things about the ESP Game:
How it uses a game structure to build
an index of images on the web
What words become taboo from

What words become taboo from frequent use

How interesting some of the images pulled randomly from the web are

But by far the most intriguing aspect of the game is how often your random, unknown partner is a complete idiot.

Dear Luis von Ahn,

Your game is a fraud

I do research on ESP (extra sensory perception), and have an online ESP telepathy test on my website

Please refrain from using the term ESP, as it makes us legitimate ESP researchers look like a fraud

Audio ESP SUCKS

Two-Player Game

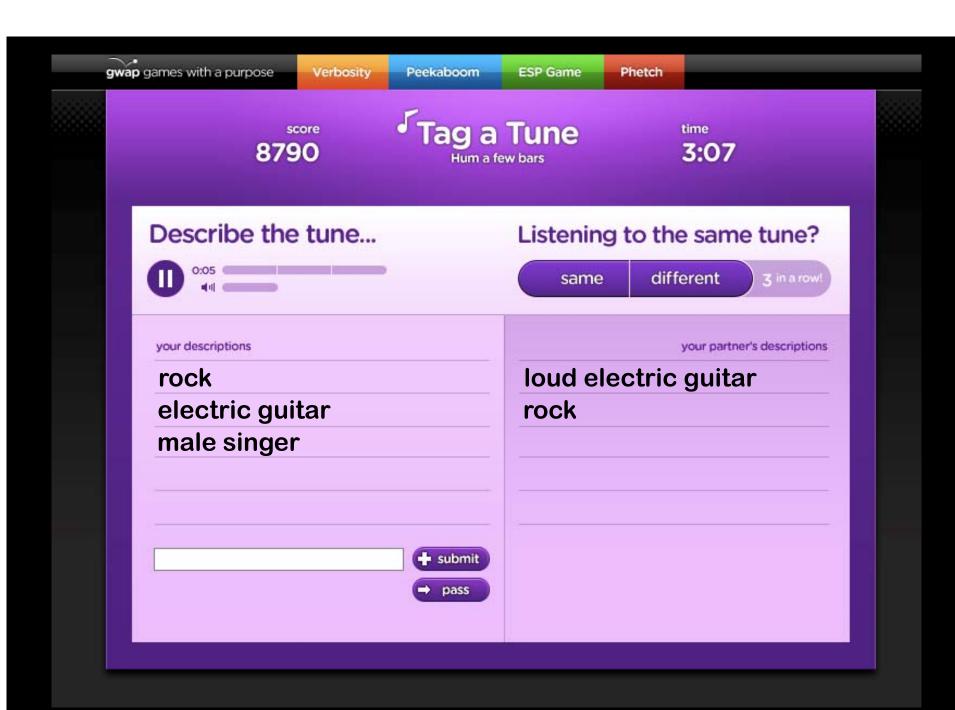
Both players can see each other's guesses



Edith Law

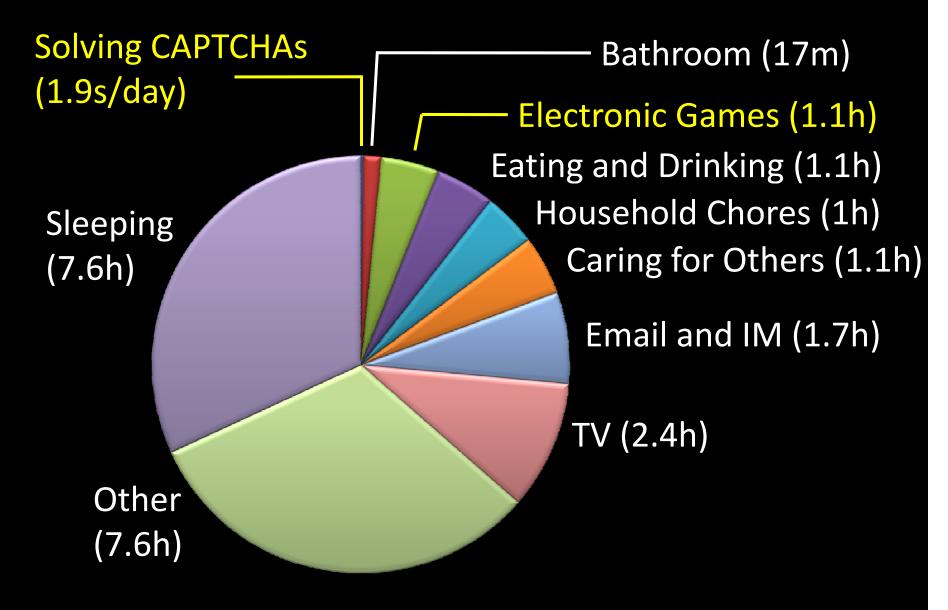
Players may or may not be listening to the same song

Object of the game: Tell if you're both hearing the same thing





Reusing Wasted Cycles



The Next Frontier



www.recaptcha.net www.gwap.com

Slide Design

Luis von Ahn

CAPTCHA Crew

Luis von Ahn Manuel Blum Nicholas Hopper John Langford

The ESP Game Crew

Luis von Ahn

Laura Dabbish

Th Lenore Ramm :er

Roni Rosenfeld

Push Singh

The David Stork tion

