# the computer science behind



#### Ooi Wei Tsang Department of Computer Science



School of Computing

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#### Taiwanese Lin Yu Chun Sings Whitney Houston's "I Will Always Love You" LIVE

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Lin Yu Chun Sings Whitney Houston's 'I Will Alw... 1,764,888 views actonish



Wow! American Boy Speaks Mandarin Chinese in China 228,717 views weirdchina



Taiwanese Boy Lin Yu Chun Sings Whitney Houston... 1,051,170 views clse945111

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ORIGINAL: Taiwanese Boy Lin Yu Chun Sings I Wil... 283,609 views moffalee









Lip Vu Chup Sings Amoning Groco

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			0:38 / 2:59		4:35	Whitney Houston 16,970,894 views bohemya1
1music4ali competition. (Parton wrote	- Lin sings Dolly Parton classic on Ta and first recorded the so	iwanese tv talent show	≥ 5,20 view		3:08	REMIX: Taiwanese boy Lin Chun and Whitney Ho 238,182 views moffalee
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## how to make video download or upload more efficiently?



hours of video uploaded every minute (april 2010)

# 700,000 video viewed every minute (october 2009)

# 700,000 x 480 seconds of video viewed per minute

(average length: 8 minutes)

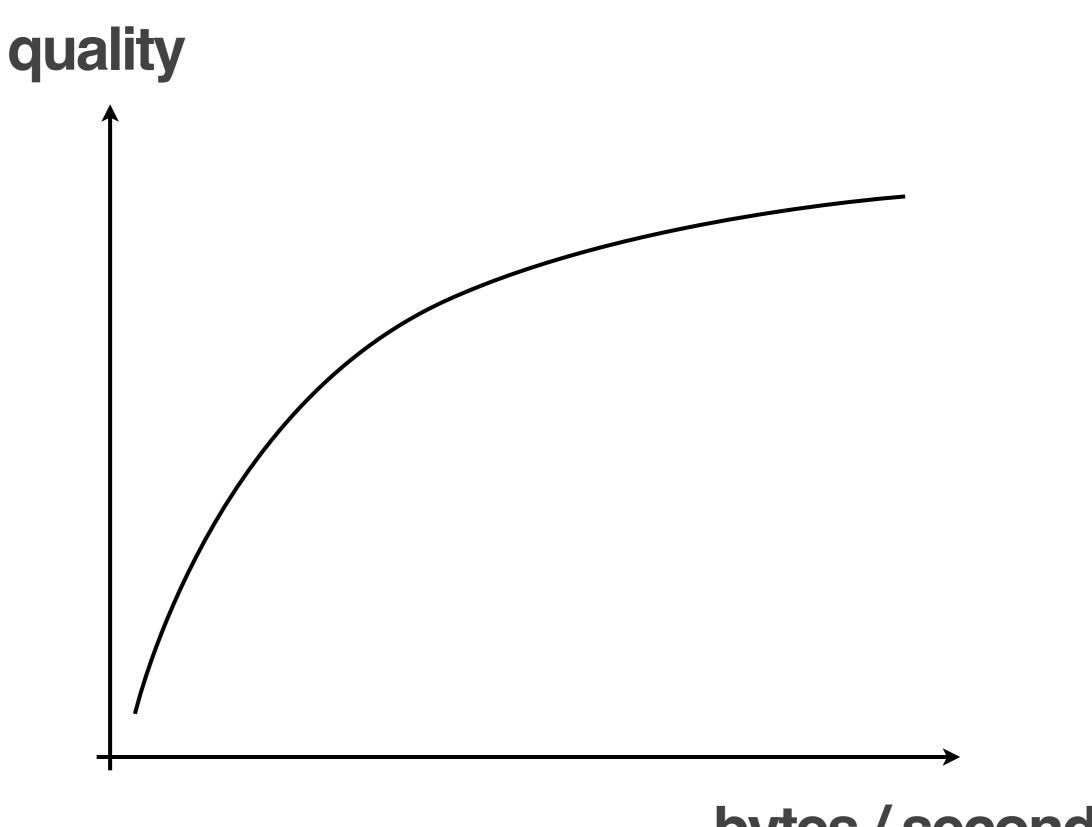
# $700,000 \times 480$ $\mathbf{X}$ **328** kilobits of video served per minute

(average bitrate: 328 kbps)

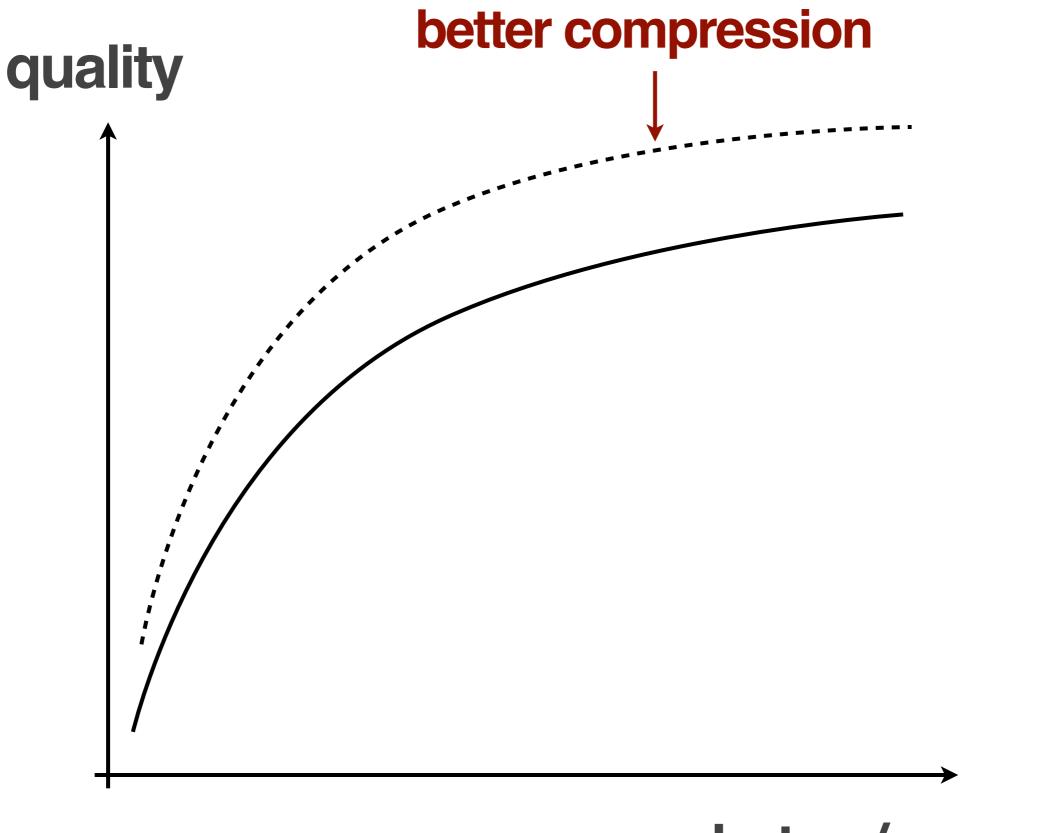
# 229 TB of video served per seconds

## how to make video download or upload more efficiently?

# $700,000 \times 480$ $X328 \downarrow$ kilobits of video served per minute



bytes / second



#### bytes / second

## how video compression works?



#### group into 8x8 pixels



# principle: don't store details that our eye cannot see (details)



#### principle: store differences





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#### Google Acquires Video Compression Technology Company On2 For \$106 Million

by **Robin Wauters** on Aug 5, 2009

112 Comments 347 retweet

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Share

Google and On2 Technologies jointly announced today that they have entered into a definitive agreement under which Google will acquire On2, a developer of video compression technology. The acquisition is expected to close later this year. On2 markets video compression technologies that power high-quality video in both desktop and mobile applications and devices and also holds a number of interesting **patents**.



Some of its codec designs are known as VP3, VP4, VP5, TrueMotion VP6, TrueMotion VP7 and VP8. Its customers include Adobe, Skype, Nokia, Infineon, Sun Microsystems, Mediatek, Sony, Brightcove, and Move Networks. On2, formerly known as The Duck Corporation, is headquartered in Clifton Park, NY.

Under the terms of the agreement, each outstanding share of On2 common stock will be converted into \$0.60 worth of Google class A common stock in a stock-for-stock transaction. The transaction is valued at approximately \$106.5 million.

According to the release, \$0.60 per share represents a premium of approximately 57% over the **closing price** of On2's common stock on the last trading day immediately prior to the

### compression:

# how to store information in fewest number of bits

how to throw away bits without losing information

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Amusic tall 1	videos 🖂	Subscribe		

甜	級星光大道				4:14	Lin Yu Chun Sings Whitney Houston's 'I Will Alw 1,764,888 views actonish
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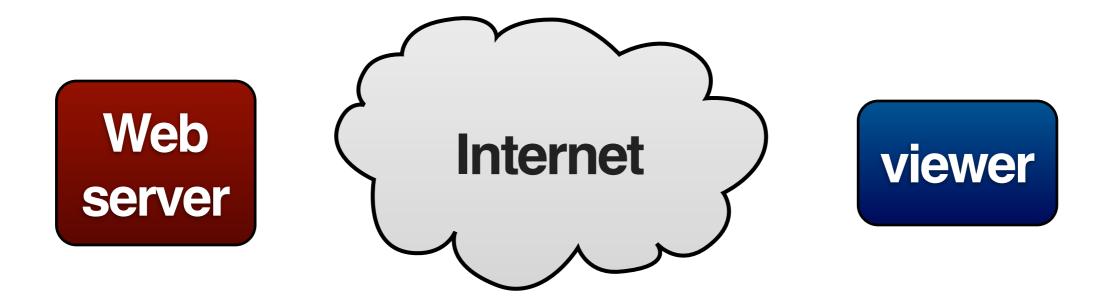
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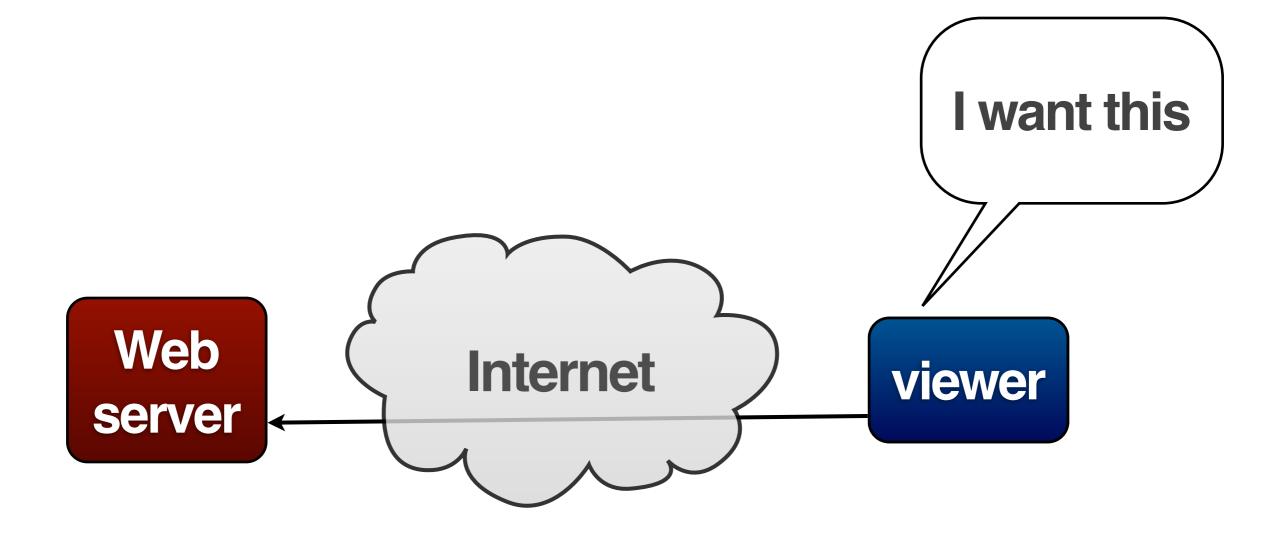


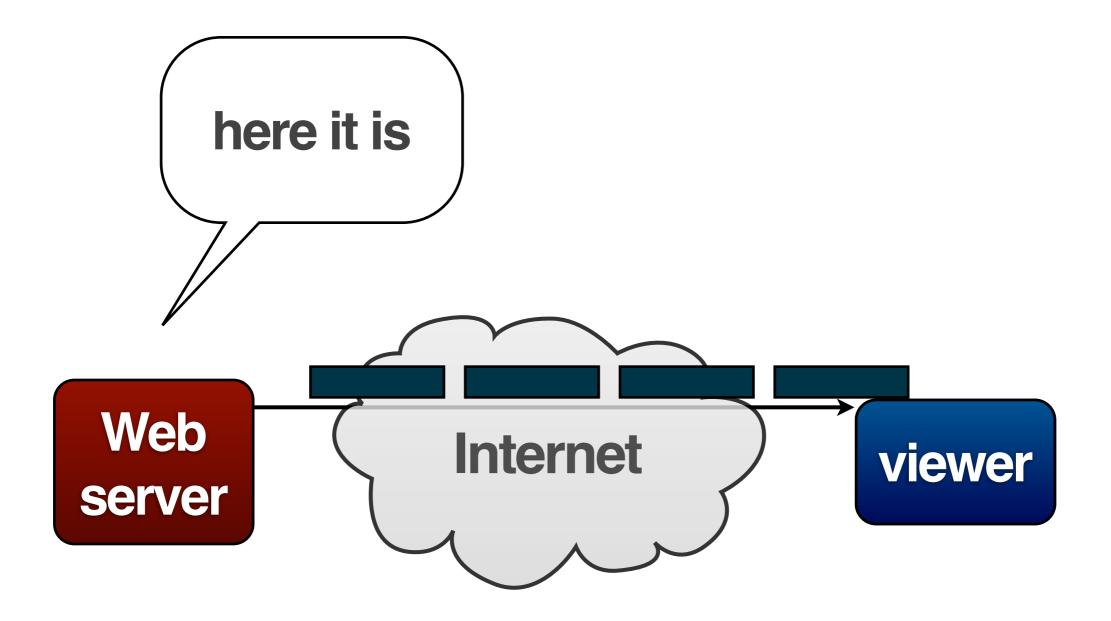


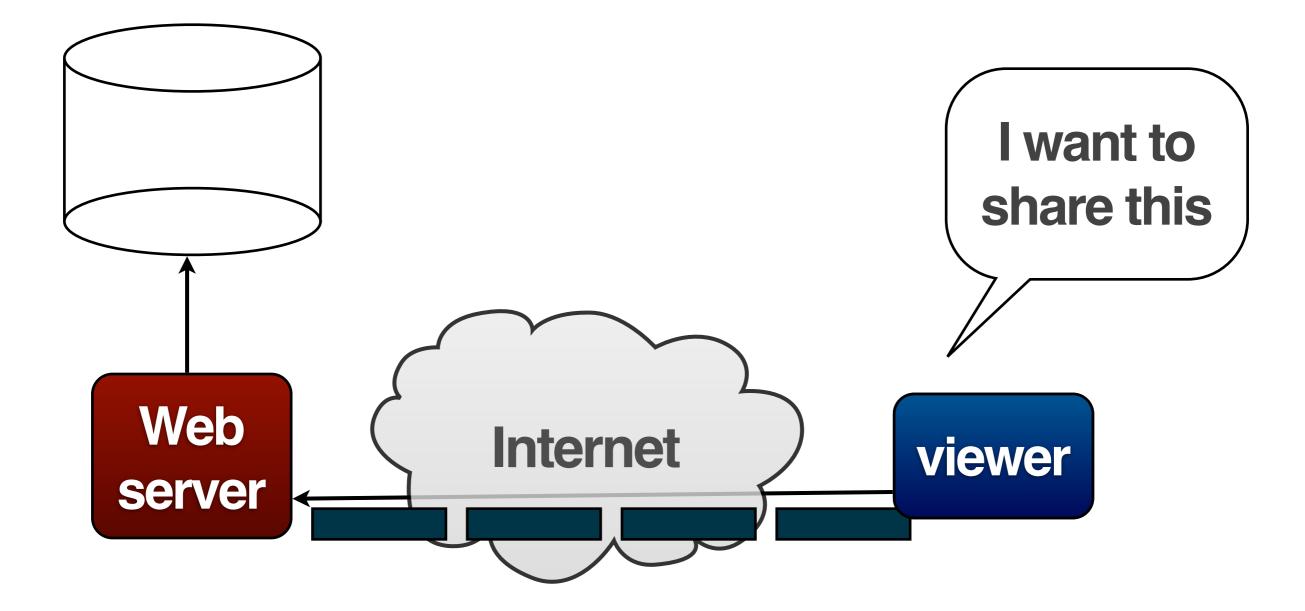
# **135.4 million** US users in January 2010

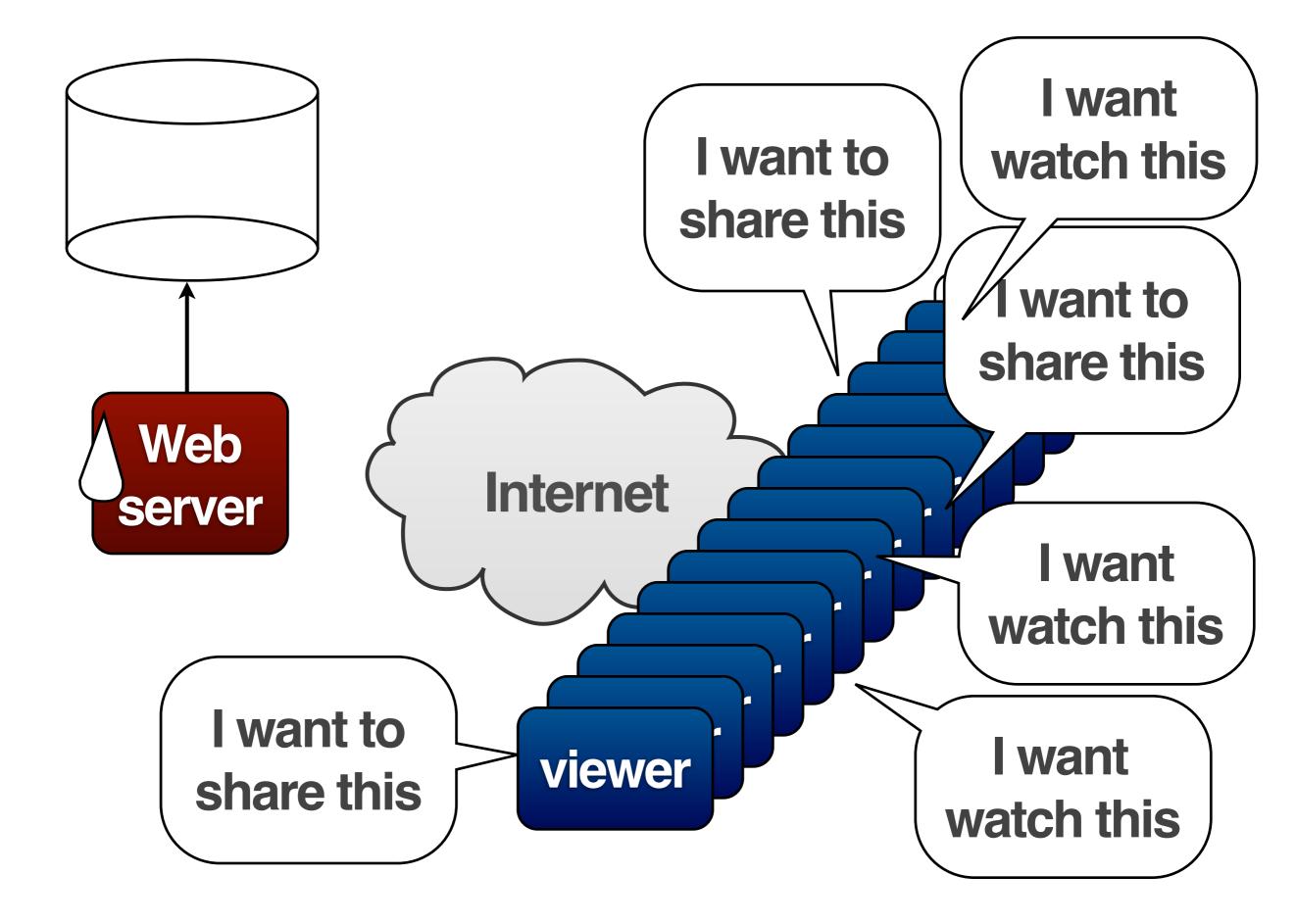
# 12.7 billions video watched in January 2010





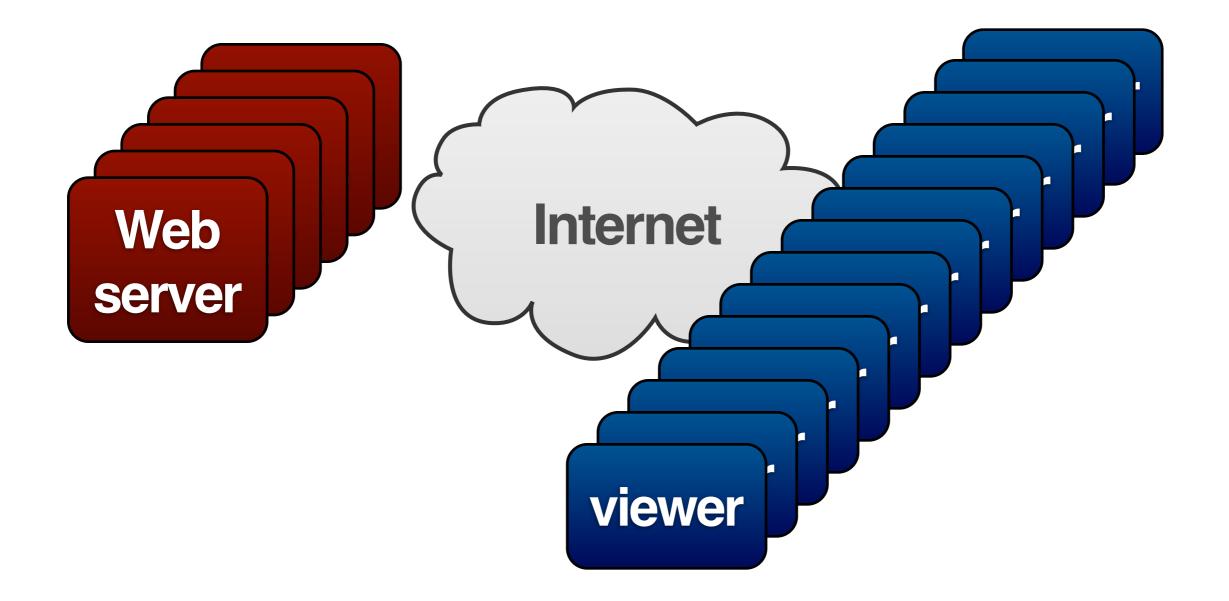




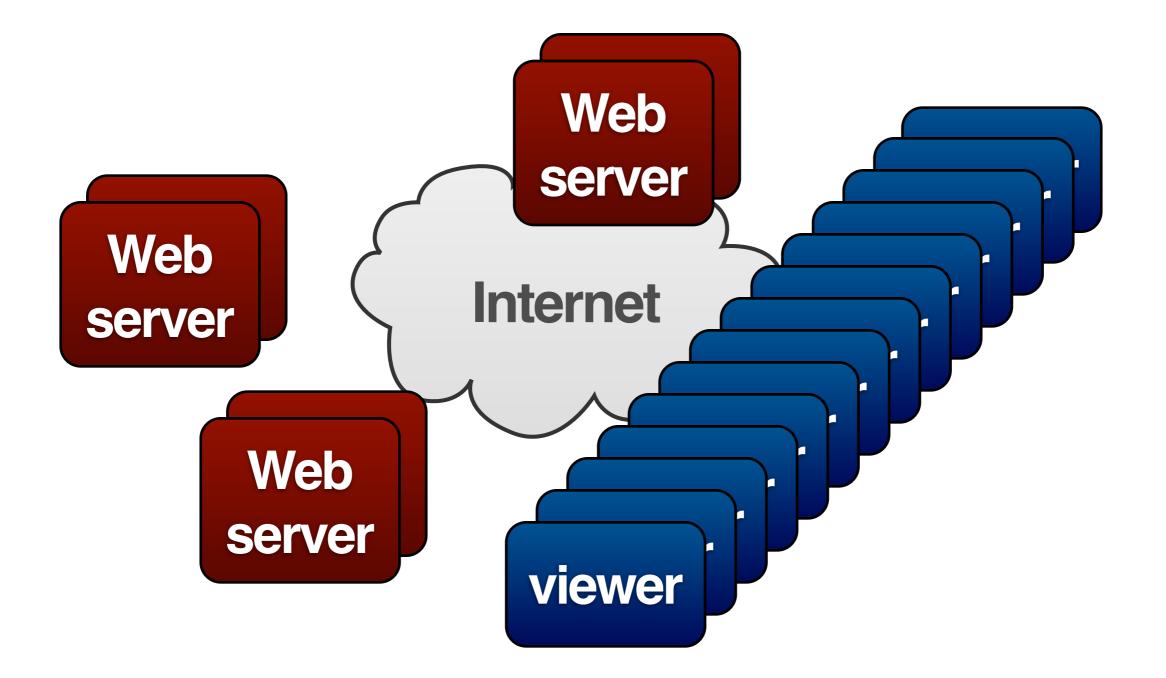


how to support many many viewers and not have them wait too long?

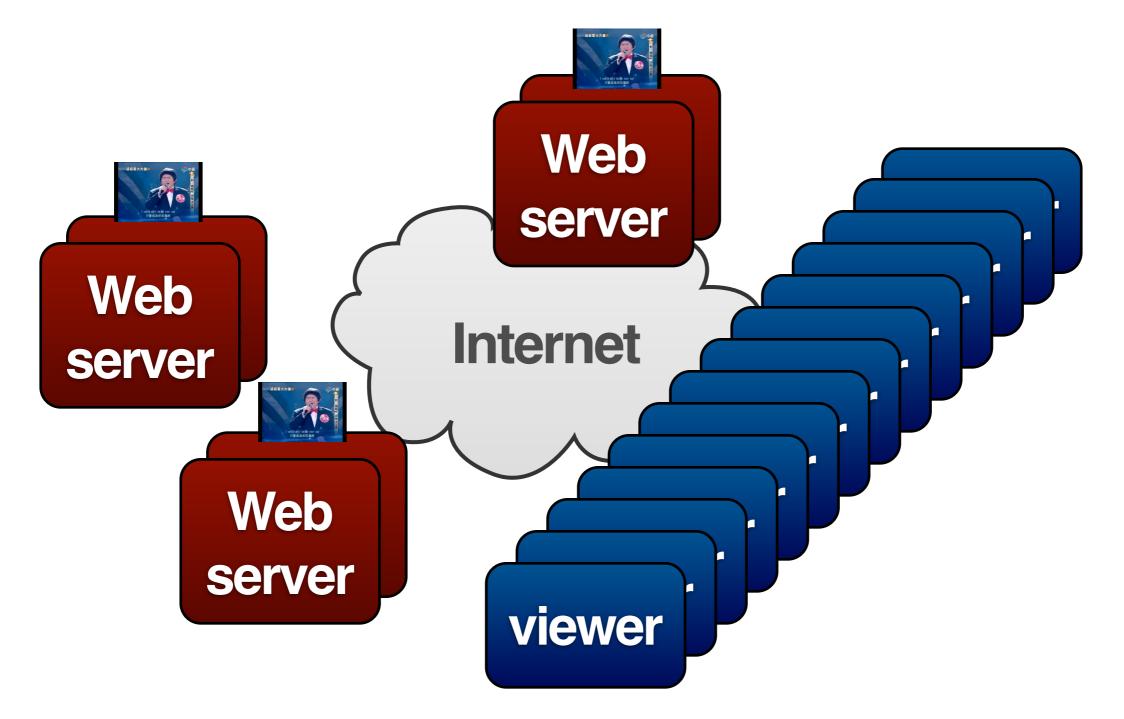
### have many many servers



## distribute all over the world



## popular videos are duplicated



### where to put video servers?

## which video store where?

## who has this video?

## who is closest to the user?

### need to adapt to:

## network condition, popularity of videos

## distributed systems

how multiple computers, communicating over a network, can achieve a common goal?

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Taiwanese Lin Yu Chun Sings Whitney Houston's "I Will Always Love You" LIVE			
超級星光大道	<b>②</b> 中親	4:14	Lo Yu Chun Sings Whitney Houston's 'I Will Alw 1/64,888 views Actonish
		2:42	Wow! American Boy Speaks Mandarin Chinese in China 228,717 views weirdchina
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毎踏出一步 我都會想起你    	0:38 / 2:59	4:35	Whitney Houston 16,970,894 views bohemya1
<b>1music4all</b> — April 07, 2010 — Lin sings Dolly Parton classic on Taiwanese tv talent show competition. (Parton wrote and first recorded the so	S,268,188 ≥ views	3:08	REMIX: Taiwanese boy Lin Yu Chun and Whitney Ho 238,182 views moffalee
Like Save to Save to EStare	<embed/>	2:22	Young black woman speaking Chinese on Li Jing's 113,930 views steve4nlanguage

## how to identify interesting and informative frame as thumbnail?



frame 1

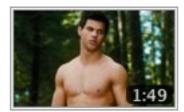
**frame 900** 



#### Toy Story 3 - Official Trailer [HD]

Title: Toy Story 3 Release Date: 18 June 2010 Genre: Animation Cast: Tom Hanks, Tim Allen, John Ratzenberger, Joan Cusack, Michael Keaton Director ... 6 months ago 4,526,905 views trailers

Featured Videos



#### New Moon Movie Trailer - Official (HD) HD

New Moon – Official Movie **Trailer** HD Follow Us – Twitter.com The brand new Twilight New Moon movie **trailer** courtesy of Summit 10 months ago 31,420,182 views **clevverTV** 



#### '2012' Trailer HD HD

Never before has a date in history been so significant to so many cultures, so many religions, scientists, and governments. A global 10 months ago 20,418,099 views hollywoodstreams



#### Breaking Dawn Teaser Trailer

Stephenie's Meyer novel Breaking Dawn **Trailer**. So I finally finished! I loved this book so much I decided to create my first 1 year ago 18,583,280 views **fervt88** 



#### Eclipse Trailer

BREAKING DAWN **TRAILER** : www.youtube.com This is a fanmade **trailer**. \*\*\* I wanna thank everybody for watching my video & your

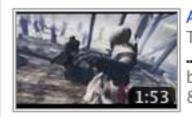
1 year ago 16,060,562 views TiteLola



#### Hannah Montana The Movie ... Hannah Montana The Movie Trailer

Featured Videos

Hannah Montana The Movie **Trailer** Follow Us – Twitter.com The Ha... by clevverTV 1 year ago 8,252,336 views



#### Assassin's Creed The new trailer for Assassin's Creed. ... Assassin&#... by stallons 3 years ago 8,553,315 views



Star Wars: The Force Unle... STAR WARS THE FORCE UNLEASHED : The release trailer for Star Wa... by machinima 1 year ago 5,370,006 views



#### Nine – Official Traile...

Release 25 December 2009 Genre: Musical Cast: Daniel Day-Lewis, Penélo...

by trailers 10 months ago 4,164,188 views



#### High School Musical 3 ...

The Official **trailer** for High School Musical 3 in theaters Oct ... by ashleytisdale 1 year ago

"Deconormal Activity" Official Test UD

#### Toy Story 3 – Official Trailer [HD]

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#### Eclipse Trailer

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#### Assassin's Creed

The new trailer for Assassin's Creed. ... Assassin&#... by stallons 3 years ago 8.553.315 views



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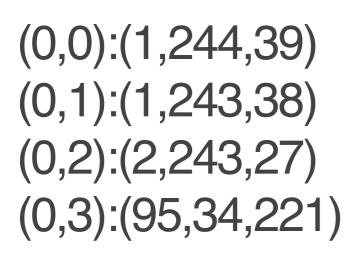
4.164.188 views

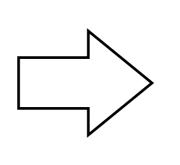


#### High School Musical 3 ... The Official trailer for High School Musical 3 in theaters Oct ... by ashleytisdale 1 year ago 14 022 001 views

"December and Activity" Official Trai

## need to understand the content of the video

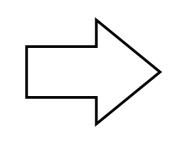




# is there a variety in the colors?



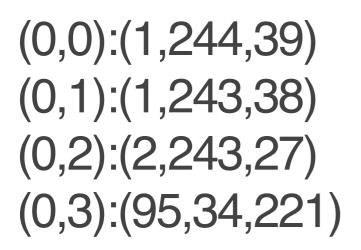
### (0,0):(1,244,39) (0,1):(1,243,38) (0,2):(2,243,27) (0,3):(95,34,221)

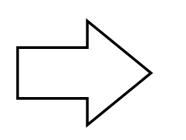


## is there a face inside?

## is it the same face?

### doable





## is the scene an important one, based on the text description?

## very hard



## need to detect duplicates

## but length, size, quality, colors, content may change slightly

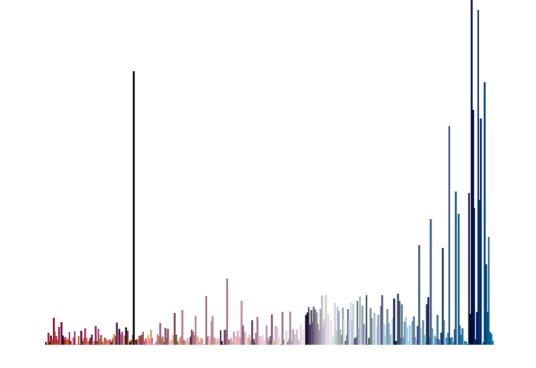






## one possible method:

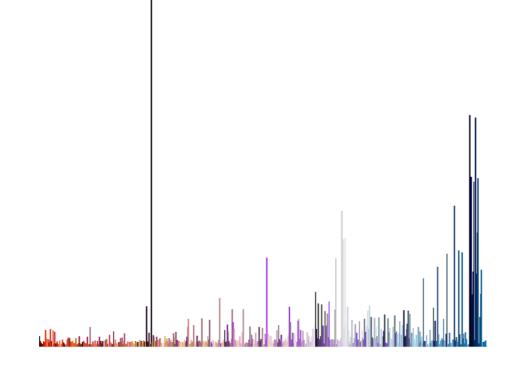
## compute color histogram for each frame

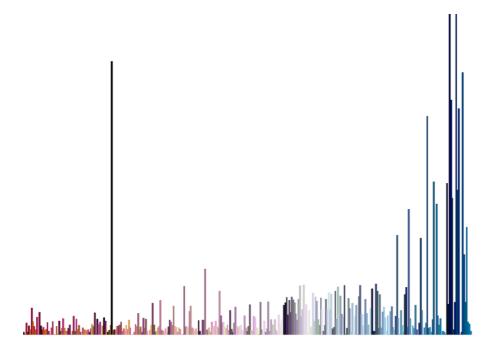


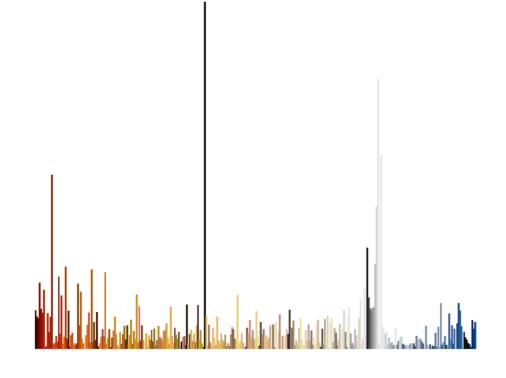






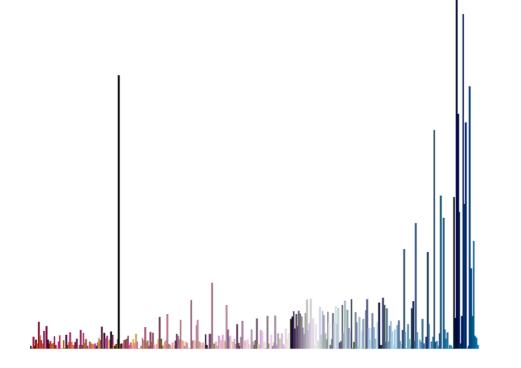




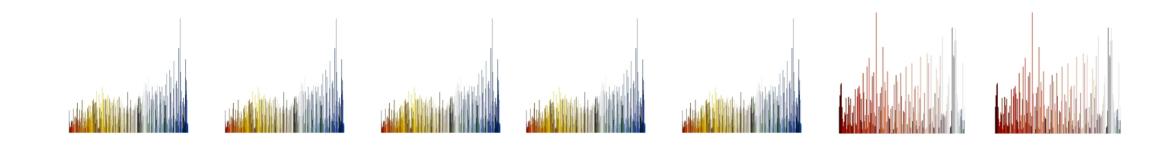


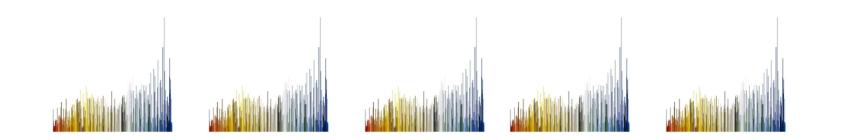




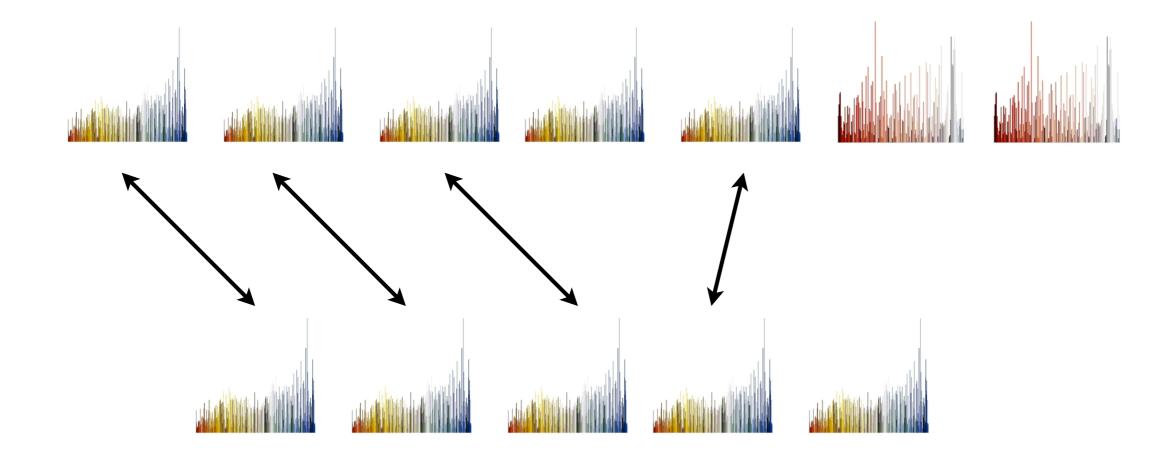


## construct sequence of color histograms for videos





## perform approximate matching

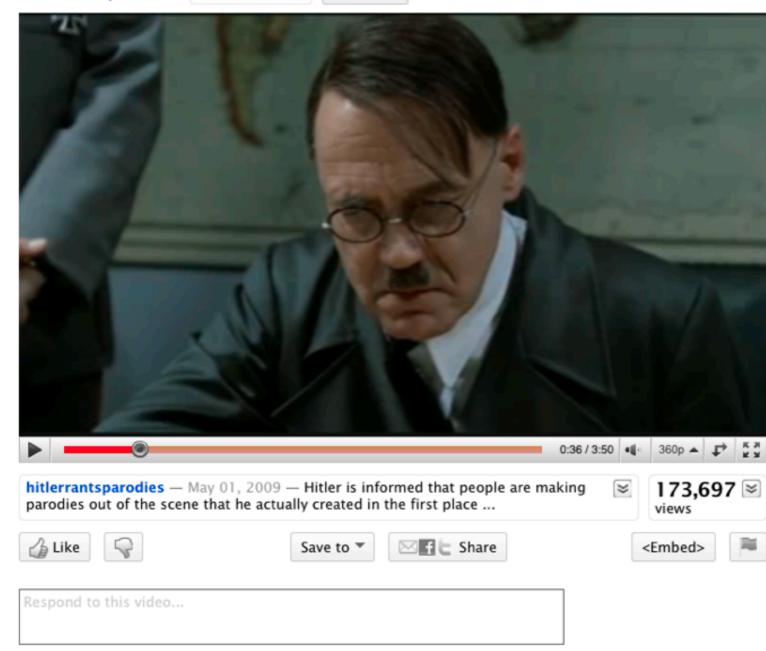


## but it does not always work

## different subtitles, same video

#### Hitler rants about the Hitler Parodies

hitlerrantsparodies 256 videos 🗵 Subscribe



Highest Rated Comments

KieCuster No don't stop arguing! It entertains me! Here I'll give you more topics to argue about: 9/11 was awesome, woman shouldn't vote, slavery was a good thing, why can't I rape children, and there is no god. So please continue the fight. 15 🕏

NeedlesKillerOF "But Sir, Leaved not help but lel when watching



#### Usain Bolt Breaks 100m World Record and Hitler ... 1,142,123 views welcometo21 Featured Video



0:21











the Movie 116.155 views meeee0W





0:21

Hitler is informed about the Apple iPad 270,763 views hitlerrantsparodies



Somebody Stole Hitlers Car 1.706.000 views SmokeyMcPot420yee



#### Hitler gets banned from Xbox Live 4.350.606 views MOTURK49



Hitler is asked "Why so

## with recognition of video content, we can also

## detect inappropriate materials

## content-based search (e.g., find video of cat the musical)



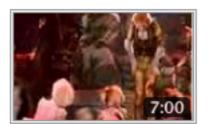
#### Cats Musical - Memory

Cats is an award-winning musical composed by Andrew Lloyd Webber based on Old Possum's Book of Practical Cats and other Most liked 2 years ago 4,552,666 views UrChatNoir



#### Cats The Musical DVD - The Rum Tum Tugger

The Rum Tum Tugger from **Cats**. ~lyrics~ The Rum Tum Tugger is a curious **cat** If you offer me pheasant I'd rather have grouse If you **Most liked** 1 year ago 181,594 views **QuaxosJellicleSpoon** 



#### The Best Of Cats The Musical Hey.. This is parts of Cats the musical 3 years ago 1,270,483 views Bog



### "NORA: Practice Makes Purr-fect" - Check the sequel too.

can be found at www.ravenswingstudio.com Copyright © 2007/09 by Yow!/Alexander. Nora The Piano **Cat**, LLC ... piano **music** video

3 years ago 17,342,702 views burnellyow

## detect copyrighted video



Search

Browse Upload

weitsang 👻 Sign Out

About YouTube

Contact us

Company blog

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Company History

Jobs

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YouTube on Your Phone YouTube on Your TV YouTube on Your Site YouTube RSS Feeds TestTube

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### YouTube Video Identification Beta

Thanks to the continued cooperation of content owners large and small, YouTube is able to develop, test, and implement increasingly effective content management tools. Today, we are proud to launch, in beta form, our latest innovation in online video: YouTube Video Identification.

Like our other content policies and tools, YouTube Video Identification goes well above and beyond our legal responsibilities. And like those other tools and policies, Video Identification aims for three main goals: accurate identification, choice for copyright holders, and a great user experience.

### Identification

YouTube Video Identification will help copyright holders identify their works on YouTube. We have worked with Google to develop one-of-a-kind technology that can recognize videos based on a variety of factors. As its Beta status indicates, our Video Identification is brand-new, cutting-edge stuff, so we will be constantly refining and improving it. Early tests with content companies have shown very promising results. As we scale and refine our system, YouTube Video Identification will be available to all kinds of copyright holders all over the world, whether they want their content to appear on YouTube or not.

No matter how accurate the tools get, it is important to remember that no technology can tell legal from infringing material without the cooperation of the content owners themselves. This means that copyright holders who want to use and help us refine our Video ID system will be providing the necessary information to help us recognize their work. We aim to make that process as convenient as possible.

## more relevant video



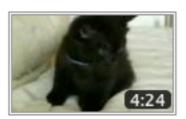
## multimedia content analysis

## how to reason about the content of image, video, and audio?

#### **Recommended for You**



Confessions of an Area 51 Employ... 2 years ago 58,078 views Because you watched Agent Cooper Ente...



THE BEST CAT VIDEO YOU'LL EVER 3 years ago 25,640,211 views Because you watched The Internet Is M...



Destroyed in Seconds - Chemical 1 year ago 1,468,097 views Because you watched Qwirkle



Edit 🔊 🗙

Twin Peaks - "Bob"

3 years ago 117,200 views Because you watched Albert's speech -...



Steve Vai - "I Know You're Here" 1 year ago 3,696,800 views Because you watched Prefab: What if ...



Happy Birthday

3 years ago 7,824,002 views Because you watched corgis singing ha...



David Letterman -Rudolph The Re...

4 months ago 24,833 views Because you watched David Letterman -...

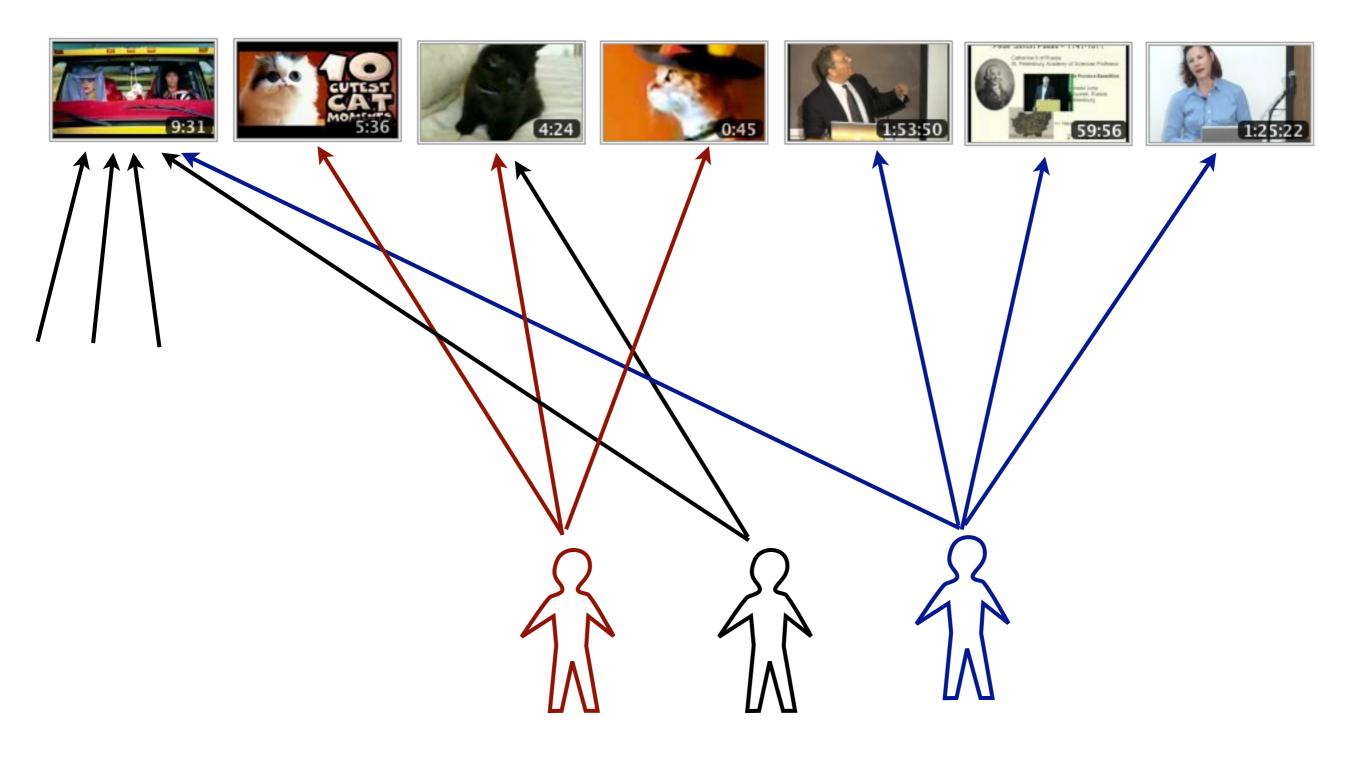


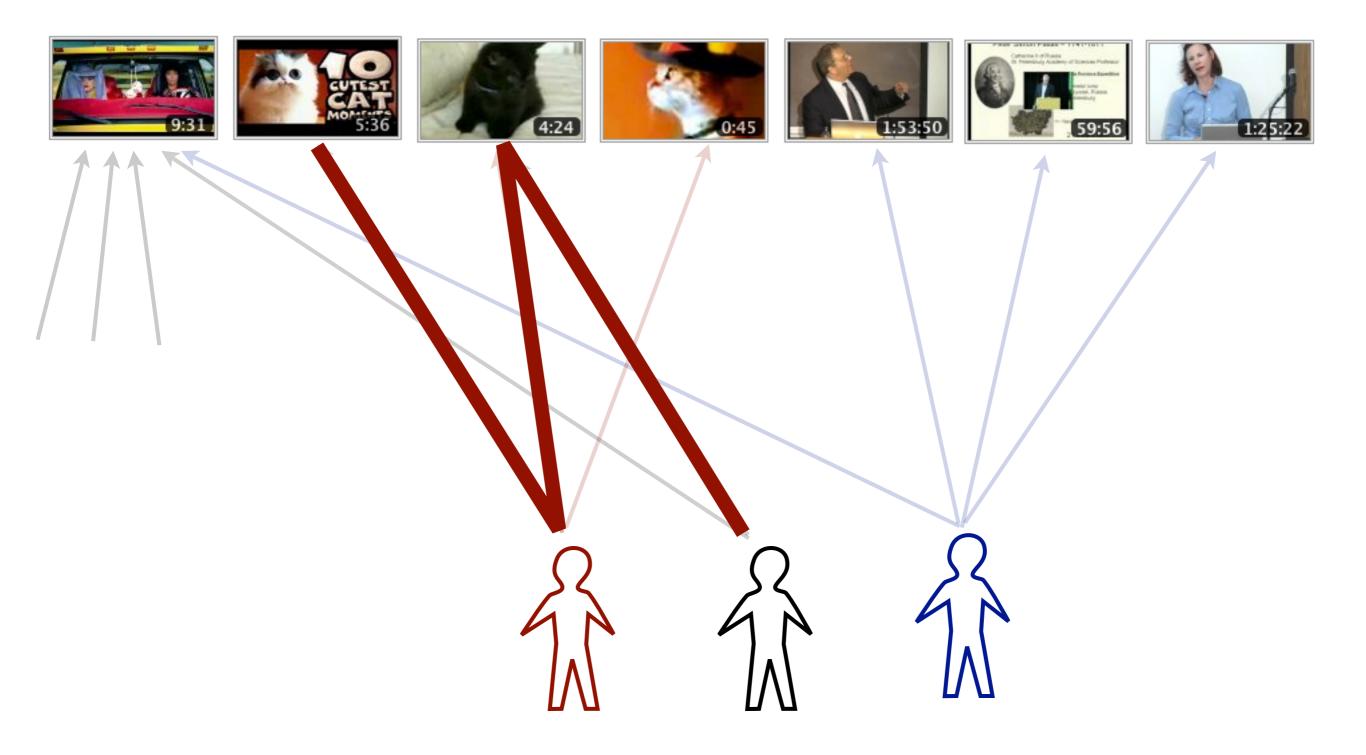
Lesson 1 -Preferences -2 years ago 500,096 views Because you watched English Grammar L...

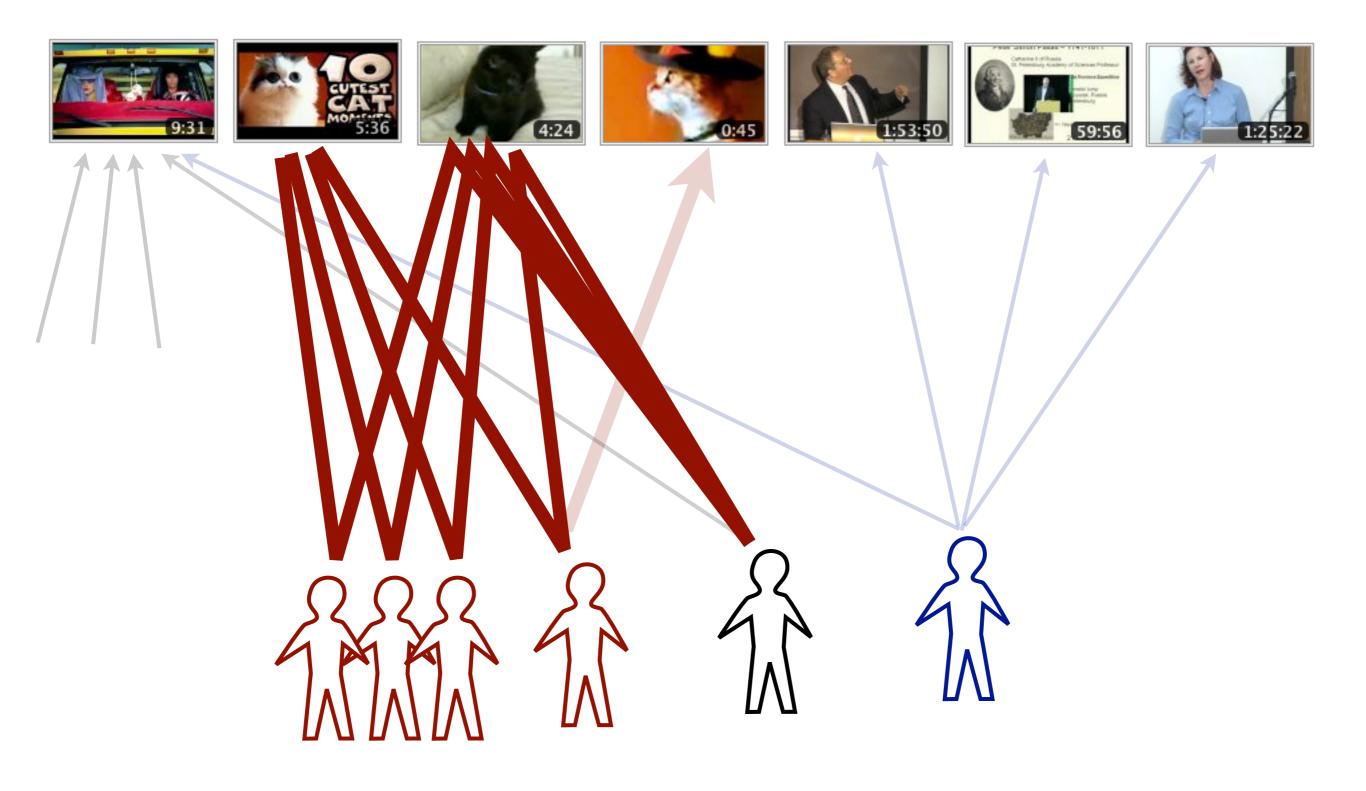
## need to predict what a user likes to watch

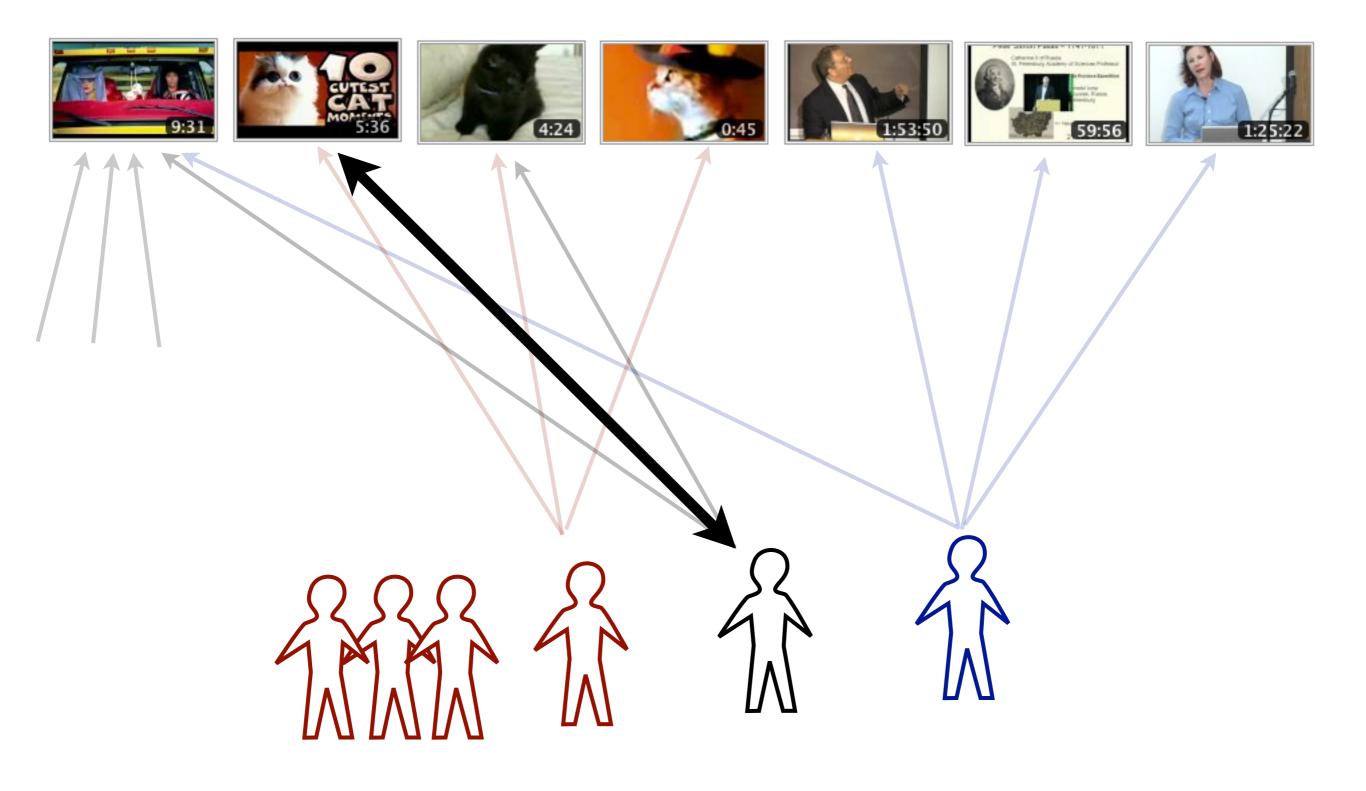
## Observe pattern: many users who viewed X, also viewed Y

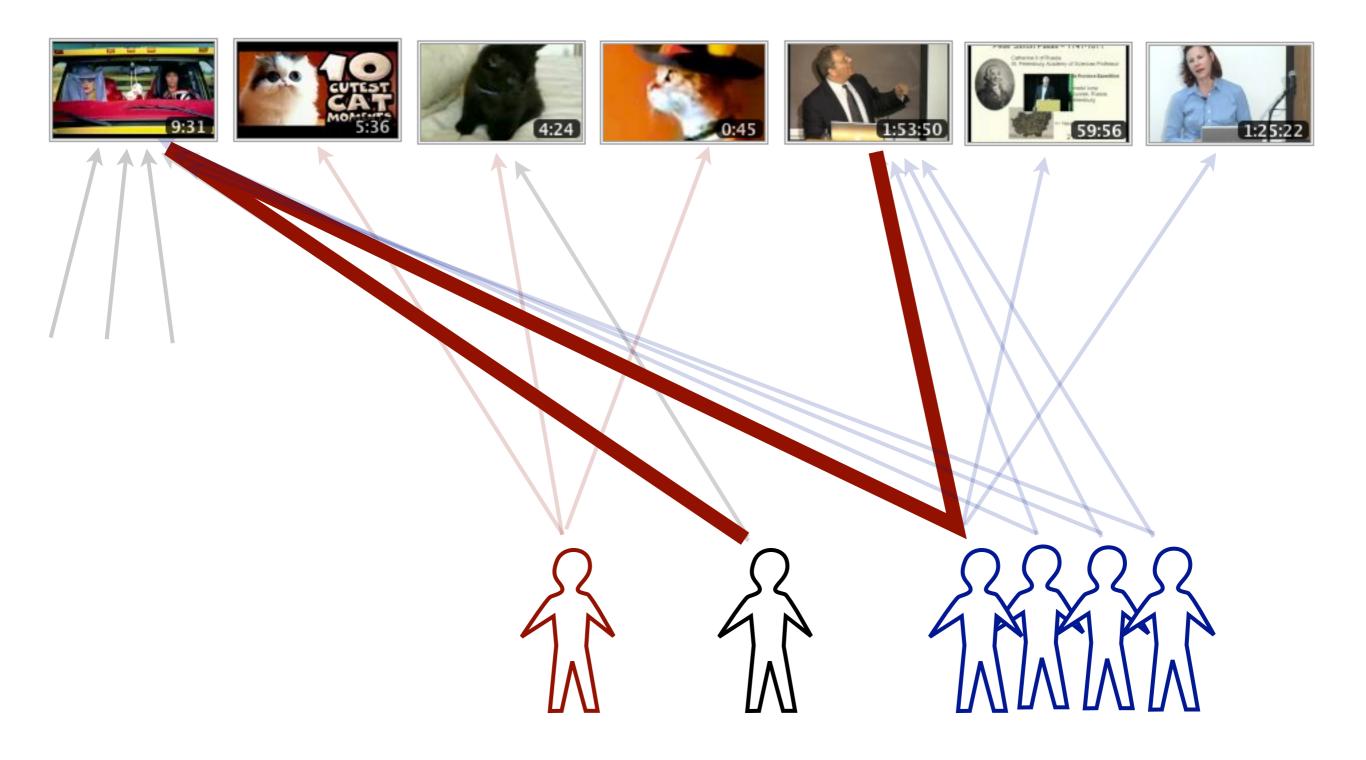
## if a user is viewing X, the user might like Y too.









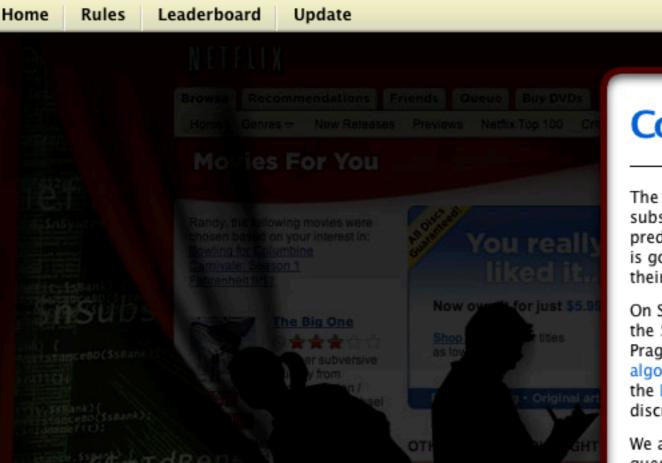


### User U may like video V if

there is a short path between *U* and *V* there are many paths between *U* and *V* not going through popular videos

#### NETFLIX

#### **Netflix Prize**



#### **Congratulations!**

COMPLETE

The Netflix Prize sought to substantially improve the accuracy of predictions about how much someone is going to enjoy a movie based on their movie preferences.

On September 21, 2009 we awarded the \$1M Grand Prize to team "BellKor's Pragmatic Chaos". Read about their algorithm, checkout team scores on the Leaderboard, and join the discussions on the Forum.

We applaud all the contributors to this quest, which improves our ability to

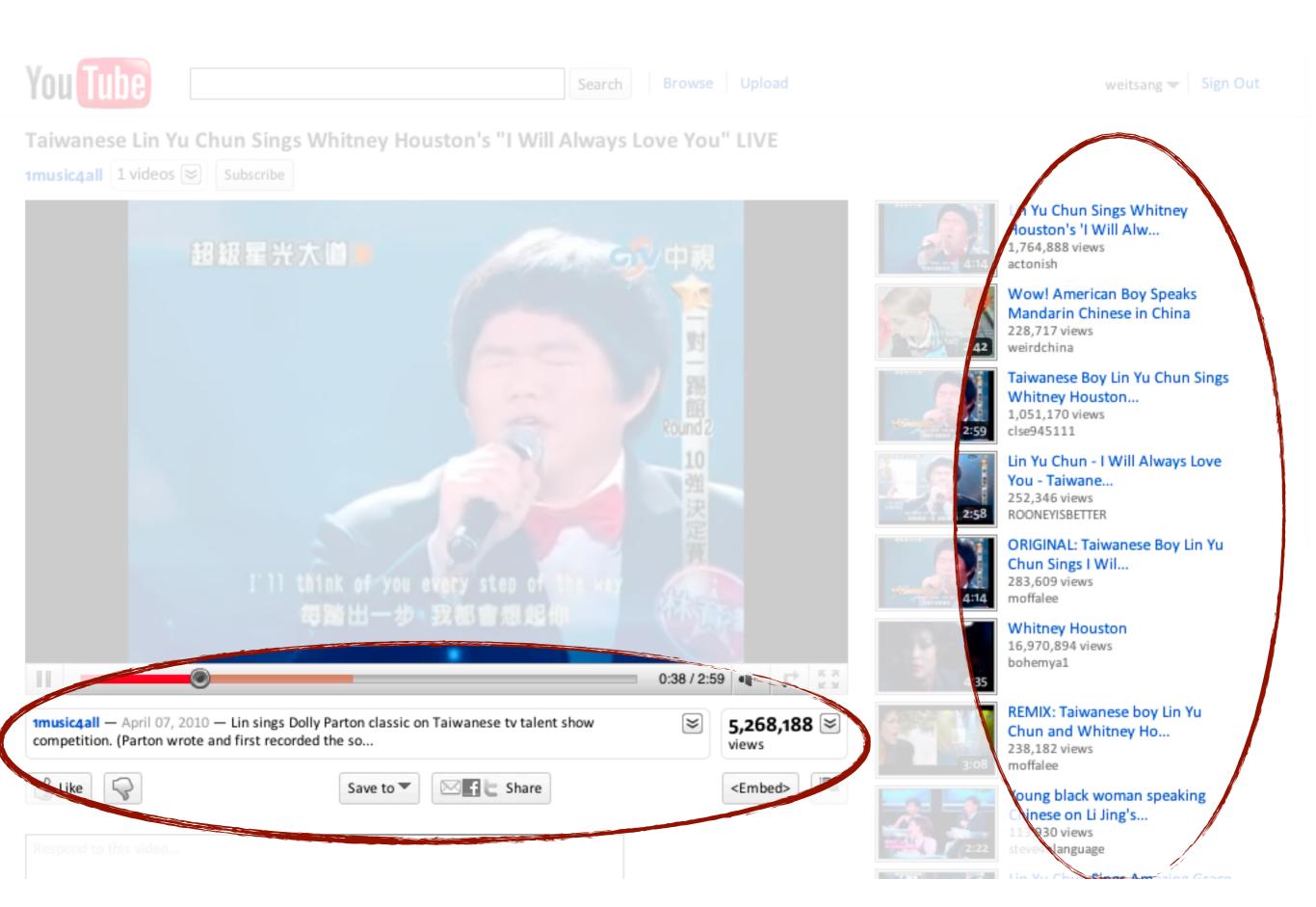
Netflix gave out \$1M to improve their recommendation

FAQ Forum Netflix Home

© 1997-2009 Netflix, Inc. All rights reserved.

#### machine learning

#### how to recognize pattern and learn information from data



#### each video has many properties:

#### who has viewed it who likes it who commented what about it who tags it with what

(and when, where ..)

#### how to find:

#### top 10 most viewed video in Singapore

#### how to find:

#### all videos tagged with "cat" "favorited" by me

#### top 10 most watched videos liked by viewers who also liked video X

## ~250,000,000 videos on YouTube (my estimate)

## 700,000 video viewed every minute (october 2009)

#### need to store, search, retrieve, and update metadata about video efficiently and consistently



## how to manage large amount of data

compression distributed systems media content analysis machine learning database computational methods to store retrieve transmit process display interact with information

#### computer science

# the computer science behind



#### Thank You



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