**LIFE AFTER MOOCS** Online Science Education Needs a New Revolution\*

### Phillip Compeau

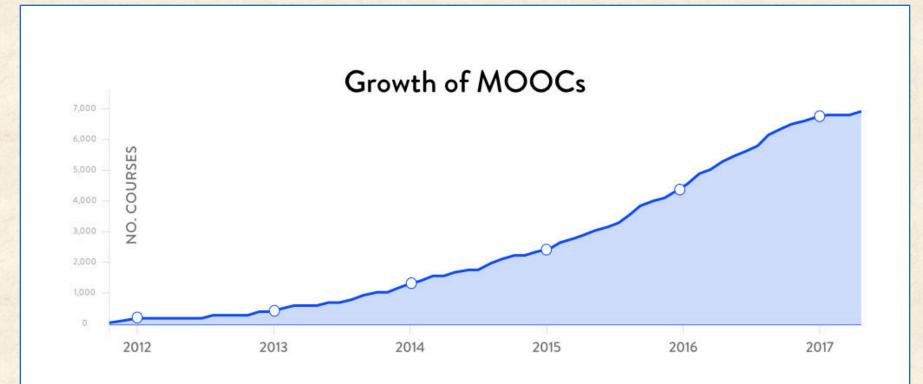


**Carnegie Mellon University** School of Computer Science

Appeared in Communications of the ACM (with Pavel Pevzner), Oct. 2015

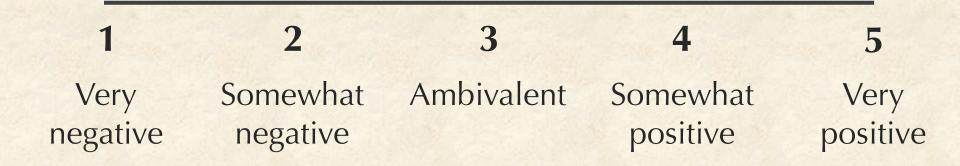
Massive Open Online Course

## Growth of MOOCs



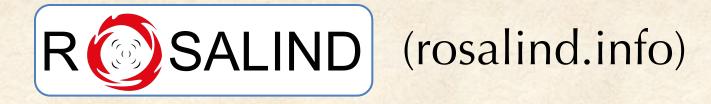
Source CLASS CENTRAL

## What Is Your Feeling About MOOCs?



## Outline

- What Brings Me Here
- What is Wrong with MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"





#### Problems

Stronghold of Bioinformatics -

List Tree

Rosalind is a platform for learning bioinformatics through problem solving. Take a tour to get the hang of how Rosalind works.

DNA	Title	Here's the list of Rosalind problems	Solv	Solved By	Correct ratio	Questions	Solutions Solutions 21 minutes
	Counting DNA Nucleotides		3644				
RNA	Transcribing DNA into RNA	Click to see the first problem.	8121	1			
REVC	Complementing a Strand of DNA			5			
GC	Computing GC Content			5	-		
HAMM	Counting Point Mutations			3			
SUBS	Finding a Motif in DNA			1			
GRPH	Overlap Graphs				-		
IPRB	Mendel's First Law				and the second second		
LCS	Finding a Shared Motif				and the second se		
MPRT	Finding a Protein Motif				_		
PERM	Enumerating Gene Orders			5			
PROT	Protein Translation			1	and the second		
REVP	Locating Restriction Sites						
IEV	Calculating Expected Offspring						
LEXF	Enumerating k-mers Lexicographically						
LIA	Independent Alleles						



- 284 problems in 5 different "locations"
- 168,000 signups
- 43,000 users solving at least one problem
- 414,000 correct submissions
- Used 375 times by 100+ different instructors



- 284 problems in 5 different "locations"
- 168,000 signups
- 43,000 users solving at least one problem
- 414,000 correct submissions
- Used 375 times by 100+ different instructors

• But...Rosalind is not a standalone educational resource!





## **Bioinformatics Algorithms MOOCs**

- 2013: First bioinformatics MOOC
- August 2015: Bioinformatics Specialization
  - 1. Finding Hidden Messages in DNA
  - 2. Genome Sequencing
  - 3. Comparing Genes, Proteins, and Genomes
  - 4. Deciphering Molecular Evolution
  - 5. Genomic Data Science and Clustering
  - 6. Finding Mutations in DNA and Proteins
  - 7. Capstone: Big Data in Biology (sponsored by Illumina)

## Outline

- What Brings Me Here
- What Is Wrong With MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"

## Criticisms of MOOCs

## COMMUNICATIONS Will MOOCs Destroy Academia? 11/2012

### **Ehe New York Eimes** 5/2013

Professors at San Jose State Criticize Online Course



#### **The MOOC Racket:**

Widespread online-only higher ed will be disastrous for students and most professors.

#### THE CHRONICLE of Higher Education

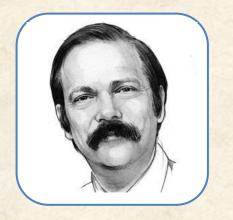
7/2013

**A MOOC Delusion:** 

Why Visions to Educate the World are Absurd

## Criticisms of MOOCs

# COMMUNICATIONS Will MOOCs Destroy Academia?

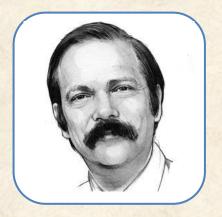


### Vardi, 2012

"If I had my wish, I would wave a wand and make MOOCs disappear."

## Criticisms of MOOCs

# COMMUNICATIONS Will MOOCs Destroy Academia?



### Vardi, 2012

"If I had my wish, I would wave a wand and make MOOCs disappear."



### Trithemius, 1492

"The printed book is made of paper, and like paper, will soon **disappear**."

## Which Would You Prefer?



OR

Of one the knoweth not the condicion Thuf Bondis Ben alle gote and have be pore That knows Boups I dar fap nomore Afadin the lapa the Breachidy childy auftaunce The ponge wughter followdy Bp to fofte Ehat moft you loueth With okiffaunce Ouir alle thing out take aift on lofte Custauna pour child) for recomaundith ofte Onto your grace for I that to furepe Me fal 7 neuer fe pou more Bith pe Allas Snto the Bar Barik nacion I muste anon acordpung to your Bil But aift that apa for our reamption So peue me grace fis feftis to fulfille A Breachio Bomman no fors though 7 foolle Dommen are born to thraf dom a to penaunce And to be Bnder mannys gouernaunce I two at trope Bhan Turmes Brac the Bal OF Thion not brent Bas Thekes the Cyte Me Lome for the fege of Banyfal That Lomapus hade Lengup ffeor tymes thre (Mas ford) fuche tender Bepunge for pote As Bas in the chambir for her apartpinge But forth for moot Blether for Bepe or funge O frofty mornprat auel firmament Dith the opurnal Blek that a Baft av And Burtelift al fro efte to oardente That naturelly Wolde folde another Bep The aoBound fet the feuen in fuche arap

hurde

Long

#### it the state of th JAK JAKE - HIS. EAM S - 2 MES/K - 2 NB $\int d(y) d(y) = C' \left(\frac{2\pi}{p}\right)^n = I$ 200+ students to 1 instructor (b) the extraction of the state of the sta

 $(\frac{1}{2}) \underbrace{f(r_{i}^{2})}_{\text{integration}} = \underbrace{\frac{1}{2}}_{\text{integration}} \nabla \underbrace{f(r_{i}^{2})}_{\text{integration}} \underbrace{\nabla f(r_{i}^{2})}_{\text{integration}} \underbrace{\nabla f(r_{i}$ 

(Kit/2Tiller

any many fight for an 10

for retents

WY VY MULADO

1) = 32 × 10-1m -= = 32 × 10-2.

" V= (16 + 10 - " a) (ax 10" N w 1/0")

and the falles in survilles

10 England Jack Richney Bles De - the Dora grannishe by - 5 / cancel

STATIC CONTRACTOR

(7,17) K= (2,1)/2, e ==

Ni

e.f. H. W. Fan F

Ho and All - I and - 1

CTIN PRODUCT JE

 $\langle L^2 \rangle_{2} S \langle L_{k}^{\pm} \rangle_{2} \frac{1}{2(+1)} \sum_{m_{1} \neq m_{2}} m_{1}^{\pm} S^{\pm} \cdot L((k+1)) S^{\pm}$ 

E ["07], [4 002402 ++ 12 0 - 15 9995, ];\* + 0.079482;\*.4

.12.

- 3'5.

- 991

With a stand of a stand

D Par times = 2 mat

Inglish 10

网络 杂水谷

to a de bip

Co Jalant K "(lans)" Er (4+1.12)

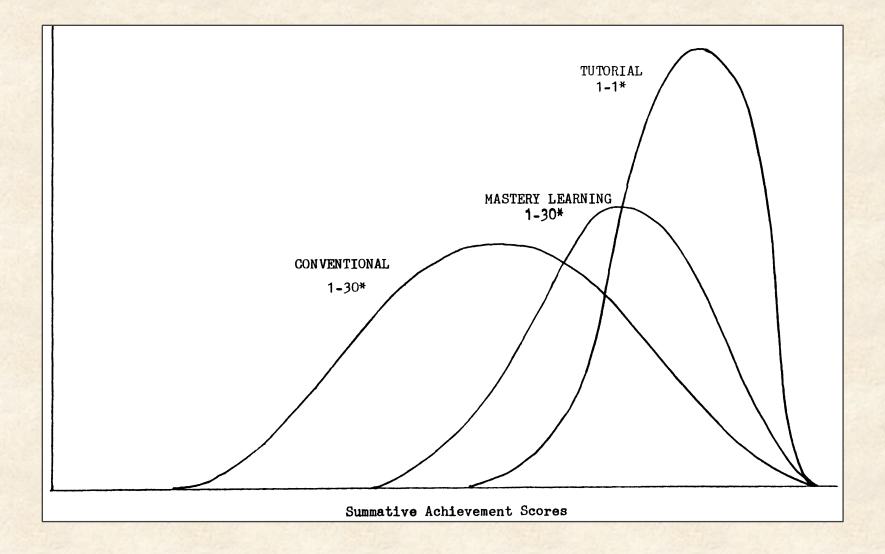
O A areata path - Endedy

ENEI DELETTOR COMMENTS ENEXT

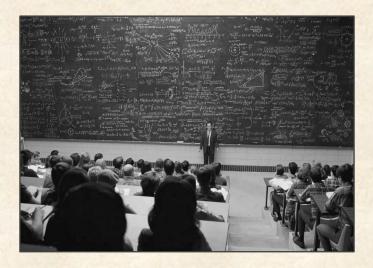
E hundren (maril) SEction

Varps Bre S.B.

## Bloom's 2**σ** Problem (1984)







Massive Open Online Course



Massive Adaptive Interactive Text

## Outline

- What Brings Me Here
- What Is Wrong With MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"



Kolowich 2013: ~100 hours spent before launch of typical MOOC

## Massive Development Resources



Nikolay Vyahhi Rosalind founder, Stepic CEO, co-instructor



Olga Botvinnik course/graphics development



Yu Lin, Ph.D. course development



Randy Christopher resident artist



Son Pham, Ph.D. invited lecturer, course developer



Max Shen course/software development



Robin Betz course development



Lars Bernstein course development



Kai Zhang chief assessment programmer



Vu Ngo course/software development



Mark Mammel teaching asst, content review



Glenn Tesler, Ph.D. content review



Alexei Balandin chief Rosalind programmer



**Jeffrey Yuan** course/software development



**Isabel Lupiani** teaching asst, content review



Sangtae Kim invited lecturer

## Massive Development Resources



2013-2014



2013-2014



2014-2015



2015-2018

## The " $\frac{1}{2}\sigma$ Problem"

- Freeman et al., 2014: Active learning increases student performance by ½σ over traditional instruction.
- All assessments are integrated into our courses as soon as they are needed:
  - STOP and Think questions
  - Exercise Breaks
  - Code Challenges
  - Final Data Challenges
- How can we move from a  $\frac{1}{2}\sigma$  to a  $2\sigma$  improvement?

# $\bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc$

# $\bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc$

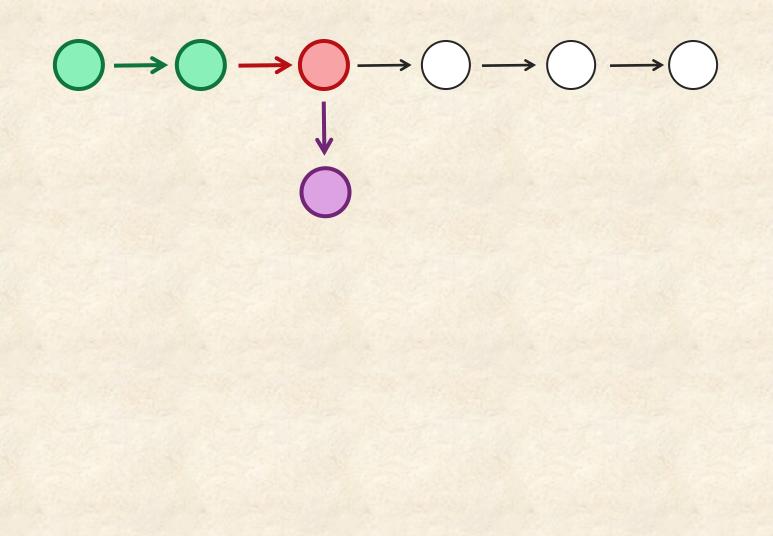
# $\bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc$

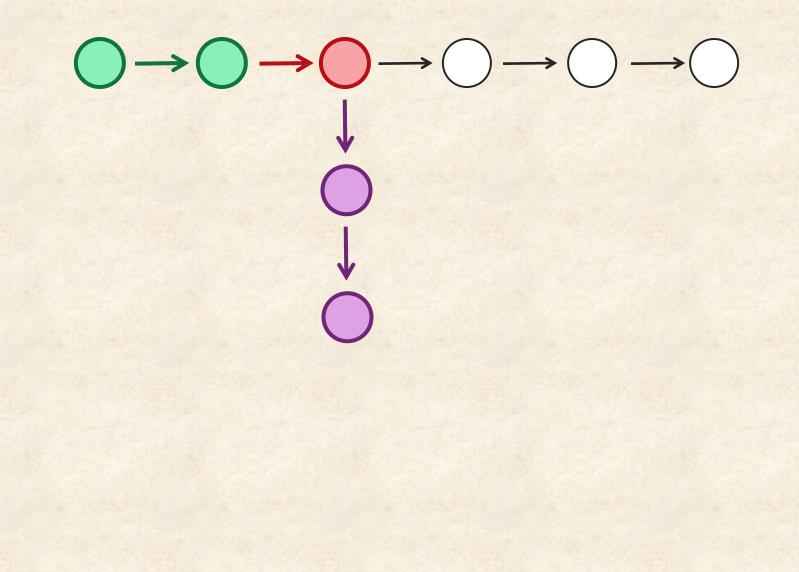
# $\bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc$

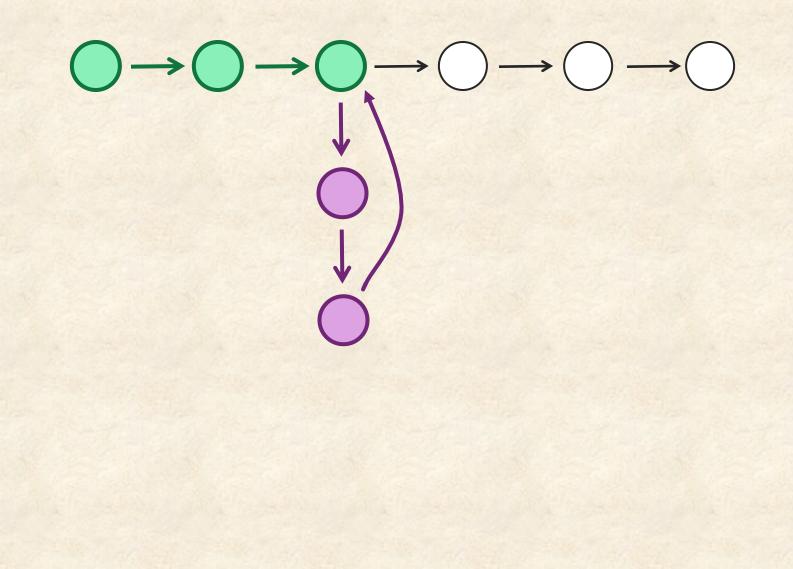
# $\bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc$

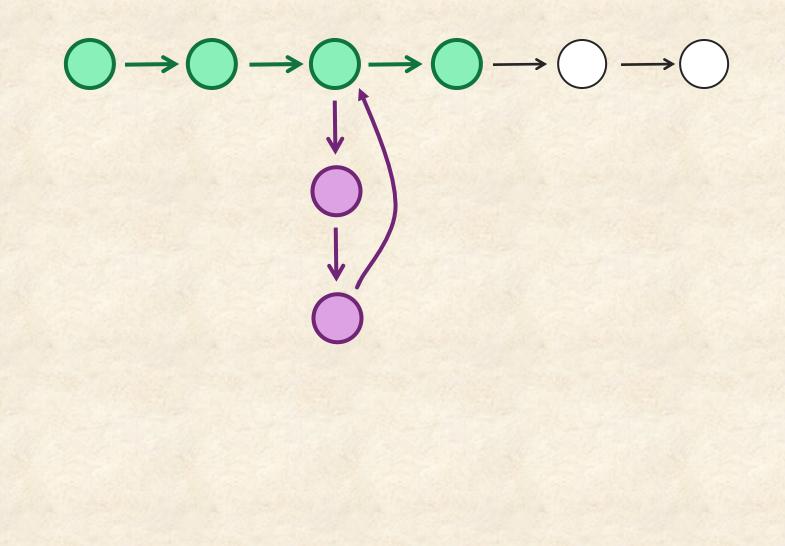
# $\bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc$

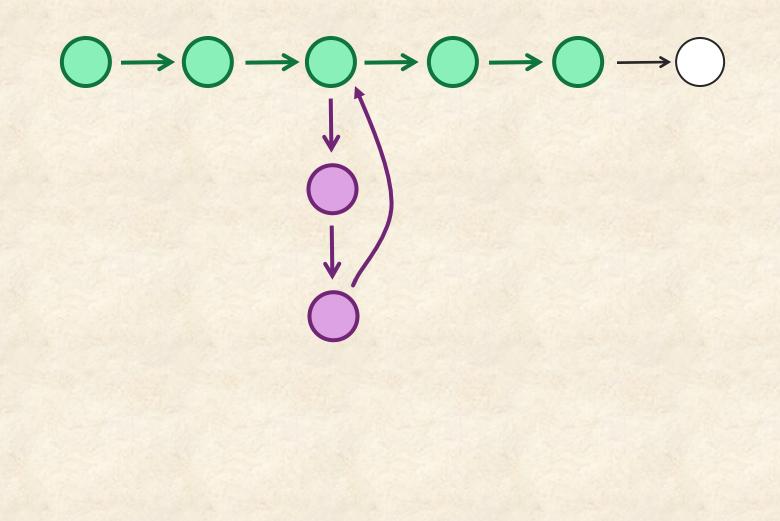
# $\bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc \rightarrow \bigcirc$

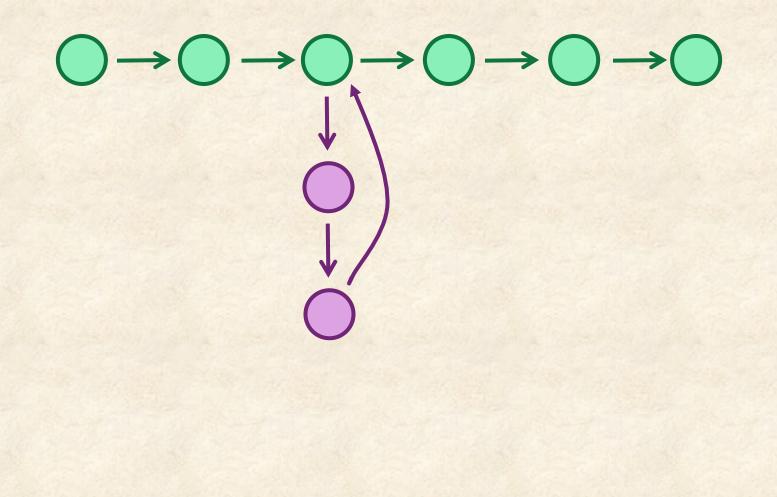




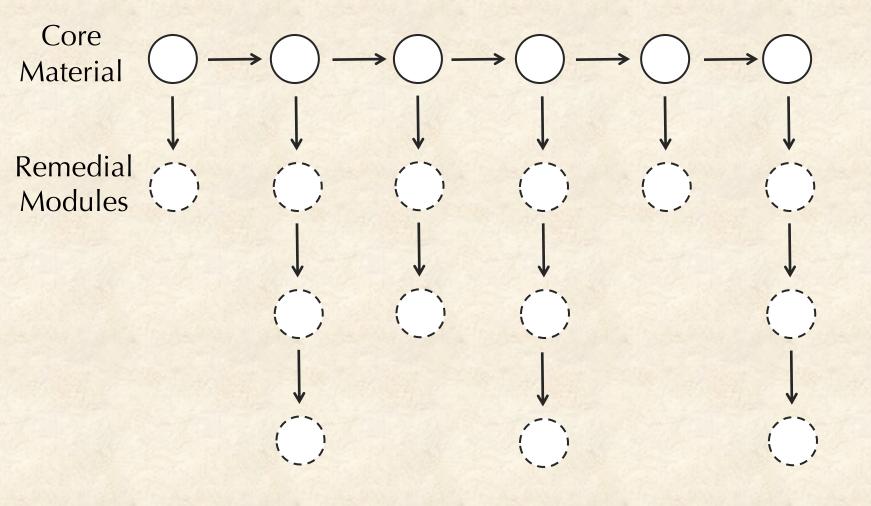








## $\begin{array}{c} \text{Core} \\ \text{Material} \end{array} \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \longrightarrow \bigcirc \end{array}$



#### **Compendium of Learning Breakdowns**

- First run of first three courses (12 weeks):
  - 8,500 discussion forum posts: 4,400 pages
  - compendium of learning breakdowns: 42 pages
  - changes to courses based off student issues: 128 pages

#### Compendium of Learning Breakdowns

**Pattern Matching Problem:** Find all starting positions of a word (*DnaA* box) in a text (origin of replication).

## CTCGGAGCGACTCTCGGTCGGTCAGTGAGTTCCAGTCGACTTTACTC01010122741

- Swap text and word in input (0 occurrences)
- Miss overlapping occurrences of word
- Miss strings at beginning or end of text
- Read too far ahead in text and include counts accrued in the reverse complement of text.
- Identify only the first occurrence.
- Identify only the last occurrence.
- Use 1-based indexing instead of 0-based indexing





#### Toward an Interactive Content System

• There is an entire research field in **intelligent tutoring systems** (dating to LISP interactive tutors developed in 1982).

• But financial barriers have meant this research has rarely moved beyond K-12 or introductory undergraduate STEM classes.



Playlists Channels Discussion About Q Home Videos

#### **Created playlists**



Chapter 5: How Do We Compare Biological... 7 months ago



**Chapter 3: Which DNA Patterns** Play the Role of Molecular... 7 months ago



Chapter 7: How Do We Locate Disease-Causing Mutations?

7 months ago



Chapter 2: How Do We Sequence Antibiotics?

7 months ago



Last added to 👻

Grid -

Chapter 1: Where in the Genome Does DNA Replicati... 7 months ago



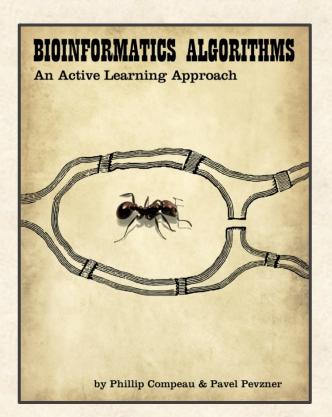
Chapter 4: How Do We **Assemble Genomes?** 7 months ago



**Chapter 6: Are There Fragile** Regions in the Human... 7 months ago

• Adopted for use in 50 universities (and three high schools!) since fall 2014

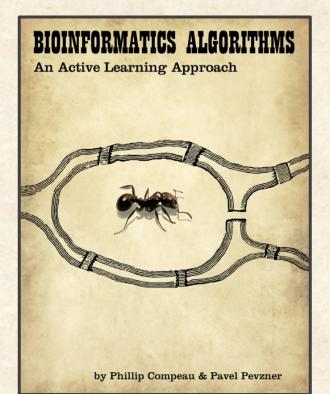




 Coursera courses are powered by a completely interactive version of this textbook with remedial modules.

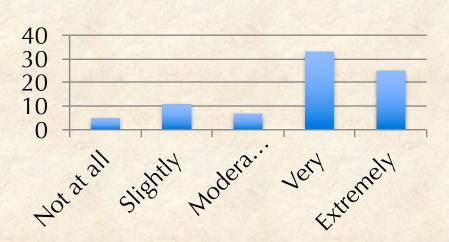


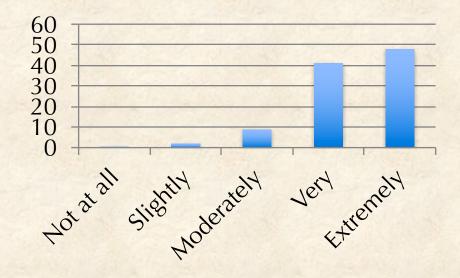
**Hosted by Stepik** 



How valuable are the **lecture videos** in helping you learn?

# How valuable is the **interactive text** in helping you learn?

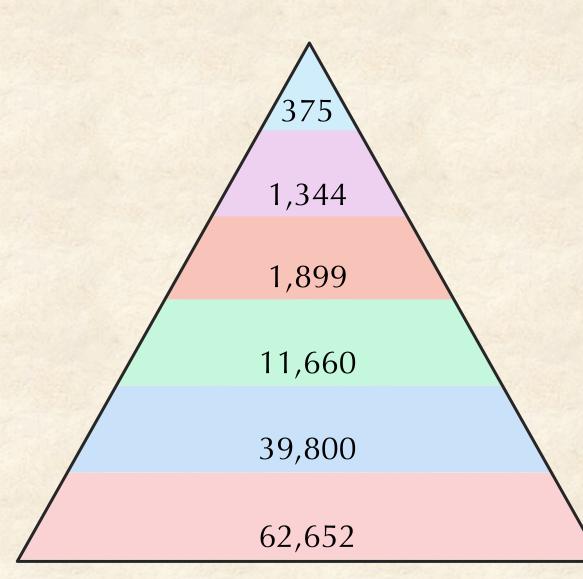




#### Outline

- What Brings Me Here
- What Is Wrong With MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"

#### Student Stats (First Course, 2013-2015)



100% completion

80% completion

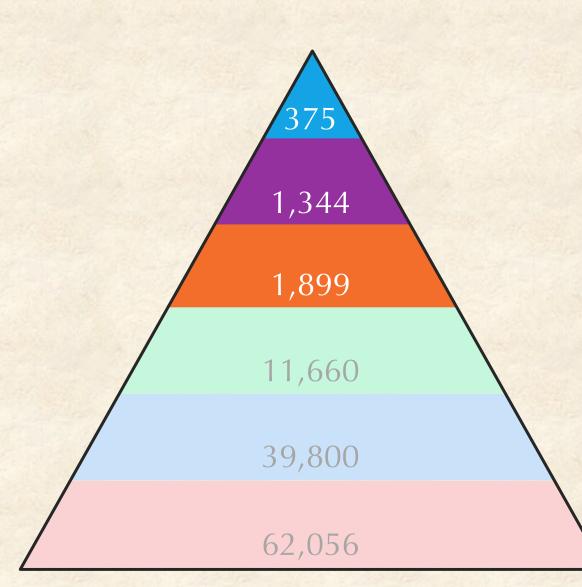
60% completion

Submitted an exercise

Watched a lecture

Visited the course

#### Student Stats (First Course, 2013-2015)



80% completion 60% completion

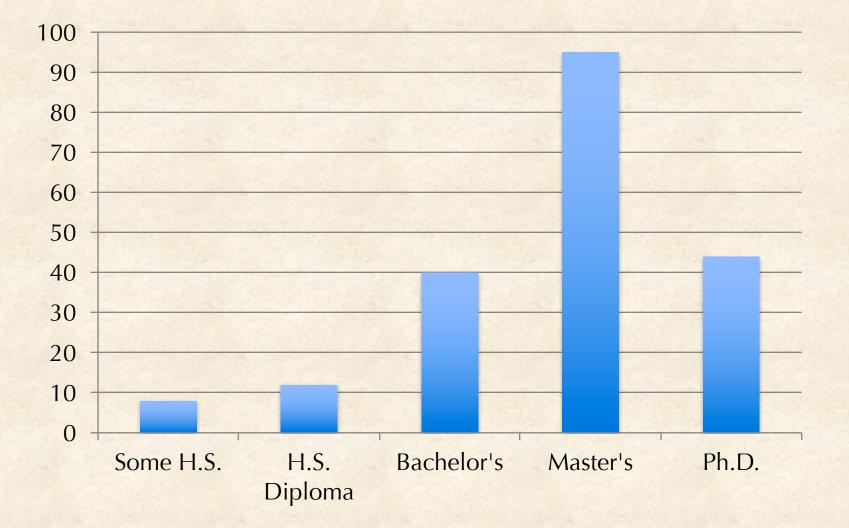
100% completion

Submitted an exercise

Watched a lecture

Visited the course

#### "Highest Educational Level Attained?"



#### "Relative Difficulty of Our MOOC?"



#### In Students' Words ...

#### **HIGHEST RATED MOOC**

This course is a Top 50 MOOC of All Time based on thousands of reviews written by Class Central

users. It's guaranteed to be good!

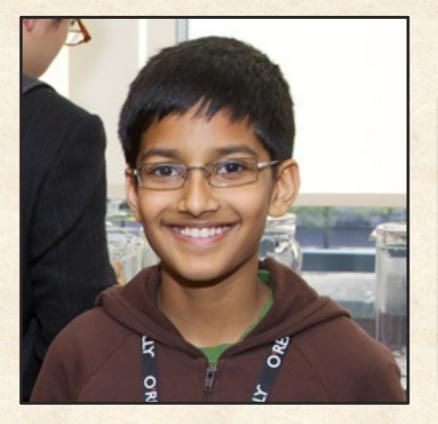
Check out the rest of the Top 50 here.

#### **ELASS CENTRAL**

*"This is, hands down, the best course I have ever taken."* 

"MIT 7.00x, taught by Eric Lander, is the only [MOOC] that is on the same level. This is the highest compliment I can give."





#### Shadaj

"I got really excited about DNA when we learned about it in school..."



#### Holly

## "This class has sparked a fire in me..."



#### Venkata

"I had a great genomics extension class once..."



Mark

"The new clone outperformed the original so we have destroyed the original ... there must have been a mutation."



#### **?????**

#### 

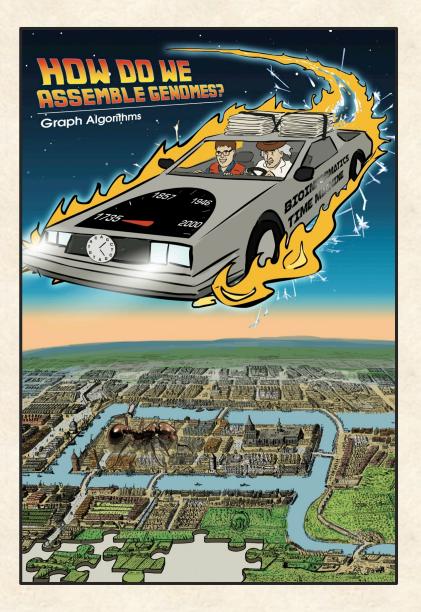
#### Outline

- What Brings Me Here
- What Is Wrong With MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"

### Building a Brand



#### Building a Brand





#### Generating Revenue

Coursera Cour	rses Specializations Institutions About - Phillip Comp
Johns Hopkins University Data Science A Sequence of Courses: Learn to be a Data Scientist and Apply Your Skills in a Capstone Project Final Capstone Project created with: SwiftKey.	
Overview Certificate Courses Instructors FAQs	Start Specialization
<ul> <li>In this course you will learn:</li> <li>Formulate context-relevant questio and hypotheses to drive data scientific research</li> <li>Identify, obtain, and transform a do set to make it suitable for the production of statistical evidence communicated in written form</li> <li>Build models based on new data types, experimental design, and statistical inference</li> </ul>	<ul><li>analyzing large textual data sets</li><li>Clean real-world data and perform</li></ul>

#### Outline

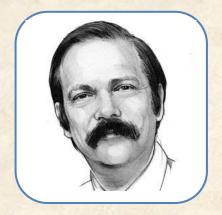
- What Brings Me Here
- What Is Wrong With MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"

#### Forming Partners

- Industry partners
  - Course materials are currently used as a job interview tool at Illumina.
  - Adoption for continued education at biotech firms.
- University partners
  - Online courses will count as credit for candidates to MS program in Computer Science at UCSD.
  - Our MAIT is perfect for grad school bootcamps, which can be a pain for departments to implement.

#### What Exactly Are We Destroying?

## COMMUNICATIONS Will MOOCs Destroy Academia?



#### Vardi, 2012

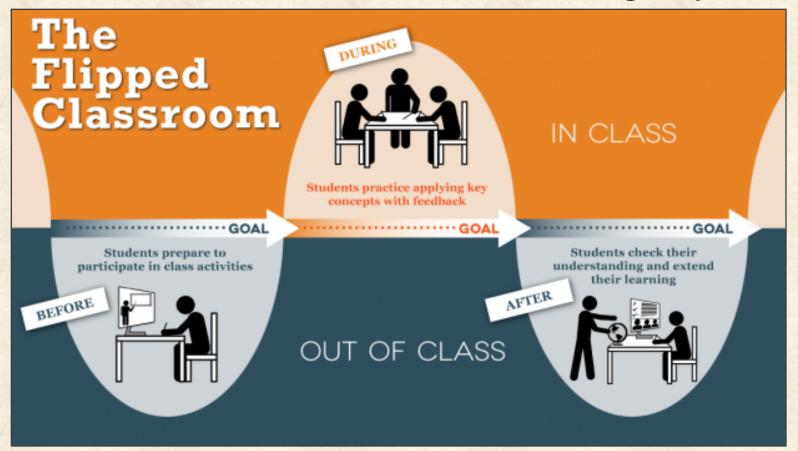
"If I had my wish, I would wave a wand and make MOOCs disappear."

#### Outline

- What Brings Me Here
- What Is Wrong With MOOCs?
- From MOOCs to MAITs
- Meet Our Students
- Sustaining a Million-Dollar MAIT
- Future Directions
- "My MAIT is a Better Teacher than I am!"

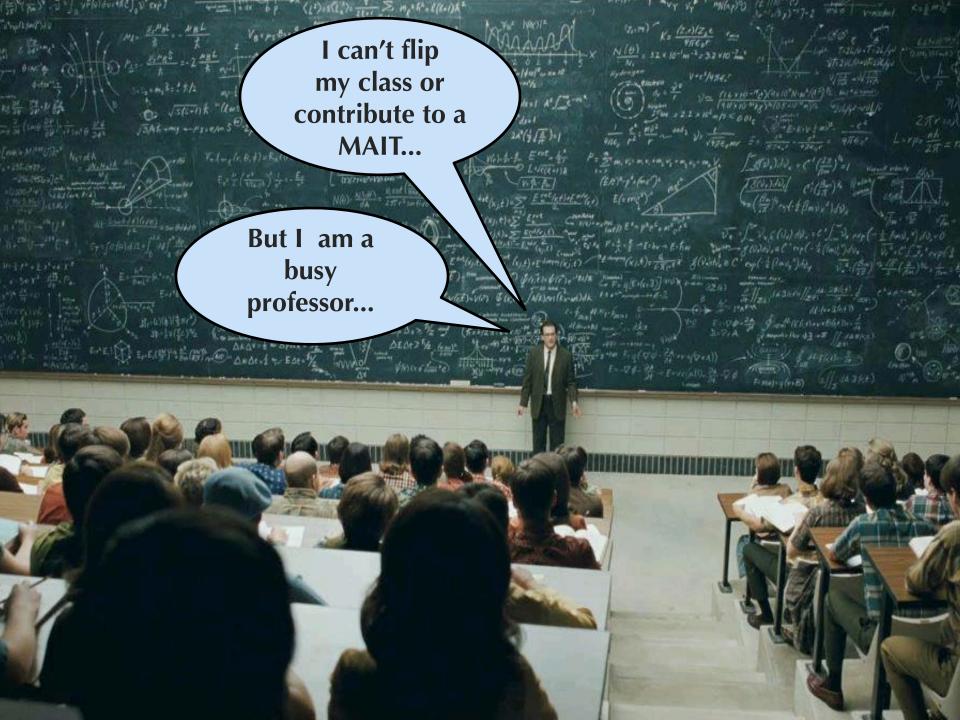
#### **Online Materials Inform Offline Courses**

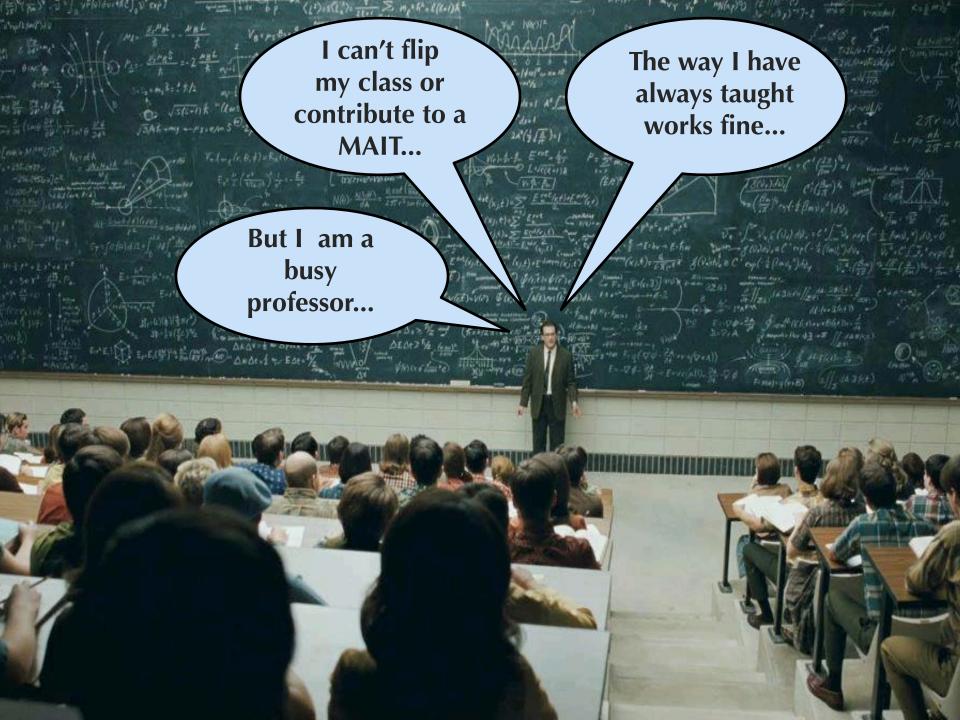
• At CMU, I teach a "flipped" class with 40 students divided into four discussion groups.

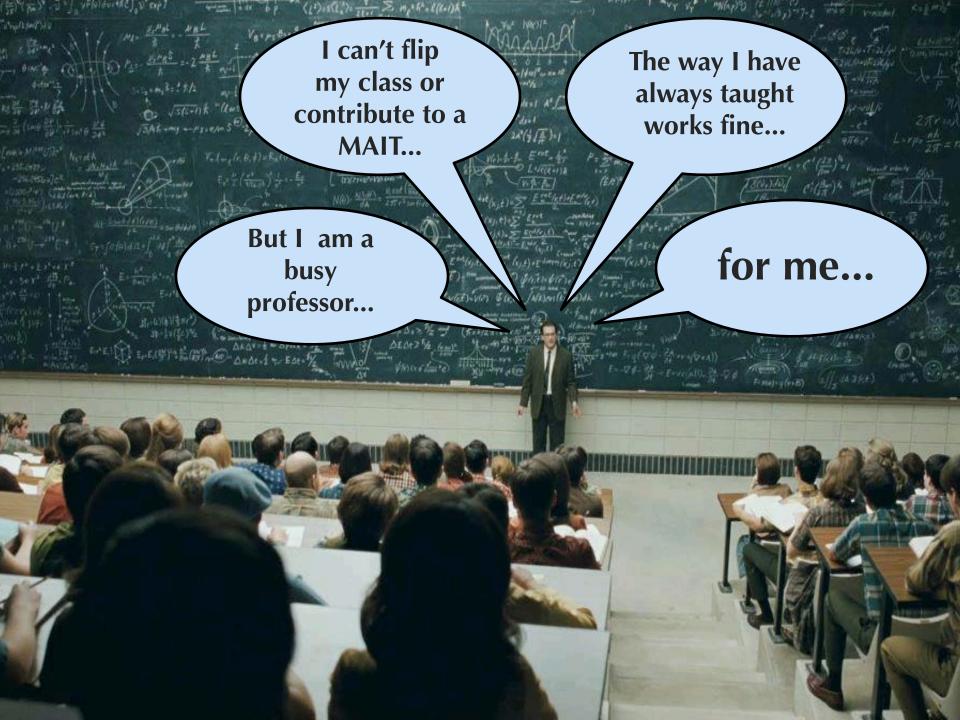


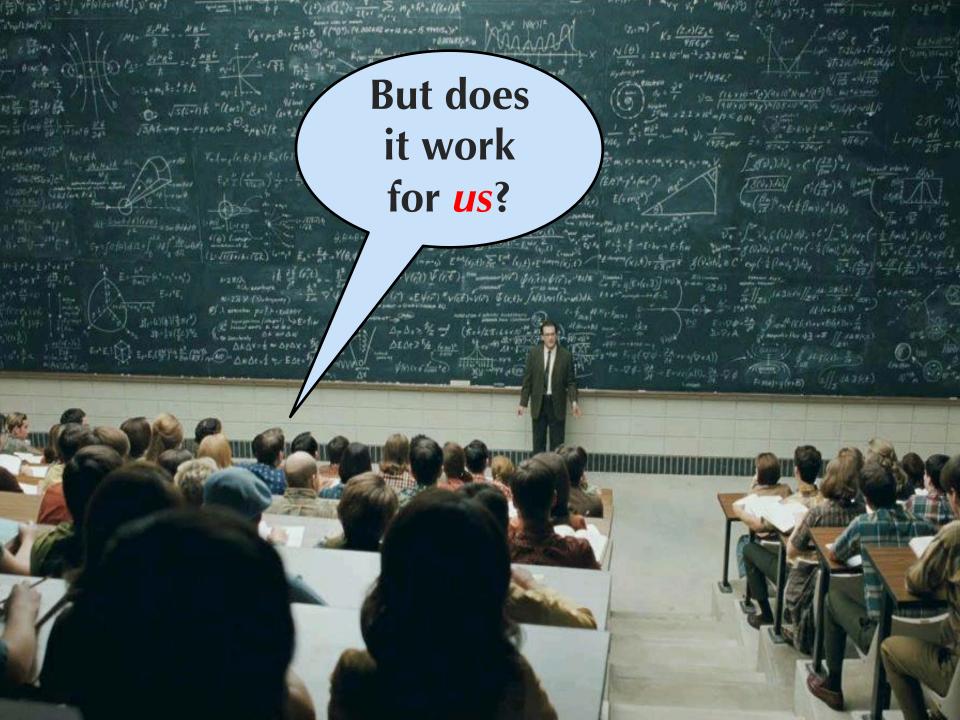












#### Acknowledgements



Nikolay Vyahhi Rosalind founder, Stepic CEO, co-instructor



Olga Botvinnik course/graphics development



**Yu Lin, Ph.D.** course development



Randy Christopher resident artist



Son Pham, Ph.D. invited lecturer, course developer



Max Shen course/software development



Robin Betz course development



Lars Bernstein course development



Kai Zhang chief assessment programmer



Vu Ngo course/software development



Mark Mammel teaching asst, content review



Glenn Tesler, Ph.D. content review



Alexei Balandin chief Rosalind programmer



**Jeffrey Yuan** course/software development



**Isabel Lupiani** teaching asst, content review



Sangtae Kim invited lecturer

#### Acknowledgements



