

Application for Coterminal Study

Applicant Name	Stanford ID
Aaron Reed	
Degree Program	Entry Term
Computer Science (MS)	Winter 2022-2023

This application preview is for your records only.
Do not send this document by mail as your application.

Coterm Biographical Data Notice

You may notice missing biographical details in this PDF — this is normal.

The following information will be imported from your Stanford student record *after* you submit your application:

- **Stanford ID number**
- **Birthdate**
- **Birthplace**
- **Citizenship & visa status**
- **Address**
- **Phone number**

To check what information is on your record and to make updates, see the [Personal Information Updates](#) page on the Student Services website. Make any necessary updates in Axess *before* you submit your application.

Allow 48 hours after application submission for the missing biographical details to be filled in on this PDF.

Personal Background

Name

Full Name	Chosen First Name	Pronouns
Aaron Zachary Reed	Aaron	He/him

Contact Information

Email Address	Primary Phone	Mobile Phone
aaron73@stanford.edu		
Mailing Address	Permanent Address	

Biographical Information

Birthdate	Birthplace	First Spoken Language
		English
Sex	Gender Identity	
Male	Man	
Primary Citizenship	Secondary Citizenship	<input type="checkbox"/> U.S. Permanent Resident
Race/Ethnicity	<input type="checkbox"/> Hispanic <input type="checkbox"/> American Indian/Alaska Native <input type="checkbox"/> Asian <input type="checkbox"/> Black/African American <input type="checkbox"/> Native Hawaiian/Pacific Islander <input checked="" type="checkbox"/> White	
Military Status		

Additional Languages	Reading Fluency	Writing Fluency	Speaking Fluency
French	Intermediate	Intermediate	Beginner
Latin	Intermediate	Intermediate	Not Applicable
Chinese	Beginner	Beginner	Beginner

Please indicate the highest level of education completed by any of your parent(s)/guardian(s) while you were growing up.

Bachelor's degree or equivalent

Additional Background

Were or currently are eligible for Federal Pell grants.

My mother has a B.S. in dental hygiene and my father has a B.S. in accounting, both from Louisiana State University.

Academic History

Primary Undergraduate Institution

1	Institution		Location	
	Stanford University		Stanford, CA	
	Level of Study	Dates Attended	Degree	Degree Date
	Undergraduate	09/2015 - 12/2023	Bachelor of Science	12/2023
	Major	GPA	GPA Scale	
	Engineering Physics	3.723	4.3	

Additional Post-Secondary Institutions

2	Institution		Location	
	Level of Study	Dates Attended	Degree	Degree Date
	Major	GPA	GPA Scale	

3	Institution		Location	
	Level of Study	Dates Attended	Degree	Degree Date
	Major	GPA	GPA Scale	

4	Institution		Location	
	Level of Study	Dates Attended	Degree	Degree Date
	Major	GPA	GPA Scale	

5	Institution		Location	
	Level of Study	Dates Attended	Degree	Degree Date
	Major	GPA	GPA Scale	

Academic History Questions *Explanations, if any, will be displayed on the following page.*

Have you ever been suspended, dismissed, or placed on enforced leave from any college, university, or post-secondary institution or been the subject of disciplinary action by such an institution?

☐ Yes ☒ No

Have you ever been placed on academic probation by any college or university?

☒ Yes ☐ No

Academic History

Academic History Questions

Have you ever been suspended, dismissed, or placed on enforced leave from any college, university, or post-secondary institution or been the subject of disciplinary action by such an institution?

Have you ever been placed on academic probation by any college or university?

I incurred an academic probation status following Autumn 2017 and a provisional registration status following Autumn 2019. In Autumn 2017 I was beginning to be affected by mental issues that turned into major depression. I took Spring 2018 off, began treatment, and came back in Autumn 2018. Later, in Autumn 2019, I completed 10 units, but was placed on provisional registration because I neglected to renew my Reduced Course Load accommodation through the OAE (I wasn't aware that it had to be renewed annually).

If applicable, please provide an explanation of any gaps on your transcript indicating time away from your post-secondary institution(s) or program(s).

I took leaves of absence in Spring 2018, Winter 2019, and Spring 2019 because I was still dealing with the effects of major depression and a cardiac disability. I also took a leave of absence in Winter 2020 in anticipation of heart surgery (see also "Diversity Statement"), which was ultimately postponed due to the onset of the COVID-19 pandemic.

You may use the space below if you would like to provide further contextual information about any aspect of your transcript, e.g., the impact of the COVID-19 pandemic or other personal experiences on your educational opportunities or achievements.

I have been on a reduced course load due to my heart condition (see also "Diversity Statement") since Winter 2017, and have consistently been taking less than 12 units per quarter since then. I also changed majors during my junior year. For both of these reasons, it has taken additional quarters to complete my undergraduate degree. Finally, I have been attending school completely remotely (from Louisiana) every quarter since Spring 2020 via a special OAE accommodation because I have a heightened risk of complications if I contract COVID-19.

Undergraduate Unofficial Transcript - Detailed

Leland Stanford Jr. University
Stanford, CA 94305
USA

Name : Reed,Aaron Zachary
Student ID : 05954880

Print Date: 09/26/2022

* Worksheet - For office use by authorized Stanford personnel *

Academic Advisor: Burchat,Patricia Rose

----- Academic Program -----

Program : Undergraduate Matriculated
08/28/2020 : Engineering (BS)
Engineering Physics (Subplan)
Active in Program

----- Advanced Placement Test Credit -----
Applied Toward Undergraduate Matriculated Program

Advanced Placement Latin: Vergil 10.00
Advanced Placement Mathematics: Calculus BC 10.00
Advanced Placement Physics C - Electricity & Magt 5.00
Advanced Placement Physics C - Mechanics 5.00
Total Quarter Units Posted: 30.00

Allowable Test Credit subject to restrictions.

----- Beginning of Academic Record -----

2015-2016 Autumn				
Course	Cmpt	Title	Attempted	Earned Grade
CHEM 31A	LEC	CHEMICAL PRINCIPLES I Jennifer Schwartz Poehlmann Robert Waymouth	5.00	5.00 A
CME 100	LEC	VECTOR CALCULUS FOR ENGINEERS Vadim Khayms	5.00	5.00 A-
PHYSICS 18N	ISF	FRONTIERS IN THEORETICAL PHYSICS AND COSMOLOGY Savas Dimopoulos	3.00	3.00 A

UG Term GPA	3.884	Term Totals	13.00	13.00
UG Cum GPA	3.884	Cum Totals	13.00	13.00

2015-2016 Winter				
Course	Cmpt	Title	Attempted	Earned Grade
CHEM 31B	LEC	CHEMICAL PRINCIPLES II Hemamala Karunadasa	5.00	5.00 A
CME 102	LEC	Jennifer Schwartz Poehlmann ORDINARY DIFFERENTIAL EQUATIONS FOR ENGINEERS	5.00	5.00 A-
EE 22N	ISF	Hung Le MEDICAL IMAGING SYSTEMS	3.00	3.00 A
MUSIC 184B	WKS	Dwight Nishimura TOPICS IN OPERA STAGECRAFT	2.00	2.00 A
PWR 1JJ	SEM	Marie-Louise Catsalis WRITING & RHETORIC 1: THE RHETORIC OF LANGUAGE AND THOUGHT	4.00	4.00 A-

Jennifer Johnson

UG Term GPA	3.857	Term Totals	19.00	19.00
UG Cum GPA	3.868	Cum Totals	32.00	32.00

2015-2016 Spring				
Course	Cmpt	Title	Attempted	Earned Grade
CHEM 33	LEC	STRUCTURE AND REACTIVITY Daniel Stack; Megan Brennan	5.00	5.00 A
CME 104	LEC	LINEAR ALGEBRA AND PARTIAL DIFFERENTIAL EQUATIONS FOR ENGINEERS	5.00	5.00 A
THINK 48	DIS	Vadim Khayms READING THE BODY: HOW MEDICINE AND CULTURE DEFINE THE SELF Nicole Martinez	4.00	4.00 A

UG Term GPA	4.000	Term Totals	14.00	14.00
UG Cum GPA	3.908	Cum Totals	46.00	46.00

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Leland Stanford Jr. University
Stanford, CA 94305
USA

Name : Reed,Aaron Zachary
Student ID : 05954880

Reed, Aaron; DOB: 01/01/0001; ID: 399326483

2016-2017 Autumn										2016-2017 Spring									
<u>Course</u>	<u>Cmpt</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>	<u>Course</u>	<u>Cmpt</u>	<u>WKS</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>	<u>Course</u>	<u>Cmpt</u>	<u>WKS</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>
BIO	41	GENETICS, BIOCHEMISTRY, AND MOLECULAR BIOLOGY	5.00	5.00	B	CME	193		INTRODUCTION TO SCIENTIFIC PYTHON	1.00	1.00	S							
CS	103	Dominique Bergmann; Mary Beth Mudgett Stephanie May; Waheeda Khalifan MATHEMATICAL FOUNDATIONS OF COMPUTING	5.00	5.00	A-	CS	107	LEC	Blake Jennings; Jacob Perricone COMPUTER ORGANIZATION AND SYSTEMS	5.00	5.00	B-							
CS	103A	Keith Schwarz MATHEMATICAL PROBLEM-SOLVING STRATEGIES	1.00	0.00	NC				Previous Grade(s): I										
CS	106A	Keith Schwarz PROGRAMMING METHODOLOGY	5.00	5.00	A	PHIL	1	LEC	INTRODUCTION TO PHILOSOPHY	5.00	5.00	A-							
PHYSICS	45	Mehran Sahami LIGHT AND HEAT	4.00	4.00	A-	PHYSICS	65	LEC	Quantum and Thermal Physics	4.00	0.00	W							
PHYSICS	46	Previous Grade(s): I Giorgio Gratta LIGHT AND HEAT LABORATORY	1.00	1.00	S	PHYSICS	67	LEC	Hari Manoharan INTRODUCTION TO LABORATORY PHYSICS	2.00	2.00	S							
UG Term GPA	3.594		Term Totals	21.00	20.00	UG Term GPA	3.200		Term Totals	17.00	13.00								05/17/2017
UG Cum GPA	3.816		Cum Totals	67.00	66.00	UG Cum GPA	3.763		Cum Totals	97.00	88.00								
2016-2017 Winter										2017-2018 Autumn									
<u>Course</u>	<u>Cmpt</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>	<u>Course</u>	<u>Cmpt</u>	<u>WKS</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>	<u>Course</u>	<u>Cmpt</u>	<u>WKS</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>
CS	106B	PROGRAMMING ABSTRACTIONS	5.00	5.00	A	BIOE	101	LEC	SYSTEMS BIOLOGY	3.00	0.00	RP							
EE	101A	Keith Schwarz CIRCUITS I	4.00	0.00	RP	CS	109	LEC	Previous Grade(s): I,D Markus Covert	5.00	5.00	A-							
PWR	2JU	Thomas Lee WRITING & RHETORIC 2: THE RHETORIC OF LANGUAGE, IDENTITY AND POWER	4.00	4.00	A	CS	279	LEC	INTRODUCTION TO PROBABILITY FOR COMPUTER SCIENTISTS	3.00	3.00	B+							
UG Term GPA	4.000		Term Totals	13.00	9.00				Chris Piech COMPUTATIONAL BIOLOGY: STRUCTURE AND ORGANIZATION OF BIOMOLECULES AND CELLS										
UG Cum GPA	3.839		Cum Totals	80.00	75.00	UG Term GPA	3.550		Ron Dror	3.550	11.00	8.00							
						UG Cum GPA	3.744		Term Totals	108.00	96.00								
2017-2018 Winter										2017-2018 Winter									
<u>Course</u>	<u>Cmpt</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>	<u>Course</u>	<u>Cmpt</u>	<u>WKS</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>	<u>Course</u>	<u>Cmpt</u>	<u>WKS</u>	<u>Title</u>	<u>Attempted</u>	<u>Earned</u>	<u>Grade</u>
						EE	102A	LEC	SIGNAL PROCESSING AND LINEAR SYSTEMS I	4.00	4.00	A							
						PHYSICS	112	LEC	Previous Grade(s): GNR Joseph Kahn	4.00	4.00	A							
									MATHEMATICAL METHODS FOR PHYSICS										
									Srinivas Raghu										

Undergraduate Unofficial Transcript - Detailed

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Stanford, CA 94305
USA

Name : Reed,Aaron Zachary
Student ID : 05954880

UG Term GPA	4.000	Term Totals	8.00	8.00								
UG Cum GPA	3.765	Cum Totals	116.00	104.00								
2018-2019 Autumn					2019-2020 Spring							
Good Standing Exemption Medical					Provisional Registration 1st Quarter Complete							
Course	Cmpt	Title	Attempted	Earned	Grade	Course	Cmpt	Title	Attempted	Earned	Grade	
ME 104B	SEM	DESIGNING YOUR LIFE Gabrielle Santa-Donato	2.00	2.00	S	CS	229	MACHINE LEARNING Chris Re; Moses Charikar; Tengyu Ma	4.00	4.00	S	
MUSIC 23	LEC	John Armstrong ELEMENTS OF MUSIC III	3.00	3.00	A+	PHIL	2	INTRODUCTION TO MORAL PHILOSOPHY	5.00	5.00	S	
PHYSICS 70	LEC	Talya Berger FOUNDATIONS OF MODERN PHYSICS	4.00	4.00	A	PHYSICS	113	COMPUTATIONAL PHYSICS Barry Maguire	4.00	4.00	S	
PHYSICS 111	LEC	Shamit Kachru PARTIAL DIFFERENTIAL EQUATIONS OF MATHEMATICAL PHYSICS	4.00	0.00	W	UG Term GPA	0.000	Term Totals	13.00	13.00		
		Srinivas Raghu				UG Cum GPA	3.752	Cum Totals	161.00	136.00		
UG Term GPA	4.128	Term Totals	13.00	9.00		Course	Cmpt	Title	Attempted	Earned	Grade	
UG Cum GPA	3.788	Cum Totals	129.00	113.00		ENGR	145	TECHNOLOGY ENTREPRENEURSHIP	4.00	4.00	A+	
2019-2020 Autumn					2020-2021 Autumn							
R0 Provisional Registration Begins Next Quarter					Provisional Registration 2nd Quarter Complete							
CS 229	LEC	MACHINE LEARNING	4.00	0.00	W	11/05/2019	Course	Cmpt	Title	Attempted	Earned	Grade
MUSIC 113	SEM	Andrew Ng; Chris Re; Moses Charikar INTRODUCTION TO INSTRUMENTAL COMPOSITION	2.00	2.00	A		BIOE	101	SYSTEMS BIOLOGY Markus Covert	3.00	3.00	A
MUSIC 123A	SEM	Francois Rose UNDERGRADUATE SEMINAR IN COMPOSITION: RHYTHMIC DESIGN	1.00	0.00	W	10/29/2019	CS	110	PRINCIPLES OF COMPUTER SYSTEMS	5.00	5.00	A+
PHYSICS 105	LEC	Francois Rose INTERMEDIATE PHYSICS LABORATORY I: ANALOG ELECTRONICS	4.00	4.00	A-		CS	110A	PROBLEM SOLVING LAB FOR CS110	1.00	1.00	S
PHYSICS 110	LEC	Rick Pam ADVANCED MECHANICS	4.00	0.00	GNR		CS	230	DEEP LEARNING Andrew Ng; Kian Katariforoosh	4.00	4.00	A-
PHYSICS 111	LEC	Patrick Hayden PARTIAL DIFFERENTIAL EQUATIONS OF MATHEMATICAL PHYSICS	4.00	4.00	B-		EE	134	INTRODUCTION TO PHOTONICS Dan Congreve	4.00	4.00	A
UG Term GPA	3.360	Term Totals	19.00	10.00			UG Term GPA	4.018	Term Totals	17.00	17.00	
UG Cum GPA	3.752	Cum Totals	148.00	123.00			UG Cum GPA	3.799	Cum Totals	182.00	157.00	

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Stanford, CA 94305
USA

2020-2021 Winter									
Provisional Registration 3rd Quarter Complete									
Course	161	120	130			UG Term GPA	UG Cum GPA	3.433	3.784
Course	CS	PHYSICS	PHYSICS	UG Term GPA	UG Cum GPA	UG Term GPA	UG Cum GPA	3.433	3.784
Compt	LEC	LEC	LEC	3.792	3.798	APPPHYS	228	228	228
Title	DESIGN AND ANALYSIS OF ALGORITHMS	Moses Charikar, Nima Ahmadipouranari	INTERMEDIATE ELECTRICITY AND MAGNETISM I	13.00	13.00	CS	210A	210A	210A
Grade	A-	A	A-	5.00	5.00	PHYSICS	171	171	171
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	3.00	3.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Earned	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00
Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
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Grade	A-	A	A-	4.00	4.00	PHYSICS	171	4.00	4.00
Attempted	5.00	4.00	4.00	4.00	4.00	PHYSICS	171	4.00	4.00

Undergraduate Unofficial Transcript - Detailed

Leland Stanford Jr. University
Stanford, CA 94305
USA

Name : Reed,Aaron Zachary
Student ID : 05954880

UG Activity Units 8 0.00 0.00
UG Pass/Fail Units (Satisfactory & Credit) 36 7.00 6.00

* Transfer Students are allowed a Maximum of 27 Pass/Fail Units

Pass/Fail units do not include terms that are offered Satisfactory/No Credit

* Worksheet - For office use by authorized Stanford personnel *

END OF TRANSCRIPT

Research Experience

1	Organization Name	Location	Dates of Experience
	Stanford University	Stanford, CA	06/2019 - 08/2019
	Position/Title	Principal Investigator	Hours/Week
	Electrical Engineering Summer REU Scholar	Gordon Wetzstein	20
	Description		
	Designed, modeled, 3D-printed, and tested a medical device to to treat strabismus using Risley prisms; presented at a poster session. Skills learned: CAD modeling in Solidworks, electronics, rapid prototyping, technical presentation.		

2	Organization Name	Location	Dates of Experience
	Stanford University	Stanford, CA	06/2018 - 08/2018
	Position/Title	Principal Investigator	Hours/Week
	Bio-X Undergraduate Fellow	Euan Ashley	20
	Description		
	Assisted in literature review and implementation of multiomics pipelines and data analysis. Skills learned: reading technical papers, R programming language.		
	I was dealing with major depression during this research experience, and as a result I was not able to work to my full capacity during my time in Dr. Ashley's lab. I appreciated Dr. Ashley and my research mentor David for being so supportive and understanding.		

3	Organization Name	Location	Dates of Experience
	Position/Title	Principal Investigator	Hours/Week
	Description		

Publications / Presentations / Posters

1

Type

Poster

Title

Foveators: Strabismus correction with Risley prisms

Date

08/2019

Authors

(see attached poster)

☐ Peer-reviewed

☐ First-author

Journal/Conference/Event Title

Electrical Engineering REU Poster Day 2019

Status

PMID

2

Type

Poster

Title

Utilizing differential network methods for analysis of multiomics data

Date

08/2018

Authors

(see attached poster)

☐ Peer-reviewed

☐ First-author

Journal/Conference/Event Title

Stanford Bio-X Undergraduate Poster Day 2018

Status

PMID

3

Type

Title

Date

Authors

☐ Peer-reviewed

☐ First-author

Journal/Conference/Event Title

Status

PMID

4

Type

Title

Date

Authors

☐ Peer-reviewed

☐ First-author

Journal/Conference/Event Title

Status

PMID

5

Type

Title

Date

Authors

☐ Peer-reviewed

☐ First-author

Journal/Conference/Event Title

Status

PMID

Work Experience

1	Organization Name	Location	Dates of Experience
	Lab64, Electrical Engr. Dept., Stanford University	Stanford, CA	01/2018 - 03/2018
	Position/Title	Industry	Hours/Week
	Maker-in-Residence	Healthcare	10
Description			
Researched, designed, pitched, obtained materials for, and began building "autofocals" (auto-focusing reading glasses) using Alvarez lenses. Skills learned: soldering, 3D printing, Raspberry Pi, OpenCV, Pupil Labs platform (open source eye tracking software).			
Reason for Leaving			
The length of the program was one quarter.			

2	Organization Name	Location	Dates of Experience
	St. Tammany Parish Public Schools	Mandeville, LA	08/2014 - 09/2015
	Position/Title	Industry	Hours/Week
	Substitute teacher	Education	10
Description			
Worked as a substitute teacher in elementary, middle, and high schools (including my alma mater) during gap year before starting college. Skills learned: classroom leadership, organizing and implementing lesson plans.			
Reason for Leaving			
Starting college at Stanford. (I took a gap year after high school.)			

3	Organization Name	Location	Dates of Experience
	Self-employed/freelance	Mandeville, LA	08/2014 - 09/2015
	Position/Title	Industry	Hours/Week
	Private Tutor	Education	10
Description			
Started private tutoring business and tutored junior high, high school, and college students in mathematics, science, English, and ACT prep. Skills learned: teaching, communication, motivating others, adaptability to diverse learning styles.			
Reason for Leaving			
Starting college at Stanford. (I took a gap year after high school.)			

AARON Z REED

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EDUCATION:

9/2015 - present **Stanford University**, Stanford, CA

- Pursuing B.S. in Engineering Physics; planned M.S. in Computer Science
- Coursework in physics, CS, machine learning, electrical engineering, chemistry, biology
- Academic interests: Physics simulation, biomedical engineering, adaptive optics, AI

8/2010 - 5/2014 **Mandeville High School**, Mandeville LA

- AP coursework in Physics C (Mech and E&M), Calculus, Biology, Macroeconomics, U.S. History, English Literature, Latin, and Computer Science. Scored 5 on all 9 AP tests taken
- Valedictorian ACT: 36 SAT: 2360

8/2012 - 1/2014 **New Orleans Center for Creative Arts**, New Orleans, LA

- Louisiana's high school arts conservatory, attended for jazz piano half days during grades 11 and 12; admitted by audition
-

HONORS AND AWARDS:

- 2014 Presidential Scholar Nominee and Semi-Finalist
 - National Merit Scholarship Winner
 - National AP Scholar Award
-

EXPERIENCE AND LEADERSHIP:

1/2022 – present **GPU Leasing for Artificial Intelligence**

- Using [vast.ai](#) to lease GPUs to AI researchers. Created custom Docker image to idle-mine cryptocurrency and shell scripts for monitoring and conditional overclocking.
- Skills learned: Docker, shell scripting, Nvidia CLI, Ubuntu Server installation and administration

1/2022 – 6/2022 **CS 210: Software Project with Industry Partners**, Stanford University

- In a 4-student team: consulted with Chia blockchain representatives, created a marketplace for NFTs based on Chia tokens, pitched our solution to VC investors (a16z) and Bram Cohen
- Implemented a Chia node and frontend web server on AWS instance; managed system administration and networking tasks
- Skills learned: need-finding, opportunity analysis, business presentation; cryptocurrency technology, NFT design, Chialisp, AWS, Flask, Unix sysadmin skills, IPFS

6/2020 – 8/2020 **ENGR 145: Technology Entrepreneurship**, Stanford University

- In a 4-person team: identified a market need for accessible psychotherapy, interviewed patients, brainstormed/evaluated solutions, and finally pitched an NLP-based therapy app to VC investors
- Built a simple chatbot with voice recognition using OpenAI GPT-3 and Google Cloud
- Skills learned: need-finding, opportunity analysis, business presentation, working with diverse backgrounds and skill sets, Python APIs

6/2019 – 8/2019 **Electrical Engineering REU, Wetzstein Lab**, Stanford University

- Designed, modeled, 3D-printed, and tested a medical device to treat strabismus using Risley prisms; presented at a poster session
- Skills learned: CAD modeling (Solidworks), electronics, rapid prototyping, technical presentation

- 9/2018 – 9/2019 **Stanford Students in Biodesign, Project Team**, Stanford University
- Designed an NLP pipeline for patient-friendly interpretation of free-text radiology reports
 - Skills learned: project management, networking, collaboration in a small (4-person) group
- 6/2018 – 8/2018 **Bio-X Undergraduate Fellow, Ashley Lab**, Stanford University
- Assisted in literature review and implementation of multi-omics pipelines and data analysis
 - Skills learned: reading technical papers, R programming language
- 1/2018 – 3/2018 **Maker-in-Residence, Lab64**, Stanford University
- Researched, designed, pitched, obtained materials for, and began construction of autofocals (auto-focusing reading glasses) using Alvarez lens-based design
 - Skills learned: soldering, 3D printing, Raspberry Pi, OpenCV, Pupil Labs (open source eye tracking software)
- 2/2017 – 4/2017 **“FroSoCo 500” Derby**, Freshman-Sophomore College, Stanford University
- Worked on a team of 3 students who built an electronic vehicle and participated in a race against other Stanford teams
 - Skills learned: RC vehicle basics, technical collaboration
- 9/2016 – 6/2017 **Sophomore Fellow**, Freshman-Sophomore College, Stanford University
- Organized and coordinated dorm events for freshman and sophomore students on my floor
 - Skills learned: social leadership, event planning
- 8/2014 – 9/2015 **St. Tammany Parish Public School Substitute Teacher**, Mandeville, LA
- Worked as a substitute teacher in elementary, middle, and high schools during gap-year before starting college
 - Skills learned: classroom leadership, organizing and implementing lesson plans
- 8/2014 – 9/2015 **Entrepreneur: Private Tutoring Services**, Mandeville, LA
- Started private tutoring business and tutored Maths, Sciences, English, and ACT prep to junior high, high school, and college students
 - Skills learned: teaching, communication, motivating others, adaptability to diverse learning styles
- 2010 – present **Freelance Musician/Composer**
- Pianist and percussionist in diverse ensembles: church (incl. Catholic Mass at Stanford Memorial Church), stage band, jazz combo, theater pit orchestra, marching and concert band, orchestra
 - Most recent project (2019 – present): composed and orchestrated an original musical theater album. Worked with a globally-distributed team of actors, musicians, and production crew.

SKILLS AND INTERESTS:

- Computer/Technical:** Windows/Mac/Linux OS, Python (incl. NumPy, SciPy, PANDAS, Matplotlib), C/C++, UNIX shell scripting, Java, MATLAB
- Languages:** English (native), French (3 yrs), Latin (4 yrs), some Mandarin (one summer)
- Interests:** Music (classical and jazz piano, and percussion); science exploration and research; languages and linguistics

Recommenders

1

Name

Jay Borenstein

Organization

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Position/Title

Lecturer

Relationship

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Waiver Response*



I waive my right to access this report.



I do not waive my right to access this report.

2

Name

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Waiver Response*



I waive my right to access this report.



I do not waive my right to access this report.

3

Name

Mehran Sahami

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Relationship

Professor

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Waiver Response*



I waive my right to access this report.



I do not waive my right to access this report.

4

Name

Keith Schwarz

Organization

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Position/Title

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Relationship

Instructor, CS106B and CS103

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Phone

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Waiver Response*



I waive my right to access this report.



I do not waive my right to access this report.

** The information you provide in your application is — after you engage in enrolled attendance as a Stanford student and to the extent it is retained — covered by the Family Educational Rights and Privacy Act of 1974 (FERPA). FERPA also permits students to waive the right of access to letters of reference if you so choose. Waiving your right of access is optional; your decision to waive or decline to waive that right will have no bearing on the handling of your application. Your recommender will be notified of your choice.*

I am interested in Stanford's CS coterm program because the curriculum furthers the academic interests I developed as an undergraduate. As I was completing my degree in Engineering Physics, I found myself most interested in the computational aspects of physics, such as simulation, quantum computing, and physical modeling in an engineering context. I have extensive coursework in both quantum computing (my EPhys track was Quantum Science and Engineering) and classical computing (the entire CS major core, plus some AI classes). I began an optics project in Wetzstein Lab that evolved into an independent project involving physical modeling of liquid crystals for optics applications -- if possible, I'd like to continue pursuing this project in the context of a Master's thesis. In both my coursework and my research, I realized that fluency in computational methods is essential to progress in a natural science like physics.

To me, the most compelling fields of CS are AI and Systems -- AI because it has yielded great leaps in previously intractable problems in science, such as protein folding and data mining; and Systems because it deals with the architecture and networks that underlie all other software. For this reason, I will be taking both Systems and AI classes in my Master's program.

Diversity Statement

Since the age of 14, I've had an invisible disability. I've been physically limited due to heart problems: an enlarged aortic root and a severely leaking aortic valve. A corrective heart surgery is in my near future, made more complicated (and dangerous) because my cardiac anatomy is already abnormal: I was born with a congenital heart defect (Transposition of the Great Arteries) and underwent surgery at 5 days old.

While having a disability has presented me with academic and personal challenges (see "Academic History"), it has also given me a unique perspective and opportunities that I never would have had otherwise. For a long time, I struggled with how to make sense of my medical condition and contextualize it in my own life -- to "make it mean something." That opportunity came when a friend at Stanford confided in me that she too had an invisible disability: accommodative spasm, an eye condition that made basic tasks like reading a whiteboard and taking notes (switching between near and far vision) a struggle, and also kept her in constant pain. She said she usually didn't talk about it because "no one can do anything about it." Knowing what it is to cope with a rare, all-pervasive medical problem without an easy solution, I could not sit idle. Empathy compelled me to try to "do something" anyway.

I investigated the state-of-the-art in eye tracking, adaptive optics, and wearable technology, and came up with a design for a medical device: a pair of glasses that do the work of the eye's lens, automatically changing focal power. I found out about a "Maker-In-Residence" opportunity at Lab64 in the Packard building, pitched my idea, and was funded to work on it for a quarter (Winter 2018). While I was working in Lab64, someone told me about a grad student who had been working on a similar optics project. I contacted that grad student and his PI, Gordon Wetzstein, which led me to do research in Gordon's lab in Summer 2019.

My experience in an engineering lab convinced me that no "off-the-shelf" adaptive optics systems had all the characteristics my application required. I went back to the drawing board and discovered liquid crystals (LCs), a state of matter with unique optical properties and promising engineering applications. Wanting to understand LCs is part of why I changed majors to Engineering Physics. In my physics coursework, I became interested in computational physics simulation, especially simulating the optical properties of LCs to make it easier to design with them. I had to shelve my project due to the pandemic, but I've been looking for an opportunity to pick it up again — a CS Master's thesis could be just such an opportunity.

When I came to Stanford, I never could have predicted how my disability would shape my time here. Sometimes I think my Stanford journey has taken every possible detour, but when I reflect on where it has brought me, I wouldn't change a thing about it.

Copy Program Supplemental

Reed, Aaron; DOB: 01/01/0001; ID: 399326483

Form Title	Program Supplemental
Academic Interest 1	Systems
Academic Interest 2	Artificial Intelligence
Academic Interest 3	Computer and Network Security
Please list your home page URL (if any).	https://github.com/aaronzr



Foveators: Strabismus correction with Risleys prisms

Aaron Reed¹, Robert Konrad¹, Gordon Wetzstein¹, Anthony Norcia²

¹Stanford Computational Imaging Lab, ²Stanford Vision and Neuro-Development Lab



Motivation

- Strabismus (misaligned eyes) affects 5% of people¹. It can be present in infancy or acquired later. It causes vision loss and destroys stereoacuity (depth perception).
- Current treatment options are¹:
 1. Surgery: risky and usually not 100% effective
 2. Corrective lenses: fixed, work well only near center of vision
 3. Vision therapy: effective, but difficult, time-consuming, and expensive
- Goal: improve treatment with optical and computational techniques: Risleys prisms (Fig. 1) and eye tracking (Fig. 3)

Methods

1. Create computer-controlled, mechanically actuated Risleys prisms
 2. Use existing eye-tracking system² to find gaze positions, control prisms
 3. Use Maxwell's spot (see below) and eye tracker to localize fovea (Fig. 2)
 4. Run user trials in strabismus patients to test for improved vision and stereoacuity
- Maxwell's spot is a dark splotch that appears in the visual field at the position of the fovea when a particular light stimulus is presented to the subject³. The subject can move a cursor to the perceived position of the spot to record its coordinates.

Figures

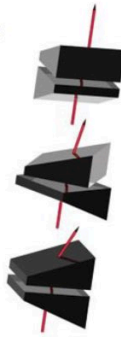


Figure 1 (above). Risleys prisms are two wedge prisms coupled back-to-back. They can deflect light in any direction by angles up to -20° . Source: [4]

Figure 2 (right). (a) The fovea has the highest density of photoreceptors of any place on the retina, and provides the sharpest detail to the center of the visual field. (b) The foveal pit in cross-section. Source: NIH



Figure 3. The eye-tracker used to calibrate Risleys prisms and localize Maxwell's spot. Source: own work, [2]

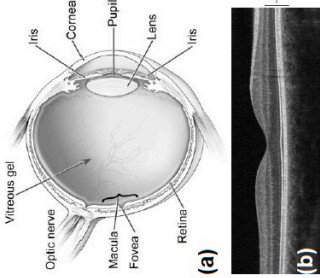


Figure 4. A SolidWorks model of the Risleys prism assembly with servos attached. Source: own work

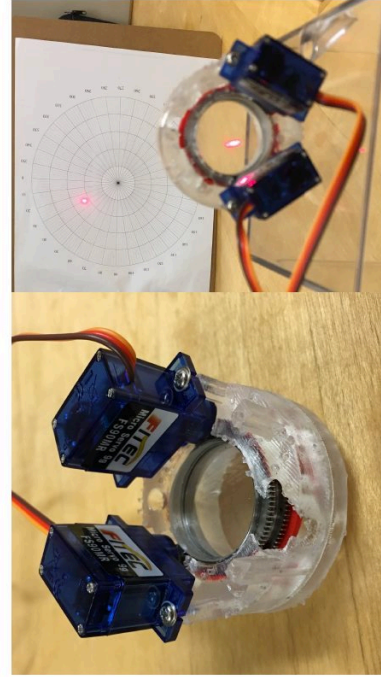


Figure 5. The printed Risleys prism assembly. The outer casing (clear plastic) was printed using clear resin on a Formlabs Form 1+ printer. The lens holder (inner red ring) was printed using red PLA filament on an Ultimaker 3 printer. Source: own work

Figure 6. Steering a red laser beam using the device. The image of the laser is deflected from the center of the polar coordinate system although the beam passes through the center of the Risleys prisms. Source: own work

Results

Commercially available Risleys prisms (Thorlabs) were disassembled and paired with two continuous-rotation servo motors (Feetech). A housing for the prisms and servos was designed (Fig. 4) in SolidWorks (Dassault Systèmes) and printed (Fig. 5) using FDM and SLA 3D printers (Ultimaker; Formlabs). The servos were controlled through the GPIO interface of a Raspberry Pi 4 (Raspberry Pi Foundation) and laser beam steering was demonstrated (Fig. 6).

Future work

- Implement eye-tracking hardware and software on the Pi to automate servos
- Migrate low-level servo control to Arduino to improve accuracy
- Preliminary user studies to refine gaze tracking and detection of Maxwell's spot
- Switch to low-profile stepper motors to remove obstruction of peripheral vision by servos
- Miniaturize prism assembly and integrate into a wearable platform for strabismus trials
- Long-term clinical trials in strabismus patients to compare with current treatment options

References

1. Lang, J. (1984). *Strabismus*. Thorofare, NJ: Slack.
2. Kassner, M., Patena, W., & Bulling, A. (2014). Pupil: An Open Source Platform for Pervasive Eye Tracking and Mobile Gaze-based Interaction. *Proceedings of the 2014 ACM International Joint Conference on Pervasive and Ubiquitous Computing*. Adjunct Publication, 1151–1160.
3. Flom, M. C., & Weymouth, F. W. (1961). Centricity of Maxwell's Spot in Strabismus and Amblyopia. *Archives of Ophthalmology*, 66(2), 260–268.
4. Schwarze, C. (2006, June). A New Look at Risleys Prisms. *Photonics Spectra*, 38(6). Retrieved from https://www.photonics.com/Articles/A_New_Look_at_Risley_Prisms/a25652

Acknowledgement

The authors wish to thank the Stanford Electrical Engineering Summer Research Experience for Undergraduates and Stanford Computational Imaging Lab for their generous support of this work.



Utilizing differential network methods for analysis of multiomics data

Aaron Reed¹, David Amar², Euan Ashley²

Departments of Computer Science¹ and Cardiovascular Medicine², Stanford University



Introduction

Multimomics is the analysis and interpretation of data across different types of “omics,” including genomics, proteomics, transcriptomics, metabolomics, and microbiomics. Data can vary across samples, subjects, and time points. Analysis of this data is complicated by its heterogeneity: data points vary across omics types, subjects, and time. Various methods have been implemented to address different challenges of interpreting this data.

Many approaches use the paradigm of biological networks to organize data. In this representation, analytes (e.g., genes, proteins, clinical markers) are represented as nodes in a network and the relationships among them (e.g., coexpression, protein-protein interactions) are represented as edges. In **differential network analysis**, two networks are compared and the differences between them are highlighted. For example, subtracting the coexpression network of a set of genes in healthy patients from one in diseased patients would yield a representation of how gene interactions change with the onset of disease. Our project focuses on comparing differential analysis algorithms in the analysis of multimomics data.

Methods

We analyzed data from the **iPOP (Integrative Personalized Omics Profiling; Chen et al. 2012)** study performed in the Snyder Lab at Stanford. The study tracked 108 individuals, many of whom were pre-diabetic, in order to measure how various omics measurements change with the onset of disease. We isolated the RNA data from the study and ran differential analyses using two published methods:

1. ModMap (Amar and Shamir 2014)

Given two networks representing different types of gene interactions, the ModMap algorithm finds strongly connected modules in the first network and inter-module connections in the second. For example, the first set of gene interactions could represent the frequency of gene co-expression, and the second could represent interactions between the proteins encoded by the genes.

Mathematically, the algorithm takes as input two graphs G and H with the same vertices but different edge weights: $G = (V, E_G, W_G)$, $F = (V, E_H, W_H)$. It outputs a graph $F = (M, L)$, where M contains disjoint subsets of V that are highly connected in G (“modules”), and L is a set of links between modules based on their connectivity in H .

2. DINGO (Ha et al. 2015)

DINGO creates differential gene expression networks by performing a procedure akin to subtracting one

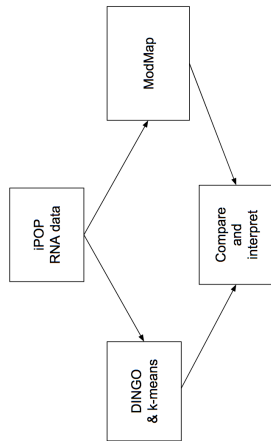


Figure 1: Analysis pipeline

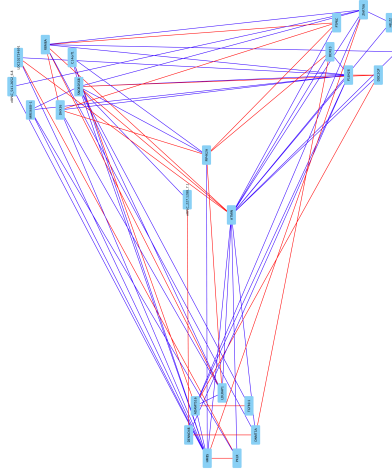


Figure 2: Clusters with differential edge scores found by DINGO

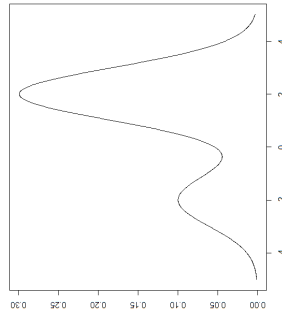


Figure 3: Mixture of Gaussians produced by ModMap

network from another. For example, it is possible to isolate the differences in gene expression between long-term and short-term survivors of glioblastoma by comparing the networks in each case.

DINGO takes genomic data such as mRNA, methylation, DNA copy number, and microRNA from each group in the form of a matrix Y (n patients \times p genes) and X ($n \times 2$), indicating to which of two groups each patient belongs). It then estimates a GGM (Gaussian graphical model) with two components: G , representing the “global” component of the network (the part that is conserved between both groups) and $L(x)$, the “local” component representing the differences between the group networks.

Results

We ran DINGO on a randomly sampled, 50-gene subset of the iPOP RNA data from healthy and diseased patients. This produced 1225 edges between gene pairs, representing the differences in the correlation networks in the healthy and infected groups. We selected for significant p values, leaving 44 edges. Finally, we used k -means clustering to group these genes into three clusters, representing genes that were highly correlated in the original networks. As a result, their expression levels change as a unit, preserving the genes’ correlation with each other between healthy and diseased groups. Thus, a preponderance of the edges are found between the clusters rather than within them. These results are displayed in **Figure 2**.

We also ran the ModMap algorithm on all ~7000 genes from the iPOP dataset. Community identification yielded several modules (analogous to clusters), one of which contained genes with low correlations. This cluster was removed from the rest and analyzed separately as “non-mated” genes, i.e., those that do not have strong correlations with another gene. Plotting the correlations yielded a mixture of Gaussians, schematized in **Figure 3**, with a clear delineation between the mated and non-mated groups.

However, the non-mated genes had an average correlation > 0 , indicating either a technical error in processing or the need to change the input parameters to the algorithm to produce more statistically sound results.

Future directions for this research involve repeating DINGO on a 500-gene set to find more robust differential networks and diagnosing the statistical inconsistencies in the ModMap results.

References

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Date: 10/01/2022