1	UNITED STATES DISTRICT COURT
2	DISTRICT OF MASSACHUSETTS
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4	STUDENTS FOR FAIR ADMISSIONS, INC.,
5	Plaintiff, Civil Action No. 14-14176-ADB
6	v. October 30, 2018
7	PRESIDENT AND FELLOWS OF HARVARD COLLEGE, et al., Pages 1 to 185
8	Defendants.
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12	TRANSCRIPT OF BENCH TRIAL - DAY 12
13	BEFORE THE HONORABLE ALLISON D. BURROUGHS UNITED STATES DISTRICT COURT
14	JOHN J. MOAKLEY U.S. COURTHOUSE ONE COURTHOUSE WAY
15	BOSTON, MA 02210
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PROCEEDINGS

(The following proceedings were held in open court before the Honorable Allison D. Burroughs, United States District Judge, United States District Court, District of Massachusetts, at the John J. Moakley United States Courthouse, One Courthouse Way, Boston, Massachusetts, on October 30, 2018.)

THE COURT: Can I see counsel at sidebar, please.

[Sidebar sealed and redacted.]

THE COURT: Okay. When you're ready.

MR. WAXMAN: Your Honor, Harvard calls President

12 Ruth Simmons.

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(RUTH SIMMONS, duly sworn by Deputy Clerk.)

COURTROOM CLERK: Will you please state your name and spell your last name for the record.

16 THE WITNESS: My name is Ruth Simmons,

 $17 \mid S-I-M-M-O-N-S$ .

18 | EXAMINATION BY MR. WAXMAN:

- 19 Q. Good morning, President Simmons.
- 20 A. Good morning.
- 21 Q. What is your current position and title?
- A. I'm currently president of Prairie View A&M University in Texas.
- Q. Have you been asked by Harvard to testify as an expert in

25 this matter?

A. I have.

- Q. Are you being compensated for your time and expertise in
- 3 this case?
- $A \mid A$ . I am not.
- **Q.** Did Harvard offer to compensate you?
- 6 A. Yes, they did.
- Q. Before we discuss the questions that you were asked to address, could you please tell us something about your family background and where you grew up?
- 10 A. I was born the last of 12 children in Grapeland, Texas.
- I was born in a sharecropper's shack on a plantation. I
- 12 lived there with my family until I was seven years old, after
- which my family moved to Houston.
- We lived in Houston in the notorious Fifth Ward,
- sometimes called "Bloody Fifth Ward," a segregated community
- in the shadow of downtown Houston. I went to elementary
- school, middle school, and high school in the Fifth Ward in a
- 18 completely segregated environment.
- 19 Q. Did you attend college?
- 20 **A.** I did.
- 21 **Q.** Where?
- 22 A. I went to Dillard University in New Orleans.
- 23 Q. And did you spend all four years at Dillard?
- 24 A. No. I went to Wellesley college my junior year, with a
- junior year exchange program between Dillard and Wellesley.

Q. Let me ask you a few questions about Dillard and then Wellesley.

Tell us about your educational experience at Dillard.

A. Well, in the early '60s, mid-'60s, higher education was still relatively segregated in the South. Dillard was an African-American institution, formed just after slavery and supported by the Methodist church. So all the students were African-American.

However, many faculty, white faculty from the North, interested in doing something to address the inequities in education, either retired from their positions in the universities in the North or decided to come South to work in historically black universities.

And so for the first time in my life, I was exposed to different races, mostly because of the white faculty who had come to Dillard to teach. And this had a profound experience on me because for the most part, during my time at Dillard, these were the faculty who nurtured me and who gave me inspiration to do the things that I had done.

- Q. At the time that you were at Dillard, did you have the opportunity to become exposed to other cultures?
- A. Certainly not through experiences with my peers, but because of the faculty putting in front of me opportunities to learn more about other cultures, I was inspired to go to

Mexico to study Spanish.

So at the end of my first year, I got on a bus and went to Mexico to live with a Mexican family and to study — and to study Spanish. It was a — the French have a term, bouvsea (ph), completely overturned my world having the opportunity to encounter this very different culture.

- Q. Was Mexico a segregated -- were you living in a segregated environment in Mexico?
- 9 A. Well, I wouldn't call it segregated.
- 10 Q. I know, they were all Mexicans but --
- 11 **A.** Yes.

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- 12 **Q.** Were you segregated?
- 13 I don't even think that Mexico, at the time, thought in 14 terms of segregation. Segregation at the time was a uniquely American construct, I would say. And so there were certainly 15 many different people who were in Saltillo, some of them as 16 tourists, some of them as students and so forth. So there 17 were other students, white students in the Spanish program 18 19 that I was a part of, but I was living fundamentally with a Mexican family. 20
- Q. So you mentioned that you spent your junior year at Wellesley. How did that come about?
  - A. Well, I'm not sure whether or not Dillard wanted to get rid of me, but at one point the president called me to the president's house and told me that I had been designated as

the Dillard student to go to Wellesley that year. And he asked me if I would be willing to do that. And he was a very imposing figure, this president, and so of course I said yes. Being terrified, nonetheless.

So I went to Wellesley and obviously for the first time in this country, I was exposed to peers who were white and it was a -- quite an experience for me.

- Q. Did you form relationships with your peers at Wellesley?
- A. I did. I was the only African-American student on my hallway. Nevertheless, the students welcomed me quite warmly, and I became very close to a number of the students on the hallway. All of whom I would say were white but who came from different parts of the country.

One student in particular was from a farming community in Connecticut, and she took me home with her when we had long weekends or holidays. I formed a relationship with a Jewish girl from Philadelphia, and she took me home with her to Philadelphia during holidays.

So it was a wonderful experience in that regard.

- Q. Did you continue your education after graduating from Dillard?
- A. I did. I received a Fulbright fellowship and went to study in France at the University of Beaune.
- Q. What were you studying?

A. I was reading Proust, which couldn't have been farther

- afield from my background, actually. Reading Proust.
- Q. When you completed Swann's Way or the entire cycle, what did you do then?
  - A. I came back to -- actually, I was in France during the student riots and though it was very hard to get back, I managed to get to Geneva and take a flight home.

I came back and I was married that summer that I returned. And my husband had intended a career in the foreign service and wanted to be part of a program at U.S.I.A. So we went to Washington where he was part of that program, and I took a job as an interpreter at the U.S.

- Department of State and I enrolled in classes at George
  Washington University.
- 14 Q. Did you come to obtain a Ph.D.?
- 15 **A.** T did.

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- Q. Where did you earn your Ph.D.?
- A. I earned my Ph.D from Harvard in the Romance languages and literatures department.
- Q. Why did you decide to study Romance languages, other than having a year reading Proust?
- A. It's very hard to convey at this distance what it was
  like to grow up in a deeply segregated environment in Texas.

  But one of the things I can say is that that environment
  shaped my thinking about the possibilities in life that

awaited me. It shaped my thinking about what I was worth as

a person. It shaped my thinking about who whites were, and what their motives were in regard to me and my family.

And I somehow knew that one of the things that I needed to do was to escape from the thinking that had been imposed upon me by virtue of this trenchant segregation. And once I started studying language, and certainly once I went to Mexico and saw that there was a different people there who made no presumptions about me, I came to the conclusion that my own view for the world was very narrow and one way for me to resolve some of the presumptions that I had was to study language.

And as -- the more I got -- more deeply I got into the study of language, I found that it was extremely beneficial to exploiting the assumptions that I grew up with. And so I thought, well, why not do that for the rest of my life and impart that to other young people.

So that's how I came to be in the career that I'm in.

Q. Let's turn now to your work in the field of higher education.

Would you please turn to Tab 1 of your book, which is Defense Exhibit 134?

A. Yes.

- 24 Q. What is this document?
- 25 A. I believe that's an abbreviated CV.

Okay. And Mr. Lee, could we have page 2 of the CV on the 1 2 screen.

President Simmons, I'm directing you now to the part of your CV that describes your experience in the field of higher education. Does this fairly represent your professional positions with universities?

Yes, it does. Α.

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Now let's focus -- let's go through these one by one. Q.

So with starting your work at Radcliffe, what did you do there and for how long?

- Well, while I was a graduate student at Harvard, I was surprised to be asked to serve as an admissions officer at Radcliffe; and I agreed to do that, and so I worked for two years in the Radcliffe admissions office.
- And then going down under employment history to 15 Princeton, looking at your first role at Princeton, what did 16 you do and for how long? 17
- I was director of studies at Butler College, a 19 residential college at Princeton University, and I did that for two years. 20
- And what did you do next? 21 Q.
- I was asked to direct the Afro-American studies program 22 23 at Princeton, actually to build it. And so I took that on from 1985 to '87, and then was asked to become assistant dean 24 of the faculty at Princeton and then associate dean of the 25

- 1 faculty.
- 2 Q. And after Princeton, what happened?
- A. Well, I decided that it might be useful for me to take my
- 4 experience to a minority-serving institution, and so I left
- 5 Princeton to go to Spelman College, where I became provost.
- Q. And can you just describe the characteristics of Spelman College?
- 8 A. Spelman College is an African-American college for women.
- 9 It is a liberal arts college, very small college.
- 10 **Q.** And what were your duties there?
- 11 A. Essentially to oversee academic affairs at the college.
- 12 Q. And we're working our way up your employment history. I
- see that you then went -- you then returned to Princeton.
- 14 **A.** Yes.
- Q. And what were your duties in the role of vice-provost?
- A. I was asked to return to Princeton, to become
- vice-provost because of a change in the administrative
- structure of the university, and I fulfilled that role as
- 19 deputy to the provost.
- 20 Q. What did you do next?
- 21 A. I was asked to become president of Smith College.
- 22 Q. And I see here that you served for six years at Smith,
- 23 from 1995 to 2001?
- 24 A. I did. Yes.
- 25 Q. Prior to your appointment, had Smith College ever had an

- 1 African-American president?
- 2 **A.** No.
- 3 | Q. Let's go next up the line. How did you get to Brown?
- A. How did I get to Brown?
- 5 Q. I know, by Interstate 90, but --
  - A. I wasn't going to say that, but it's clever.
- I was asked to -- I was invited by the board of trustees of Brown to serve as president of Brown.
- 9 **Q.** And prior to your appointment, had Brown ever had a permanent female president?
- 11 **A.** No.
- 12 Q. Prior to your appointment, had Brown ever had an
- 13 African-American president?
- 14 **A.** No.
- Q. Prior to your appointment, had any Ivy league university
- ever had an African-American president?
- 17 | **A.** No.
- 18 Q. And I see that you served as president of Brown for 11
- 19 years, if my math is right?
- 20 **A.** Yes.
- 21 Q. And then there's a gap. What did you do next? An
- 22 uncharacteristic gap.
- 23 A. I retired, very happily.
- Q. And what did you do in retirement? Other than simply all
- 25 that Providence has to offer.

A. Well, I actually went back to Houston and became involved in some of the programs that were familiar to me as a young person. I started first with supporting a preschool program for African-American children in a housing project in the Fifth Ward. And then I became involved with the community center in my old neighborhood, and then I took on the leadership of a new effort to support the improvement of public schools in Houston.

- Q. So that sounds lovely. How did you then come to leave retirement and become president of Prairie View A&M? How and why?
- A. Quite unexpectedly. The chancellor of the Texas A&M system called me up and asked to meet with me to discuss becoming interim president of Prairie View because the president was leaving. And I thought, of course, that this was a foolish idea and but nevertheless assured him that I would give it some thought.

I did for some period of time and then concluded that, again, it was my responsibility, given all of the help that I received as a young person, that it would be appropriate for me to try to help the students at Prairie View today, and so I agreed to take on the interim position.

- Q. And how did your interim status turn into a non-interim status?
- A. They asked me to continue and I agreed to do so.

- Q. Looking back at the three institutions that you served as president, Smith, Brown and Prairie View, do those institutions have different educational missions?
  - A. Distinctly so.
- O. How so?

A. Well, I mean, I suppose any institution is founded first and continues on the basis of the mission that helped to create it.

In the case of Prairie View, two ex-slaves, during Reconstruction, put through legislation in the state -- in the Texas legislature to create a school for black youth. The truth is African-Americans were not permitted to be educated, as you know, during slavery in the South. And the only way to assure that freed slaves would now have an opportunity to be educated was to create schools for them, which is how most HBCUs came into being.

At the same time, the legislature created a school for white youth to ensure that never the twain shall meet.

So Prairie View was formed in that context and for many, many years was the principal way for African-Americans in Texas to gain a higher level education.

- Q. And how, if at all, has that manifested, that history manifested in the mission of Prairie View today?
- A. It continues to prize that legacy and to believe that its mission is to continue to make opportunities available for

- African-American youth and others who come from non-privileged backgrounds, let's say. Over 80 percent of the students at Prairie View are Pell-eligible students. And so it is very proud of that tradition and continues to enforce that today.
  - Q. And what percentage of the current undergraduate population at Prairie View is African-American?
- A. Over 80 percent.

- Q. What about Smith?
  - A. Well, Smith was formed at a time when people routinely said that women were incapable of higher order intellection. In fact, I remember reading that people argued that serious intellectual study would somehow affect the reproductive organs of women, and therefore it would be dangerous for women to study at university because, I suppose, the species would disappear, ultimately.

And so at a particular time in history, these institutions were created not just so that women could be educated but Smith was specifically created so that women could be educated on a par with men in the best universities in the country.

And so that was the origin of the college, and it continued after that to insist on equality for women, the ability of women, the proof, in a sense, that women had the ability to do any order of thinking that a man could do.

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And, in fact, when I was there as president, one of the things that I did was to create a program for a -- a program for women in engineering because of the problem that women were having in gaining access to engineering degrees.

So it continues to have the same essential mission today, to provide a place for women to be educated well.

Q. Let's turn to Brown, which was created during the Colonial era, and I'm willing to -- I'm ready to hear you say that it is not rigidly continuing its original mission.

But leaving aside my asides, what about Brown?

A. Well, it was created as the Baptist university for the country at the time. It has evolved, as other Colonial universities have, to be a broad-ranging university that has still as its aim to prepare students for leadership roles.

At the time that the country was formed, there were many people very concerned about whether or not in this nascent country there were people sufficiently fit to lead this nation. That, too, was part of what Brown leaders were thinking at the time; that there was a desperate need for leaders who had the breadth of education and the leadership ability to provide for this nation a future that was secure.

And so Brown continues to do that today, to educate young people for leadership positions, and in the broadest liberal arts context.

Q. Let's turn now to the questions that we asked you to

address.

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And Mr. Lee, could we pull up Demonstrative 9.2.

What questions were you asked to testify about?

- A. I was asked to testify to, one, the question of what benefits flow to students, institutions, and society from a diverse undergraduate student body; and second, do certain criticized admissions practices serve legitimate institutional interests?
- Q. And we're going to go through these, each one of them,
  separately in some detail. But as to question number one, do
  you have an opinion?
- 12 **A.** I do.
- 13 Q. And what is your opinion?
- A. My opinion is that benefits definitely flow to students, institutions, and society from a diverse undergraduate student body.
- Q. And turning to now question two, do you have an opinion on the second question?
- A. My opinion on the second question, based on my decades of experience and my first-hand observations of students and alumni, that the criticized admissions practices serve legitimate institutional interests.
- Q. Mr. Lee, please pull up the next demonstrative.

And President Simmons, could you just explain to the court which admissions practices you will be offering,

- you've discussed in your reports and will be discussing today?
  - A. Yes. These practices include legacy status, contributions to the university, children of faculty or staff, athletic achievement, and early action.
  - Q. And what is your opinion regarding those practices?
    - A. My opinion, based on my experience, is that all of them play a legitimate role in the admission process.
    - MR. WAXMAN: Your Honor, I've been given a note to remind me that I forgot to offer into evidence Defense Exhibit 134, which is her CV.
  - MR. CONNOLLY: No objection.
- 13 THE COURT: It's admitted.
- 14 (Defendant Exhibit 134 admitted into evidence.)
- Q. In forming your opinions you'll be expressing today, did you review the statement of Harvard's educational mission?
  - A. Yes, I did.

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- Q. Would you please turn to Tab 2 in your binder, which is
  Defense Exhibit 109, I believe, in evidence. And I want to
- ask you to focus on the sentence that Mr. Lee is going to be
- 21 highlighting and ask you what that says.
- A. "The mission of Harvard College is to educate the citizens and citizen-leaders for our society."
- Q. What do you understand that to mean?
- 25 A. Well, it's very much as I said in regard to what John

- Adams expressed on his way to the Constitutional Convention;
- and that is, what are the needs of societies and how can
- 3 institutions like Harvard prepare its students to play the
- 4 roles they need to play to maintain our way of life as a
- 5 country.
- 6 So educating citizens who will play important roles
- 7 in all manner of endeavors, and especially leaders in our
- 8 country.
- 9 Q. And did you conduct your analysis with that mission
- 10 statement in mind?
- 11 A. I certainly did.
- 12 Q. Let's turn to the next demonstrative, which is
- Demonstrative 9.6, and look back at the first question.
- 14 Did you analyze the benefits that flow from
- 15 diversity?
- 16 **A.** I did.
- 17 Q. And looking at -- now at Demonstrative 9.7, can you
- explain the categories of people in institutions who, in your
- 19 view, benefit from having a diverse undergraduate student
- 20 body?
- 21 A. Those categories are students, institutions, and society.
- 22 Q. Let's focus on individuals, students first.
- 23 **A.** Okay.
- 24 Q. How do individual students benefit from a diverse
- 25 university environment?

A. Our greatest concern as educators is always for the depth of learning that students have access to. It is not enough at our universities for students to come to sit in class, to observe what they're told, and to leave with -- impoverished, without having been deeply engaged in their learning.

Diversity provides an opportunity to deepen that learning, to give students first-hand experience with difference. And we know the difference is one of the primary means for students to test themselves, to test their background, to test their ideas, to challenge assumptions. And in that context, it is in coming in contact with difference that we tend to deepen our learning.

- Q. So in referring to the benefits to students that you've just described, are you limiting those do you limit those benefits do your prior comments relate to the, quote—unquote, diverse students who attend an institution, say, the African—American, Hispanic and other underrepresented minority students, or do your opinions apply more broadly?
- A. They apply to both.

So first of all, in challenging our assumptions, I don't mean picking up different books that have dialectic around a particular subject. I mean in every possible respect coming in contact with difference. And that certainly applies to having different faculty, having

different students live on your hallway, encountering different students who come from backgrounds that are so different from yours that you have no choice but to learn about the complexity of the world that you're going into when you graduate.

- **Q.** Can you think of an example from your own undergraduate experience that illustrates the point that you were just addressing?
- A. Yes. I use the example of my being in a classical philosophy class at Wellesley at a time when apartheid was probably the most important social, political issue around the world; and naturally it came upon us to discuss apartheid and the ethics surrounding that system. And, of course, I was quite passionate about the evil of apartheid and how it needed to be overturned.

I was pleased to discover that most of the students in class, all of whom were white, shared — seemed to share my view about apartheid, except there was one young woman who toward the end of the discussion raised her hand and identified herself as a South African. I don't know if there was an audible gasp in the room, but I certainly was surprised. And she then began a spirited defense of apartheid from the perspective of a white South African.

I had never encountered anything like that before and it threw me into a state, but here is what I garnered

from that experience; that I was forced to listen to a different opinion about South Africa, one that I never, under ordinary circumstances, would have heard.

Today, I can remember no one in that class but I can remember her. She had such an impact on me. And I would say I often think that the person that I became as a scholar and as a leader prized that interaction because I learned to listen to difference. And I don't think I could have done what I've done in my life, been the person I've been to my students, if I had not had that experience.

- Q. President Simmons, have you familiarized yourself with Harvard's experience with diversity and inclusion sufficient to express an opinion about how whether Harvard students benefit from diversity?
- **A.** I think I have.

- 16 Q. How do you know that?
  - A. Well, I've read many documents describing the way that Harvard puts its students in touch with diversity. It's very thoughtful. It's very deliberate, the way that students are assigned to housing, which is quite something when you think about it. The idea that when you go off to college you have no control, really, over your living circumstances; that you're put into an environment where you are challenged to adjust. It's a powerful thing.

In the first year, students have no choice about

their living arrangements. Thereafter, they are assigned to houses also. It's also the case that there are committees that are responsible for intentionally creating an environment in which students can learn from diverse others. So I think — I think that the university does a very good job.

And by the way, I should say these actions are fairly typical of what we have come to understand in university life as being important to do so that our students get that depth of learning that we're seeking.

Q. Let's turn to the next category that you identify, the benefits flowing from diversity to institutions.

How do institutions like universities benefit from having a diverse student population?

A. Well, one of the things that won't surprise you about universities like Harvard and Brown is that we often think that we are all-knowing. And so without the inputs of a lot of different people over time, with different backgrounds and different perspectives, we'd hardly change, I think, as institutions.

But because we are open to difference and because we have inputs that vary over time, our institutions change and I believe change for the better. We make new discoveries. We teach new courses. We create new fields.

And more than that, because we do all of those

things, our students all come to understand, in the course of their lives, the great benefit that they have had by coming to our institutions. And so that is why we can't get rid of them. They come to our institutions and they stay on as alumni forever, which is to our delight.

The standing that we enjoy around the world is surely due to our diversity. Imagine Harvard's footprint around the world. It's hard to imagine an institution that is more prominent around the world than Harvard. Oxford might say they're equally so, Cambridge might say. But I don't know. I rather think that Harvard has a bit of the edge when it comes to that because of the way they've admitted students over time and because of the fields that — in which they have excelled.

So our stature as institutions depends on the fact that we have systematically over time brought many different types of people to our institutions. They have gone back to regions around the world and established a bigger footprint for us.

- Q. So does having a diverse student body, I'm asking you now based on your experience, long experience as a professor and a leader of institutions with professors, in your experience, does having a diverse, engaged, safe environment for students have an effect on the faculty of an institution?
- A. Well, I would say it has an effect on the learning that

takes place in and out of the classroom. I can tell you as a professor that having a homogeneous group of learners sitting around a seminar table is not as catalytic as having students with different backgrounds and different opinions sitting around the seminar table. The discussion is more robust. The depth of learning, as I said before, is more significant. And the teacher probably gets better over time by having all of these different scholars, students, available to them.

Q. So I think you mentioned earlier, I tried to write this down, that having a diverse student body affects the research agenda or the research questions.

Could you explain to Her Honor what you mean by that?

A. Well, one of the -- one of the things that faculty believe in American universities is that they have academic freedom, and what that often suggests to them is that they're free to pursue a course of research that is of interest to them. And naturally, what that means is that if you have a diversity of scholars, you also have a diversity of interests and those interests will lead you to pursue different scholarship.

And so you have only to look at the vastly different scholarship that exists today as a consequence of women coming more into the center of academic life and as a result of minorities coming into the center of academic life.

When I was at Smith, I created a journal called "Meridians," and it is a journal to highlight the research being done on women of color. That would never exist, of course, in the academic world if you didn't have people who were varied and who were interested in the status of women in India or the status of women in this country and so forth.

- Q. So in sum, is it your opinion that Harvard could accomplish its educational mission without the diversity that you described?
- A. It could accomplish a mission, but it would be an impoverished mission that does not provide for its students the kind of education that prepares them to live in the world that we now have.
- Q. Let's turn to the third category in your demonstrative.

  How does society benefit from having diversity in university education?
- A. Well, I would say that we are bedevilled in society by enduring schisms, schisms based on differences, political differences, cultural differences, religious differences.

  And those schisms sometimes break out and we're faced with tragic circumstances.

Sorry. I'm thinking about the shooting in Philadelphia -- in Pittsburgh. So -- so here is the thing. What are you going to do in a society that is riven by conflicts of all kinds? How are you going to mediate them if

you don't have people capable of doing that?

When we go back to our enclaves, enclaves of sameness, how are we going to get to the point where we can mediate these conflicts and have a peaceful society that advances?

I don't know a way to do that if we don't prepare people who can lead in such a society. And in my view, places like Harvard, bringing people into the center of learning, learning about difference, I don't know how we do that unless we prepare them well and send them out to do just that.

- Q. Let me switch topics slightly and ask you whether you are familiar with the whole person admissions process?
- **A.** I am.

- 15 | **O.** What is it?
  - A. It is an admission process in which instead of doing a kind of automatic admission based on test scores and GPA and rank in class, that you consider every aspect of what a person brings to a college. You consider their life experience. You consider their cultural origins or their racial origins. You consider what they've done up to that point. You consider what their aspirations are. And you consider whether or not they are intent on contributing something to society. You consider everything.
  - Q. At the time that Radcliffe employed you as an admissions

- officer, did it employ a whole person admissions process?
- 2 A. It did.
- Q. And in your opinion, does this whole person
- 4 individualized approach to admissions facilitate assembly of
- 5 a diverse student body?
- 6 A. It did.
- Q. Let's talk about once students are admitted to the
- 8 college.
- 9 Did you examine whether Harvard has practices that
- 10 facilitate diverse interactions on campus?
- 11 A. Yes. My opinion is that they do.
- Q. Can we have, Mr. Lee, can we have Demonstrative 9.11?
- 13 At a high level, what did you find?
- 14 A. Well, at a high level, I found that in numerous ways
- Harvard has an intentional process of facilitating
- interaction among different students.
- 17 Q. And what do these -- what do these segments of the circle
- 18 on the demonstrative reflect?
- 19 A. In extracurriculars, for example, students participate
- 20 not just in varsity sports but in club sports and other
- 21 extracurriculars; like theater or dance or any number of
- 22 different areas. And when they are doing that, they have the
- 23 opportunity to spend time with different students from
- 24 different backgrounds in a common project.
- I find that in housing, again, the way that housing

is assigned is intentionally designed to make sure that students have the best chance of being in a living environment in which they're exposed to difference.

And so as I said, the first year they are assigned housing with a roommate not of their choice. After that they are randomly assigned to houses to make sure that that mixture continues. And, again, in terms of faculty and staff, the intentionality extends there where students are given the opportunity to interact with many faculty and staff who come from different backgrounds.

- Q. I must confess, I hope that I'm not imagining this, but did you, in your report, give an example of a particular student housing arrangement, a freshman housing arrangement between a particular white student and a particular African-American?
- **A.** I think the only mention that I made was with Mark

  2 Tuckerberg --
- 18 Q. I didn't imagine it, okay.
- A. -- and his roommate who happened to be a Haitian
  Olympian, Samyr -- I can't remember his last name, but yes.
- 21 Q. Did you review Dean Khurana's testimony in this court?
- **A.** I did.

Q. And is his testimony regarding the practices that Harvard employs to facilitate diversity consistent with your analysis?

- A. It is consistent with my analysis.
  - Q. Do you recall Her Honor's question to Dean Khurana about how to measure when there's enough diversity?
  - A. I remember that.

- Q. And what is your response to that question?
- A. My response is that wouldn't it be marvelous if we had the capacity to know when enough diversity is enough diversity.

I have been doing this work for decades, and I have never seen a moment when we are certain of that. We are constantly striving to make sure that we have the appropriate mix of students. But I don't think there is any university in the country that has decided that it has the key to that.

So here is what we do know. We know, because we've been told over the decades by students who have experienced it, that sometimes there are insufficient numbers of a -- of particular groups on the campus for them to feel safe and comfortable and for the learning that they have access to to be equal to that of others on the campus.

So we're immensely sensitive to the fact that we can have too few students in a particular group.

We also know, from what we've been told by different groups, that our assumptions about diversity are often too unsophisticated. And so we might think that because we have a black student that that's diversity.

Whereas, many students will say that you don't have enough black students from a particular socioeconomic class or you don't have enough students, black students, who are wealthy, or you don't have enough black students who come from outside the country.

So within different groups, their definition of diversity is somewhat different from ours sometimes, and we've learned over time to be much more variegated in the way that we think about diversity.

- Q. President Simmons, we heard yesterday, all day yesterday, from students and alumni of Harvard.
- Did you manage to hear any of that testimony?
- 13 A. I heard some of the testimony.
- Q. And do you recall some of the students expressing concerns about inclusion?
- 16 **A.** Ido.

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- Q. How do the concerns expressed by the students affect your analysis?
- A. They're very much, as I have heard over the years, and very much in keeping with my thinking about this -- about these questions.
- Q. Are those concerns that we heard expressed yesterday an indication that efforts to have diverse learning environments are failing?
- 25 A. Not at all.

Q. Let's turn now to the --

- A. May I say a little more about that?
- Q. Yes. You've got the floor -- chair.
- A. One of the things that I wrestle with as a university president is trying to impart to my students the difference between what they are experiencing now and what people experienced decades ago.

I want to say that part of what I hear from the students is all too familiar because, of course, I've heard it for so long over the decades. Nevertheless, the fact that they are smarter about it, more aware of it, and in a sense dealing with it so amazingly is, to me, a sign of progress, frankly. And so I just wanted to put that context on it.

Q. Thank you. Let's turn now to the second of the two questions that Harvard asked you to address.

And Mr. Lee, yes, thank you. Demonstrative 9.12.

Let's focus on whether the admissions practices that you identified at the outset of your testimony in your opinion serve legitimate institutional interests. And let's start by turning to Demonstrative 9.13.

And this, again, if you'd just remind us, these are the practices that you have considered and expressed an opinion about?

- A. Yes.
- Q. Do you agree that Harvard should cease providing what it

calls an admissions, quote, tip, to legacies, to applicants whose parents have contributed to Harvard, to children of Harvard faculty and athletes?

- A. I do not.
- Q. And do you agree that Harvard should end early action?
- A. I do not.

Q. Let's start with legacies. Look at Demonstrative 9.14.

What institutional interests are served by considering legacy status?

A. Our institutions are venerable, I think that's the right word, because they are revered over many, many years by a succession of alumni who come to love our universities and what they provide. It is entirely appropriate for them to believe that it would be wonderful if their children could also enjoy the same benefits that they enjoyed as students.

At the same time, because they are so involved with our universities, and do so much for us -- and parenthetically let me say, I do firmly believe that Harvard today would not be Harvard without that involvement: Alumni who are advising Harvard, alumni who are giving to Harvard, alumni who are challenging the university at all times to be better. Without that, Harvard would not be Harvard.

And so one of the distinct advantages that we enjoy as institutions is that we've been made stronger by benefit of that involvement. And one of the ways that we signal to

alumni how important that is for us is that we consider their children in the context of our admission process never, never to admit them if they are not qualified on the same basis as other students. It's very important to say that.

And also, let me say, I hope it's a given that people understand as educators one would never admit students that you think cannot thrive at your institution. It would be considered highly unethical to do so.

And so in the admission process, when we're thinking about students and comparing students, our final question is whether or not that student will thrive because they're perfectly capable of doing the work at a high level.

And so in that regard, we believe that it is appropriate to give a tip to legacies, and that it is in keeping with the tradition that we have as institutions where there is strong identity of alumni with our institutions.

## Q. Thank you.

Let's turn now to item number two. And looking at that, can you explain to the court what institutional interests are served by giving consideration to applicants whose families make a contribution to the university?

A. Well, first of all, let me say, you'd never, ever admit a student because their family promises a contribution. That would be a quid pro quo. It would be, again, completely inappropriate to do that.

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Nevertheless, there are occasions when individuals who are prominent, who have expertise, who have all manner of things that they can do to assist the university, might have children apply and, in that regard, if it is possible that their children are highly able and at the same time their parents could make a difference for the institution, I don't believe that it is problematic to admit those students. The number is infinitesimally small. I couldn't even count on one hand the times that I've seen this apply at Brown. But it is certainly possible that there are students who come along whose families can do incredible things for an institution. We are, after all, private institutions.

How do we survive from generation to generation, to be 400 years old? I mean, how does one comprehend that? A private institution from era to era that not just survives but becomes stronger in every era. How does that happen? It doesn't happen because we sit on our hands and do nothing. It happens because we are constantly looking for help, from as many different corners as we can find it.

Q. I just have one clarifying question. You've spoken eloquently about the different types of contributions that parents or family of an applicant might make. Can I assume that you're including, among that panoply, very significant financial contributions? Not a quid pro quo, but either a history of generosity with the university or the prospect

that perhaps there will be significant generosity.

- A. If there has been a history of contributions to the university from someone, of course. I can say that at Brown, for example, in a couple of instances people who had made very generous donations to the university who had children apply, not not at the same time, we gave special consideration to their children because they were, after all, highly qualified on the basis of the rest of the pool.
- Q. Let me turn to item 3 on the demonstratives.

What institutions are served by considering whether the applicant is the child of faculty or staff at the university?

A. Well, there are a lot of different ways to think about the resources available to universities and every university. I'm in a public university right now. Every university has access to different kinds of resources. One resource that we have is the admission of children of faculty or staff if they're highly qualified. Now, it also must be said that the single most important factor in the quality of a university is faculty quality.

The second most important factor in the quality of an institution is faculty quality. I could go on ad infinitum. Faculty are the determination of the standing of a university. They are at the heart of the learning of students also. But the representation of a university

depends mightily on what the faculty output is.

And so anything we can do to retain the most outstanding faculty, certainly we would have to do. It is our competitive advantage. There is a fierce, fierce battle in this country for faculty, and trying to keep them is very important to us.

And so I think it's perfectly legitimate if a child is highly able to admit a faculty child or a senior person staff person's child. Let me say this is very rare. I think that it happens. It's not a significant number in any given class.

Q. Let me ask you to turn next to athletic achievement.

What institutional interests are served by giving what Harvard calls a tip, and I'm going to divide athletes into two categories, first to recruited athletes?

A. Well, we're in an athletic league. How are we going to field teams to play each other if we don't admit athletes for those teams? You know, there are a lot of people outside the Ivy League that believe — who believe that we're not serious when it comes to athletics. That's because they've never sat around a table of Ivy League presidents fighting about athletics. We are very serious about athletics.

And so, again, one of the defining elements of Harvard is actually, is actually its athletic program and what it does for the campus in terms of building school

spirit, what it does when Harvard beats Yale, you know. And when Brown beat Harvard, it was — it was a holiday, okay? So these are serious matters. They are taken absolutely seriously.

And then the other thing that seems to me very important is that the Council of Ivy League Presidents exists for one purpose, and that is to monitor athletics, to make sure there's no funny business when it comes to admitting athletes. And so it is the most regulated athletic competition, in a sense, in the country. Forget the NCAA.

Presidents sit on the council to determine whether or not they're following all the guidelines. And importantly, at particular times, the presidents will decide to ratchet up the requirements for athletes.

And I know during my time as president of Brown, one of the things that I did was to cut back on the number of recruited athletes in order to make more room for other students in admission. I believe that Harvard did the same thing, actually.

So we take athletics seriously, but we believe that it should be very strictly controlled.

Q. Let me ask you: You've spoken eloquently about the ability and necessity of recruited athletes to allow, for example, Harvard consistently to defeat Yale and Brown -- as a Harvardian I will say surprisingly in somewhat a

demoralizing way to beat Harvard. Do talented athletes like this bring value to the campus more generally than just bringing glory?

A. Of course. Of course they do. I mean, none of us should be cited as unidimensional individuals just because we have a particular talent. And so a cellist, even at the highest level, is not just a cellist. Nor is an athlete just an athlete.

And so there have been famous examples of Ivy
League athletes who have been incredible leaders, who have
been CEOs, who have been in every sense of the word the
citizen leaders that Harvard has identified in its mission.

Q. Let me ask you now about the non-recruited athletes.

Do university communities benefit from having avid, skilled, non-recruited athletes on campus?

A. Absolutely.

- **Q.** In what way?
  - A. And in so many ways. First of all, the average student can find their way to a sport that they love. And as you know, that experience with sport can often lead to a lifetime of enjoyment. And so and I was visited recently in my office by the rugby team on my campus, and it was glorious. These the men's rugby team, although I had women's rugby also at Smith, games that I couldn't watch. It was too painful to watch them but the men's rugby team. And to

see them interact as athletes, doing it for the love of it, was exhilarating.

They are working alongside individuals to accomplish wins. They're learning about people. They're becoming more disciplined in their lives because, as you know, as educators, we always say that athletes are much better students during the season than outside the season because it lends more discipline to their total endeavors when they do that.

So there are a lot of different things that athletes contribute, non-varsity athletes contribute in the environment. And sometimes it's just as much fun watching a club sport as it is a huge varsity athletic event.

Q. Let's turn finally to early action and the -
THE COURT: May I interrupt you for a second?

MR. WAXMAN: Sure.

THE COURT: I just have a couple of things I've been thinking about and there's really been no one to ask but here you are. We'll see how relevant these things are.

But I have been told that these things that we've just discussed, legacy, contributions, children of faculty and staff and athletic achievement, are about 30 percent of each class. And it seems to me, and you can correct me if I'm wrong, that that can be a way to tamp down diversity, right? Like, if all of your legacies are white and all of

your donors are white, then the larger that pool is, the less diverse your school population becomes in some ways, right?

And I hear you saying that contributors and faculty kids are a small percentages, or should be small percentages, but I haven't seen a breakdown of that. But if you take those things together that I think can be a way of limiting diversity, is there some number that's too much?

THE WITNESS: I actually don't think of it that way. And here is why. I've always been involved in my career in the continuum of education. A lot of people focus on one institution, one admission cycle. I didn't, I didn't go to Harvard. I'm not --

THE COURT: Neither did I, as has been recently published in the --

THE WITNESS: So we can commiserate.

THE COURT: That's not the adjective I'd use.

THE WITNESS: So here I am, you know, I went to a liberal arts college, 900 black students, and then I became president of an Ivy League university over mostly white students.

So the first thing I would say is that one institution does not drive our opportunities, and that's important to remember. Because, as I say, I left to go to Spelman because I thought Spelman had wonderful things to offer. I'm now at Prairie View because Prairie View has

wonderful things to offer.

So getting back to your question. I believe, truly believe, that the uniqueness of our institutions is actually created by all these factors. It is — it is a series of things that makes people want to be a part of us. But now people want us to abandon them because it may be inconvenient to have them, or that might be their assessment.

I believe that the thing that makes this country, especially higher education in this country, so phenomenal is the fluidity. And so I can go to a 900-student black college that is nowhere on the radar screen for anybody and then end up in a Ph.D. program at Harvard.

And so what I used to tell students when I was interviewing them for Harvard, I used to say, you know, you know you can ultimately go to Harvard from lots of different routes. You don't have to be an undergraduate at Harvard. Okay? In fact, it's not always a good idea to go to Harvard as an undergraduate if you're in this field, if you're in that field.

So I think our country has become besotted with the idea of getting into a narrow number of institutions. But the great thing that they miss is that our educational opportunities are so much richer than that.

And so that's the way I think of it.

THE COURT: All right. Another one that might be

more unanswerable that I've been sort of wrestling with, and I throw it out there to you because you seem to be the most knowledgeable person I've seen on these subjects, is -- you know, I'm sure that the Supreme Court says you can't have quotas and you can't have floors. So if you're talking about a place -- and I'm going to use Harvard because here we are -- that accepts 2,000 kids a year, looking for 1,600 -- I mean, those two numbers are pretty fixed.

THE WITNESS: Yes.

THE COURT: Then if we can agree that one black student on campus is not enough and five black students on campus is not enough, if you're trying to get to a number that's enough to meet the goals that you talked about, like a group feeling safe and represented, how do you avoid a floor?

THE WITNESS: Well, I think that's because of the select activity that you have access to.

When I was working at Radcliffe, there was a plentiful supply of highly-able students. That's not always true for every university, but it's certainly true for Harvard. And so one of the things, as you look at what you're trying to achieve across the entire university that you're more concerned about, is that if you were to admit a certain number of students, that the whole — one whole part of your campus would be devoid of any difference. And so it isn't so much a floor as it is an effort to make sure there's

sufficient numbers of students in your campus so that the students who need that deep learning are exposed to it. And if it is too small, you'll get the feedback.

And one of the reasons that I say that that feedback is important and we've had it over the decades, is that when we first started this process, we had no idea what we were doing. So there were many tokens admitted into programs like this.

So, for example, I was a token at Wellesley. And so Wellesley was not admitting African-American students in any significant numbers, and what they did was to go to the South to black colleges and invite black students from black colleges to come to Wellesley. But even when they did that, it didn't make much of a difference because there were so few on the campus.

So I think one of the things we've learned over the years, because we've heard the feedback from our students, this is what it feels like when it's like this. And every time we get the feedback, we tend to make adjustments.

And so I wrote a report at Princeton, for example, about the consequences of having the -- either the wrong mixture or the wrong policies, and we made adjustments to that.

So universities are always trying to make adjustments. I don't ever see this as a fixed point, where

we're utterly satisfied that as a nation, we have figured this out. I don't see that happening because we are changing constantly, different demographics are taking place.

And so how many of us are floored by what's happening in the country today? I know I am. I didn't expect to see it again. But here we are. And so we'll take that in and we'll make our adjustments and we'll try to improve. And that's the way it's always going to be because when you have so many different people involved, you cannot predict what they are going to do in the future. You can only look at where you are now and try to come up with the best solution.

THE COURT: Thank you.

MR. WAXMAN: Can I ask one follow-up question to Your Honor's questions?

THE COURT: You may.

Q. I'll be perhaps a little more pointed than the Court was.

When you were president of Brown and when you were president of Smith, did those institutions make a concerted effort to value diversity and try and promote a diverse, including racially diverse, learning environment in those institutions?

A. Of course.

Q. Did those institutions, do you feel, that in order to evaluate whether you have provided such an institution that

it is useful, necessary, or appropriate to identify a particular percentage, like we need to have, I don't know, 20 percent African-American?

A. No, never.

O. So how does --

MR. WAXMAN: I don't know whether I'm channeling
Your Honor's questions but --

THE COURT: I'm not sure there's an answer.

A. See, that's the problem. I have seen institutions with a very different mix of ratios do it successfully, and I've seen institutions with a much larger proportion of certain groups and it's been difficult, if not disastrous.

So here is what I tell my students, and this is what I say to all the groups that I speak to scores of times every year. And I always say, Never expect -- Never tell your campuses that there will be a point at which they will be satisfied that we've achieved the right mix of diversity. Never, never issue that promise because you will fail every time.

It is not scientific. It just isn't. And so I think what I advise is that you don't pay attention to that point. Here is what you pay attention to. You pay attention to the striving. That's what you pay attention to. In every year in every way, you're still striving to learn about difference. It's the striving that matters. And as long as

you're doing that institutionally, and individually, you're making progress undeniably. But if you try to set these false expectations, that there is a magic point at which it's now functioning best, you'll be disappointed.

THE COURT: That's the ceiling. What about the floor?

THE WITNESS: The floor, again, I don't think of it in terms of a floor. I just don't. I've seen so many circumstances in which small numbers have worked, and I've seen circumstances in which they are alleged not to have worked.

You know, we are mired in a situation where all of this is subject to interpretation and reaction and the reaction of many different people. And in such a circumstance, it is impossible to come up with a formula that we're going to be satisfied with.

And so I think we'll never get there in terms of that floor. I don't think we'll get there in terms of any ceiling. And I think that this whole idea of keeping ourselves honest by narrowly interpreting what we are doing and consistently doing that is a pretty good way of doing it.

I can only say that over a lifetime of trying to do this in lots of different settings, I've never been in a setting where people were satisfied that they were doing it exactly the right way. And that's been a vast array of

settings.

U.S.C. was right on the edge of the black community, one of those venerated institutions. And when the riots occurred in Los Angeles, the riots went right up to U.S.C. and stopped. And it had nothing to do with the diversity of U.S.C. in terms of numbers. It had to do with the fact that that community respected U.S.C. because of the way U.S.C. had respected its athletes.

So there are so many different ways of looking at this.

MR. WAXMAN: Over to me?

Q. Let's turn finally, President Simmons, to number five on the slide, which is the proposal that Harvard eliminate early action.

Could you please summarize your opinion about the consequences to private universities like Harvard of eliminating the criticized early action program?

A. Well, I would say that when Harvard decided not to use this competitive advantage, we were very happy at Brown. Because any advantage we can enjoy in terms of recruiting students, we want that advantage.

Early action provides a competitive advantage when it comes to the most sought-after students. And if you -- if you abandon that and don't have access to those students, there are consequences for it.

And so as a practical matter, I would say any university that is competing at that top level for the very best students will want to maintain that advantage, and early action is such an advantage.

Q. I was going to ask you about your experience at Brown and Princeton, but I think you've testified about the consideration at Brown.

Did Princeton -- does Princeton offer early action?

A. It does. It abandoned it for a time and went back to it.

And, again, there is a cluster of institutions that compete fiercely.

I remember when I was at Princeton, I remember a time at Princeton when Princeton was very annoyed, that they didn't feel they were getting their fair share of the top students who were applying to Princeton, Yale, and Harvard. And they went to work to try to figure out how to overcome what they saw as a deficit.

But in regard to early action, they restored early action because those institutions that did abandon it realized that they were giving up a substantial competitive advantage by giving it up.

- Q. President Simmons, did you review Mr. Kahlenberg's contention that early action programs disproportionately benefit white and wealthy students?
- A. Yes.

Q. Do you agree with him?

A. Well, I looked at the process by which Harvard reaches out to all income groups, to minorities, and so forth. And perhaps people don't understand this very well, but if you're in a household in my old neighborhood, Bloody Fifth Ward in Houston, Texas, and you are a high-performing student, you're getting information from Harvard in your junior year telling you, "Here are your options for applying." That's how extensive the marketing has become. It wasn't always so.

But today, the outreach is aggressive and virtually omnipresent, and so typically students of all incomes will be aware of what their options are.

That's not to say that a student who has modest scores and is in the middle of their class will get that. They won't. Because there are lists that are circulated of the highest achieving students, and universities concentrate on those lists and they go after those students.

- **Q.** Would an average student who is acquitting herself in the middle of the class likely be an appropriate candidate for early action in the institution --
- A. Would never be admitted.
- Q. Let's turn to Demonstrative 9.19.

And, President Simmons, can you please summarize your opinion about the consequences to private universities like Harvard of eliminating the criticized admissions

practices that we have discussed?

- A. I believe that eliminating the criticized admission practices would undermine the ability of Harvard to continue on its path of outperforming other universities. These practices have been responsible in, I think, large measure for the success that Harvard enjoys today. And if you really admire that success, then undermining it by eliminating these provisions would not make much sense to me.
- Q. In looking at number one on the demonstrative, what is your bottom line on the importance of diversity at Harvard?
- A. It's very hard for me to overstate my conviction about the benefits that flow to all of these areas from a diverse undergraduate student body.

I know something about the lack of diversity in one's education. I know what it was like to live in a society where that was the bedrock approach to education. I know what it was like to walk down the streets where random people attacked us or issued slurs because they didn't understand what my community was all about. I understand what it was like for African-Americans in this country not to have access to professions.

My father was a janitor, my mother was a maid.

They had been sharecroppers, they had few opportunities. I lived through that. I remember it.

So to me, the benefits that flow to students is

they get a better education, a deeper education, a truer education to deal with what they're going to have to deal with in life.

To the institution, it makes for not just an enhanced learning environment but for the opportunity to be unparalleled in their standing because they offer something that is so indispensable for society.

And for society, my goodness, I've spoken about the conflicts in society, how deeply they run, how they resurface from time to time. How can we imagine a world in which we are not creating leaders and citizens who have the capacity to mediate those differences? I cannot imagine it. And so it's with great conviction that I say that we must continue to offer diverse undergraduate education to our young people to save our nation.

- Q. I have one final question, President Simmons: Have you ever testified in a trial before?
- A. No, and I hope never to again.

MR. WAXMAN: Thank you.

THE COURT: Why does everybody say that?

THE WITNESS: It's unaccustomed, Your Honor.

THE COURT: We could use a little diversity on that perspective.

MR. WAXMAN: If I may be so impertinent, has Your Honor ever testified as a witness at trial?

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THE COURT: Yes, I have.
 1
                MR. WAXMAN: Maybe that's the diversity. Thank
 2
 3
     you.
 4
                THE WITNESS:
                              Thank you.
                May I go now?
 5
                THE COURT: No.
 6
 7
                MR. CONNOLLY: Could we have a few minutes to set
 8
     up?
 9
                THE COURT:
                           Yes, of course. You can stand and
     stretch for a minute if you want while he's getting set up.
10
11
                THE WITNESS: Okay.
                MR. CONNOLLY: May I approach the witness?
12
13
                THE COURT: Of course, yes.
     EXAMINATION BY MR. CONNOLLY:
14
          Good morning, President Simmons.
15
     Q.
     A. Good morning.
16
        My name is Michael Connolly. We met at your deposition
17
18
     in Houston.
19
     Α.
          Yes.
     Q. Thank you for being here.
20
                I want to start by talking about how you formed
21
     your opinions in this case. To form the opinions in your
22
23
     reports, you did not conduct any studies or statistical
     analyses, correct?
24
     A. No, I didn't.
25
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- Q. And you also did not talk to anyone currently working in Harvard's admissions office, correct?
- 3 A. I didn't.
- Q. Now, in your report, you write about how diversity is important because it helps people overcome bias and stereotypes that we may have; is that correct?
- 7 **A.** Yes.
- Q. I'd like to talk about some of the things you've done in your career to address the issues of bias and stereotype.

  And you mentioned this morning the report you did for --
- while you were at Princeton.
- There you were asked to investigate issues of racial bias on campus and to see whether the university needed to take actions to remedy this, correct?
- 15 **A.** Yes.
- Q. And you wrote a report called "The Report on Campus Race
- 17 Relations." That contained the findings of your
- 18 investigation, correct?
- 19 **A.** Yes.
- 20 Q. And it contained a number of recommendations for how
- 21 Princeton could address the concerns of bias and stereotypes
- 22 that many minority students had expressed to you, correct?
- 23 **A.** Yes.
- Q. And the report that you wrote has been widely cited
- around the country, correct?

**A.** I think so.

- 2 Q. Now, later in your career, while you were the president
- of Brown, you served on a committee that was charged with
- 4 examining why women faced barriers being hired and promoted
- 5 in the science and engineering departments at colleges and
- 6 universities; is that correct?
- 7  $\mathbf{A}$ . Yes, it is.
- 8 Q. And the committee that was created was created by the
- 9 National Academies of Sciences, Engineering and Medicine,
- 10 correct?
- 11 A. That's correct.
- 12 Q. Now, the National Academies is an organization that has
- members who are the top performer scientists in medicine,
- 14 science and engineering, correct?
- 15 A. Yes. The Academies.
- 16 Q. The Academies.
- And the Academies regularly work on policies to
- improve the fields of science, engineering, and medicine,
- 19 correct?
- 20 A. That's correct.
- 21 Q. And the Academies committee did issue a report, correct?
- 22 A. It did issue a report, correct.
- 23 Q. And that report was called "Beyond Bias and Barriers,
- 24 | Fulfilling the Potential of Women in Academic Science and
- 25 Engineering," correct?

- 1 **A.** Yes.
- Q. Now, your committee put together a PowerPoint
  presentation summarizing some of the findings, correct?
- A. I actually don't recall a PowerPoint presentation. I recall a report.
- Q. Well, it's been a while, so I've included the PowerPoint in the binder. You can refresh your recollection. It's on Tab C108.
- 9 THE COURT: Mr. Connolly, do you have an extra copy 10 of that binder, please?
- Q. And we can also put it up on the screen if that's easier for you.
- So there's the title that we just mentioned. And if you turn to the second page, it's the first tab you see.
- 15 It lists the people that served on your committee. About
- two-thirds of the way down, there's your name, Ruth Simmons,
- 17 correct?
- 18 A. That's correct.
- Q. And you were the president of Brown University when you served on this committee, correct?
- 21 **A.** Yes.
- 22 Q. And the chair of the committee was Donna Shalala,
- 23 correct?
- 24 **A.** Yes.
- Q. And I see a number of people on here, professors from

Berkeley and Harvard and Duke, Yale, MIT. They served on the committee with you, correct?

A. Yes.

Q. Now, if you turn to the second red tab. I'll also put this up on the screen for you.

Now, your committee --

MR. WAXMAN: Your Honor, I don't think there's a foundation yet to ask this witness a question. I believe that she earlier testified that she didn't recall a PowerPoint. And I think if counsel wants to ask her about pages in the PowerPoint, he has to establish that, in fact, she did see this.

MR. CONNOLLY: I'm not trying to admit this in evidence. It was a PowerPoint that accompanied her report. I'm just using it to, sort of as an aid to walk through questions with her.

THE COURT: All right. So he's trying to refresh her recollection.

But why don't you ask her about the substance of what's on the slide rather than the slide itself.

MR. CONNOLLY: Sure.

- Q. Did your committee find that a substantial body of evidence establishes that most people, men and women, hold implicit biases?
- A. I don't remember the exact language that way, but we

- certainly discussed bias in academic life as with regard to women.
- Q. And do you -- so you do not recall in particular whether
  the committee found that a substantial body of evidence
  establishes that most people, men and women, hold implicit
  bias?
- A. Again, that's very specific. This has been many years ago, and I don't remember that language from the report.
- Q. Okay. So I also have a copy of the executive summary of the report in your binder. It is identified as P450. You can turn there to refresh your recollection.
- 12 **A.** 450?
- Q. Mm-hmm. Will you turn to page 4 in the report. You see the bottom right paragraph starting with "A substantial body of evidence"?
- 16 A. Okay, number five.
- 17 Q. Number five, yeah?
- 18 A. I see that.
- Q. If you could read that paragraph. It starts there and then finishes onto the next page.
- Just let me know when you're finished.
- 22 **A.** You want the whole paragraph?
- 23 Q. Not aloud but just to yourself to refresh your --
- 24 A. Just to myself.
- 25 Q. -- recollection about what your committee found.

MR. WAXMAN: Your Honor, if I can just ask that since the witness is not being examined about the PowerPoint that the slide be blanked, the screen be blanked.

THE COURT: Why don't you take the slide down, Mr. Connolly.

A. I've finished.

Q. Okay. Thanks.

Now, after reading a summary of what your committee found, would you now agree that your committee found that a substantial body of evidence establishes that most people, men and women, hold implicit biases?

- A. It's apparent that that's what the committee found. I didn't write the report. The staff wrote the report, but that's in their committee report.
- Q. And you served on the committee, correct?
- **A.** I did.
- Q. And the report of the committee reflects the findings of the committee, correct?
- 19 A. Let me describe how it works.

When a committee of this kind does this work, there is usually a staff that collects the information, writes the report, and the committee as a whole reacts to what the draft is. And so that might mean some of the things in the committee report I agree with and some things I might not agree with but that the majority might have agreed with.

So that's the way it actually works.

So in terms of bias, I certainly would agree that many people hold biases and that it did affect the process with regard to women in science and engineering. But I don't make broad statements about implicit bias.

- Q. If you could turn back one page to page 3. Read the bottom -- the first sentence of the bottom right paragraph starting out with -- and just, again, read it to yourself to refresh your recollection -- starting out, "The report presents the consensus views." Just read the first sentence to yourself.
- 12 A. (Witness reviews document.) I've read it.
- Q. Now, again, would you agree that the report here, at least according to the report, presents the consensus views and judgment of the committee members?
- 16 A. Consensus.

- Q. All right. Now, would you also agree that what your committee found, the consensus views of the committee, was that decades of cognitive psychology research reveals that most of us carry prejudices of which we are unaware but that nonetheless play a large role in our evaluations of people and their work? Would you agree that that is what the committee report found?
- 24 A. Yes, I thought we just said that.
  - Q. And would you also agree that the committee found that

- every study that the committee evaluated found a significant
- 2 effect of bias based on the gender or race of the person
- 3 being evaluated?
- 4 A. I don't think it was framed that way. But -- would you
- 5 say that again?
- 6 Q. Do you recall your committee finding that every study
- 7 that you examined, there was a significant effect of bias
- 8 based on the gender or race of the person being evaluated?
- 9 A. Oh, being evaluated.
- 10 **O.** Yes.
- 11 **A.** Yes.
- 12 Q. Okay. And did your committee also find that there was --
- there was no significant effect of the gender or race of the
- 14 person doing the evaluation?
- 15 A. Repeat that.
- Q. In other words, your committee did not find that bias
- against women in the fields of science and engineering was
- isolated to one race or one gender, correct?
- 19 A. I don't remember that discussion at all in terms of
- relating to race or gender. I think at first you mentioned
- gender and not race, but I don't recall a discussion of the
- 22 bias of women, for example, no.
- 23 Q. You don't recall a discussion of bias of women from what
- your committee found. Is that -- I'm sorry, I don't
- 25 understand.

- A. I don't recall focusing on the bias of women in the report. It's been some time since I was part of this committee.
  - Q. Okay. And after your committee found -- made these findings, one of the recommendations your committee made was that university leaders should educate all faculty members and students about unexamined bias and effective evaluation; is that correct?
- 9 **A.** Yes.

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- Q. Okay. Now, one of the other things your committee found was that there were many women qualified to be professors in the science and engineering departments, correct?
- 13 **A.** Yes.
- Q. And despite this large number of highly qualified women, they were underrepresented in the science and engineering departments of many universities in this country, correct?
- 17 A. Yes, I believe so.
  - Q. And one of the reasons these highly qualified women were failing to advance is that they faced bias and discrimination in the science and engineering departments of universities when it came to hiring and promotion, correct?
- A. I would say one possible reason was that. That's not the only reason.
- Q. Again, could you turn to page 4 of the report that I have in front of you.

- Read the paragraph numbered four, just the very first sentence.
- A. "Women are very likely to face discrimination in every field of science and engineering."
- Q. And you would agree that is what your committee found, correct?
- 7 A. Yes, but that's not what I said.
- Q. Okay. Now, at your deposition we talked about some of
  the conclusions that you've formed and you've reached about
  bias and stereotypes, and you believe that people can develop
  biases through the ways in which they are socialized,
- 13 **A.** Yes.

correct?

1

- Q. For example, we can develop biases from our parents, from the communities we grow up in, and through the things that we endure through our lives, correct?
- 17 A. That's correct.
- Q. In fact, you've said before that we all have biases, correct?
- 20 **A.** Yes.
- Q. But the fact that we grow up in a certain way, that we're conditioned in a certain way, that we experience life in a certain way doesn't mean that we are held to that for all times, correct?
- 25 A. Correct.

- 1 Q. There are ways for us to overcome biases, correct?
- 2 **A.** Yes.
- Q. And one of the ways to overcome bias is through education and training, correct?
- 5 **A.** Yes.
- Q. And this is because through education and training,
  people can overturn the conditioning that they receive as a
  consequence of their lived experience?
- A. I'm not sure that I use the term -- are you quoting me
  when you say "training"? Are you quoting from my deposition?
- Q. Let me -- this doesn't -- let me just ask you if this is
  what --
- A. Could you just tell me whether that that's -- I don't have it in front of me. Are you reading a quote from my deposition? Because I don't recall saying "training."
- 16 Q. I am reading part of a quote from your deposition.
- 17 A. Well, what specifically did I say in my deposition?
- 18 Q. I believe --
- A. Okay. That's okay. I thought you had it in front of you.
- 21 Q. I'll move on.
- 22 **A.** Okay.
- Q. Last question on the subject. You believe that
  interrogation about our biases is a lifelong process for all
  of us, correct?

- 1 **A.** Yes.
- 2 Q. Okay. So I'd like to turn to how Harvard treats
- 3 applicants who are the children of Harvard alumni, what we
- 4 also know to be legacy applicants.
- 5 **A.** Okay.
- 6 Q. Now, you support Harvard's decision to give legacy
- 7 applicants a preference or a tip in the admissions process,
- 8 correct?
- 9 **A.** I do.
- 10 Q. And you also --
- 11 A. Obviously not all legacy applicants.
- 12 Q. I'm sorry, I didn't catch that?
- 13 A. Not all legacy applicants, but the applicants that are on
- a par with the top of the pool.
- 15 Q. You also believe that if Harvard eliminated the
- preferences or tips that it gives to the children of alumni,
- that fewer people would donate to Harvard, correct?
- 18 A. I personally believe so, yes.
- Q. Now, in your report, you cite a study from Coffman,
- 20 O'Neil and Starr. It's entitled "Empirical Analysis of
- 21 Legacy Preferences on Alumni Giving At Top Universities,"
- 22 correct?
- 23 A. I don't have it in front of me, but okay.
- Q. Sure. Well, I'll put it up on the screen for you.
- 25 **A.** Okay.

- Q. This is the -- this is your rebuttal report on page 6.

  It's also in your binder.
  - A. Oh, it is. Okay.

Q. I'm referencing the Coffman study. You write, "It finds that schools with legacy preferences on average have 35.7 percent higher alumni giving than non-legacy preference schools before controlling for family wealth. The study also acknowledges that its model suggests that abolishing legacy preferences would have a deleterious impact on the finances of universities that currently consider legacy status in admissions. In my opinion, such an outcome would be harmful for many private universities whose financial resources affect their ability to sustain the excellence of their offerings and provide resources for low-income students of all races to afford the costs of their education."

That is what you wrote, correct?

- A. Yes.
- Q. Now I'd like to turn to look at the rest of the Coffman study, and that is also in your binder at Defendant's Exhibit 132. I believe it's the first one.

If you turn to page 114 and see the quote from your brief, "The coefficient of 0.357 implies that schools with legacy preferences, on average, have 35.7 percent higher alumni giving than non-legacy preference schools before controlling for wealth. But the authors continue and what

they write is, 'What does this tell us?' This suggests that schools with legacy preferences have higher alumni giving, but it can be explained entirely by the wealth of their admitted students. The fact that legacy preference schools, on average and holding all else equal, have wealthier admitted students is consistent with the notion that elite schools achieve higher giving simply by selecting disproportionately from families of their own wealthy alumni, not that giving legacy preferences somehow changes giving behavior."

Did I read that right?

A. Yes.

Q. And the authors continue further down on page 115. And they wrote, "Thus, it is not that these elite institutions are simply lucky enough to have wealthier families in their student body; instead, the preference policy itself allows, contributes to, and perpetuates overselection from the upper class. Once we control for whatever wealth differences there are, whether exogenous to the selection process or exogenous to the applicant pool, there is no evidence suggesting legacy preference policies contribute to greater giving."

Did I read that right?

A. Yes.

MR. CONNOLLY: Thank you. No more questions.
MR. WAXMAN: If those hearsay statements are being

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offered for the truth, we object. Obviously he's done an
1
     accurate reading of those two sentences.
 2
               THE COURT:
                            They haven't been admitted at all.
               MR. CONNOLLY: This is a study that she relied on
 4
     in her report and I'm asking her questions about it.
 5
                           It's fair game to ask her about it, but
               THE COURT:
 6
 7
     I think he's objecting to their admission and they haven't
     been admitted.
 9
               MR. WAXMAN: I just will correct the record.
               MR. CONNOLLY: And that's fine. We're not seeking
10
11
     to admit.
               THE COURT: Okay.
12
13
               MR. WAXMAN:
                            This is not a study that she offered
14
     in her report. This is a study relied upon by Mr. Kahlenberg
15
     to which she responded.
               MR. CONNOLLY: And we read into the record what she
16
     said about the report, so I think it's clear.
17
18
               THE COURT:
                           Yes.
19
               MR. CONNOLLY: Thank you.
               THE COURT: Redirect?
20
               MR. WAXMAN: No, thank you.
21
               THE COURT: Now you are excused.
22
23
               THE WITNESS:
                             Thank you, Your Honor.
                               So we're early for the lunch break.
24
                   THE COURT:
     Do you want to start on your next witness? Do you --
25
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MR. WAXMAN: Sure. I mean, if -- needless to say, 1 I haven't had the opportunity to confer with anybody about 2 anything, but I think we can probably get started. I mean, other than Your Honor. MR. LEE: He has our permission if he has your 5 permission. 6 7 It will take us a couple of minutes to MR. WAXMAN: set up. Among other things I need to retrieve the book that 8 9 has my list of questions. Your Honor, just one -- I know it's housekeeping, I 10 don't know if it's housekeeping, technical issue. Professor 11 Card has even an older back than Your Honor and has asked 12 13 that if at some point in discussing --14 THE COURT: That seemed very backhanded somehow. Even older than me. 15 I'm sorry. Professor Card himself, to 16 MR. WAXMAN: a point that we will testify about, has described himself as 17 18 on the bubble of retirement and has asked -- we've procured a 19 lapel mic and asked whether if periodically during his testimony we have a large projection screen that has -- that 20 displays what is also on the screens, if he can stand up at 21 appropriate points to illustrate his testimony. 22 That's fine. Even if he wasn't even 23 THE COURT: older than me, that would be fine. 24

MR. WAXMAN: That was an unforced error.

- 1 THE COURT: Agreed.
- 2 (DAVID CARD duly sworn by Deputy Clerk.)
- COURTROOM CLERK: Can you please state your name and spell your last name for the record.
- 5 THE WITNESS: My name is David Card, C-A-R-D.
- 6 EXAMINATION BY MR. WAXMAN:
  - Q. Good morning, Professor Card. Have you been retained as an expert by Harvard in this case?
- 9 A. I have, yes.
- 10 Q. And what is your current position?
- 11 **A.** I'm the class of 1950 professor at U.C. Berkeley.
- 12 Q. And what is your educational background?
- 13 A. I got my undergraduate degree in Canada at Queens
- University in 1978, and I completed my Ph.D. at Princeton.
- The degree was awarded in 1983.
- 16 Q. And what is your field of specialization?
- 17 A. Labor economics.
- 18 Q. And what courses do you teach?
- 19 A. For undergraduates I teach advanced econometrics and for
- graduate students I teach topics in labor economics.
- 21 Q. What is econometrics?
- 22 A. Econometrics is the application of statistical methods to
- problems in economics, generally.
- 24 Q. And what is labor economics?
- 25 A. Labor economics is the field of economics that deals with

- individual decision-making, mostly how people make choices
- over things like what job to take, what level of education to
- get. So it deals broadly with issues of wages,
- 4 discrimination, immigration, things like that.
- 5 Q. Has your research been published?
- 6 A. Yes, I have over 100 book chapters and publications.
- 7 Q. And have you published any work focused on
- 8 discrimination?
- 9 A. Yes. So over the course of my career, I've written a
- 10 number of articles on both gender discrimination and race
- 11 discrimination issues.
- 12 Q. Have you also published a study of the effects of
- race-conscious admissions?
- 14 A. I did one study of that, yes.
- 15 Q. Please turn to Tab 48 of Volume 2 and take a look at what
- 16 has been marked as Defense Exhibit 133.
- Do you recognize that document?
- 18 **A.** Yes.
- 19 Q. And what is it?
- 20 A. It's my CV as of December 2017.
- MR. WAXMAN: Your Honor, we offer Defense Exhibit
- 22 | 133.
- MR. MORTARA: No objection, Your Honor.
- 24 THE COURT: It's admitted.
- (Defendant Exhibit 133 admitted into evidence.)

- Q. Professor Card, since the time of your report, have there been any significant changes in your CV?
  - A. I've stepped down, my term as director of labor studies program at the NBR ended. And I've had a number of new publications and new working papers and so on, yeah.
  - Q. Please turn to page 2 of Defense Exhibit 133, and if we could have this highlighted, Mr. Lee.

Does this fairly list your professional accomplishments, awards, and publications? I guess we only have the awards and prizes first.

Does that fairly list the awards that you've received for your professional work?

A. Yes, some of them, yes.

- Q. Now, we've heard quite a bit already about the John Bates Clark Prize. So let me focus you on the Frisch Medal and ask you if you can explain what the Frisch Medal is.
  - A. The Frisch Medal is an award that's given every second year for a paper published in the Journal of Econometrica, which is, I guess, the foremost journal for research studies in econometrics, and I won that award with my coauthor, Dean Hyslop, in 2005.
- Q. And what is the IZA Prize in Labor Economics?
- A. Well, IZA is a research institute in Germany, a large institute, and the Prize in Labor Economics, it specializes in labor economics. And the prize is an award they give

every year, sort of a lifetime achievement award, I quess. 1 And I won that award with Alan Krueger in 2006. 2 Have you ever testified in a trial before? Q. No, I have not. 4 Α. MR. WAXMAN: All of my expert witnesses. 5 THE COURT: I know. They're all happy to be here, 6 7 too. Q. And what were you asked to do, Professor Card, as an expert in this case? I was principally asked to look at four main questions. 10 And have you prepared a set of demonstratives to assist 11 0. you in your testimony today? 12 13 Α. I have, yes. 14 Ο. So let's look first at Demonstrative 10.2, and let me have you explain what questions you were asked to address. 15 So the first question is whether statistical evidence 16 supports the plaintiff's claim that Harvard discriminated 17 18 against Asian-American applicants. 19 THE COURT: Can I stop you? Do I have this? Is it in one of the binders? 20 MR. WAXMAN: Have I not given a set of 21 demonstratives to the court? You certainly should and you 22 will. 23

THE COURT: Old people like me do better with

24

25

paper.

MR. WAXMAN: Somebody even older than Your Honor 1 will provide it. 2 3 THE COURT: If there is such a person in the 4 courtroom. Is it in one of the binders? MR. WAXMAN: Yes, it's in a binder. 7 THE COURT: One of the binders I have? MR. WAXMAN: I believe we provided it to Karen. 8 9 COURTROOM CLERK: Yes, I gave it to her. MR. LEE: Tab 63. 10 MR. WAXMAN: And we're at Tab 63. Tab 36 has all 11 the demonstratives. 12 13 THE COURT: Excellent. Thank you. 14 Q. So what questions were you requested to address? The first was whether statistical evidence supports the 15 plaintiff's claim that Harvard has discriminated against 16 Asian-American applicants in its admissions decision. 17 18 The second question was to what extent does race affect admissions decisions at Harvard. 19 The third question is, is there statistical 20 evidence that Harvard has engaged in racial balancing. 21 And the fourth question I was asked to examine, how 22 23 Harvard's admitted class would change if it were to eliminate the consideration of race and pursue some of the race-neutral 24

alternatives that have been proposed.

Q. Now, Professor Card, we're going to be spending some considerable time examining your analysis on each question. But can we begin by just asking at a high level what you concluded with respect to each?

## A. Yes.

So with respect to the first question, my conclusion is that the statistical evidence does not support the claim that Harvard has discriminated against Asian-American applicants.

With respect to the second question, my conclusion is that race is a factor in admissions at Harvard. It's one of the factors that is valued in some candidates. It has a comparable effect to other positive tips or awards that Harvard gives or preferences that Harvard gives to different students. And it's never a situation where race alone is individualistically determinative of a student's admission.

On the issue of racial balancing, my conclusion is there's no statistical evidence that Harvard has engaged in racial balancing.

And finally on the issue of race-neutral alternatives, my conclusion, which is very consistent with large existing research data, is that Harvard, if it were to eliminate directly the consideration of race and use race-neutral alternatives, it would face a trade-off in that using race-neutral alternatives would necessarily, to achieve

higher levels of diversity close to or roughly similar to the levels of a diversity, it would involve a reduction in the quality of the class.

So there's a trade-off there.

- Q. Dr. Card, were you here for Dr. Arcidiacono's testimony?
- A. I was, yes.
  - Q. Did you hear him testify about a, quote, Asian penalty?
  - A. Yes.

1

- Q. What did you understand him to mean by "penalty"?
- 10 A. Well, my interpretation of what he was saying is that
- there are really three components of that. The first
- component is that if there is, in the admissions process, if
- there is, for example, a positive preference for, say,
- 14 Hispanic and other types of people in the admissions process,
- that that necessarily is a disadvantage or discrimination
- against Asians and, I guess, non-Hispanic white candidates.
- 17 So that was one component of what he said.
- 18 The second was he was directly asserting that
- 19 relative to white applicants, white domestic applicants,
- 20 Asian-American applicants face a negative disadvantage in
- 21 admissions.
- 22 And the third assertion I think he was making was
- 23 that the mechanism for that was largely through
- 24 discrimination or negative assessment of the personal rating
- of Asian-Americans.

- Q. Do you agree with him?
- A. No, I disagree on all three issues.
- Q. Why not -- or why?

A. Well, first, with respect to the issue of a positive benefit for one, say, underrepresented minority group is equivalent to a negative discrimination or discrimination against other groups, I disagree with that. I don't think that's the right way to think of the issue, and I certainly don't think that's the way that Harvard does it.

The way they're thinking of it is there's a way for well-qualified candidates who have a level of academic qualification and extracurricular qualifications and so on, for those candidates race then can be an additional tip; just like being an accomplished musician can be a tip or being from a sparse country, as the dean would say the other day, or having, say, a strong athletic record.

And so I don't think it's appropriate to think of there being discrimination against people who don't play the cello as well as Yo-Yo Ma just because Yo-Yo Ma is so accomplished in that. And similarly, I don't think it's appropriate to think of a positive benefit for an underrepresented group as necessarily representing negative discrimination against others.

Secondly, on the issue of the difference between Asian-American applicants and white applicants in the

admissions rates, I think that the statistical evidence is very clearly not a showing of evidence of discrimination. And I think a proper analysis of the overall admissions procedure does not show that.

And finally, with respect to personal rating, I also think that an evaluation of all of the evidence, including the other ratings that are awarded, and a consideration of all of the available evidence definitely does not support the claim that there's discrimination in the personal rating.

Q. Let's turn to the work that you did in this case.

Did you review documents and data about Harvard, the Harvard admissions process in the course of forming your opinions?

A. I did, yes.

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- 16 Q. What did you review?
  - A. Well, I started with a lot of material that Harvard uses; for instance, training admission officers. There's publicly available material on the Internet about their admissions process. By the time I was working on my report, some of the admissions officers had already been deposed, and so I read some of those depositions.

So I looked at that kind of material.

Q. Did you also examine data from the Harvard admissions database?

- A. I did. I was given access to data for a series of classes, admissions classes for the classes of 2014 to 2019.

  And these data are coming from the NEVO database that Harvard uses to store information and process it about the characteristics of admitted applying students.
  - Q. Did you also evaluate material that had been provided to you or provided in this litigation from the college board?
  - A. Yes.

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So an additional supplemental set of data comes from the college board, and that contains a lot of background information about the schools and neighborhoods of the places where the students are coming from who are in the application database.

- Q. Now, over the course of my examination of you, we're going to be reviewing a range of data regarding Harvard admissions, correct?
- 17 **A.** Yes.
- Q. And some of the data is going to relate to racial groups.

  Do you understand that?
- 20 **A.** Yes.
- Q. And to be clear, we're going to be looking at average group data, correct?
- A. Yes, by nature of a statistical analysis, I'll be reporting data about averages of differences between groups, for example.

- Q. But does the data itself show variation among individuals within any particular group?
- A. Yes, certainly. In fact, there's enormous variation
- 4 within any of the groups, within any racial group. So
- 5 there's, in fact, substantially more variation within, say,
- 6 the white population or the Asian-American population than
- 7 there is in the small difference between their averages.
- Q. So if I refer to any racial group, will you understand me to be referring to average group data?
- 10 **A.** Yes.
- 11 Q. And will you understand I'm not referring to every single
- individual, just the average group data?
- 13 A. Yes, certainly.
- Q. Please turn to Tab 1 in Volume 2 of your binder, which is
- 15 Exhibit 669. What is this document?
- 16 A. This is an exhibit that shows the number of domestic
- applicants per year in the database that both Professor
- 18 Arcidiacono and I analyzed the number of admitted students
- 19 and average admission rate.
- 20 Q. Is this a summary that you created?
- 21 **A.** Yes.
- 22 **Q.** Did you prepare this summary using data extracted from
- 23 Harvard's admission database?
- 24 **A.** Yes.
- 25 Q. And is that data maintained in the ordinary course of

- 1 Harvard's business, to your knowledge?
- 2 **A.** Yes.
- 3  $\mid$  Q. Approximately how many fields of data did you analyze
- 4 from Harvard's database?
- 5 A. Well, certainly I would say over 200 because there's 200
- 6 variables used in most of my models.
- 7 Q. Did you rely on this summary in forming your opinion in
- 8 this case?
- 9 A. Yes, I certainly did.
- 10 Q. Does this summary fairly and accurately reflect your
- review and analysis of the data we've discussed?
- 12 **A.** Yes.
- 13 Q. Now, over the course of your examination, will we be
- 14 looking at other summary exhibits?
- 15 A. Yes, quite a few.
- 16 Q. I may ask you these tedious questions again, but does
- each reflect your review and analysis of the Harvard
- 18 admissions data?
- 19 **A.** Yes.
- MR. WAXMAN: Your Honor, we offer Defense Exhibit
- 21 669.
- 22 MR. MORTARA: No objection.
- THE COURT: It's admitted.
- 24 (Defendant Exhibit 669 admitted into evidence.)
- 25 Q. Professor Card, please turn to Tab 3 in Volume 2.

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Do you see defense Exhibit 671?
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     A. Yes, I do.
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     Q. What is it?
     A. So this is an exhibit number of applicants to the class
     of 2019.
                   MR. WAXMAN: Your Honor, we offer Defense
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     Exhibit 671.
               MR. MORTARA: No objection, Your Honor.
               THE COURT: It's admitted.
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                (Defendant Exhibit 671 admitted into evidence.)
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     Q. Please turn to Volume 4, Professor Card, and look at
     Defense Exhibit 672.
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               Do you have that?
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     A. Yes.
     Q. What is it?
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     A. It's a tabulation, applicants and admitted students by
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     profile ratings combinations.
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                   MR. WAXMAN: Your Honor, we offer Defense
     Exhibit 672.
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               MR. MORTARA: Also no objection, Your Honor.
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               THE COURT: Admitted.
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                (Defendant Exhibit 672 admitted into evidence.)
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     Q. Let's look, Professor Card, at Defense Demonstrative
     10.3.
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               What is this showing?
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**A.** So this is data for the class of 2019 admittees, and this is some characteristics of the applicant pool, so that — the set of students who have applied, and what I'm showing is an extremely important characteristic of the applicant pool at Harvard.

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The applicant pool at Harvard, as I think everyone knows, is extremely well qualified, but in particular, they're extraordinarily well qualified on academic dimensions.

And so for benchmark purposes, the green line along the axis shows the number of domestic admitted students in the class of 2019. So that was 1,756 students in total. And just to understand the overwhelming abundance of academic excellence, for that class, there was 2,741 students who had a perfect SAT verbal score. There was 3,450 who had a perfect SAT math score, so roughly twice as many as there were total domestic slots. There was around 8,200 who had a perfect GPA. And there would be something around 5,000 students who would be in the top two deciles of what Professor Arcidiacono was calling the academic index, which is an index of SAT and GPA and class rank. And that would be equivalent to students who essentially have nearly perfect SATs and nearly perfect GPAs and so would be considered on the basis of SAT and GPA to be extremely highly accomplished.

Q. Professor Card, let's turn to Demonstrative 10.4. And

can you please explain to the court what this shows?

A. Yes. So this is now showing on average across the six admission cycles that I'm going to be talking about extensively, this is showing the fraction of students on average who achieve a rating of 1 or 2 on each of four key dimensions.

So key dimension one would be their academic rating; second would be their extracurricular rating; third would be their personal rating; and fourth would be their athletic rating.

So these are the profile ratings that we've heard a lot about in the case so far.

And just as a reminder, 1 or 2 is actually quite a high level of accomplishment. A 1 is an extremely high level of accomplishment, but 2 is very, very solid. I'm not sure I would have ever gotten any 2s myself.

So this shows that in this on average amongst all of these four dimensions of strength, I'm going to call these strengths, these four dimensions of strength, academic strength is by far the most common dimension of strength. So 42 percent, roughly, of all applicants to Harvard, all domestic applicants, have an academic 1 or 2, which means they're extremely well qualified academically.

By comparison, the other three attributes are much less common. So only 24 percent have an extra-curricular 1

or 2. Only 21 percent have a personal 1 or 2, and only around 10 percent have an athletic 1 or 2.

So emphasizing the relative abundance of academic strength, there are substantial more students who are highly qualified on an academic dimension than on these other dimensions.

And I should say this is not to say that these are the only dimensions of strength that Harvard cares about. These are just the four profile ratings. There are, of course, other dimensions of strength like extraordinary music skill or things like that that would be on top of this.

- **Q.** How does the abundance of academic strength affect Harvard's admissions process?
- A. Well, in my view, it's really one of the most important, if not the most important thing, to understand about the admissions pool at Harvard, and also to understand this case.

Because one can see by the previous slide, for example, if one was just focusing on SAT and GPA, there's just an incredible numbers of students with virtually perfect scores and virtually perfect GPAs. So academic strength is not really sufficient to distinguish amongst this huge pool of academically qualified students, and that's not what they do. Instead, what they're looking for is students who have multidimensional strengths. A student who is well-qualified academically but in addition has extracurricular strength and

a personal strength, and, if possible, athletic strength.

So they're looking for what I would call a multidimensional accomplishments.

- **Q.** How much of the Harvard applicant pool is strong on multiple dimensions?
- A. A relatively low fraction. Something like only 7 percent have actually got a 1 or 2 on three of these categories. So the relative importance of that is quite low.

MR. MORTARA: Your Honor -- Your Honor, I don't want to be interrupting Mr. Waxman's examination. Subject to the discussion that we had earlier, about wedges and noses, I'm going to not object to this. I'll let you know when I'm going to have an objection, if that's okay.

THE COURT: Okay.

MR. WAXMAN: Is this the camel's nose?

MR. MORTARA: I think it was a nose in the tent and a wedge in a door.

MR. WAXMAN: Got it. Okay.

- Q. Looking at Demonstrative 10.5, what does this show?
- A. So this is more of a complete characterization of the applicant pool. So it's a bit confusing because there are applicants and admissions and admitted pools and so on. So this is the overall number of people who apply to Harvard, domestic applicants over these six years. So that's about 150,000 students.

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And looking at that group, about three-quarters have only one dimension of strength. So that would be the vast majority of students while well-qualified in many senses, when we look at these four ratings would only have 1 or most 1 of those ratings of a 2 or better. A much smaller fraction of students would be like around 20 percent, would have two strengths. So they might have say an academic 2 and an extracurricular 2 or academic 2 and an athletic 2.

Then as I mentioned before, the set of students with three or more strengths, so these would be very strongly multidimensional students, students who have an academic 2, a personal 2 and an athletic 2, that's only 7 percent. And these groups with two or more strengths represent about 7,000 applicants per year.

So even focusing on this sort of multidimensional group, there's still a big process of winnowing that down to get to the 1,700 or so that are going to be admitted.

Q. Mr. Lee, please show Demonstrative 10.6.

And let me ask Professor Card whether you can explain what this shows?

**A.** Yes. So this is a simple demonstration of this extreme importance of well-roundedness or multidimensionality to the admissions process at Harvard.

So focusing at the left of the graph on the fraction of -- so on the students, this is the three-quarters

of students who have one strength or not even that. Their admission rate is only around three percent. So having one dimension of strength is only going to give you an admission rate of about three percent. The overall average admission rate is around 7 percent, so this is much below average.

If we go to students that have two strengths, that's the yellow bar, that second strength is having a big effect on their probability of admission. So whereas the first strength gave them a three percent probability of admission, second strength is going to raise their probability of the admission by 11 percentage points, up to 14 percent.

So the second strength is more valuable than the first.

And when we go to the third strength, so students with the three strengths I mentioned before, this is now only 7 percent of the applicant pool, but you can see now that group has a 46 percent admission rate on average.

And you can see that compared to the second -- the group with only two strengths, the value of that third strength is really large so that we're going from 14 to 46 or we're increasing the probability of admission by 32 percentage points with that third strength.

And even among students with three strengths, if we go all the way to 4, that fourth strength is also extremely

valuable. You're going from 46 to 70 percent admission rate, so you're going to increase the probability of admission by 25, 24 points.

So one can see this very important feature, that it's not -- one strength alone really doesn't do much for you. You're below average. And if we focus in particular amongst the one strength group is the group that are strong just on academic and their probability of admission is even below three percent, a little bit lower than that.

So a group of students that are strong academically but have no other strengths have below average admission rates.

- Q. So what if you're a superstar on academics? I assume that the left-hand bar includes the academic 1s?
- 15 A. Yes, it does.

- Q. What if you're a superstar; is that enough to be admitted to Harvard?
  - A. Yes, I think the next demonstrative will show that.
- Q. In that case, please, let's have the next demonstrative.

  What does Demonstrative 10.7 show?
  - A. So let me remind you, the academic 1 is an extraordinary level of accomplishment, so this is not really like just good SAT and GPA. This is only 100 students or 150 students a year that have extraordinarily high level of accomplishment. So they would be students that have virtually perfect scores

in most cases but in addition have competed in national contests and math contests or science contests and won. So this would be an extraordinarily high level of accomplishment.

so amongst that group of students, with no other 2 rating, so this is like academic superstars, their probability of admission of 40 percent. So that's quite good considering that's only a single strength. But for that group of students, adding one additional strength increases their probability of admission by 35 percentage points, from 40 to 75. And even among that group, the third strength increases probability of admission by another 20 percent.

So even amongst somebody who is an academic superstar, additional strengths are quite important.

- Q. Let's turn now to Demonstrative 10.7 and let me ask you what this shows.
- A. Yes. So this is a side-by-side comparison of the composition of the applicant pool. So this is the group of students who apply to Harvard on the left versus the admitted students. So those are the ones who actually get accomplish -- get admitted.

And a reminder that strength represents a profile rating of 1 or 2 on any of these four dimensions. So the applicant pool is sort of one-dimensional. 73 percent have one or fewer strengths. Only 20 percent have two strengths,

and only 7 percent have three or more strengths.

When we look at the admitted pool, the set of students who actually get admission, almost half have three or more strengths. So they're going from 7 percent of the admitted pool to nearly half — excuse me, 7 percent of the application pool to nearly half of the admitted pool. So their representation in the admitted pool is seven times larger than their representation in the application pool.

Similar in the 2 strength group, their representation is about double, so they're 20 percent of the application pool, 38 percent of the admitted pool, and only 15 percent of all students admitted have only one strength.

- Q. Now, to set the stage for the next slide, Dr. Arcidiacono testified, did he not, that Harvard's admissions office discriminates against Asian-American applicants as compared with white applicants, correct?
- A. Yes.

- **Q.** How did Dr. Arcidiacono characterize the strength of the average Asian-American applicant as compared to the average white applicant?
- A. Well, throughout his presentation, at trial the other day, he was emphasizing the academic index. So many of his charts had deciles of the academic index.

The academic index is a construction used to monitor compliance with Ivy League athletics rules. So it

- has a formula that takes SAT and GPA and constructs an index.
- 2 And he was using that as an index and focusing on differences
- 3 across academic index.
- Q. So do you agree with his conclusion that -- his characterization that applicants -- that Asian-American applicants are much stronger than white applicants?
- A. I agree with his characterization that they're stronger
  on the academic dimension. I think there's no doubt about
  that. But I would not use the academic index as a measure of
  strength because as we see in this chart, having one
  strength, just being strong academically, as we saw in the
  previous chart, even being a superstar academically is not
- really sufficient to guaranty admission.

  Q. Did you examine whether white applicants and

  Asian-American applicants differ again on average in how many
- strengths they have?
- 17 A. Yes, I did, yes.

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- Q. Let's look at the next demonstrative, and let me ask you what Demonstrative 10.9 shows.
  - A. So this is focusing on presence of three or four strengths, which I've emphasized that's about half of the overall set of students who end up getting admitted. And this is comparing between white applicants on the right in red and Asian-American applicants on the left in blue.
    - So there's about 7.6 percent of Asian-American

students have three or more strengths versus 8.8 percent of white students, white domestic students have that. So that's equivalent to something like 500 students per year Asians versus 900 students per year whites.

And so that difference, the 900 versus 500, is a very important thing to keep in mind when looking at the overall characterization of the set of students who are admitted because, of course, there's nine versus five, nine-to-five ratio in terms of the relative representation in this three-strength group.

- Q. So is that difference that you've just described meaningful?
  - A. I think it's extraordinarily meaningful and helpful in understanding many aspects of the case, yes.

THE COURT: When you get a good spot for lunch, I'm hungry and Kelly has been going all morning.

MR. WAXMAN: I believe that I'm just about to -well, I can stop at any time. I have about maybe ten minutes
to go before a logical break.

THE COURT: Okay. Go ahead.

- Q. Did you examine whether white and Asian-American applicants have different relative strengths across the four dimensions that you've been discussing?
- A. I did, yes.

Q. And what does Demonstrative 10.10 show?

A. So this is showing, I think, a point that we just talked about to some extent if we look at these four dimensions of strength.

Now, again, I would emphasize that these are not the only dimensions of strengths that are important, but these are the four profile rating measures so they're quite important in the process.

Asian-Americans are more likely to have academic strengths so they're -- 60 percent of overall set of Asian students who apply to -- domestic students who apply to Harvard get an academic 1 or 2 versus 46 percent. So this is a very important fact that Asian-American students are, in fact, better qualified on the academic dimension than white students or other groups, in fact.

When we look at the extracurricular dimension, they're not too different than the white students. And then when we look at the other two dimensions, you can see that on the personal dimension there's a gap. And on the athletic strength dimension 1 or 2, there's also a gap.

And so when you put these three, four pieces together, the multidimensional advantage coming for the white students is coming because although there's a higher academic strength in the Asian students, there's a higher personal and higher athletic strength in the white students and that adds up to a multidimensional strength, a more balanced set of

- 1 students.
- Q. Were you here during the opening statements in this case?
- $\mathbf{A}$ . I was, yes.
- 4 Q. Did you hear Mr. Mortara say that the athletic rating
- 5 does not matter for anyone who is not a recruited athlete?
- $6 \mid \mathbf{A}$ . I did, yes.
- 7 Q. You agree with that?
- 8 A. No, not at all.
- 9 Q. Please turn in Volume 2 to Tab 5 and look at Defense
- 10 Exhibit 673.
- Do you have it?
- 12 **A.** Yes.
- 13 Q. What is it?
- 14 A. Probability of admission for applicants with different
- profile ratings.
- MR. WAXMAN: Your Honor, we offer Defense Exhibit
- 17 673.
- 18 MR. MORTARA: No objection.
- 19 THE COURT: It's admitted.
- (Defendant Exhibit 673 admitted into evidence.)
- 21 Q. Let's turn now -- thank you.
- Let's turn now to the next demonstrative, Mr. Lee,
- 23 10.11.
- 24 What does this show?
- 25 A. Well, contrary to the opening statement, this is an

illustration of the importance of an athletic rating of 2. So this is not an athletic rating of 1, these are not looking at recruited athletes, this is looking at the importance of having an athletic rating of 2, which would be the kind of students who would be strong, expected to participate, say, in the club level as President Simmons was talking about in her testimony a minute ago.

So if we look at admission rates on the vertical axis for applicants with one other strength, so suppose they've got an academic strength, so that means they've got a 1 or 2 academically, their probability of admission as we saw before was quite low, 2 percent. If we then combine that with an athletics rating of 2, their probability of admission goes up to 8 percent. So there's a significant gain in the probability of admission, four times higher.

If we take applicants with two other strengths, so suppose a student that has an academic 1 or 2 and an extracurricular 1 or 2, that's already a pretty good group, so their probability of admission is around 13 percent, twice the average for the overall pool. But if we combine that with an academic -- excuse me, with an athletic 2, their probability of admission rises from 13 percent to 32 percent. So there's a very large -- almost a 20 percentage point increase in their probability of admission from having athletic 2.

And similarly for students, even for students with 1 three other strengths on the far right, so they've got an 2 academic 2, an extracurricular 2, and a personal 2, which is a pretty high level, going to the -- completing the set by having an academic -- or excuse me, an athletic 2 would raise 5 their probability of admission by another 18 percentage 7 points. So across the board, having an athletic rating of 2 is extremely important and valuable in the process. 9 So to sum up, is it fair to say that athletics matters in 10 0. 11 the admission process?

- 12 A. I think it's fair to say that, yes.
- 13 Q. And is it fair to say that multidimensionality matters?
- A. I don't think it's possible to emphasize too much just how important multidimensionality is. It's really the defining feature of the admissions process.
  - MR. WAXMAN: Your Honor, this is an appropriate stopping point.
  - THE COURT: All right. Why don't we come back at 1:15. Does that work for everybody? Okay.
  - MR. WAXMAN: Yes, Your Honor, thank you.

    (Recess taken, 12:28 p.m.)

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\*\*\*\* AFTERNOON SESSION \*\*\*\*

2 [Sidebar sealed and redacted.]

THE COURT: When you're ready, Mr. Waxman.

4 BY MR. WAXMAN:

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- Q. The good afternoon, Dr. Card. Did you construct a statistical model of Harvard's admissions process?
- A. Yes, I did.
- $\mathbf{Q}$ . And why did you do that?
- 9 A. That would be completely the standard type of model to
  10 use in analyzing something like an admissions decision which
  11 is in the context of a case like this with many different
  12 attributes of candidates that need to be taken into
  13 consideration and making a determination about one particular
  14 feature like ethnicity.
- 15 Q. And what kind of model did you construct?
- A. So just like Professor Arcidiacono, I used a multivariate logistic regression model.
- 18 Q. What is a regression?
  - A. So a regression is a statistical technique, widely used in economics and other fields, where you try to statistically describe the relationship between a series of inputs or factors, sometimes called. So those would be -- in the context of the admissions case, those would be things like gender of a student or where they're from, characteristics of their high school, their transcript, and so on, and relate

those to an output. In this case the output would be are you admitted or not.

- Q. When you call something a multivariate logit regression, what does that refer to?
- A. Unpacking the first part, "multivariate" means that it's going to try and simultaneously take account of multiple factors. The interpretation that arises in a multivariate regression means it shows the effect of any one of those factors, holding constant the other factors.

So for instance, if I was looking at a model of, say, retirement, which I'm going to present as a hypothetical, and I was trying to look at the effect of higher and lower salary on the effect of retirement, I would be trying to simultaneously do that while holding constant other factors like a person's age. Multivariate regression allows one to isolate the effect of one factor, holding constant the other factors.

- Q. What does it mean to say that a multivariate regression is logit or logistic?
- A. Logit or logistic is a special form of regression model that's specially designed to handle a situation where the output that you're modeling is a yes/no type of output, in this case admissions decision. So you're either admitted or not. So it's going to give rise to for each person, it's going to assign a probability that they are admitted.

- Q. And did Dr. Arcidiacono also construct a multivariate logit regression model?
- A. Yes, he did.
  - Q. Have you prepared an illustration of how a multivariate logit regression works?
- 6 A. I have, yes.

- Q. Can you please describe what illustration you're going to be using for the Court?
  - A. Well, as I just mentioned, I'm going to try and explain some of the concepts in a multivariate regression model and some of the specific concepts that arise in a logistic regression model with reference to a very simple example abstracted from the terms of the case completely to try and keep it isolated on the concepts rather than any particular slant.

I'm going to try and use a set of people who are working at a company, observed at a point in time. And over the next year, some of them are going to retire and some of them are not. So imagine 5 percent of these people are going to retire. So that's the output variable, yes or no, do you retire or not.

And I'm going to be thinking about a situation, at least to begin with, where there are potentially two important characteristics of people: their age, which obviously is important, and also their salary. To keep it as

simple as possible, I think it would be helpful to have a situation where their salary could either be high or low.

So each person will differ depending on -- about their ages, which say could be between 25 and 75. Then in addition they'll have a high or low salary.

I want to think of a scenario where, as is true in real life, on average older people have a higher salary. But it isn't strictly so. So there's young people and, on average, most young people have low salaries. But some young people, the high performers, I guess, have higher salaries.

And then in the older group on average the salaries are higher, so the average fraction of people in the older group is higher for them, but there's also lower salary people in that group.

Q. So suppose that you now -- we have in mind a simplified hypothetical in which the outcome is retire or not in the next year. And the model has available to it, I think you explained two variables: age and whether they have a lot of money or -- or a high salary or a low salary.

Now, suppose you omit from your regression the worker's age and just the model now only knows salary. What might happen to the model's calculation of the estimated effect of salary?

A. Right. So what would happen, and the way a regression model works is if you exclude variables or they're not

available to the model, the model does the best job it can in trying to explain the outcome.

In the case where I only had data on salary and the only information that's available to predict who retires and who doesn't and make this assessment is just their salary, not their age. And imagine, for example, that age is a strong determinant of retirement; salary may or may not be.

But in the absence of this information about age, the model is going to see, well, on average the people who had high salaries seemed to be the ones who were retiring. People who had lower salaries were not so likely to retire. So it's going to derive an estimate of the effect of salary which suggests that salary has a positive effect on retirement.

And the way that's usually thought about is in terms of -- there's two parts of it: a coefficient in the model, and then an effect for each person.

Q. Let me just stop you there.

We've heard testimony in this case both about coefficients from a model and also about something called the average marginal effect or marginal effect.

Can you explain the two?

A. Yes. I'll try. It's an important difference between these two. The way the model is going to work is it's going to -- after the estimation is finished, there's going to be a

set of coefficients which represent the relative weights of each of these characteristics or features or variables in the probability of retirement.

And actually Professor Arcidiacono referred to those coefficients in his demonstrative. So he was able to show — discuss this in a demonstrative and show there's some coefficients associated with each factor.

Now, once the model is constructed, there's going to be a predicted probability for each person given their characteristics that they retire. And what one does when one's looking at the effect of an individual characteristic, so imagine in general — not in the specific case we're talking about with only the information on salary, but imagine in general that one has a lot of different characteristics, and for any given characteristic, one can imagine, for example, the probability of retirement from the model when that characteristic is present, and then the probability from the model for the same person when that characteristic is absent.

And that difference in probability is the marginal effect for that person of that characteristic. So for example, in my simple hypothetical, I could imagine in the absence of other information that having a high salary might lead to a predicted probability of retirement that might be like 4 percentage points higher than for other people that

have low salaries.

And so there's a very important characteristic of a logistic model, and this can be -- will be, in fact, very, very important in understanding a lot of different dimensions of this case.

And that is that that effect, the marginal effect for any one person will depend on their other attributes. So in general, the coefficient is not enough information to tell what the effect is. One needs to know all the other characteristics to say when I take one individual characteristic like, for instance, higher salary and then turn that on and turn it off, is the lingo we would use, or make it happen and make it not happen, that marginal effect can differ.

The way that it's usually summarized, and we've summarized it throughout this case, is in terms of the average marginal effect. And the average marginal effect is the average of this marginal effect, for example, of higher salary across all the people in the sample. And it can be quite different for different people in the sample, and this summarizes it in a very important and useful statistic.

Q. So for example, just so make sure that Her Honor understands this, the simple model that -- let's say we now have both variables, age and high salary and low salary. The model would, if I understand you, calculate a coefficient for

each of those two variables, correct?

A. Yes, it would.

- Q. But again, if I understand your testimony, the marginal effect that that factor, either an additional year of age or a higher salary has will vary across the population depending on, for example, what their age is, whether they will be 25 in the next year or 65?
- **A.** Yes. Would it be helpful for me to use the whiteboard to try to explain the difference in these two?
- Q. It would be. I don't know if it would be helpful to Her Honor, but I think it might be helpful to you.

THE COURT: Or you.

MR. WAXMAN: Yes. It would be very helpful to me. Not as helpful as the little animations about people retiring, but . . .

A. So after the model is estimated, say the sparse model. So over here I'm going to have, say, the sparse model. And it's going to have an average marginal effect for salary, and that could be, like, 4.0. And there might be a star. Okay?

And so the way to interpret that in the sparse model, that there's no other factors in that model, but the way to interpret it in general is holding constant everything else about the person. On average, going from a low salary to a high salary across everybody increases their probability of retirement by 4 percentage points. So the 4.0 is the

extra percentage points in the probability.

- Q. If a worker with a relatively low salary had a 2 percent probability of retiring in the next year, what would that sparse model predict?
- A. This model would predict on average that the increment of probability across everybody is 4 percentage points. But for somebody who is, say, relatively young now, not in the sparse model because the sparse model can't distinguish between people. So the sparse model, having no other information, essentially assumes that everybody gets the same average marginal effect.

And the star is the convention that we use to indicate statistical significance at the 5 percent level.

- Q. We've heard about this at least once, but could you explain what that means?
- A. Yes. So if you have a sample of data and you estimate a model, the particular estimate that you get can vary a little bit from sample to sample. And you might have a situation where there's truly no effect, where there really is no effect of salary on retirement. But in some particular sample you would have an estimate that might be a positive or a negative. And so the statistical significance gives an indication of how likely the estimate you got could have occurred by chance when the true answer was zero.

So it says -- when you see a star, it means it's

quite unlikely. It's less than 5 percent chance; that's why the 5 percent significance level. It's less than 5 percent chance that you would have got this number when the truth was there was no effect. So it gives a sense is this really different than zero, given the data you have. So people say it's statistically significantly different than zero at the 5 percent level, for example.

- Q. Is it possible to construct a graph showing how average marginal effect works in this very sparse example only looking at the age of the workers?
- A. If it's possible, I'd like to go on and talk about the richer model now and allow us to discuss the concept of omitted variable.

THE COURT: Hold on.

You're saying on that model, if all you have is salaries, it's going to be like a straight correlation between age and retirement, right?

THE WITNESS: It's going to do this kind of crazy thing of saying everybody with higher salary is more likely to retire because it doesn't have any other information to make the prediction. So it's only going to make two predictions. Everybody that has high salary, like we could imagine that — let's suppose in the data, the average probability of retirement for people with low salary was 2.0 percent per year. This would say the average probability

of retirement for people with high salary would be 6.0 percent per year. And that difference is the average marginal effect. And that's the only thing it has in the model, so that's the only thing it can distinguish people by.

THE COURT: Okay.

THE WITNESS: So now let's consider the richer model.

So in a richer model, I would have both -- I have two AMEs, AME for salary and AME for age. I'm thinking of the age case as the average marginal effect of each additional year of age. So no one wants to do this, but we could all get one year older, and we could see whether that increased that probability of retirement.

BY MR. WAXMAN:

- 15 | Q. Not Her Honor.
- 16 A. None of us want to get older.

So in this case, I'm going to imagine if the model had access to both salary and age, I'm going to imagine a scenario where age is actually quite an important driver of retirement.

So this could have -- let's imagine this effect is, say, a 2.0, and that's statistically significant. So that says each additional year of age increases your probability of retirement on average across all the people by 2 percentage points. And then in this case, I'm going to

imagine that once you control for age then this falls to 0.6 and it no longer has a star.

Q. Why does that happen?

A. Yes. So this is the important concept of an omitted-variable bias. So this sparse model doesn't have access to information by age. So this model, only having information on salary, is making the best prediction it can, given salary, and says, well, if you only tell me salary, people with higher salary are more likely to retire. And that's a true fact. And that difference is statistically significant.

However, the richer model now with access to two pieces of information, the interpretation of this variable is what's the average marginal effect; in other words, the effect on average across all people of giving a higher salary when you control for age.

So in the multivariant model now, there is not a statistically significant effect and it is actually positive, but it's not statistically different than zero, so we could think of it as roughly zero. So that says in a model that has access to both salary and age, there isn't a difference. There is a difference by age. And this difference, the difference between the 4.0 and the 0.6, that's the omitted-variable bias. So the omitted-variable bias is the fact that this is different than that.

Q. And when does the omission of a variable cause bias?

A. So this is extremely important, too. Remember the setting for my scenario is kind of a somewhat realistic work force where older people earn more. So if you don't have information on salary -- excuse me -- if you don't have information on age and you only see salary but the true effect is driven by age, there will be a problem.

So you'll have a problem when the omitted variable is correlated with the included variable. So older people have higher salaries. And that variable is important, so you need two things to be true. You need an omitted-variable bias as driven by the omission or exclusion of a very important variable that is correlated with some of the factors that are included in the model.

- Q. So for example, if we made your model even richer and included -- we knew everybody's hat size, is it likely that including the hat size would demonstrate that there was, in fact, omitted-variable bias in the model with two factors?
- A. No. A good feature of regressions and actually why they're used by economists and social scientists and many, many other researchers, is if you have a set of factors and there's some factor such as, let's say, hat size or eye color or something like that, it really isn't a driver. It's just some variable that is different across people.

The regression model will find that that has a zero

effect on average almost all the time. The regression will successfully sort out the factors that matter and the factors that don't matter.

So in this particular richer model, it's saying, well, on average, age is an important factor. Once you control for age, salary is not an important factor. If you put it into the model, hat size, it should have a statistically insignificant effect or not a statistically effect, close to zero most of the time.

- Q. Professor Card, when economists and econometricians are studying real world outcomes, for example, whether a worker will or won't retire, is it ever possible to avoid omitted-variable bias?
- A. Unfortunately, no. The reason is in realistic data settings, the kind where you're observing real data like I'm observing people at a company and seeing whether they retire or not, in those settings you can never be 100 percent sure that you've got all of the real relevant factors in the model.

In all of those models, there's inevitably an important unexplained component in the model. So the model does not perfectly describe who retires and who doesn't. It can't perfectly classify people.

Q. So thinking about your retirement example, can you give from your experience some example of factors that are omitted

from this two-variable model that would be thought to be relevant to a decision of a worker whether to retire in the next year?

A. So I've had a number of students who have done research on retirement, and I've done a couple of papers on that myself.

One of the most important drivers of retirement is health, and so less healthy people are much more likely to retire. And unfortunately health is correlated with age, so one — even with this richer model, since it doesn't control for health, one might be concerned that health is actually the culprit, is really the driver. And this 2.0 percent here is itself affected by omitted-variable bias.

- Q. So would, for example, the climate that you live in be expected to be a variable that might correlate with the probability of retirement?
- A. Yes. Lots of other factors. You could imagine, for instance, the situation of your family, is your spouse retired or working? A situation with your children, are they still living with you? Did you manage to get them out of the house?
- Q. Or grandchildren.

A. Or grandchildren would be a good example.

Climate -- and some factors like that might be quantifiable. And other factors it would be very difficult

to quantify but might be important, like, for instance, the relationship with your coworkers.

It's thought that a very important driver of retirement is job satisfaction, which may be driven by do you get along with your boss or something like that. Ordinarily there's many of these unquantifiable factors as well as some quantifiable potentially.

Q. I believe you answered my next question, but let me just ask it anyway.

If you include in your regression every variable for which you have data, does that mean that there's no omitted-variable bias?

A. Unfortunately not, no. That's a huge problem in all kinds of research, any research projects that I've worked on.

So one can never be certain that the factors that you've omitted or can't measure aren't available. Sometimes they're either not available in the data set or they're just not quantifiable. One can never be certain that they not correlated, say, with age, one of the included variables, and therefore are leading to some sort of omitted-variable bias.

So ordinarily it's a matter of understanding the process that you're working with, trying to document carefully, and think carefully about what's omitted and make some assessment.

Q. So the Court was asking you when we were back on the

exceedingly sparse model as opposed to the very sparse model, the relationship between -- what the average marginal effect curve would look like for the population.

Can you now demonstrate that for us?

A. Yes, I can.

- O. On a model?
- A. Yes. So I'm going to do an example of this. So imagine on this axis I'm going to have -- I apologize. I could never draw a straight line.

This is age, and this is the probability of retirement, and that can range from zero to 100 percent. So I've got, say, people down here. The youngest person in my sample might be 25. Let me draw a benchmark at 60, another benchmark at 70, and I might have people as old as 75 in my sample.

What will come out of the model is a set of predictions by age. And they will ordinarily look something like this. Like that. So the shape of this curve, this S-curve, that's actually called a logistic curve. So the reason why this is called a logistic regression has to do with this logistic shape.

In the range down here, I'm imagining in my model that on average there's a two-year -- a 2.0 percentage point effect of retirement. Which means if I was to go all the way from age 25 to all the way to 75, that 50 years would change

my probability of retirement from zero to 100 percent. So that's kind of a scaling factor.

But for many, many people, people say below something like 55 or something like that, even though I've got one coefficient in the model which represents the effect of age, so it's the same coefficient, even though there's only one coefficient in the model, the probability of retirement down here is so low that the average marginal — the marginal effect for one of these people, say somebody down here who's like 40, going from 40 to 41 actually will have almost no effect on their probability of retirement. So these people will have a very low probability.

And if you look at the graph, you can see the same kind of pattern at the top. Up at the top, this is a group of people that are very close to retirement. And so an additional incremental effective age, so going from 75 to 76, isn't going to have much of an effect. All of the marginal effect in the model, almost all of it, is attributable to this group which you can think of as being on the bubble.

And the important thing about this logistic curve is if you have that situation for people in that group, one more year of age, going from 70 to 71, for that group of people could have a much bigger effect than just a 2. It could have like a 5 or a 6 or a 7 percentage point effect.

So in these logistic-type settings where there's

lots of people who are kind of out of the money for retirement, they're too young, and a lot of people who are very, very close or almost surely going to retire in the next year, all of the effects are concentrated in that group of people on the bubble.

I think that's all I have, actually. I think I can sit down.

- Q. I can't remember any other points we were going to demonstrate.
- A. Let me sit down. If I could, I might have wanted to add one more point, which is if we have this situation and we had other characteristics like, for example, health, then the effect of health would also have this property that younger people even though health can be a very powerful predictor of retirement, its average marginal effect would be concentrated for the people on the bubble.

So the characteristic of a logistic model is that any factor has kind of a multiplied or a much more powerful effect, once you get into the range where the probability starts to be, say, between 5 percent and 90 percent or something. So that group of people in the bubble, all of the variables in the model have a magnified marginal effect in there.

Q. So if what we were looking at is not the average marginal effect but the coefficient associated with the variable,

would that tell you -- could that tell you what the shape of 1 the curve was like or the effect of --2 [Alarm system goes off in Federal Courthouse] 4 0. I'd like to have him give that answer and then we can move on, but if that puts people in harm's way --5 THE COURT: Now I can't remember the question. 6 7 Please head out. (Off the record) 9 THE COURT: Whenever you're ready, Mr. Waxman. MR. WAXMAN: For the record, we've marked the 10 whiteboard as DD 10.A and 10.B. 11 (Defendant Exhibit DD 10.A. and 10.B admitted.) 12 13 MR. WAXMAN: I honestly don't recall the question 14 at all. Could I ask the court reporter --THE WITNESS: I know what the question was. 15 asked me, Mr. Waxman, to once again explain the difference 16 between the coefficient and the marginal effect. 17 18 BY MR. WAXMAN: 19 Q. Oh, yes. Would you please. So this is just a hypothetical. It isn't totally 20 Yes. representative. In general what would be true in a logistic 21 regression model is that one could have, for example, a 22 23 single coefficient on age. And yet the marginal effect will differ across people in the pattern shown here. So that's 24 25 why I was emphasizing before that distinguishing between the marginal effect and how it differs across different ranges of people versus the coefficient is extremely important in understanding these kind of models and how they imply things.

As I was saying before, for people in the bubble range, all of the different factors are magnified. One additional factor, for instance, health or age or presence of grandchildren, those are factors sort of have a multiplicity effect in the bubble range.

- Q. Let's now talk about the model that you prepared in this case. What data did you use to construct your model?
- A. As I mentioned before, the data consists of two sources of information. One is information on the application files in the NEVO system for the class of 2014 to 2019. And the second source of data is information from the College Board, which basically sells information to colleges constructed from different sources providing information about characteristics of groups of high schools that are sort of grouped together and for groups of neighborhoods that are grouped together. And so I've matched that data on as a type of contextual factor.
- Q. In constructing your model, how did you determine which variables to include?
- A. Well, I followed basically the same procedure as I would in any kind of research enterprise. So it's a combination of trying to understand what factors are important in the

admissions process through reading documents in the case and 1 some of the testimony. 2 I knew something of the literature on admissions. 4 A number of my Ph.D. students have written papers on admissions, so I knew generally about that. And then looking 5 at the data that's available and thinking about which aspects could be quantified and what was available and what wasn't 7 and so on. Would you turn to Volume 2, Tab 17, and tell me when you Ο. have Defense Exhibit 693. 10 11 Α. I have it, yes. **O.** What is that? 12 13 It's a six or seven-page list of the variables used in my model and Professor Arcidiacono's model of admissions. 14 MR. WAXMAN: Your Honor, we offer 693. 15 MR. MORTARA: Your Honor, we object. It's not a 16 Rule 1006 summary. It's an assemblage of demonstrative 17 18 created by the expert. It is not a summary of the database. 19 MR. WAXMAN: Your Honor, this information is in verbatim form in Mr. Card's rebuttal Appendix C and his 20 original report Appendix E. It is simply a listing of the 21 variables that each expert --22 23 THE COURT: The objection is overruled. (Defendant Exhibit No. 693 admitted.) 24 25 BY MR. WAXMAN:

- Q. Looking at these variables, Dr. Card, does your model capture everything about the Harvard admissions process?
  - A. Certainly not, no.

- Q. What kinds of data does it not include?
- A. Well, it excludes a lot of information that would be directly observed by the admissions officers, information coming from, for example, essay or a personal statement that a student submits, information coming from the letters that are written on behalf of a student by the two teachers and the guidance counselor, information that's summarized in the reports from the alumni interviewer.

And my understanding is that many, many files these days have multiple additional letters from community members and things like that.

So that kind of qualitative information is completely missing from the database, and that's an important limitation of what I can do with the data.

- **Q.** Did you hear or review testimony about how the profile ratings are used as an applicant proceeds into subcommittee and committee discussions?
- A. I did, yes.
- Q. And what do you understand from your review of the materials and the testimony?
- A. So my understanding is that the profile ratings, for example, would be assigned by the first reader based on

reading the file and looking at both the quantitative and qualitative information that they have. And then it might be updated by a second reader.

But once the file gets to the subcommittee level where they're reviewing files from the same docket -- and my understanding is they would often be looking at files -- all the students from the same school at once, my understanding in that case is that the individual officers would be looking at the materials themselves, not necessarily concentrating at all on the ratings. Because at that point they then have the materials to look at.

And similarly my understanding is that at the committee level where there's a group of 40 people and they're going to take a vote, that they're actually reviewing material on slides and overheads and evaluating the individual material.

And in some cases, for example, I guess there was an example of this earlier in the trial where there was an application where clearly information came in after the original first profile ratings were assigned. And my understanding is that in most cases that late information, if it's in time for the committee, would be reviewed and interpreted.

Q. So would any of the text of -- the substance of any of the subcommittee or committee discussions be reflected in the

- 1 database?
- 2 A. No, it's not.
- Q. What about the note -- we've seen a bunch of admissions
- 4 files now. What about the notes that are taken by one or
- 5 more admissions officers? Are they reflected in the
- 6 database?
- 7 A. No, they're not.
- 8 Q. Did you hear testimony that the ratings or see evidence
- 9 that the ratings that individual first readers or second
- 10 readers provide include not only whole numbers but pluses and
- 11 minuses?
- 12 **A.** Yes.
- 13 Q. Is that information included in the database?
- 14 A. Unfortunately not. So the database only allows the whole
- 15 number for the profile ratings.
- Q. So in terms of what the model does, it has -- correct me
- if I'm wrong. I'm not trying to provide your testimony.
- It has no way to distinguish someone whom a reader
- has assigned a 2+ on a particular factor to a 2-?
- 20 A. Right. And my understanding is that that actually is a
- fairly big gap, to tell you the truth.
- 22 Q. Now, in Dr. Arcidiacono's model, did he omit any of the
- variables that you included?
- 24 **A.** Yes.
- 25 O. Which ones?

- A. Well, the most important ones are first -- I'm speaking now of his preferred admissions model.
- O. Yes.

A. The most important ones would be indicators for the so-called ALDC categories because he doesn't include that group of students in -- or applicants in his model.

Another set of variables would be variables representing the intended careers of individual applicants.

Another set of variables that he excludes would be variables representing the mother's and the father's occupations, categorizations of those occupations.

Another variable he excludes is an indicator for whether the student had an interview with the staff prior to admissions season.

And then he also excludes the personal rating entirely from his preferred model.

Q. Now, let's -- Mr. Lee, if we could put up demonstrative 10.2, and focus on the first question that you addressed.

What is your opinion as to whether statistical evidence supports SFFA's claim that Harvard discriminates against Asian-American applicants?

- A. In my opinion, the statistical evidence does not support that claim.
- Q. How did you reach that conclusion?
- A. Well, I reached that conclusion by a combination of

looking at the statistical evidence and thinking about that statistical evidence in the context of available information about the admissions process.

- Q. And in your model evaluating the effect of Asian-American ethnicity, what racial group did you use as a baseline?
- A. In every case, I used white domestic students.
- Q. And why did you choose that baseline?

A. Well, my understanding is that that is in some sense the proper reference group for thinking about these issues. Some other racial groups, for example, underrepresented minority groups, could potentially receive some kind of a tip in the admissions process in some cases. And so I don't want to use that group as the reference group. I use the group that's kind of baseline representation of the admissions pool.

THE COURT: Can I ask one question?

Just thinking back on the missing variables. Could you have and then did you take in the profile ratings, like kind of your initial pass, and then compared profile ratings above a certain number to who actually got in? Like could you figure out who got in but didn't look like they would have made it in on the profile scores and then broken that down by ethnicity?

THE WITNESS: I think, Your Honor, I have never actually done that. One could do that. And there are certainly cases, for example, I showed in my slide early on

there are some students who are admitted who have only one strength. And I suspect that in some cases that may be this kind of student.

Oftentimes it might represent this late information, I think. I'm not entirely sure. I don't believe that I've done that. I think it's possible we could have some tabulations of that overnight if you wanted to see it.

THE COURT: I don't think anyone is going to allow me to do that, but it would be interesting to see.

MR. WAXMAN: We --

THE COURT: No.

MR. WAXMAN: Not that I'm in a position to allow you to do anything, Your Honor.

THE COURT: I'm just curious about whether there's a way to sort of -- both you and the other expert talked about missing variables and the missing-variable bias. And I'm just thinking that by seeing who looks like they should have gotten in on the numbers and then who actually got in, it's a way to account for the size of that missing-variable bias. Do I have that wrong?

THE WITNESS: Your Honor, no. That's actually -I'm going to show something very much along those lines.
That's a very good insight. That's a general point that when the factors in the data are relatively sparse or unable to

explain the phenomenon, then the concern about these omitted variables is much larger. And that differs across -- well, first of all, it differs between different models, and it also differs in terms of, for instance, Professor Arcidiacono fit some models of the program ratings and some of them, they differ in terms of how much unobserved content there is in

BY MR. WAXMAN:

his models.

- Q. I think you were just explaining why you used white
  applicants as the baseline in evaluating discrimination,
  alleged discrimination against Asian-Americans. Let me ask
  you now what your model showed.
- A. So relative to that benchmark, so relative to white
  domestic students, my model shows that there's no
  statistically significant difference in admission rates
  between Asian-Americans and white applicants.
- Q. Would you turn in your Volume 2 of exhibits to Tab 13, please.
- 19 **A.** Yes.
- 20 **Q.** What is this?
- A. So this is a summary exhibit from my rebuttal report, showing average marginal effect of Asian-American ethnicity and confidence intervals.
- MR. WAXMAN: Your Honor, we offer Defense Exhibit 685 into evidence.

MR. MORTARA: Your Honor, I object. To be clear, I do not object to the witness discussing this. I object to it as a 1006 summary of the database. It is his opinion. It's from his report. His report is not evidence.

MR. WAXMAN: Your Honor, this is in the report. It was disclosed. It represented his conclusions. I could ask him to read all these numbers into the record if Your Honor doesn't admit it, but there's nothing undisclosed about this. And it is the result of his regression model.

MR. MORTARA: Your Honor, my objection is not a failure of disclosure. It goes to what goes into evidence versus what is a 611 demonstrative, as we discussed this morning.

THE COURT: I thought we had agreed they were all coming in.

MR. MORTARA: The demonstratives of slides, yes, Your Honor. This is one of the exhibits that we discussed this morning. This is an exhibit that is not a 1006 summary of the database. It is, in fact, a portion of the expert's report which is being used here, I guess now as a demonstrative. It's now being offered into evidence.

I am absolutely fine with the Court taking it into evidence as long as our demonstratives that were used with our experts would also come into evidence. And as I mentioned this morning, this is angels on a head of a pin.

There's no problems here as long as there's equal treatment 1 on both sides. 2 THE COURT: I thought we had agreed this morning 4 that all the demonstratives would come in. MR. MORTARA: For use of the demonstratives. I'm 5 sorry I was not clear, Your Honor. I have no more objections 6 7 to use of any demonstratives. I have objections to the admissibility. This goes to the jury bench issue we discussed this morning. THE COURT: I understand the issue. I just thought 10 we had agreed this morning that they were all going to be 11 treated equally and that we had agreed they would all be 12 13 admitted into evidence. MR. MORTARA: That was not what I was 14 communicating, Your Honor. But if they're fine with that, 15 that's absolutely fine. 16 MR. WAXMAN: That's fine. The next demonstrative 17 18 shows this precisely. 19 MR. MORTARA: Then, Your Honor, at the end of the day, we'll offer our demonstratives as well with no 20 objection. 21 THE COURT: Is this a new concept or is this not 22 23 what we agreed to this morning? MR. LEE: I think to the extent he's talking about 24 25 Dr. Arcidiacono, that's what we agreed to this morning. I

assume that we're talking about the demonstratives that we 1 2 used during his testimony. 3 MR. MORTARA: Yes, of course. We're just talking 4 about now what is going to be admitted. 5 THE COURT: Right. The disclosure issues on the MR. MORTARA: 6 7 demonstratives for Professor Card with the ruling this morning have been completely resolved. There are no disclosure issues. We're now only talking about what's going to be 10 11 admitted. We've now reached a secondary additional agreement. And I will sit down now, if that's okay. 12 13 THE COURT: You can sit down. I thought we had 14 agreed this morning that that secondary agreement was already agreed to. Had we? 15 We had. 16 MR. LEE: MR. WAXMAN: It was my understanding and it's also 17 18 fine with us. 19 THE COURT: So whether or not we agreed to it this morning, we'll admit all of the demonstratives. 20 MR. WAXMAN: In that case, Mr. Lee, can you pull up 21 Demonstrative 10.30. 22 23 BY MR. WAXMAN:

A. So this summarizes the results of my model estimation. I

Professor Card, what does this show?

24

25

Q.

estimate my admissions model separately by year, as I'll be discussing in some detail later on.

And so the result of the estimation in each year is a average marginal effect for Asian-American ethnicity. And what that represents is the difference in admission rates in percentage points between Asian students and white students, holding constant all the characteristics of the students that are in the model.

So for example, in the 2016 admissions cycle, Asian students have a 0.09 or 9/100 of a percentage point higher probability of admission than white students, holding constant all their other characteristics.

And you can see at the bottom there's a number overall, and that's a weighted average. It's essentially an average. There's roughly the same number of students per year, but it's a weighted average reflecting the slight differences in the number of students per admissions cycle, of those effects across years.

And let me point out a couple of characteristics of these estimated average marginal effects. First of all, the average value is very small and close to zero, not statistically significant. There's no star.

So the average gap, once you take account of all the factors on average across these six years, is only 5/100 of a percentage point difference between whites and Asians.

25 BY MR. WAXMAN:

Secondly, year to year there's some positives and some negatives. None of them are statistically significant either. That's exactly the kind of pattern you would expect if the true effect was zero.

And from year to year there's some differences arising from just statistical differences that are by chance. So you would expect a pattern that's distributed around zero, a positive and negative.

And so my conclusion of no statistical evidence of discrimination in admissions is largely and fundamentally coming from this analysis.

THE COURT: I'm sorry. Would Dr. -- I'm never going to get his name right -- Arcidiacono.

MR. MORTARA: Arcidiacono.

THE COURT: Would his numbers have been the same if he had done a year-by-year analysis instead of doing all six together, or does this take into account the variables that you're including that he didn't?

THE WITNESS: Thank you, Your Honor. This takes account of the -- this is my model which has these extra -- first of all, it has the ALDCs in it. Secondly, it has the extra variables. So his estimate is year by year, which he has in his report someplace for some version of his model. They would be different.

Q. So before we leave this, just let me as you, just to understand -- I understand none of these percentages are statistically significant; that is, they could very well have

occurred by chance.

But if you look at, for example, in the overall, the weighted overall, assuming that the average admission rate for white applicants were 8 percent, what would the model predict the admission rate for -- in the overall model be for Asian-American applicants?

- A. So what it would predict is if Asian-Americans had the same average characteristics as whites, which they don't, but if they did, then their admission rate would be 7.95 percentage points. So it says that controlling for characteristics, there's a 5/100 of a percentage point gap.
- Q. For 2016, which is the first example you used, if white applicants even then had an 8 percent probability of admission, what would that predict, all other things equal, the Asian-American rate of admission would be?
- A. If they had the same characteristics as whites in that year, then it would have been 8.09.
- Q. Now, so you testified that these are all statistically insignificant. And again, am I correct that that means that the effects that you're observing here in any year and overall are not statistically different than zero?
- A. Yes. That's exactly what the statistical significance

means, that these effects could have occurred by chance with some probability, yes.

- Q. In other words, could the expected admission probability of Asian-American applicants be the same as that of otherwise identical white applicants, according to the model?
- A. Yes. According to my model, in fact, my interpretation is that seems to be quite likely.
- Q. Professor Card, did you conduct any other analyses to test your results?
- A. Yes. So one analysis that is often done in professional research is to try and understand what's driving the results and how they vary and so on would be to try and estimate the model on a subset, a larger subset of data.

I should emphasize my model has — in any given year has a couple hundred variables in it, 200 or so. So I need to use a larger subset. So I looked at two large subsets of students where there's a significant Asian population. One is just females and one is students from California.

- Q. Would you please turn to -- well, let me ask you first.

  When you did that analysis, what did you find?
- A. What I find in those cases is very similar kind of pattern as we see in the overall sample, which is quite reassuring from my interpretation, I think.

So what we see is, in fact, on average the marginal

effects in both of those samples are slightly positive, but again not statistically different than zero.

Year by year none of the estimates are statistically significant than zero. So for both Asians and whites from California and for Asian and white females, the gap between Asian students and white students, controlling for other characteristics, is not statistically different than zero.

- 9 Q. Would you please turn to Tab 14 in Volume 2 of your binder.
- 11 **A.** 14?

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- 12 Q. 14. It should be Defense Exhibit 686.
- 13 **A.** Yes.
- 14 O. What is that?
- A. So it's a series of exhibits, percentage of
- 16 Asian-American applicants with profile rating of 2 or better
- by gender, summary of Asian-American effect for female
- applicants, a summary of Asian-American effects for
- California, and a pie chart of the shares of students in
- 20 those categories.
- 21 Q. And are these pages of this exhibit identical to the
- 22 information provided in your report, Exhibit 24, and your
- rebuttal Exhibits 19, 20, and Footnote 108?
- A. To the best of my knowledge, yes.
- MR. WAXMAN: Your Honor, we'd offer defense

Exhibit 686. 1 MR. MORTARA: No objection, Your Honor. 2 THE COURT: Admitted. (Defendant Exhibit No. 686 admitted.) 4 BY MR. WAXMAN: 5 Let's turn now, please, to defense demonstrative 10.31. And what does this show? So this is a summary of the estimation results when I estimate the model separately for only females and then separately for only applicants from California. 10 11 And again, the format is the same as the table we were looking at before. So the model is estimated year by 12 13 year, and each year there's an average marginal effect which 14 represents any difference between the application rate of Asian-Americans and white Americans, for example, in the 15 first column for females only and in the second column for 16 applicants from California only. And then a summary at the 17 18 bottom. And what does this show? 19 Q. Well, as I mentioned, we discussed just before, on 20 average across both of these -- looking across each of these 21 groups, none of these estimates are statistically 22 23 significant. For females, the average across all six years is 24

0.14 positive but not statistically significant.

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For Californians, the average is a little bigger.

- 2 It's 0.32, but again, not statistically significant. And
- none of the individual year-by-year estimates is
- 4 statistically significant.
- 5 Q. And is this subgroup analysis consistent with your
- 6 overall analysis of the Asian-American applicant pool?
- 7 **A.** Yes.
- Q. Looking at the next demonstrative, can you tell us what
- 9 percentage of Asian-American applicants to Harvard fall
- 10 within one of those two groups, women or Californians or
- 11 women from California?
- 12 **A.** 64 percent.
- 13 Q. Do you recall Dr. Arcidiacono's testimony that
- 14 Asian-American applicants are favored in the ALDC categories?
- 15 **A.** Yes.
- Q. Do you recall him testifying that he found a positive
- estimated effect for being Asian-Americans for the group of
- 18 applicants who are ALDCs?
- 19 **A.** Yes.
- 20 O. What does that mean?
- 21 A. So what that means, if one looks with his model, he
- 22 doesn't estimate the model separately for different groups.
- 23 He estimates a separate effect for Asian-Americans for
- 24 different groups in his analysis, and he doesn't estimate the
- 25 model separately year by year. So he comes up with a single

summary measure.

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But if one takes his model, it shows that controlling for other characteristics amongst the ALDC population — or did he say the LDC population. I'm not precisely remembering which of the two he did say. So either amongst the ALDC or the LDC, one of those two, there was a positive difference for Asian-Americans, which means in that group they're more likely to be admitted than whites, controlling for their characteristics.

- Q. We'll get into your model in a minute.
- But do you agree with that conclusion?
- 12 **A.** I do, yes.
- 13 Q. Did you analyze the effect of Asian-American ethnicity
- for legacies, children of faculty and staff, and applicants
- on the dean's or director's interest list in
- 16 Dr. Arcidiacono's model?
- 17 A. Yes. One of the things I did in one of my reports was
- 18 look at that, yes.
- Q. Would you please turn to Tab 2 in Volume 2. Do you find
- 20 Defense Exhibit 707?
- 21 **A.** I do, yes.
- 22 O. And what is that?
- 23 A. It's a summary of average marginal effects of
- 24 Asian-American ethnicity or the likelihood of admission for
- 25 LDC applicants from Professor Arcidiacono's preferred model.

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Q. And is this Defense Exhibit 707 replicating the results
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     from your rebuttal report and Footnote 93?
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     Α.
          Yes.
               MR. WAXMAN: We offer Defense Exhibit 707.
               MR. MORTARA: Your Honor, I have ultimately no
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     objection but one minor point.
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               Harvard lawyers and I had negotiated a change to
     the title of this one because it is not Professor
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     Arcidiacono's preferred model. It is Professor Arcidiacono's
     model when Professor Card adds back in the athletes, so he
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     made a change to it. It is not, in fact, Professor
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     Arcidiacono's model.
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               MR. WAXMAN: I have no objection to altering the
     title of the model. First of all, we'll change the title.
14
               May it be admitted?
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               THE COURT: Yes. Someone will give me a new one of
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     these?
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               MR. WAXMAN: Yes, indeed.
                (Defendant Exhibit No. 707 admitted.)
19
     BY MR. WAXMAN:
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     Q. Let's look now, Professor Card, at defense demonstrative
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     10.33. And what do you find here?
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23
     A. Well, this is the results of that analysis, so using
     Professor Arcidiacono's model with athletes.
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               In that model, the average marginal effect of
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Asian-American ethnicity for lineage applicants is 3.12 percentage points. So it's 3.12 percentage points higher admission rate for lineage applicants who are Asian than for white applicants who are white lineage applicants. And that is statistically significant.

And then the estimate for applicants on dean's and director's list and children of Harvard faculty as a group together is 3.15 percentage points. That estimate is not statistically significant.

- Q. Roughly what proportion of admitted students are ALDCs?
- 11 A. Just under 30 percent of all admitted students are ALDCs.
- Q. Did you hear Dr. Arcidiacono testify that the positive estimated effects of Asian-American ethnicity were not statistically significant?
- 15 A. I believe I did, yes.
- 16 Q. Was that correct?

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- 17 **A.** No, not as this exhibit shows.
- Q. And are you referring to the star of statistical significance next to the positive average marginal effect of Asian-American ethnicity at 3.12 percent?
- 21 **A.** Yes, I am.
- Q. So what conclusion do you draw from these findings, the findings that ALDC applicants, whether lineage applicants or LDC applicants, have a higher marginal effect of being admitted than white applicants in the same group?

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A. Well, I find -- I think there's a perfect possible explanation for this, but I find it totally inconsistent with the idea that on the Harvard application process is discriminating against Asian students.

Because in this set of students, there's actually positive, and certainly among the lineage, which is the largest group of the ALDC by far, there's a statistically significant effect.

So I find it hard to reconcile the idea of discrimination against Asian students with this finding of a positive effect here.

THE COURT: To come to that conclusion, what if the Asian legacies were much better or much worse qualified than the white legacies? Do you have to somehow look at the profile ratings to have that statistic mean anything?

THE WITNESS: Thank you, Your Honor. These models have a fairly extensive list of controls for all of those things. So profile ratings, SAT scores, and so on. So the average marginal effects are always other things equal or controlling for anything that we can observe.

Now, of course, they don't control for the unobserved things, and so another alternative interpretation for differences across groups is that. But this is controlling for everything that's in his model when his model was extended to the ALDC population.

1 THE COURT: Thank you.

2 BY MR. WAXMAN:

- Q. Now, Dr. Arcidiacono thinks that the statistical evidence shows discrimination against Asian-Americans, right?
- A. Yes, he does, yeah.
- Q. How can two models of the same process reach different conclusions?
- A. Well, I think there's primarily two main explanations for that. One is that he's excluded the ALDC group for whom there's this positive effect. So he's focusing on a subset of applicants, in particular a subset of applicants who are highly represented in the overall admission pool, admitted pool. So 29 percent of all admitted students are ALDCs.

And secondly, he's made a set of choices about variables to exclude from his analysis, so these parental option variables, whether the student had an interview with the staff, their intended careers.

And that combination of choices to exclude variables and exclude the ALDCs I think directly accounts for the difference in our findings.

- Q. So let's look at the next demonstrative 10.34 and ask you to explain to the Court what is reflected here.
- A. So this is meant to be a schematic summary of three main sets of differences. I'm showing my understanding and my belief of what the actual admissions process is at Harvard in

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the first column, the way that that particular issue is
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     handled in my model in the second column, and the way that
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     that issue is handled in Professor Arcidiacono's model in the
     third column.
               MR. WAXMAN: Your Honor, we'd offer Exhibit 695
 5
     into evidence.
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               MR. MORTARA: No objection, Your Honor.
               THE COURT: 695, what tab? Is that 10.34?
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               MR. WAXMAN:
                            That is Volume 2, Tab 19. Is it also
 9
     at 10.34? Yes, it's also at 10.34.
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11
               THE COURT: I don't think those are the same, but
     all right. It's admitted.
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13
                (Defendant Exhibit No. 695 admitted.)
     BY MR. WAXMAN:
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          Let's look at the next demonstrative, 10.35.
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               And looking at this, what does this show?
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          Well, this is meant to be -- I know there's a lot of
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     numbers on this chart, but it's meant to be a helpful summary
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     of the differences between my model, starting on the left,
     and the average marginal effect for Asians ethnicity relative
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     to white students for my model, which is minus 0.05 across
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     all the years.
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23
               And it shows what happens as one moves further and
     further along the route, getting to Professor Arcidiacono's
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     model which is on the far right. In his model, the average
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marginal effect of Asian-American ethnicity relative to whites is minus 1.02 percentage points and is also statistically significant.

So this is meant to help us understand the steps involved in getting from my model to his model.

- Q. And can you just take us through those steps at a high level? We're going to stop on almost each one of those boxes.
- A. Yes. So the first step here is so Professor

  Arcidiacono includes a set of interaction variables, and
  actually discussed at some detail in his testimony various
  features of those interactions. So interactions like gender
  and race, gender by race.

If you take my model and include all the interactions that Professor Arcidiacono includes in his model, the average marginal effect changes a tiny bit, from minus 0.05 to minus 0.08.

If in addition to that you exclude intended career and staff interview indicator, which Professor Arcidiacono does, the average marginal effect rises to a magnitude to minus 0.19. It's still not statistically significant.

If one in addition to that set of exclusions further excludes parental occupation -- so there's parental occupation variables for mother and parental occupation variables for the father -- then the average marginal effect

rises to minus 0.38. So around a third of a percentage point differential and statistically significant.

If on top of that in addition you exclude the personal rating variable, then the average marginal effect rises in magnitude to minus 0.79. So roughly doubles in magnitude and it remains statistically significant.

If in addition to that you estimate that class of model, so excluding all those variables and including these interactions but estimate it in single model rather than year by year, the marginal effect gets a little bit more negative. It's not a huge difference.

And then finally if one takes that model and then finally excludes the ALDC group, which has been included of course in my model, then the average marginal effect rises to minus 1.02 and remains to statistically significant.

THE COURT: I'm sorry. I hate to keep interrupting you, but I just want to make sure I get this while he's here.

Between the two of you, you've given like a hodgepodge, like an a la carte menu of things you can include or exclude, right? So here you've put them back in, in a certain order?

THE WITNESS: One way to they about it -- yes, thank you, Your Honor.

One way to think about it is you start with my model and you make some exclusions. So you do this

interaction thing, which doesn't make too big of a difference. Go from minus .05 to minus .08.

And after that, you start making some exclusions, so you exclude the intended career and staff interview. You exclude the parental occupation. You exclude the personal rating. You pool the data, which one could think about excluding the fact that the model differs from year to year a little bit. And then finally, you exclude the ALDCs.

With respect, my interpretation is you start with my recipe and then you take out some parts of it. You take out parts.

THE COURT: I'm interested in the order in which you take out the ingredients, what the effect is.

So what if I thought the you first four things should be in but I wanted to do it by single year and I wanted to include the ALDCs? Is there any way to look at these numbers and have it correlate back to that? Could I figure out what that is from looking at this?

THE WITNESS: Not directly. Roughly speaking, the magnitudes would stay the same. But not directly. Yeah, so, for instance starting with — the difference between the pooled and unpooled model is not usually very large.

But starting from the pooled model without the ALDCs and adding the ALDCs makes the effect minus two or minus something in that kind of magnitude. So you could

argue that that's about -- that would be somewhat similar. 1 THE COURT: Can you add those two numbers together 2 3 and get the effect? THE WITNESS: Not quite. If Your Honor has a particular set order that she'd like, I'm sure we could get 5 that for you. 6 THE COURT: We can't do that either. I'm just trying to understand if there's a way to extrapolate that 8 9 data from not just you but what he's given me too. Sorry. Go ahead, Mr. Waxman. 10 11 MR. WAXMAN: I'm guessing that you don't want the explanation for why it's not always arithmetically similar. 12 13 THE COURT: No. Because it looks like -- I mean, 14 you're going from, for example, excluding the personal rating to the pooling data thing, it's a very small change. But 15 that change could be much larger if you put it at the other 16 end of the graph, right? 17 18 THE WITNESS: That particular change wouldn't be 19 too much larger at the other end of the graph. It would be a little bigger but not much larger. 20 THE COURT: How can I figure that out from looking 21 at this? 22 23 THE WITNESS: I apologize, Your Honor. You can't. That particular exercise, I remember. I mean, I've 24 25 certainly done all kinds of different permutations, and I'm

sure Professor Arcidiacono has too. So I have a vague sense of it. The precise magnitudes, it's not strictly the same in the order. But roughly speaking, it would stay the same.

THE COURT: So not to be cynical about this, but are you guys ordering the data the way you put it in and take it out? Because he did these same sorts of analysis. I'm sort of asking this on behalf of statisticians all over. Are you guys — do you guys — wouldn't it be a way to manipulate the data by the order in which you choose to put the variables in and out?

THE WITNESS: Not -- well, actually I believe that, Your Honor, that the chart that he showed was actually from my report. So I believe that there was a slightly different order or something, but I think the general tenor of it would be the same.

THE COURT: Okay.

THE WITNESS: It's possible that -- I assume I'll be here tomorrow. It's possible that I could --

THE COURT: That's likely.

THE WITNESS: It's possible I could have a clearer statement for you tomorrow morning.

THE COURT: I'm not looking for extra data. I just want to understand the data you have here. No criticism intended, but I assume that you're both presenting the data in the way that's most efficacious for your models. I'm just

wondering if I want to buy into the some variables but not others, if there's any way to look at his models or your models and figure out what that would look like.

THE WITNESS: I would say, Your Honor, that in my report there are versions of this type of analysis done in slightly different orders. That's the best I've got, off the top of my head.

MR. MORTARA: Your Honor, maybe I can help. We would be absolutely fine, and we would invite Professor Card to take just the personal rating out of what he's showing as his preferred model here and see if that's statistically significant.

MR. WAXMAN: I believe we're going to come to this, Your Honor, in the fullness of time. If for some reason I miss, I'm highly confident that my friend will direct his attention to that question.

## BY MR. WAXMAN:

- Q. Let's turn now to demonstrative 10.36 and start with the first difference that you identified between your model and Dr. Arcidiacono. And that is just to summarize what?
- A. So the first difference is whether the ALDCs are included as part of the model or are dropped before we start estimating the model.
- Q. You included them and he excluded them, correct?
  - A. That's correct, yes.

- Q. Does that make any sense to you?
- A. To tell you the honest truth, no.

I think all of the evidence I've seen and all of the testimony and so on suggests that this group is part of the process. The ALDCs are evaluated, they all have admissions folders, they all — they're evaluated against other candidates in the year.

The ALDC group is a highly competitive group, as I'm going to show, along lots of other dimensions besides just the fact that they're ALDCs.

So to exclude, they're almost 30 percent of the overall group. So excluding this highly competitive group who are 30 percent of the admissions in my mind would be kind of like estimating a model for retirement and excluding all the people over 65 or something like that.

- Q. Could you please turn to Tab 28 in Volume 2 and tell me when you've found Defense Exhibit 706.
- **A.** 706?

- Q. I believe it's 706. Either that or I've written it down wrong.
- **A.** Yes.
- 22 O. What is this?
- A. So this is a simple summary of the share of admitted students in ALDC categories.
- MR. WAXMAN: Your Honor, we offer Defendant's

Exhibit 706. 1 2 MR. MORTARA: No objection. 3 THE COURT: Admitted. (Defendant Exhibit No. 706 admitted.) 4 BY MR. WAXMAN: 5 Please turn now to demonstrative 10.37. Using this demonstrative, Professor Card, could you explain the reasons 7 that you included the ALDC applicants? 9 Α. Yes. So reiterating some of the same points I've already raised, the three main reasons are the following: 10 11 First, ALDCs are part of the same process, so they're evaluated against each other. And if ALDCs -- more 12 13 ALDCs get in, fewer of other people get in, exactly as we understand the whole process to work. So understanding the 14 process as a whole or understanding Harvard admissions and 15 understanding whether that's, in my view, a bias against 16 Asians would necessarily take account of the fact that some 17 18 Asians are ALDC and many admitted students are ALDCs and so 19 on. Second point related to that is that 30 percent of 20 the admitted students are ALDCs. So as I said, ignoring this 21 highly competitive group who are fairly likely to get in and 22 23 comprise almost a third of the overall admitted pool seems completely nonsensical to me. It seems like you're ignoring 24

a very big subgroup of people.

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And finally, the ALDCs have very strong characteristics. So I'm going to show in a couple of slides that they have higher characteristics than other students in terms of many, many features. And so their presence in the model helps to pin down just how valuable some combinations of these skills are or these attributes are. And that's important in understanding the competitive process for getting into Harvard.

- Q. Turning to demonstrative 10.38, what does that show?
- A. This is a simple comparison of the share of ALDCs in the overall applications pool, which is 5 percent. So it's a little bit smaller than the set of students that have three strengths. Remember, it was around 7 percent. But like that group, they are substantially overrepresented in the pool of admitted students. So they're 29 percent or six times more likely to be admitted than other students.
- MR. WAXMAN: Please turn, Mr. Lee, to the next demonstrative, 10.39.
- Q. What does this show?
- A. So this shows at a very high level differences between ALDC and non-ALDC applicants and the comparison within ALDC category and within non-ALDC category between whites and Asians.
- And I believe this is responsive to a question that Her Honor raised some time ago in the trial which was --

Q. Very prescient of you.

A. The first column shows the overall admission rate for ALDCs and non-ALDCs. And so overall ALDCs as a group have about a 44 percent admission rate, non-ALDCs about 5.5.

Amongst white applicants, 8 percent of white applicants are ALDC, 92 percent are non-ALDC. The admission rate for white ALDCs is about 43.6 percent.

If we go over to Asian-American applicants, the current share of Asian-American applicants on average in my sample is 2 percentage points. And the admission rate for Asian-American ALDCs is 44.1 percent. So consistent with some of the stuff we were talking about before, even without controlling for other factors, Asian students have a slightly higher admission rate than white students if they're ALDC.

And looking now at the bottom row for non-ALDCs, in the Asian group that's a larger fraction. So 98 percent of Asian students are there. But again within the non-ALDC group, one sees Asian admission rates are actually higher than white admission rates.

- Q. And what implication does this have?
- A. Well, the most important implication I think is that in understanding the Harvard admissions process and understanding differences at a high level between these groups, whites and Asians, it's very important to understand the differences between ALDC and non-ALDC status. So there

are very large differences between ALDC students and non-ALDC students, not just their tips because of the process but actually because of some other characteristics.

And I think that's a thing that Harvard itself has known for a very long time. In fact, it's one of the main conclusions that came out of the Office of Civil Rights analysis that was done back in the 1990s. One of their main conclusions was that this difference was very important in understanding the process.

- Q. Would you please turn to Volume 2, Tab 9, and tell me when you have Defense Exhibit 679.
- 12 **A.** Yes.

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- 13 | **Q.** What is it?
- A. It's two tables. The first is ALDC attributes for
  Asian-American and white students, and the second is
  admission rates of ALDC applicants by race.
- MR. WAXMAN: Your Honor, we offer Defense Exhibit 679.
- MR. MORTARA: No objection, Your Honor.
- 20 THE COURT: Admitted.
- 21 (Defendant Exhibit No. 679 admitted.)
- 22 BY MR. WAXMAN:
- Q. Have these dynamics -- I'm sorry. You answered that question.
- Now please turn to Tab 6 in Volume 2, which is

- 1 Defense Exhibit 674.
- 2 **A.** Yes.
- Q. What is that?
- 4 A. This is a summary, admission rates for applicants who are
- 5 non-athletic recruits, lineage applicants, on dean's or
- 6 director's list, children of Harvard faculty and staff,
- 7 ALDCs.
- MR. WAXMAN: Your Honor, we offer Defense
- 9 Exhibit 674.
- MR. MORTARA: No objection, Your Honor.
- 11 THE COURT: This is the admission rate for
- 12 non-ALDCs.
- 13 THE WITNESS: Yes. Thank you, Your Honor. My
- 14 apologies. The titles get long in some of these things.
- 15 (Defendant Exhibit No. 674 admitted.)
- 16 BY MR. WAXMAN:
- 17 Q. Earlier in the trial, did you hear or review testimony
- about similar calculations done in the admissions office
- 19 known as NLNA admission rates?
- 20 **A.** Yes.
- 21 Q. Is it useful to calculate a non-legacy, non-athlete
- 22 admission rate or a non-ALDC admission rate?
- 23 A. I certainly think it can be informative, yes.
- Q. Does that mean that you need to take legacy and athletes
- 25 out of your regression model?

A. No, not at all. My understanding is there is a large difference in admission rates between ALDCs and non-ALDCs, just as there's a large difference between admission rates of students with two or three strengths and other students or students with lots of other dimensions.

And my understanding is that Harvard has been aware of the difference in admission rates between ALDCs and non-ALDCs for a long time, and that might be one reason it would make sense to keep track of it.

- Q. And does your regression model control for legacy and athlete status?
- A. Yes, certainly. All of my models would control for any tip that that individual student gets on top of whatever characteristics they have, yes.
  - Q. Is it fair to say that including them in the model and controlling in this way is basically a more elaborate way of doing the simple descriptive comparison?
- 18 A. Yes. In my view, yes.

- Q. Now, let me ask you whether in your view there is a downside in taking legacies and athletes completely out of the model?
  - A. Yes. In my view, as I mentioned on my overview slide, one downside of that is you're not really looking at the actual applicant pool anymore when you try and fit your model. So your model is trying to evaluate who got in

without reference to this other 30 percent of the group that got in.

So if you're trying to look at the relative value of certain characteristics like are you intending to major in humanities or something like that, and obviously the admissions people are thinking about how many people are going to be taking humanities this year, understanding, okay, how many people in the ALDC group are going to take humanities versus how many people in the non-ALDC are intending to major in humanities or engineering or any of these things would be extremely important.

Without that information in the model, the model can't contextualize a lot of these other concerns for Harvard correctly.

- Q. Professor Card, you mentioned that the ALDC applicants are more likely to be admitted than other applicants. Is that just because they're ALDC applicants?
- A. No, not at all.
- Q. Please turn in your binder to Tab 27. That's Volume 2, Tab 27.
- **A.** Yes.

- 22 Q. What is this?
- A. It's a set of slides -- tables showing predicted probability of admission for ALDC and non-ALDC, a proportion of ALDC and non-ALDC receiving ratings of 1 and 2.

MR. WAXMAN: Your Honor, we move defense 1 Exhibit 705 into evidence. 2 3 MR. MORTARA: No objection, Your Honor. THE COURT: Admitted. 4 (Defendant Exhibit No. 705 admitted.) 5 MR. WAXMAN: Please turn now, Mr. Lee, to 6 7 demonstrative 10.40. BY MR. WAXMAN: 9 0. What does this show? So this is a simple comparison of ALDC and non-ALDC 10 applicants in terms of their probabilities of receiving 11 ratings of 1 or 2. 12 13 The first four sets of bars concern the profile ratings that we've talked about before: the academic rating, 14 personal rating, extracurricular rating, and athletic rating. 15 The next set of five bars refer to the teacher 16 So each student has recommendation letters from two 17 18 teachers and a quidance counselor and there's a rating 19 assigned to them. Then there's two ratings signed by alumni 20 interviewers. One is alumni personal rating and one is the 21 alumni overall rating. 22 23 And then finally on the right, far right, I've shown the fraction of the ALDC and non-ALDC who have three or 24 more strengths. So in other words, three or more of these 25

profile ratings of 2 or better. And as I noted before, that's a very, very strong correlate of being admitted.

And you can see when you look across all of these different categories that the ALDC group is substantially stronger than the non-ALDC group.

And I would point out one thing you might be concerned about in this comparison is the athletic rating.

Obviously the ALDC group includes athletic 1s, and so there's a certain set there. But even if one excludes the As, so only looks at LDCs, the pattern looks the same.

In fact, on most of the other ratings, the LDCs are substantially better than the As, so that comparison looks quite good. And this general pattern of higher ratings in multidimensionality is very strongly true of the LDCs as well as the ALDCs.

- Q. Just to be entirely clear, do any of these bars reflect any admissions tip that is given to ALDC applicants?
- A. No.

- Q. Now, Dr. Arcidiacono excluded all of the ALDC applicants from his model, correct?
- **A.** Yes.
- Q. Did he suggest a way in his report of dealing with ALDC attributes other than excluding the ALDC applicants from the model?
- 25 A. Yes, he did.

- Q. Please turn to Tab 54 in your volume binder 2, and tell me when you've found Plaintiff's Exhibit 435.
- A. Yes.
- Q. Do you see that this is Dr. Arcidiacono's rebuttal report?
  - A. Yes.

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- 7 MR. WAXMAN: Mr. Lee, can we zoom in on page 36, 8 the sentence beginning, "It is thus essential."
- 9 Q. Professor Card, can you just read us the sentence, that sentence.
- 11 **A.** Yes. The sentences that follow are when he says "these applicants," he's talking about ALDCs.
  - "It is thus essential to either, one, remove these applicants from the analysis; or two, allow for the possibility that the effect of race is different for these applicants, i.e., interacting these variables with race."
- Q. Okay. And you didn't remove the ALDC applicants from your analysis, correct?
- 19 A. Correct. I did not.
- Q. Did you instead try Dr. Arcidiacono's alternative suggestion?
- 22 A. Yes, I did.
- 23 Q. And what did you do?
- A. Well, exactly following his suggestion, what I did was I took the model that I used, my main or preferred model, and I

```
included a set of interactions for each of the A and the L
1
 2
     and the D and the C category that allow those tips to vary by
     race.
                So for example, if one was concerned that the
     legacy tip applied differently to African-Americans than to
 5
     other groups and that somehow was causing problems for my
     model, then this would be one way to get at that.
 7
          Please turn to Tab 21 in Volume 2. Do you find Defense
     Exhibit 697?
     Α.
          Yes.
10
          What does it show?
11
     0.
          This is a summary exhibit, average marginal effect of
12
13
     Asian-American ethnicity in Professor Card's model
14
     interacting ALDC attributes with race.
          Is that the attributes you just described?
15
     Q.
16
     Α.
          Yes.
               MR. WAXMAN: Your Honor, we offer Defendant's
17
18
     Exhibit 697 into evidence.
19
               MR. MORTARA: No objection.
                THE COURT: Admitted.
20
                (Defendant Exhibit No. 697 admitted.)
21
               MR. WAXMAN: Mr. Lee, let's now turn to
22
     demonstrative 10.41.
23
     BY MR. WAXMAN:
24
```

O. What does this show?

A. This is the estimation results from following that procedure. Now I'm doing exactly what Professor Arcidiacono suggested, which is to interact each of A and L and D and C, each of the tips associated with those four categories with all the different racial groups from the model.

And I'm showing the average marginal effects of Asian-American ethnicity year by year and on average in my model.

And it's really quite remarkable how similar these are to the estimates from my baseline model. So they're essentially identical. So none of them are statistically significant. Three are negative and three are positive on a year-by-year basis, again none statistically significant. And the average is minus 0.05 and is not statistically different than zero.

- Q. And so what does this tell you about the statistically significant negative effect of Asian-American ethnicity in the admissions process, allowing for the effect of being an ALDC applicant to vary by race?
- A. It says that it makes no difference at all in the
  assessment of the average marginal effects year by year on
  average.
- Q. Did you in your analysis try excluding any group of the ALDC applicants from your model?
  - A. Yes. Professor Arcidiacono in his rebuttal, second

report, basically fits what he calls an extended sample but 1 now excluding athletes. So he's made a special case that 2 athletes should be excluded in some sense no matter what. And so what I did was I took my model and simply excluded athletes to see how different the results would be. 5 Would you please turn to Tab 20 in Volume 2. Do you find Defense Exhibit 696? 7 Α. Yes. O. What is this document? The first table is average marginal effect of 10 Asian-American ethnicity in Professor Card's model when 11 recruited athletes are excluded. And the second is a summary 12 13 table that shows the average marginal effect comparing different choices between my model and his model when 14 athletes are excluded. 15 MR. WAXMAN: Your Honor, we offer defense 16 Exhibit 696 into evidence. 17 18 MR. MORTARA: No objection. THE COURT: Admitted. 19 (Defendant Exhibit No. 696 admitted.) 20 MR. WAXMAN: Let's turn, Mr. Lee, to the next 21 demonstrative 10.42. 22

23 BY MR. WAXMAN:

24

25

Q. And let me ask you, Dr. Card, to please explain what this is looking at and what you found.

A. So this is the results of estimation from my model, now excluding recruited athletes entirely from the analysis.

And I'm showing estimated average marginal effects year by year and on average across the six years, exactly in the format of all the other tables that I've presented.

And you can see that the average marginal effects year by year are very similar to the ones that we've seen in previous tables. The average marginal effect across all the years is minus 0.02 versus minus 0.05, so it's a tiny bit different but not in any important way different.

None of these are statistically significant, just as in my main model.

- Q. So is it fair to say that even excluding recruited and athletes, as Professor Arcidiacono does even in his expanded model, shows no statistically significant average marginal effect of Asian-American ethnicity on admissions probabilities?
- A. Yes.

- MR. WAXMAN: So let's put up, Mr. Lee, please,
  DD 10.37 again.
  - Q. So just to recap, can you summarize again why you included ALDCs in your model?
  - A. Yes. So just to summarize, my understanding of the process, the results of reading a lot of depositions and listening to the trial and so on as well as documentary

1 2

questions about who's included in the process and not, all of that to me says that ALDCs are, in fact, part of the process.

Secondly, they are a very important part of the

materials put together by Harvard itself, including like web

Secondly, they are a very important part of the overall admitted pool. So it's true that they're underrepresented in the set of applicants, but like other students who are strong — and I've shown these students are particularly strong in many, many dimensions — they're more likely to be admitted than other students. So they end up representing 30 percent of the admissions pool.

And so I think it's important to understand the process and the composition of the class to understand that group and include them in the analysis.

And finally, as I emphasized, the third point, if you're trying to understand the way that Harvard's admissions committee is evaluating different factors in some kind of context vis a vis the rest of the class, then throwing away a third of the people who will be admitted just is not going to work because you're not going to be able to look at who was being compared to who in that evaluation process.

Q. Let's now turn to defense demonstrative 10.43. And now let's go to the second line of your demonstrative showing the major differences in modeling, how you dealt with six years of data in your -- the six years of data at issue here.

Did you run your model on a year-to-year basis?

A. I did, yes.

- Q. And why did you do that?
- A. Well, there's a variety of reasons. I'm going to summarize them at a high level in the next slide, I believe. Yes.
- Q. Let's by all means see the next slide.

MR. WAXMAN: Mr. Lee. Thank you.

A. So one reason just conceptually is that the process is year by year and so fitting a year-by-year model seems a straightforward way to deal with that, and very intuitive and obvious.

A second reason is that in the early years of the sample, Harvard had dropped early action, as we heard President Simmons talking about, when they experimented with getting rid of early action and then brought it back.

So the process was somewhat different. So different issues were at play, I think, in terms of understanding admissions decisions potentially. And so I want to have a year-by-year model to allow things to be different in the early action in different years.

A third issue is that over time, my understanding -- and I think the evidence shows this is true. My understanding is that Harvard is gradually having different priorities for who it would like to look for.

For example, just before my sample got started,

they opened up the School of Engineering and Applied Science, a major initiative for them. So they are looking for building up the computer science department, which is many, many top departments are trying to do that over this period. So their priorities are changing.

Related to that but somewhat different is the applicants are changing. So an example I think that's important, certainly at my university and I believe at Harvard as well, is fewer and fewer applicants each year are applying for certain fields like humanities. So the characteristics of the students are changing.

A fifth reason is that there's different codings of different variables in different years.

So for instance, Harvard has a so-called docket system. And they actually changed the docket system and introduced a new docket from the first year to the later years of the sample. So it's I think important to think about that kind of coding.

And that kind of coding difference affects quite a few different variables. It affects the fraction of students who are, for instance, coded as disadvantaged changed from year to year. And as I'll show below, the fractions are coming — fractions of students who are classified with different parental occupation and so on changes.

Finally, not shown on the slide, but there's a

sixth set of reasons. So purely from a statistical point of view, not substantive -- I would think of these as substantive reasons.

But purely from a statistical point of view, there's a couple of important features of a year-by-year model. So first I'm going to show that fitting a year-by-year model gives rise to a model that has more explanatory power. So that's usually considered a superior feature. I'm going to show it gives rise to an estimated marginal effect that's more precise or more powerful. So it's got higher statistical power.

And finally, as I showed in my report, there's a formal statistical way to see whether a year-by-year model is preferred over a model that's pooled. And that kind of statistical test prefers the year-by-year model.

- Q. Would you please turn, Professor Card, to Tab 25 in the same volume, Volume 2, and tell me when you've found Defense Exhibit 703.
- **A.** Yes.

- Q. What is Defense Exhibit 703?
- A. So this is an exhibit showing graphically proportion of applicants by intended concentration in different years.
  - MR. WAXMAN: We offer defense Exhibit 703, Your Honor.
- MR. MORTARA: No objection.

```
THE COURT: Admitted.
1
                (Defendant Exhibit No. 703 admitted.)
 2
     BY MR. WAXMAN:
 3
     Q.
          Turn to Tab 26, please, in the same volume.
 4
     Α.
          Yes.
          Do you find Defense Exhibit 704?
     0.
 7
     Α.
          I do, yes.
         And what does this show?
     0.
 9
     Α.
          It's two exhibits, one showing the number of Harvard
     applicants receiving an application fee waiver by year, and
10
11
     one showing the number of Harvard applicants identified as
     disadvantaged by year.
12
13
               MR. WAXMAN: We offer defense Exhibit 704.
14
               MR. MORTARA: No objection.
                THE COURT: Admitted.
15
                (Defendant Exhibit No. 704 admitted.)
16
     BY MR. WAXMAN:
17
     Q. And, Professor Card, did you also calculate an average of
18
19
     the year-by year results?
          Oh, yes, certainly. That's what I'm always doing in the
20
     bottom row of my tables. I'm always showing an average
21
     across all the years.
22
          And can you explain to the Court why you do that?
23
          Yes. So my understanding is that these six years are the
24
     Α.
     issues -- are the years under contention.
25
```

So what's important to understand would be the average difference between Asian students and white students that remain on average across these eight years. So finding the average marginal effect across those six years would be the appropriate thing to do, and that's what I tried to do.

- Q. Did you hear Dr. Arcidiacono testify that his model allows for more "statistical power" for some of the coefficients?
- A. Yes.

- 10 Q. Do you agree with that?
  - A. I agree that it potentially allows statistical power for certain kinds of coefficients. But for the coefficient that's fundamental to this case, which is the average marginal effect for Asian-American applicants as a whole, the average across all Asian and other students and assessing that average effect, it's not correct.

In fact, if you look at and compare the statistical power, precision of the estimates from his model versus my model, my model is superior. It has a higher statistical power.

Q. Did you examine how the precision of you -- I think you answered this, but let me just make it clear.

Did you examine the precision of your model and how it compares to the precision of Dr. Arcidiacono's model?

A. I did. I did that directly, yes.

Q. Would you please turn to or can we now have defense demonstrative 10.45.

And using demonstrative 10.45, can you explain what you found?

THE COURT: Are you going to now explain about what you mean by "statistical power"?

THE WITNESS: Yes. Yes, Your Honor, I'm going to try.

THE COURT: If you think you've already done it, you've lost me. So keep going.

MR. WAXMAN: And the examiner.

THE WITNESS: Yes. What the term means, it has a formal and statistical meaning, but I'm not going to try and explain that because that's hopeless and not very useful.

What I'm going to do instead is what it's used to kind of mean informally. It means that what you're trying to do is get an estimate of something like, for instance, the average marginal effect that you can say is as precisely estimated as possible.

So "precisely estimated" means that when you get that estimate it's less likely to have occurred by chance, given the estimate that you got. And so it means that for a given estimate if both of us have an average marginal effect of 2, say an estimate, one of those could be statistically significant and one might not be.

1 2

\_

The one that is statistically significant, the reason why it's statistically significant is because that model had more power. It was able to say, well, this given estimate, this 2 percentage point difference is different than zero. The other model, the weaker model is not able to do that.

Does that help answer it?

THE COURT: How do you get to the power measurement?

THE WITNESS: Okay. Thank you. That's what this slide is meant to do. So the way that we assess statistical power is by something called a standard error, which is an assessment of the range of values that could have generated -- very closely related to the range of values that could have estimated the estimate that you got by chance.

So if the standard error is large, it means that I have an estimate. That particular estimate could have come about even though the truth is in a very wide range, including, for instance, zero, which is always an important reference point.

So having a small standard error, on the other hand, means that I've got an estimate and the range of possible values of the truth that could have given rise to that estimate is quite narrow.

So a powerful model has a small standard error,

which means that you went into the data, you estimated your model, you had a lot of power, you were able to get an estimate that when you see that estimate, you know the range of possible values of the truth that could have estimated it is quite small.

And I apologize. The way statisticians think about these problems is completely unintuitive for many people, including all of my students for six, seven years. But that's what it means.

THE COURT: Is this .14 and .15, is that statistically significant or are you telling me the two models are of equal strength?

THE WITNESS: Actually that's a separate issue. I don't actually know if it's statistically significant.

I would say that my model is slightly more powerful. It's certainly not less powerful. There would be a potential way to assess whether it's significantly more powerful, but I am not asserting that.

MR. WAXMAN: Your Honor, I'm about to move to another subtopic. I don't know what Your Honor's pleasure is in terms of scheduling today.

THE COURT: Just for my own brain power, I'd rather not stop in the middle of a topic. Is your next topic going to be more or less than ten minutes?

MR. WAXMAN: I think that it will be --

```
THE COURT: And what's the statistical strength of
1
     your estimate?
 2
 3
               MR. WAXMAN: Exceptionally weak. It's barely
 4
     statistically -- it's barely confidently above zero. Yes, it
     is -- I can do it in ten minutes.
 5
               THE COURT: I'm happy to take the ten minutes.
 6
 7
               MR. WAXMAN: I have to say that I'm feeling the
     burden of yet another fire drill, so I'm happy to press on.
8
 9
               THE COURT: It's been a long day. Are you okay
     keeping going ten more minutes?
10
               THE WITNESS: Yes, Your Honor.
11
               THE COURT: Anybody else have any serious
12
13
     objections to ten more minutes? Let's go.
     BY MR. WAXMAN:
14
     Q. Professor Card, please turn to --
15
               MR. WAXMAN: Or Mr. Lee, please put up defense
16
     demonstrative 10.46.
17
18
          And going back to this, what is the third line showing?
     Q.
19
     Α.
          So this line is summarizing the set of variables that are
     included as part of the -- in my view, are included as part
20
     of the actual admissions process.
21
               So this would be parental occupation, intended
22
23
     career, staff interview, personal rating. Included in my
     model but excluded from Professor Arcidiacono's model.
24
25
     Q. And why did you include these variables in your model?
```

A. Well, as I said, my understanding is that each of these variables is, in fact, used by admission officers in evaluating candidates. I think there's substantial testimony from officers in previous depositions. There's also, for example, in some of the case studies that were talked about as part of the training materials for admissions officers, many of these issues are mentioned.

Q. Now, you mentioned earlier when you were talking about should I or should I not retire, since I'm on the bubble, that omitting factors can cause bias.

Can you just remind us what that concern is?

A. Yes. The concern is that there's some characteristic of one group of students relative to another that's somewhat different and that that characteristic is evaluated or valid in the admissions process.

And if you don't take account of the difference in that characteristic, then it will become part of the unobserved component of the model. And the model, not knowing what's going on, will essentially assign that difference as part of the average marginal effect between the two groups.

- Q. And is omitted-variable bias a concern with the variables that Dr. Arcidiacono has omitted from his model?
- A. Yes. In each case I believe that there's a substantial concern with omitting each of these variables because each of

- them is, in fact, part of the admissions process and has some power in the statistical model of the admissions process.
- And each of them differs somewhat between Asian and white students.
- Q. I see. And my next question was why.

Is the why that these factors vary by race?

- 7 A. Yes, somewhat.
- Q. And they can be associated with admissions outcomes?
- 9 | A. Yes.
- Q. What is the effect of omitting the intended career,
- parental occupation, and staff interview factors in
- 12 Dr. Arcidiacono's model?
- 13 A. Well, I think as we showed in the walk-through slide
- where we go from his model to my model, if one starts with my
- model and excludes that three sets of variables, then it
- makes a minor technical adjustment for the interactions.
- Then the effect of estimated average marginal effect of
- Asian-American ethnicity becomes negative and statistically
- 19 significant.
- Q. I think there are many factors. I think your model accounts for 200 factors every year.
- 22 Among those factors, are there other factors which 23 if omitted from your model would have produced the opposite 24 effect?
- 25 A. Yes, certainly.

- Q. Did you exclude any variables, any factors that would have produced the opposite effect?
- $\mathbf{A}$ . I didn't, no.
- Q. Did you hear Dr. Arcidiacono -- let me ask you, did
- 5 Dr. Arcidiacono exclude any factors which if omitted would
- 6 have produced the opposite effect?
- 7 A. Not to the best of my knowledge, no.
- Q. Did you hear Dr. Arcidiacono refer to "overfitting a
- 9 model"?
- 10 **A.** Yes.
- 11 Q. What does "overfitting" mean?
- 12 A. So overfitting is an issue that arises particularly when
- one has a relatively small sample and one is concerned that
- when one adds a spurious set of variables, a set of variables
- that isn't really part of the process, like hat size or eye
- color, those kind of variables, variables that don't really
- belong in the model, including those variables in the model
- can lower the statistical power of the model and lead to a
- 19 situation where when they're included in the model, an effect
- won't necessarily change very much, the estimated effect, but
- 21 it could become statistically insignificant.
  - So overfitting arises when these extra variables
- are included and kind of reduce the power of the model.
- Q. Do you have any concern that your model was overfitted?
- 25 **A.** I don't, no.

```
MR. WAXMAN: Did I make my ten minutes?
1
               THE COURT: Was that -- I don't?
 2
 3
               THE WITNESS: Yes, I don't.
               THE COURT: Was that K-N-O-W or I don't, no.
 4
               THE WITNESS: Your Honor, I apologize. I don't
 5
     have any concern that my model is overfitted.
 6
 7
               MR. WAXMAN: Your Honor, that's the end of this
     little mini segment.
8
               THE COURT: This seems like a good place to stop
9
            9:30 tomorrow? Karen, is that good for us? 9:30
10
     then.
     tomorrow. Do you want to try and start a little earlier to
11
     account for the earlier recess, or do you think we're on
12
13
     t.rack?
               MR. WAXMAN: I would have loved to be another half
14
     an hour, 45 minutes beyond. If Your Honor wants to start at
15
     9:00, it's totally fine with me.
16
               MR. MORTARA: Completely fine with me, Your Honor.
17
     I know we're leaving early tomorrow, so it would be more than
18
     fine for me.
19
               THE COURT: That's exactly why I'm trying to build
20
     in the extra time. I'm not sure I can effectively do 9:00.
21
     Why don't we shoot for 9:15 and then we can shorten up the
22
23
     lunch break a little bit, too, and get back to the number of
     minutes.
24
25
                            Thank you.
```

MR. WAXMAN:

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MR. MORTARA: Your Honor, I have one more thing,
 1
     which is we've resolved, I think, all the issues with the
 2
     exhibits with the demonstrative exhibit except for one where
     I asked for some changes to be made. It's Defendant 692.
     We'll talk about it in the evening. Hopefully there will be
     nothing tomorrow.
 7
               THE COURT: I'll get out here as close to 9:00 or
     9:15 as I can tomorrow. If we need a sidebar first, we'll
 8
     take it.
               MR. MORTARA: Your Honor, I'd offer plaintiff's
10
     demonstratives 23 to plaintiff's demonstrative 38. Those are
11
     demonstratives used for Kahlenberg's and --
12
13
               THE COURT: I'm sorry. 23 to 28? Is that what you
14
     just said?
               MR. MORTARA: PD23 to PD38.
15
               THE COURT: Mr. Waxman, I take there is no
16
     objection to those?
17
               MR. WAXMAN: No objection.
18
               THE COURT: So those are all admitted.
19
                (Plaintiff Exhibit Nos. PD23 to PD38 admitted.)
20
               MR. WAXMAN: Just to be clear, those are only the
21
     ones that went in. Mr. Kahlenberg testified --
22
23
               THE COURT: Take a look at them tonight, 23 to 38.
                (Court recessed at 4:00 p.m.)
24
25
```

1					
2	CERTIFICATION				
3					
4	I certify that the foregoing is a correct				
5	transcript of the record of proceedings in the above-entitled				
6	matter to the best of my skill and ability.				
7					
8					
9					
10	/s/ Joan M. Daly October 30, 2018				
11					
12 13	Joan M. Daly, RMR, CRR Date Official Court Reporter				
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15					
16					
17					
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19					
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21					
22					
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24					
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-					

1	INDEX OF WITNESSES	
2	WITNESS	Œ
3	RUTH SIMMONS	
4		6
5	Examination By Mr. Waxman Examination By Mr. Connolly 5	6 56
6		
7	DAVID CARD	7.0
8	Examination By Mr. Waxman	73
9		
10		
11		
12		
13		
14		
15		
16		
17		
18		
19		
20		
21		
22		
23		
24		
25		

Defendant	Exhibit Re	eceived
133		74
134		21
669		84
671		85
672		85
673		98
674		157
679		156
686		138
693		122
695		145
696		165
697		163
703		171
704		171
705		160
706		153
707		141
^ Governme	nt ^ Plaintiff Exhibit Re	eceived

1	PD24	
2	PD25	 181
3	PD26	 181
4	PD27	 181
5	PD28	 181
6		
7		
8		
9		
10		
11		
12		
13		
14		
15		
16		
17		
18		
19		
20		
21		
22		
23		
24		
25		