## **EXHIBIT C**

## **OMNIBUS BROWN DECLARATION**

1	UNITED STATES DISTRICT COURT
2	NORTHERN DISTRICT OF CALIFORNIA
3	SAN JOSE DIVISION
4	
5	
6	IN RE: HIGH-TECH EMPLOYEE )
7	ANTITRUST LITIGATION )
8	) No. 11-CV-2509-LHK
9	THIS DOCUMENT RELATES TO: )
10	ALL ACTIONS. )
11	)
12	
13	
14	CONFIDENTIAL - ATTORNEYS' EYES ONLY
15	VIDEO DEPOSITION OF KEVIN M. MURPHY, Ph.D.
16	December 3, 2012
17	
18	
19	
20	REPORTED BY: GINA V. CARBONE, CSR NO. 8249, RPR, CCRR
21	
22	
23	
24	
25	

06:07:28	1	But the as long as if you are willing to
06:07:30	2	stick to that assumption that it's really conduct by
06:07:33	3	age, then the age variable can help you identify that.
06:07:37	4	But what you are fundamentally doing is you are asking
06:07:41	5	was the age profile different in the conduct years than
06:07:44	6	in the non-conduct years. It's not surprising that he
06:07:48	7	gets a result that's actually backwards of what he says
06:07:50	8	you should have gotten.
06:07:51	9	He gets a result that says that the impact was
06:07:55	10	greatest on the youngest people and less on the
06:07:58	11	middle-age people, when his theory was it would be
06:08:02	12	exactly the reverse.
06:08:04	13	It's not surprising, given the amount of noise
06:08:06	14	he's got in his estimates. Again, it's an illustration
06:08:13	15	of how poorly this regression actually performs.
06:08:20	16	Q. So I'd like to direct your attention to
06:08:22	17	paragraph 128, please. This is the paragraph when you
06:08:34	18	discussed clustering of standard errors.
06:08:40	19	What I'd like to ask you is towards the middle
06:08:43	20	of the paragraph you make a reference to you say
06:08:46	21	that, "This exhibit shows that none of Dr. Leamer's
06:08:49	22	'undercompensation' estimates for any employer or year
06:08:52	23	is statistically significant at conventional levels
06:08:55	24	under the properly computed standard errors."
06:08:59	25	What does the phrase "statistically significant

06:09:01 1	at conventional levels" mean?
06:09:04 2	A. I think the most commonly used level that
06:09:07 3	people use is 95 percent or 5 percent level, however you
06:09:10 4	want to think about it. I think that's the most common
06:09:12 5	one. If people talk in economics, when people talk
06:09:17 6	about statistically significant and they don't say at
06:09:19 7	the 1 percent level, at the 5 percent level or whatever,
06:09:22 8	I think the shorthand economist typically uses 5 percent
06:09:25 9	level.
06:09:26 10	Q. Is that a requirement of economic analysis?
06:09:28 11	A. No, it's not a firm requirement. I'm just
06:09:31 12	saying, you know, that's the conventional level that
06:09:33 13	people use.
06:09:34 14	Q. Okay. Is that if I wanted to sort of look
06:09:36 15	that up somewhere, would I be able to look it up
06:09:39 16	anywhere?
06:09:40 17	A. Yeah. Probably econometric textbook would talk
06:09:45 18	about that. But generally people talk about
06:09:51 19	significance at various levels of significance.
06:09:55 20	(Reporter clarification.)
06:09:55 21	THE WITNESS: I'm just telling you the common
06:09:57 22	shorthand in economics is 5 percent, just talking about
06:10:01 23	statistically significant with no modifier.
06:10:03 24	MR. GLACKIN: Q. So what does statistical
06:10:06 25	significance mean?

06:10:08 1	A. It means in a classical statistical problem, it
06:10:12 2	means I achieved a result in terms of my estimate that
06:10:19 3	is typically, say, large relative to what I would expect
06:10:22 4	to happen just by chance.
06:10:26 5	So in other words, in a world where there were
06:10:28 6	no true effect, or no true difference, for example, in a
06:10:32 7	given sample, you are going to find a difference. Even
06:10:35 8	if the true say I had two populations and I was
06:10:38 9	comparing population A and population B, and I had
06:10:41 10	samples from each population, and I was going to
06:10:43 11	calculate the average height from my samples.
06:10:46 12	Even if the true average height in both
06:10:49 13	populations is the same, in my sample there is going to
06:10:52 14	be a difference in the average height of the sample from
06:10:55 15	population A and the average height from the sample of
06:10:59 16	population B.
06:11:00 17	The test of statistical significance is did I
06:11:02 18	get a difference in heights across those two populations
06:11:07 19	that was too big to happen just by chance. And the way
06:11:12 20	we quantify that is to say, did I get a difference in
06:11:16 21	heights that would happen less than 5 percent of the
06:11:19 22	time just by chance. That's really the idea of
06:11:22 23	statistical significance.
06:11:24 24	Q. Okay. Do you agree that this is a
06:11:31 25	description that statistical significance is a

06:11:33	1	description of how certain a statistical result is?
06:11:40	2	A. Yeah. It's not just it's a description of
06:11:45	3	how precisely I can estimate something, yeah. Somewhat
06:11:50	4	of a description. I mean, if you are just going to talk
06:11:54	5	about significance and not talk about the components
06:11:56	6	that go into it, then you might say it's it could be
06:12:00	7	described in terms of certainty.
06:12:05	8	Q. Is there any authority for well, is it your
06:12:10	9	opinion now, again, I don't want to invite you to
06:12:13	10	launch into excuse me. I don't want to invite you to
06:12:16	11	a discursive answer of your reviews about Dr. Leamer's
06:12:20	12	regression. I'd really like to stick to answers to the
06:12:22	13	question.
06:12:24	14	Is it your opinion that in order for a
06:12:26	15	statistical analysis to be reliable, it must produce a
06:12:30	16	statistically significant result?
06:12:32	17	A. Not necessarily. That doesn't have to be true.
06:12:36	18	Q. So
06:12:38	19	A. But statistical significance is one thing you
06:12:39 2	20	do look at. And particularly here, you can look at the
06:12:44 2	21	P values, for example, that show up in the table.
06:12:49 2	22	Q. Okay. So where are you directing me to? Are
06:12:55 2	23	you on your report or Dr. Leamer's report?
06:12:57 2	24	A. In my report. So you look at table, say, 22B.
06:13:11 2	25	Q. Is this appendix 22B or Exhibit 22B?

06:13:14 1	A. Exhibit 22B or Exhibit 22A. Either one. We
06:13:17 2	can go with A, it's the first one.
06:13:20 3	Q. Uh-huh. Okay.
06:13:22 4	A. So these would be the P values, which is the
06:13:25 5	probability that that you get a number at least that big
06:13:28 6	just by chance. And you can see for lots of these,
06:13:34 7	there these are from his estimates that restrict the
06:13:37 8	coefficients across. You get a lot of these P values 50
06:13:42 9	percent, which means it's a number I'm going to get a
06:13:45 10	number that size half the time just by chance. Kind of
06:13:49 11	what those numbers mean.
06:13:51 12	Q. You say there is a lot that are 50 percent?
06:13:53 13	A. I'm saying there is ones that are 50 percent,
06:13:55 14	30 percent, 40 percent. There is a few that are
06:13:58 15	smaller. But, you know, the majority of them are, you
06:14:03 16	know, 30 percent or higher. That means a third of the
06:14:06 17	time I'm going to get a number like that just by chance.
06:14:20 18	Q. So
06:14:27 19	A. And remember, this is just looking for an
06:14:29 20	average effect, let alone asking the question whether
06:14:32 21	there is a common effect.
06:14:35 22	Q. So if I wanted to look at some authority for
06:14:38 23	the proposition that these P values are a basis to
06:14:44 24	reject Dr. Leamer's regression analysis, what authority
06:14:48 25	should I look at?

06:14:51	A. You could look at any basic econometrics
06:14:55	2 textbook.
06:14:56	Q. Should be easy for you to identify one, then,
06:14:57	4 if I
06:14:59	A. You can look at Green, you could look at the
06:15:01	book that we cite in here. There is tons of econometric
06:15:07	textbooks out there that would talk about these things.
06:15:11	Q. And they will say a regression with P values in
06:15:13	9 that range ought to be rejected?
06:15:15 1	A. No. They would say P values in that range are
06:15:17 1	not something that you would say provides really
06:15:21 1	substantial evidence of the hypothesis.
06:15:25 1	Q. Why don't you just give me one textbook that
06:15:28 1	you are certain includes this proposition.
06:15:30 1	A. You know, look, I last looked at textbooks 30
06:15:34 1	years ago when I was in school. People we don't rely
06:15:37 1	on textbooks for what we do. We you know, it's all
06:15:41 1	done in research and papers and journals and all those
06:15:45 1	things. I mean, you know, you could you could you
06:15:51 2	could look at Green, I guess, would be a textbook that
06:15:54 2	would have it. You could look at, you know
06:15:56 2	Q. Is Green one that you cited in here?
06:15:58 2	A. Yeah, we cited Green and we cited one other
06:16:02 2	one. The book we cited on clustering.
06:16:05 2	Q. So the Angrist and Pischke?

06:16:06 1	A. No, Angrist and Pischke is yeah, that would
06:16:10 2	be a useful one to look at. You could just ask Ed. I
06:16:17 3	mean, he'll tell you.
06:16:18 4	Q. Well, if you'll take his word for it, whatever
06:16:20 5	his answer is, then I'm happy to do that.
06:16:23 6	A. I sure hope he's still the same guy I knew.
06:16:25 7	But he should be able to tell you that a P value of $.5$
06:16:30 8	isn't something that you would write home about.
06:16:32 9	But it's worse than that. It's not the P
06:16:34 10	values here. It's really it's really the degree of
06:16:38 11	precision that you have for estimating even the average
06:16:41 12	effect. It's really problematic, and it's unfortunate.
06:16:49 13	Q. Is there a better way to estimate the effect of
06:16:55 14	this conduct than using a regression analysis?
06:17:02 15	A. I think if you are going to do it, you would
06:17:03 16	have to do it a different way.
06:17:06 17	Q. What are some possible ways that are feasible
06:17:09 18	given the data?
06:17:11 19	A. First off, I think you wouldn't want the
06:17:13 20	theory economics tells us that there is going to be
06:17:16 21	differential effects for different people, which I think
06:17:19 22	pushes you away from the regression analysis to begin
06:17:21 23	with. Because the regression analysis, at most, is
06:17:27 24	going to give you an average, and that's not going to
06:17:29 25	tell you whether there was class-wide harm. I think you

Deposition of Kevin M. Murphy, Ph.D.

06:17:31 1	would have to move away from that. I don't think the
06:17:36 2	regression analysis is going to be useful for that.
06:17:39 3	If you were going to do a regression analysis
06:17:41 4	you would have to have one that does a much better job
06:17:44 5	of controlling for the other determinants of firm-level
06:17:48 6	compensation over time. That's the thing that would
06:17:53 7	solve your potential problem.
06:17:58 8	Q. What I'm asking is, is there some mechanism
06:18:00 9	other than a regression analysis by which this can be
06:18:03 10	accomplished?
06:18:05 11	A. There very well could be. But Professor Leamer
06:18:09 12	hasn't done it.
06:18:09 13	Q. Can you tell us any mechanisms, other than a
06:18:12 14	regression analysis, that would account for this
06:18:16 15	A. Sure. You know, if I had some time to work on
06:18:18 16	it, I could come up with something probably. That's not
06:18:21 17	what I was asked to do. The regression I think the
06:18:26 18	regression, the number of flaws it has, cannot be put
06:18:30 19	forward as the answer to this question. It really
06:18:33 20	can't. And I'm sorry to say that.
06:18:41 21	Q. You don't have to be sorry. It's not the first
06:18:43 22	time I've heard it, Dr. Murphy. Believe me. It's
06:18:46 23	really okay. I understand.
06:18:48 24	A. Anyway
06:18:48 25	MR. GLACKIN: So, look, I have probably, I

1	I, Gina V. Carbone, Certified Shorthand
2	Reporter licensed in the State of California, License
3	No. 8249, hereby certify that the deponent was by me
4	first duly sworn and the foregoing testimony was
5	reported by me and was thereafter transcribed with
6	computer-aided transcription; that the foregoing is a
7	full, complete, and true record of said proceedings.
8	I further certify that I am not of counsel or
9	attorney for either of any of the parties in the
10	foregoing proceeding and caption named or in any way
11	interested in the outcome of the cause in said caption.
12	The dismantling, unsealing, or unbinding of
13	the original transcript will render the reporter's
14	certificates null and void.
15	In witness whereof, I have hereunto set my
16	hand this day: December 6, 2012.
17	Reading and Signing was requested.
18	Reading and Signing was waived.
19	X Reading and signing was not requested.
20	
21	
22	
23	GINA V. CARBONE
24	CSR 8249, RPR, CCRR
25	