## WEBVTT

- 1 00:00:00.000 --> 00:00:01.250 Good morning, everyone.
- 2 00:00:03.400 --> 00:00:04.233 Noon.
- $3\ 00:00:04.233 \longrightarrow 00:00:06.390$  Welcome to the Yale Center on Climate Change
- $4~00:00:06.390 \longrightarrow 00:00:07.890$  and Health seminar.
- 5 00:00:07.890 --> 00:00:10.180 I'm your host today, Dr. Kai Chan,
- 6 00:00:10.180 --> 00:00:12.980 assistant professor at the Yale school of public health.
- 7 00:00:13.840 --> 00:00:17.350 During the presentation if you have any questions
- 8 00:00:17.350 --> 00:00:19.100 you can use the chat box
- 9 00:00:19.100 --> 00:00:23.530 and we will try to address them as the speaker finishes.
- $10\ 00:00:23.530 \longrightarrow 00:00:27.380$  As a reminder, today's seminar will be recorded.
- $11\ 00{:}00{:}27.380 \dashrightarrow 00{:}00{:}32.380$  So, it is my great pleasure today to introduce our speaker
- $12~00{:}00{:}33.010 \dashrightarrow 00{:}00{:}36.580$  professor Greg Wellenius from Boston university
- $13\ 00:00:36.580 \longrightarrow 00:00:38.090$  school of public health.
- 14 00:00:38.090 --> 00:00:40.770 So Greg is actually the 2019,
- 15 00:00:40.770 --> 00:00:45.770 recipient of the ISEE Tony McMichael award.
- $16~00{:}00{:}45.920 \dashrightarrow 00{:}00{:}50.370$  So it is very exciting to have Greg here today because,
- $17\ 00:00:50.370 --> 00:00:53.840$  everyone knows Tony McMichael was the pioneer
- $18\ 00:00:53.840 \longrightarrow 00:00:55.810$  that developed the connection
- $19\ 00:00:55.810 \longrightarrow 00:00:58.870$  between epidemiology and the global countries.
- $20\ 00:00:58.870 \longrightarrow 00:01:00.810$  So with that legacy,
- $21\ 00:01:00.810 \dashrightarrow 00:01:04.840$  I would like to take it over to Greg and very much,
- $22\ 00:01:04.840 \longrightarrow 00:01:06.290$  looking forward to your talk.
- 23 00:01:08.020 --> 00:01:08.853 Wonderful.
- $24\ 00:01:08.853 \longrightarrow 00:01:10.017$  Thank you, Kai.

- $25\ 00:01:10.017 --> 00:01:11.830$  Thanks so much for the invitation to speak here.
- 26 00:01:11.830 --> 00:01:14.400 And I only wish we could meet in person,
- $27\ 00:01:14.400 \longrightarrow 00:01:16.370$  under better circumstances.
- 28 00:01:16.370 --> 00:01:17.740 I was telling Kai before
- $29\ 00{:}01{:}19.280 \dashrightarrow 00{:}01{:}22.440$  a few minutes earlier that one of the great pleasures
- $30\ 00{:}01{:}22.440 \dashrightarrow 00{:}01{:}26.140$  of giving seminars in places is visiting with the people
- $31\ 00:01:26.140 \longrightarrow 00:01:27.681$  in small groups.
- $32\ 00:01:27.681$  --> 00:01:31.210 So hopefully we'll have the opportunity to do that,
- $33\ 00:01:31.210 \longrightarrow 00:01:33.043$  again shortly.
- $34\ 00:01:33.043 \longrightarrow 00:01:34.343$  So let me share my screen.
- $35\ 00:01:38.877 \longrightarrow 00:01:39.710$  Okay.
- 36 00:01:39.710 --> 00:01:41.900 So you should be able to see my slides,
- $37\ 00{:}01{:}41.900 \dashrightarrow 00{:}01{:}46.823$  Kai, give me the thumbs up or somebody can see my screen.
- 38 00:01:48.229 --> 00:01:49.062 Okay, great.
- $39\ 00:01:49.062 \longrightarrow 00:01:50.820$  So we'll just go ahead and get started.
- 40 00:01:51.840 --> 00:01:54.190 So yeah, so feel free to stop me along the way.
- 41~00:01:55.065 --> 00:01:57.270 I will rely on Kai to flag me down
- 42 00:01:57.270 --> 00:01:59.950 if you wanna put questions in the chat window
- $43\ 00:01:59.950 \longrightarrow 00:02:01.560$  and then I can stop,
- 44 00:02:01.560 --> 00:02:02.750 I don't mind being interrupted
- $45\ 00:02:02.750 --> 00:02:05.660$  and that way we can make it more interactive that's fine.
- 46 00:02:05.660 --> 00:02:07.248 I should mention that,
- 47 00:02:07.248 --> 00:02:10.980 I am currently a visiting scientist
- $48\ 00:02:10.980 \longrightarrow 00:02:13.950$  working with Google and, this
- 49 00:02:17.105 --> 00:02:18.760 nothing I say here should be interpreted
- $50\ 00:02:18.760 --> 00:02:21.740$  as being the official position of Google.
- 51 00:02:21.740 --> 00:02:22.941 All right.

- $52\ 00:02:22.941 \longrightarrow 00:02:24.223$  So with that I will get started.
- $53\ 00:02:25.661 --> 00:02:28.740$  So I wanted to talk today about the effects
- 54 00:02:28.740 --> 00:02:32.040 of heat on health, which is,
- $55\ 00:02:32.040 \longrightarrow 00:02:34.990$  very well described in the scientific literature
- $56\ 00:02:34.990 \longrightarrow 00:02:37.190$  and connect that to
- 57 00:02:37.190 --> 00:02:40.840 why we have sort of this disconnect between,
- $58~00:02:40.840 \longrightarrow 00:02:43.620$  what we know about heat and the fact that
- $59\ 00:02:43.620 \longrightarrow 00:02:48.620$  people continue to die of a heat related illness.
- $60~00:02:48.860 \longrightarrow 00:02:51.200$  So the problem, as I see it is that excess heat
- $61~00:02:51.200 \longrightarrow 00:02:54.270$  is a widely recognized threat to public health.
- 62 00:02:54.270 --> 00:02:57.010 It's often cited based on CDC statistics
- $63\ 00:02:57.010 \longrightarrow 00:02:59.387$  that in the U.S more people die
- $64\ 00:02:59.387 --> 00:03:00.470$  of extreme heat each year
- $65~00:03:00.470 \longrightarrow 00:03:02.930$  than of any other meteorologic event.
- $66\ 00:03:02.930 \longrightarrow 00:03:05.540$  So despite all this knowledge,
- $67\ 00:03:05.540 \longrightarrow 00:03:07.510$  that we have about the risks of
- $68~00{:}03{:}08.900 \dashrightarrow 00{:}03{:}12.233$  days of extreme and perhaps moderate heat,
- $69\ 00{:}03{:}12.233 \dashrightarrow 00{:}03{:}14.880$  there seems to have been remarkably little progress
- 70~00:03:14.880 --> 00:03:16.930 towards preventing heat related illness and death.
- $71\ 00:03:16.930 \longrightarrow 00:03:18.770$  So we still see that heat waves
- 72 00:03:18.770 --> 00:03:21.906 are a major source of morbidity and mortality
- $73\ 00:03:21.906 \longrightarrow 00:03:22.739$  across the world.
- 74 00:03:22.739 --> 00:03:25.564 And so this got us thinking that
- 75 00:03:25.564 --> 00:03:26.950 this suggests a lack of translation
- $76~00{:}03{:}26.950 \dashrightarrow 00{:}03{:}29.620$  of the abundance scientific knowledge about risks
- $77\ 00:03:29.620 \longrightarrow 00:03:31.113$  into public health action.
- $78\ 00:03:31.970 \longrightarrow 00:03:34.770$  And so just to highlight the point
- $79\ 00:03:34.770 \longrightarrow 00:03:36.540$  for those that may not be as familiar.

- $80\ 00:03:36.540 --> 00:03:41.024$  So a Seminole study by Antonio Gasperini and colleagues,
- 81 00:03:41.024 --> 00:03:44.160 London school of hygiene, tropical medicine,
- $82\ 00:03:44.160 --> 00:03:45.250$  published several years ago
- 83 00:03:45.250 --> 00:03:47.410 and have since published extensively,
- $84\ 00:03:47.410 \longrightarrow 00:03:51.100$  globally on the impacts of heat on health.
- 85 00:03:51.100 --> 00:03:54.820 And just to zoom in on a couple of locations,
- $86\ 00:03:54.820 \longrightarrow 00:03:56.420$  you could see that there's this,
- 87 00:03:57.802 --> 00:03:59.302 U shaped relationship between,
- 88 00:04:00.992 --> 00:04:01.825 daily maximum temperature,
- $89\ 00:04:01.825 \longrightarrow 00:04:04.440$  is typically used and the relative risk of
- 90 00:04:04.440 --> 00:04:07.210 some adverse outcome in this case mortality.
- 91 00:04:07.210 --> 00:04:10.617 And you can see that there is a temperature,
- $92\ 00:04:10.617 \longrightarrow 00:04:12.320$  what we'll call the temperature of minimum mortality,
- $93\ 00:04:12.320 \longrightarrow 00:04:15.220$  or the optimal temperature at which the fewest
- $94\ 00:04:15.220 \longrightarrow 00:04:16.697$  number of people die.
- $95~00:04:18.210 \longrightarrow 00:04:20.730$  And then as temperatures get warmer than that,
- 96 00:04:20.730 --> 00:04:24.140 you see a sharp increase, in,
- $97\ 00:04:24.140 \dashrightarrow 00:04:27.875$  the relative risk of mortality and the shape of this curve,
- 98 00:04:27.875 --> 00:04:30.180 varies from location to location,
- $99\ 00:04:30.180 \longrightarrow 00:04:35.180$  but the pattern has been shown throughout the world,
- $100\ 00:04:35.203 --> 00:04:38.910$  by Gasperini and colleagues, as well as
- $101~00{:}04{:}38.910 \dashrightarrow 00{:}04{:}40.630$  other groups in specific locations.
- $102\ 00:04:40.630 \longrightarrow 00:04:42.420$  So this is pretty universal
- 103 00:04:42.420 --> 00:04:44.639 and pretty well understood at this point.
- $104\ 00:04:44.639 \longrightarrow 00:04:48.182$  In the U.S we additionally know,
- $105\ 00:04:48.182 \longrightarrow 00:04:50.560$  about the effects on morbidity.
- $106\ 00:04:50.560 \longrightarrow 00:04:52.977$  So as measured by hospital admissions.

- $107~00:04:52.977 \dashrightarrow 00:04:56.277$  So this is some terrific work done by Jennifer Bob
- $108\ 00{:}04{:}56.277 \dashrightarrow 00{:}05{:}00.060$  working with Francesca Dominici at Harvard and team.
- $109\ 00:05:00.060 --> 00:05:02.980$  And, so this was in the Medicare population
- $110\ 00:05:02.980 \longrightarrow 00:05:06.537$  looking at millions of hospital admissions
- 111 00:05:07.956 --> 00:05:10.772 for a number of different causes and showing
- $112\ 00:05:10.772 \longrightarrow 00:05:14.063$  both the relative risk and the risk difference of,
- 113 00:05:14.063 --> 00:05:17.443 hospital admissions for different causes that you can see.
- 114 00:05:19.530 --> 00:05:21.860 Increased relative risk of fluid
- $115\ 00:05:21.860 \longrightarrow 00:05:23.320$  and electrolyte disorders, renal conditions,
- 116 00:05:23.320 --> 00:05:26.750 urinary tract infections, heat stroke,
- $117\ 00:05:26.750 \longrightarrow 00:05:29.054$  and other external causes.
- $118\ 00:05:29.054 \longrightarrow 00:05:33.660$  And, with the risk difference shown there as well.
- $119\ 00:05:33.660 \longrightarrow 00:05:36.640$  So, interestingly although heatstroke
- $120\ 00:05:36.640 \longrightarrow 00:05:38.100$  has the biggest relative risk
- $121\ 00:05:38.100 \longrightarrow 00:05:41.420$  because it's relatively uncommon as a diagnosis,
- $122\ 00:05:41.420$  --> 00:05:45.240 the risk differences is smaller than for some other causes.
- $123\ 00:05:45.240 \longrightarrow 00:05:46.590$  So terrific work.
- $124\ 00:05:46.590 \longrightarrow 00:05:47.830$  So this is just a sampling.
- 125 00:05:47.830 --> 00:05:50.307 There's a huge literature now on this,
- $126\ 00:05:50.307 \longrightarrow 00:05:52.220$  and very large studies demonstrating
- $127\ 00{:}05{:}52.220 {\:{\mbox{--}}\!>\:} 00{:}05{:}54.930$  that extreme heat is associated with higher rates of death
- $128\ 00:05:54.930 \longrightarrow 00:05:57.690$  and hospitalization all across the world.
- $129\ 00:05:57.690 \longrightarrow 00:06:02.120$  Moderate heat is associated with higher rates of death, and,
- 130 00:06:02.120 --> 00:06:04.930 building amounts of evidence suggesting also
- $131\ 00:06:04.930 \longrightarrow 00:06:06.363$  with hospitalization.

- $132\ 00:06:07.460 --> 00:06:10.270$  And we know that the vulnerability of these effects
- 133 00:06:10.270 --> 00:06:11.870 varies by personal housing
- $134\ 00:06:11.870 \longrightarrow 00:06:13.959$  and neighborhood characteristics.
- $135\ 00{:}06{:}13.959 --> 00{:}06{:}16.935$  Further we know that the U.S has already warmed
- $136\ 00:06:16.935 \longrightarrow 00:06:19.623$  more than a degree and is projected
- $137\ 00:06:19.623 --> 00:06:21.020$  to warm further through the end of the century
- $138\ 00:06:21.020 \longrightarrow 00:06:23.617$  in substantially with that,
- $139\ 00:06:23.617 \longrightarrow 00:06:27.401$  regional substantial regional variation and how much,
- $140\ 00:06:27.401 \longrightarrow 00:06:29.733$  further warming we expect to see.
- $141\ 00:06:30.970 \longrightarrow 00:06:35.020$  So how do we translate this into action
- $142\ 00:06:35.020 \longrightarrow 00:06:38.670$  that actually saves lives and reduces the health impact?
- 143 00:06:38.670 --> 00:06:40.640 So local public health and emergency
- $144\ 00:06:40.640 \longrightarrow 00:06:42.540$  preparedness officials
- 145 00:06:42.540 --> 00:06:43.890 need to know something a little bit different.
- $146\ 00:06:43.890 --> 00:06:46.117$  They need to know what are the health risks
- $147\ 00:06:46.117 \longrightarrow 00:06:49.410$  associated with a given climate hazard in my location,
- $148\ 00:06:49.410 --> 00:06:51.520$  what local actions can I take
- $149\ 00:06:51.520 \longrightarrow 00:06:53.250$  to protect the public health
- $150\ 00:06:53.250 \longrightarrow 00:06:55.470$  and do these actions actually work?
- $151~00{:}06{:}55.470 \dashrightarrow 00{:}06{:}58.330$  So I'm gonna walk you through some of the research
- $152\ 00:06:58.330 \longrightarrow 00:07:01.652$  that we've done in this domain.
- $153\ 00:07:01.652 \longrightarrow 00:07:03.020$  And I'll start with what are the health risks
- $154\ 00:07:03.020 \longrightarrow 00:07:04.900$  associated with a given climate hazard
- 155 00:07:04.900 --> 00:07:06.343 in a particular location?
- $156~00:07:07.480 \dashrightarrow 00:07:10.560$  So I started this work when I was in Rhode Island,
- $157\ 00:07:10.560 --> 00:07:13.535$  actually Julia Gold at the time

- 158 00:07:13.535 --> 00:07:14.990 at the Rhode Island department of health,
- $159\ 00:07:14.990 \longrightarrow 00:07:15.990$  came to me and said,
- $160\ 00:07:17.472 \longrightarrow 00:07:18.850$  we really wanna know how many people
- $161\ 00:07:19.687 \longrightarrow 00:07:23.264$  are dying of heat and Rhode Island and how many ed visits,
- $162\ 00:07:23.264 \longrightarrow 00:07:24.925$  we have in Rhode Island.
- $163\ 00:07:24.925 --> 00:07:26.516$  We need to know how to prioritize this.
- $164\ 00:07:26.516 \longrightarrow 00:07:28.192$  And I said, well, there's lots of literature
- $165\ 00{:}07{:}28.192 \dashrightarrow 00{:}07{:}30.060$  it's a big problem you should just be worried about it.
- 166 00:07:30.060 --> 00:07:32.380 And she said, no, can you give me a number?
- 167 00:07:32.380 --> 00:07:33.530 And so I said, okay sure
- $168\ 00:07:33.530 \longrightarrow 00:07:35.615$  let's try to give a number.
- $169\ 00:07:35.615$  --> 00:07:38.810 And then it turned out that New Hampshire and Maine
- $170\ 00:07:38.810 \longrightarrow 00:07:42.318$  were also in interested in the same question.
- $171\ 00:07:42.318 \longrightarrow 00:07:44.553$  Public health officials in those States
- $172\ 00:07:44.553 \longrightarrow 00:07:45.633$  were interested in the same question.
- $173\ 00:07:46.853 \longrightarrow 00:07:49.380$  And because this was done at small,
- 174 00:07:49.380 --> 00:07:51.563 relatively smaller populations,
- $175\ 00:07:52.900 \longrightarrow 00:07:54.120$  we all had the challenge
- 176 00:07:54.120 --> 00:07:57.060 of having sufficient statistical power,
- $177\ 00:07:57.060 \longrightarrow 00:07:58.670$  to examine the associations
- $178\ 00:07:58.670 --> 00:08:01.840$  between heat and either mortality or ed visits,
- $179\ 00:08:01.840 \longrightarrow 00:08:03.590$  in our own communities.
- 180 00:08:03.590 --> 00:08:08.590 So we partnered with between Rhode Island,
- $181~00:08:08.897 \dashrightarrow 00:08:11.970$  New Hampshire and Maine to pull data,
- $182\ 00:08:11.970 \longrightarrow 00:08:15.030$  do the analysis in each of the community shown here
- $183\ 00{:}08{:}15.030 \dashrightarrow 00{:}08{:}19.420$  and then pull the results to have enough statistical power.
- $184\ 00:08:19.420 --> 00:08:21.380$  And we also engage with the regional offices

- 185 00:08:21.380 --> 00:08:24.900 of the national weather service, in order,
- $186\ 00:08:24.900 \longrightarrow 00:08:28.730$  they were interested to reconsider the
- 187 00:08:29.880 --> 00:08:33.170 threshold criteria at which the,
- 188 00:08:33.170 --> 00:08:35.340 heat advisories or heat warnings were issued
- $189\ 00:08:35.340 \longrightarrow 00:08:37.020$  based on local evidence.
- $190\ 00:08:37.020 \longrightarrow 00:08:40.780$  So we were trying to provide local actionable evidence,
- $191\ 00:08:40.780 \longrightarrow 00:08:43.410$  and in particular in communities outside of
- $192\ 00:08:43.410 \longrightarrow 00:08:46.042$  the large cities of the area that would otherwise,
- $193\ 00:08:46.042 \longrightarrow 00:08:47.573$  dominate the signal.
- $194\ 00:08:49.489 \longrightarrow 00:08:51.927$  And so we found what you'd expect is that the,
- $195\ 00:08:51.927 --> 00:08:54.470$  here we were interested in heat index,
- $196\ 00:08:54.470 --> 00:08:56.576$  'cause we were doing this in partnership
- $197\ 00:08:56.576$  --> 00:08:58.060 with the national weather service and heat index is
- $198\ 00:08:58.060 \longrightarrow 00:09:00.970$  this combination of temperature and humidity that,
- 199 00:09:00.970 --> 00:09:03.310 they often use for issuing heat warnings
- $200\ 00:09:03.310 \longrightarrow 00:09:04.603$  and heat advisories.
- $201\ 00:09:05.474 \dashrightarrow 00:09:07.560$  And we found approximately what we expected,
- 202 00:09:07.560 --> 00:09:10.010 that there was a monotonic relationship
- 203 00:09:10.010 --> 00:09:12.880 between increasing maximum daily heat index
- $204\ 00{:}09{:}12.880 \dashrightarrow 00{:}09{:}16.440$  and relative risk of emergency department admissions
- $205\ 00:09:16.440 --> 00:09:17.910$  that you see there on the left
- $206\ 00:09:17.910 \longrightarrow 00:09:20.500$  and deaths there as you see there on the right.
- $207\ 00:09:20.500$  --> 00:09:23.640 And, these were about of the expected magnitude.
- $208\ 00:09:23.640$  --> 00:09:26.920 And you can see that even pooling across these 15 locations,

- $209\ 00:09:26.920 \dashrightarrow 00:09:30.042$  the confidence intervals around our estimates of,
- $210\ 00:09:30.042 --> 00:09:32.760$  for mortality relative to some mortality
- $211\ 00:09:32.760 \longrightarrow 00:09:34.860$  were somewhat imprecise.
- 212 00:09:34.860 --> 00:09:39.690 So, the, I think the key part of this is,
- $213\ 00:09:39.690 \longrightarrow 00:09:42.240$  to translate sort of relative risks
- 214 00:09:42.240 --> 00:09:46.996 and smooth curves, which are available,
- 215 00:09:46.996 --> 00:09:49.321 with standard software now,
- $216\ 00:09:49.321 \longrightarrow 00:09:54.321$  thanks in large part to work by Gasperini and colleagues,
- $217\ 00:09:54.374 \longrightarrow 00:09:57.110$  is to translate that into real numbers.
- 218 00:09:57.110 --> 00:09:57.943 So, okay.
- 219 00:09:58.823 --> 00:10:02.030 So a curve is all good but how does that translate to
- 220 00:10:03.225 --> 00:10:07.330 number of excess ed visits or excess deaths
- 221 00:10:07.330 --> 00:10:11.264 attributable to days of different heat indices?
- $222\ 00{:}10{:}11.264$  -->  $00{:}10{:}13.830$  So we created this table where the bottom row here
- $223\ 00:10:13.830 --> 00:10:16.860$  shows you on all the days of 100 degrees
- 224 00:10:18.175 --> 00:10:19.760 with a heat index of 100 degrees or higher,
- 225 00:10:19.760 --> 00:10:21.200 how many excess deaths,
- $226\ 00{:}10{:}21.200 \dashrightarrow 00{:}10{:}24.526$  excess CD visits were there on the same day, or,
- $227\ 00:10:24.526 \longrightarrow 00:10:28.777$  incorporating the lag effects up to seven days.
- 228 00:10:28.777 --> 00:10:31.350 And so, across these 15 new England towns,
- $229\ 00:10:31.350 \longrightarrow 00:10:34.080$  there were 39 additional ed visits
- $230\ 00:10:34.080 \longrightarrow 00:10:37.133$  on all days over  $100\ degrees$  and 232.
- 231 00:10:38.910 --> 00:10:41.790 If you incorporate the lag structure,
- $232\ 00:10:41.790 \longrightarrow 00:10:43.663$  the fact that the next day
- $233\ 00{:}10{:}43.663 \dashrightarrow 00{:}10{:}45.550$  and the next day might also have some excess ed visits
- $234\ 00:10:45.550 \longrightarrow 00:10:48.820$  and about four to eight excess deaths
- $235\ 00:10:49.705 \longrightarrow 00:10:52.200$  for the days above 100 during this time period.

- 236 00:10:52.200 --> 00:10:55.490 And, obviously there's more days that are at,
- $237\ 00:10:55.490 \longrightarrow 00:10:57.010$  or above 95 degrees.
- $238\ 00:10:57.010 \dashrightarrow 00:11:01.218$  And so then, those numbers are bigger and, at,
- 239 00:11:01.218 --> 00:11:02.051 or above 95 degrees,
- 240 00:11:02.051 --> 00:11:05.910 there's close to 200 to 700 depending on,
- $241\ 00{:}11{:}05.910 \dashrightarrow 00{:}11{:}10.688$  how far out in the delay you want to incorporate,
- 242 00:11:10.688 --> 00:11:13.760 excess ed visits.
- $243\ 00:11:13.760 \longrightarrow 00:11:16.540$  So we took this information to the national weather service,
- $244\ 00{:}11{:}16.540 {\:{\mbox{--}}}{>}\ 00{:}11{:}18.540$  to the regional office for the national weather service
- $245\ 00:11:18.540 \longrightarrow 00:11:22.080$  and said, look, we think that at temperatures below that,
- $246\ 00:11:22.080 \longrightarrow 00:11:24.940$  at which you currently issue heat advisories.
- $247\ 00:11:24.940 \longrightarrow 00:11:26.960$  So during this time heat advisories were
- $248\ 00:11:26.960 \longrightarrow 00:11:29.680$  issued by the national weather service for days
- $249\ 00{:}11{:}29.680 \dashrightarrow 00{:}11{:}32.750$  with a heat index forecast to be above 100 degrees.
- $250\ 00:11:32.750 \longrightarrow 00:11:36.570$  We said, look at days as low as 95 or 90,
- $251\ 00:11:36.570 \longrightarrow 00:11:39.550$  we still see excess ed visits.
- 252 00:11:39.550 --> 00:11:41.820 And you can see that in the curves too, that,
- $253\ 00:11:41.820 --> 00:11:44.120$  it's relatively monotonic so there's no reason
- $254\ 00:11:44.120 \longrightarrow 00:11:46.360$  to pick just  $100\ degrees$  as the threshold.
- 255 00:11:46.360 --> 00:11:48.933 It could be even at 95 degrees, you could,
- 256 00:11:50.400 --> 00:11:53.460 presumably warn or prevent
- $257\ 00:11:53.460 \longrightarrow 00:11:56.100$  some excess morbidity and mortality.
- 258 00:11:56.100 --> 00:11:59.020 And the national weather service said, okay
- $259\ 00:11:59.020 \longrightarrow 00:11:59.900$  that's great.
- $260\ 00:11:59.900 \longrightarrow 00:12:03.790$  And, so let me
- $261\ 00:12:04.655 --> 00:12:06.773$  I'm gonna skip ahead to the national weather service.

- 262 00:12:07.940 --> 00:12:08.773 Okay, sorry.
- $263\ 00:12:09.656 --> 00:12:12.053$  So before I get to the national weather service story,
- $264\ 00:12:12.941 \longrightarrow 00:12:15.392$  so 'cause I think that's really important, but then,
- 265 00:12:15.392 --> 00:12:17.855 so I want to shout out to Kate Weinberger,
- $266\ 00:12:17.855 \longrightarrow 00:12:19.677$  who was a postdoc in my group at the time.
- $267\ 00:12:19.677 \dashrightarrow 00:12:21.050$  And what she said is, okay, this is great for New England,
- 268 00:12:21.050 --> 00:12:23.350 but how many people die of
- $269\ 00:12:24.359 \longrightarrow 00:12:27.850$  deaths attributable to heat across the country?
- $270\ 00:12:27.850 --> 00:12:32.090$  And so using data that we had a mortality through 2006,
- $271\ 00{:}12{:}32.090 \dashrightarrow 00{:}12{:}37.090$  she estimated that there were 5,000 or more excess deaths
- $272\ 00:12:39.029 --> 00:12:41.650$  per year across the U.S attributable to heat.
- $273~00{:}12{:}41.650 \dashrightarrow 00{:}12{:}43.280$  This number is really important because
- $274\ 00:12:43.280 \longrightarrow 00:12:45.410$  it's about an order of magnitude
- 275 00:12:45.410 --> 00:12:48.280 higher than what the CDC estimates
- $276\ 00:12:50.850 \longrightarrow 00:12:54.290$  report for heat related deaths that are those
- $277\ 00:12:54.290 \longrightarrow 00:12:57.091$  that are coded as being due to heat.
- 278 00:12:57.091 --> 00:12:58.520 And so when we think of sort of the,
- $279\ 00{:}12{:}58.520 \dashrightarrow 00{:}13{:}03.297$  public health burden of disease of heat related illness,
- 280 00:13:03.297 --> 00:13:06.370 the CDC estimates, are important,
- $281\ 00:13:06.370 --> 00:13:08.640$  but we think a likely an underestimate
- $282\ 00:13:08.640 --> 00:13:12.200$  of the true excess mortality due to heat.
- $283\ 00:13:12.200 \longrightarrow 00:13:14.529$  The other important point here is
- 284 00:13:14.529 --> 00:13:17.680 that if we separate out the extreme heat days
- $285\ 00:13:17.680 \longrightarrow 00:13:20.200$  versus the moderate heat days,
- $286\ 00:13:20.200 \longrightarrow 00:13:21.500$  so we defined extreme heat
- 287 00:13:21.500 --> 00:13:23.960 as those days above the 95th percentile
- 288 00:13:23.960 --> 00:13:25.860 for a particular location.

- $289\ 00:13:25.860 \longrightarrow 00:13:29.063$  And these 297 counties across the U.S.
- 290 00:13:30.340 --> 00:13:33.530 The burden of disease is actually bigger for,
- $291\ 00:13:33.530 \longrightarrow 00:13:35.330$  deaths due to moderate heat.
- 292 00:13:35.330 --> 00:13:38.100 And that's been reported previously,
- 293 00:13:38.100 --> 00:13:41.240 across the world and in the U.S but it,
- 294 00:13:41.240 --> 00:13:44.270 this puts concrete numbers on that that
- $295\ 00:13:44.270 \longrightarrow 00:13:48.870$  moderate heat accounts for a substantial burden of disease.
- $296\ 00:13:48.870 \longrightarrow 00:13:53.696$  And the other key point from this study is that, the risk,
- $297\ 00:13:53.696 \longrightarrow 00:13:58.260$  or the excess mortality is not distributed uniformly
- 298 00:13:58.260 --> 00:14:01.420 across the U.S and there's parts of the country,
- 299 00:14:01.420 --> 00:14:03.563 that seem much more vulnerable to,
- $300\ 00:14:05.430 \longrightarrow 00:14:07.790$  heat-related mortality than others.
- $301~00{:}14{:}07.790 \dashrightarrow 00{:}14{:}10.240$  Again, emphasizing the importance of local knowledge
- $302\ 00:14:10.240 \longrightarrow 00:14:13.353$  and local action to prevent these.
- 303 00:14:14.310 --> 00:14:17.490 Okay, so let's turn to local actions,
- $304\ 00{:}14{:}17.490 \dashrightarrow 00{:}14{:}19.720$  that can be taken to protect the public's health
- $305\ 00:14:19.720 \longrightarrow 00:14:24.467$  and evaluating if these actions actually work.
- $306~00{:}14{:}24.467 \dashrightarrow 00{:}14{:}26.770$  So in the U.S the national weather service issues,
- $307\ 00:14:26.770 --> 00:14:29.730$  heat, advisories, and excess heat warnings
- $308\ 00:14:29.730 \longrightarrow 00:14:33.080$  when the heat index is forecast to be high.
- 309 00:14:33.080 --> 00:14:35.322 Now, and this is for most places,
- $310\ 00:14:35.322 \longrightarrow 00:14:37.776$  there's a handful of places
- $311\ 00:14:37.776 \longrightarrow 00:14:39.563$  that use the other criteria besides heat index.
- 312 00:14:39.563 --> 00:14:41.930 But these warnings that are issued,
- 313 00:14:41.930 --> 00:14:44.300 provide information that the public can take,
- $314\ 00{:}14{:}44{.}300 \dashrightarrow 00{:}14{:}48{.}217$  of actions that the public can take to protect their health.

- $315\ 00{:}14{:}48.217 --> 00{:}14{:}51.630$  And in some places the warnings may also trigger
- 316 00:14:51.630 --> 00:14:54.568 activation of local heat response plans,
- $317\ 00:14:54.568 \longrightarrow 00:14:59.230$  that may involve things like opening cooling centers, or,
- $318\ 00{:}14{:}59.230 \dashrightarrow 00{:}15{:}01.650$  reaching out to particularly vulnerable communities
- 319 00:15:01.650 --> 00:15:04.689 in addition to targeted messaging,
- $320\ 00:15:04.689 \longrightarrow 00:15:07.430$  and the optimal thresholds for issuing
- $321\ 00:15:07.430 --> 00:15:09.473$  these heat advisories or heat warnings,
- 322 00:15:10.871 --> 00:15:14.770 remain largely unknown or unstudied,
- $323\ 00:15:14.770 \longrightarrow 00:15:17.906$  refer to heat advisories and warnings together
- $324\ 00:15:17.906 \longrightarrow 00:15:19.070$  as heat alerts.
- $325\ 00:15:19.070 \longrightarrow 00:15:23.890$  So based on the work we did in that New England study,
- $326\ 00:15:23.890 \longrightarrow 00:15:26.690$  working with the national weather service regional office,
- $327\ 00:15:26.690 --> 00:15:30.890$  they decided to partition the Northeast, which was.
- $328\ 00:15:30.890 \longrightarrow 00:15:34.830$  had one criteria for issuing heat advisories
- 329 00:15:34.830 --> 00:15:37.462 prior to this work starting in summer 2017,
- $330\ 00:15:37.462 \longrightarrow 00:15:39.933$  they changed it so that the,
- 331 00:15:40.880 --> 00:15:43.310 new way in New England was treated separately
- $332\ 00:15:43.310 \longrightarrow 00:15:45.060$  from the rest of the Northeast,
- $333\ 00:15:45.060 --> 00:15:47.450$  acknowledging that the vulnerability
- $334\ 00{:}15{:}47.450 \dashrightarrow 00{:}15{:}52.450$  to a heat related illness might be different in New England,
- $335\ 00:15:53.410 \longrightarrow 00:15:54.810$  not just based on our study,
- $336\ 00{:}15{:}56.027 \dashrightarrow 00{:}15{:}57.670$  there's other studies that have shown that as well.
- 337 00:15:57.670 --> 00:15:59.970 So this felt like a major public health victory.
- $338\ 00{:}15{:}59.970 \dashrightarrow 00{:}16{:}04.100$  So following this starting of the summer of 2017,

- $339\ 00:16:04.100 --> 00:16:06.980$  the national weather service in the region,
- $340\ 00:16:06.980 --> 00:16:11.900$  issued heat advisories when the heat index
- $341\ 00:16:11.900 \longrightarrow 00:16:16.510$  was forecast to be greater than 95 degrees.
- $342\ 00:16:16.510 \longrightarrow 00:16:18.060$  And there was some confusion as to whether
- 343 00:16:18.060 --> 00:16:20.010 that should be for one day or for two days,
- $344\ 00:16:20.010 \longrightarrow 00:16:21.380$  it was initially for two days.
- $345\ 00:16:21.380 --> 00:16:25.071$  And, then they subsequently revised the criteria.
- $346\ 00:16:25.071$  --> 00:16:28.910 to be consistent across the New England region.
- $347\ 00{:}16{:}28.910 \dashrightarrow 00{:}16{:}31.620$  So essentially changing the heat advisory threshold
- $348\ 00:16:31.620$  --> 00:16:35.133 from 100 degrees heat index to 95 degrees heat index.
- $349\ 00:16:36.188 \longrightarrow 00:16:37.330$  So this felt like, to me,
- $350\ 00:16:37.330 \longrightarrow 00:16:41.440$  a major public health victory, this was, one study,
- 351 00:16:41.440 --> 00:16:44.930 one paper that, and a series of conversations
- 352 00:16:44.930 --> 00:16:47.883 that ended up changing the criteria,
- 353 00:16:47.883 --> 00:16:50.720 at which heat advisories are issued for,
- $354\ 00:16:50.720 \longrightarrow 00:16:53.360$  a region with a substantial population.
- $355\ 00:16:53.360 --> 00:16:55.230$  So that felt very impactful,
- 356 00:16:55.230 --> 00:16:57.270 but it leads to the question of okay,
- $357\ 00:16:57.270 --> 00:16:59.720$  so we're issuing more heat advisories now
- $358\ 00:16:59.720 \longrightarrow 00:17:01.870$  than we were before,
- $359\ 00:17:01.870 \longrightarrow 00:17:03.280$  because we've changed the threshold.
- $360\ 00:17:03.280 --> 00:17:06.111$  Does that actually save anybody's life?
- 361 00:17:06.111 --> 00:17:10.240 So, we weren't the first or the only ones
- $362\ 00:17:10.240 \longrightarrow 00:17:12.490$  to be having this type of conversation.
- $363\ 00:17:12.490 \longrightarrow 00:17:16.830$  We followed in that research some very nice work,
- $364\ 00:17:16.830 \longrightarrow 00:17:18.440$  from New York city,
- $365\ 00:17:18.440 --> 00:17:20.610$  where they also informed local policy

- 366 00:17:20.610 --> 00:17:24.270 through evaluation of data in New York city.
- $367\ 00:17:24.270 \longrightarrow 00:17:28.082$  And so the question we were asking is,
- $368\ 00:17:28.082 \longrightarrow 00:17:32.410$  what is the optimal threshold for issuing heat alerts,
- $369\ 00:17:32.410 \longrightarrow 00:17:34.811$  heat warnings, and heat advisories.
- $370\ 00:17:34.811 \longrightarrow 00:17:38.490$  But these conversations assume that issuing
- 371 00:17:38.490 --> 00:17:40.480 heat advisories and warnings actually
- $372\ 00:17:40.480 \longrightarrow 00:17:44.170$  reduces heat-related morbidity and mortality.
- $373\ 00{:}17{:}44.170 \dashrightarrow 00{:}17{:}48.060$  And there's been relatively few studies on that question.
- 374 00:17:48.060 --> 00:17:51.400 What, again, there's a handful of studies,
- $375\ 00:17:51.400 --> 00:17:55.163$  but one that I particularly like is this study from,
- $376\ 00:17:56.050 \longrightarrow 00:18:01.040$  Tarik Benmarhina while he was still at McGill and looking,
- 377 00:18:01.040 --> 00:18:02.800 taking a very creative approach to looking
- $378\ 00:18:02.800 \longrightarrow 00:18:05.610$  at the effectiveness of the heat action plan that including
- 379 00:18:05.610 --> 00:18:09.563 included a new heat early warning system on,
- $380\ 00:18:11.170 \longrightarrow 00:18:14.350$  heat related mortality in Montreal.
- 381 00:18:14.350 --> 00:18:18.857 And, that team reported that the,
- $382\ 00:18:20.230 \dashrightarrow 00:18:24.850$  that having this heat action plan implemented in Montreal,
- 383 00:18:24.850 --> 00:18:26.770 reduced mortality during hot days
- $384\ 00:18:26.770 \longrightarrow 00:18:28.833$  by about two and a half deaths per day,
- $385~00{:}18{:}29.780 \dashrightarrow 00{:}18{:}33.680$  and with particularly larger effects amongst the elderly.
- $386\ 00:18:33.680 --> 00:18:36.915$  So we wanted that's exactly the question
- $387\ 00:18:36.915 \longrightarrow 00:18:39.010$  we wanted to ask is the issuing of heat warnings,
- $388\ 00:18:39.010 --> 00:18:40.800$  heat early warning system.
- 389 00:18:40.800 --> 00:18:44.343 How much does that benefit the population?
- $390\ 00:18:44.343 \longrightarrow 00:18:48.790$  So we built this study on the advantage

- 391 00:18:48.790 --> 00:18:52.400 that heat warnings are issued by people,
- $392\ 00:18:52.400 \longrightarrow 00:18:53.940$  and they're issued on forecasts.
- $393\ 00:18:53.940 \longrightarrow 00:18:55.610$  They're not completely algorithmic.
- $394\ 00:18:55.610 \longrightarrow 00:18:57.580$  They are issued by specialists
- $395\ 00:18:57.580 \longrightarrow 00:18:59.606$  at the national weather service
- $396\ 00:18:59.606 \longrightarrow 00:19:02.310$  that are focused on heat warnings.
- $397\ 00:19:02.310 \longrightarrow 00:19:04.520$  And, they,
- $398\ 00:19:04.520 \longrightarrow 00:19:07.870$  there's a collection of days where we forecast
- $399\ 00:19:07.870 --> 00:19:11.413$  that there will be a high degree of heat.
- 400 00:19:12.620 --> 00:19:15.240 And then it turns out to be a little bit less,
- $401\ 00:19:15.240 \longrightarrow 00:19:17.401$  and then there's other days where we forecast,
- $402\ 00:19:17.401 \longrightarrow 00:19:21.540$  lower heat levels.
- $403\ 00:19:21.540 \longrightarrow 00:19:23.290$  And it turns out to be a little bit higher.
- $404\ 00:19:23.290 --> 00:19:26.440$  So the forecast can be wrong even just a little bit.
- 405 00:19:26.440 --> 00:19:27.920 And because they're issued by people,
- $406\ 00:19:27.920 \dashrightarrow 00:19:30.750$  there's some discretion in how much they think
- $407\ 00:19:30.750 \longrightarrow 00:19:33.980$  people need to know about the upcoming heat.
- $408~00{:}19{:}33.980 \dashrightarrow 00{:}19{:}37.370$  So for instance, we were told that on the 4th of July,
- 409 00:19:37.370 --> 00:19:40.480 you might issue a heat alert at a slightly lower,
- 410 00:19:40.480 --> 00:19:42.920 forecast heat index, then on another day,
- $411\ 00:19:42.920 --> 00:19:44.680$  because so many people are gonna be outside.
- $412\ 00:19:44.680 --> 00:19:47.910$  So many people are going to be exposed that maybe,
- $413\ 00:19:47.910$  --> 00:19:50.540 we can have the flexibility to change that threshold.
- $414\ 00:19:50.540 \longrightarrow 00:19:53.530$  And that was entirely built into the system.
- $415\ 00:19:53.530 \longrightarrow 00:19:56.580$  So there should be these days with a similar heat index,
- 416 00:19:56.580 --> 00:20:00.740 right around sort of the warning threshold,

- $417\ 00{:}20{:}00.740 \dashrightarrow 00{:}20{:}04.800$  some of which have a heat warning some of which do not.
- $418\ 00:20:04.800 \longrightarrow 00:20:05.910$  And so that's the
- $419\ 00:20:08.870 \longrightarrow 00:20:11.380$  paradigm we were taking advantage of.
- $420\ 00:20:11.380 --> 00:20:16.123$  And at the time we had data on heat warnings from 20 cities
- $421\ 00:20:17.450 \longrightarrow 00:20:20.318$  that issue heat warnings regularly.
- $422\ 00:20:20:318$  --> 00:20:22:340 And, we matched us to the mortality data we had
- $423\ 00:20:22.340 \longrightarrow 00:20:23.647$  from the CDC.
- $424\ 00:20:24.910 \longrightarrow 00:20:29.323$  So the overlap between these two data sets is 2001 to 2006.
- $425\ 00{:}20{:}30.790 \dashrightarrow 00{:}20{:}35.790$  And, again, comparing days of similar heat index,
- $426\ 00:20:36.671 \longrightarrow 00:20:40.340$  with versus without a heat alert,
- 427 00:20:40.340 --> 00:20:42.720 this is the relative risk of mortality,
- $428\ 00{:}20{:}42.720 \dashrightarrow 00{:}20{:}44.953$  associated with having a heat alert.
- $429\ 00:20:46.002 --> 00:20:49.090$  And so if he'd warnings or heat advisories were,
- 430 00:20:49.090 --> 00:20:50.590 protective of the population,
- 431 00:20:50.590 --> 00:20:54.370 you would expect to see a decreased,
- $432\ 00{:}20{:}54.370 \dashrightarrow 00{:}20{:}58.860$  relative risk or a decrease in the rate of mortality
- $433\ 00:20:58.860 --> 00:21:01.340$  on days with a heat alert compared to without.
- $434\ 00:21:01.340 \longrightarrow 00:21:03.340$  So interestingly, we did not see that
- 435 00:21:03.340 --> 00:21:05.090 across these 20 cities,
- $436\ 00:21:05.090 \longrightarrow 00:21:08.300$  overall there was a null association.
- $437\ 00{:}21{:}08.300 \dashrightarrow 00{:}21{:}11.323$  And the one place where we did see an association was,
- $438\ 00:21:12.607 \longrightarrow 00:21:14.657$  Philadelphia with a reduction of about 4%
- $439\ 00:21:15.608 \longrightarrow 00:21:17.387$  in mortality of about 4% on days
- $440\ 00:21:17.387 \longrightarrow 00:21:19.370$  with a heat warning versus without.
- $441\ 00:21:19.370 \longrightarrow 00:21:22.510$  So this could be for a couple of reasons.

- $442\ 00:21:22.510 \longrightarrow 00:21:26.730$  One Philadelphia, we know has been very proactive about,
- 443 00:21:26.730 --> 00:21:28.910 having a robust heat early warning system
- $444\ 00{:}21{:}28.910 \dashrightarrow 00{:}21{:}33.910$  and taking action on days expected to have high mortality.
- 445 00:21:35.190 --> 00:21:38.850 It could also be that this was 20 estimates,
- 446 00:21:38.850 --> 00:21:41.330 and that one out of 20 was,
- $447\ 00:21:41.330 \longrightarrow 00:21:44.080$  in the direction that we expected.
- 448 00:21:44.080 --> 00:21:48.430 So clearly needs a followup study,
- 449 00:21:48.430 --> 00:21:51.530 but then we played the thought experiment of
- $450\ 00:21:51.530 \longrightarrow 00:21:54.510$  so heat alerts were effective
- $451\ 00:21:54.510 --> 00:21:56.640$  at reducing mortality in Philadelphia.
- $452\ 00:21:56.640 \longrightarrow 00:21:59.410$  And the number of deaths we estimated,
- $453\ 00:21:59.410 --> 00:22:03.080$  that were averted in Philadelphia
- 454 00:22:03.080 --> 00:22:05.270 each time they issued a heat alert,
- $455\ 00{:}22{:}05.270$  -->  $00{:}22{:}09.260$  was about four and a half or five lives per time.
- 456 00:22:09.260 --> 00:22:12.507 And so if you extrapolate that to the,
- 457 00:22:12.507 --> 00:22:15.660 typical year in Philadelphia during this time,
- $458\ 00:22:15.660 --> 00:22:18.280$  that meant that the heat early warning system
- 459~00:22:18.280 --> 00:22:21.180 saved about 45 lives per year.
- 460 00:22:21.180 --> 00:22:23.420 Again, lots of assumptions of causality,
- $461\ 00:22:23.420 \longrightarrow 00:22:28.420$  but it gives us a starting point that if the,
- 462 00:22:28.992 --> 00:22:32.150 if heat warnings could be as effective
- $463\ 00:22:32.150 \longrightarrow 00:22:35.110$  as they were observed to be in Philadelphia
- $464\ 00:22:35.110 --> 00:22:38.197$  during this time then a city like New York,
- 465 00:22:38.197 --> 00:22:41.064 or Dallas or Phoenix,
- $466\ 00:22:41.064 \longrightarrow 00:22:46.064$  could potentially save avert quite a few lives per year,
- $467\ 00:22:47.450 \longrightarrow 00:22:49.440$  depending on the effectiveness of the heat warning

- $468\ 00:22:49.440 \longrightarrow 00:22:53.470$  and how often the heat alerts are issued per year.
- 469 00:22:53.470 --> 00:22:55.466 So this provides,
- $470~00{:}22{:}55.466 \dashrightarrow 00{:}22{:}57.850$  a rough for back of the envelope calculation as to
- $471\ 00:22:57.850 \longrightarrow 00:23:02.850$  how many lives could potentially be averted each year,
- 472 00:23:03.350 --> 00:23:08.350 across the country if heat warnings, reduced,
- $473\ 00{:}23{:}09.080 \dashrightarrow 00{:}23{:}13.363$  mortality by the same magnitude as we saw in Philadelphia.
- 474 00:23:14.988 --> 00:23:15.940 Okay.
- 475 00:23:15.940 --> 00:23:16.773 And, again,
- $476\ 00{:}23{:}16.773 \dashrightarrow 00{:}23{:}19.173$  I want to emphasize that we're not the only ones
- $477\ 00:23:19.173 --> 00:23:20.006$  that have considered this question.
- $478\ 00:23:20.006 --> 00:23:22.600$  This is some great work by Kristie Ebi
- $479\ 00{:}23{:}24.680 \dashrightarrow 00{:}23{:}29.680\ 15$  years earlier, showing that in Philadelphia, exactly.
- 480 00:23:30.510 --> 00:23:33.226 The heat warning system, she estimated,
- $481\ 00:23:33.226 \longrightarrow 00:23:35.520$  each time that a heat warning
- $482\ 00:23:35.520 \longrightarrow 00:23:39.920$  was activated at saved two and a half lives per day.
- 483 00:23:39.920 --> 00:23:42.703 So, in the same ballpark of the estimates,
- $484\ 00:23:43.822 \longrightarrow 00:23:46.671$  we were seeing but in a very different time period.
- $485\ 00:23:46.671 \longrightarrow 00:23:49.660$  Okay, so there's lots of limitations to this study.
- $486\ 00:23:49.660 --> 00:23:52.481$  One of them is that the data we were using
- $487\ 00:23:52.481 --> 00:23:56.110$  at the time was old, was mortality data through 2006.
- $488\ 00{:}23{:}56.110 \dashrightarrow 00{:}24{:}00.603$  So, Kate Weinberger has since been updating this,
- 489 00:24:01.529 --> 00:24:05.920 sorta with more recent mortality data from,
- $490\ 00:24:05.920 \longrightarrow 00:24:07.250$  nine Northeastern cities

- $491\ 00:24:07.250 --> 00:24:09.640$  where we found the data readily available
- $492\ 00:24:09.640 \longrightarrow 00:24:11.880$  in collaboration with Joel Schwartz and team.
- 493 00:24:11.880 --> 00:24:16.810 And, there, we, she found, that perhaps,
- $494~00{:}24{:}16.810 \dashrightarrow 00{:}24{:}21.400~3\%$  mortality benefit on heat warning days versus,
- 495 00:24:21.400 --> 00:24:23.560 days with versus without heat warnings.
- 496 00:24:23.560 --> 00:24:27.650 So maybe it's just that in 2006 and earlier,
- $497\ 00:24:27.650 \longrightarrow 00:24:31.520$  when most places did not yet have a heat action plan, then,
- $498\ 00:24:31.520 \longrightarrow 00:24:33.983$  we don't see very much of a benefit,
- 499 00:24:33.983 --> 00:24:35.100 but in more recent times where,
- $500~00{:}24{:}35.100 \dashrightarrow 00{:}24{:}38.173$  many more communities do have heat action plans,
- 501 00:24:38.173 --> 00:24:41.923 tied to those heat alerts that we see,
- $502~00{:}24{:}42.783 \dashrightarrow 00{:}24{:}46.279$  perhaps some signals so we're following that up
- $503\ 00:24:46.279 \longrightarrow 00:24:47.470$  in a broader population.
- $504\ 00:24:47.470 --> 00:24:49.573$  And then the other question is of course,
- $505\ 00:24:50.419 \longrightarrow 00:24:52.576$  is that mortality is not the only outcome of interest that,
- $506\ 00:24:52.576 \longrightarrow 00:24:56.430$  we also want to prevent illness,
- $507\ 00:24:56.430 \longrightarrow 00:24:58.750$  as reflected through hospitalizations.
- 508 00:24:58.750 --> 00:25:03.090 And, here we saw in 97 counties
- $509\ 00:25:03.090 \longrightarrow 00:25:06.260$  in 2007 to 2012,
- 510 00:25:06.260 --> 00:25:10.230 using Medicare hospital admission data.
- $511\ 00:25:10.230 \longrightarrow 00:25:12.903$  We found no reduction
- $512~00{:}25{:}12.903 \dashrightarrow 00{:}25{:}16.450$  in the risk of emergency hospitalization
- $513\ 00:25:16.450 \longrightarrow 00:25:17.720$  during this time point.
- 514 00:25:17.720 --> 00:25:20.913 So again, to works in progress that,
- 515 00:25:21.850 --> 00:25:23.320 we're following up on a larger scale
- $516\ 00:25:23.320 --> 00:25:24.853$  and with more recent data.
- 517 00:25:27.248 --> 00:25:28.689 Okay,

- $518\ 00:25:28.689 \longrightarrow 00:25:31.960$  so our national weather service heat warnings effective,
- $519\ 00{:}25{:}31.960 \dashrightarrow 00{:}25{:}35.070$  they may reduce the risk of death in some cities,
- 520 00:25:35.070 --> 00:25:37.010 but we don't yet see evidence of
- $521\ 00:25:37.010 --> 00:25:40.145$  widespread health benefits.
- $522\ 00:25:40.145 --> 00:25:43.291$  And if that's true and again it needs to be confirmed,
- $523\ 00:25:43.291 --> 00:25:47.220$  but that would represent a missed opportunity
- $524~00{:}25{:}47.220 \dashrightarrow 00{:}25{:}50.093$  to prevent heat-related morbidity and mortality.
- $525\ 00:25:51.050 \longrightarrow 00:25:53.900$  There's lots of limitations to the analysis I've shown here,
- $526\ 00:25:53.900$  --> 00:25:58.900 and we're working to actively to address these limitations.
- 527 00:25:59.210 --> 00:26:00.833 So I just wanna emphasize the,
- $528~00{:}26{:}01.786 \dashrightarrow 00{:}26{:}05.130$  that we're at the beginning of the road here not the end.
- 529 00:26:05.130 --> 00:26:08.820 Okay, so I wanna turn to talking about,
- 530 00:26:08.820 --> 00:26:12.940 how susceptibility to heat related illness
- 531 00:26:12.940 --> 00:26:14.190 might vary by age groups.
- $532~00{:}26{:}15.200 \dashrightarrow 00{:}26{:}19.935$  And, so in one of the first studies we did in Rhode Island,
- 533 00:26:19.935 --> 00:26:23.176 we looked at emergency department visits,
- $534\ 00:26:23.176 \longrightarrow 00:26:27.390$  to the to Rhode Island over several years now,
- 535 00:26:27.390 --> 00:26:29.420 there's only a million people in Rhode Island.
- $536\ 00{:}26{:}29.420$  -->  $00{:}26{:}34.420$  So again, there's an issue about statistical power.
- $537\ 00:26:35.070 --> 00:26:37.406$  But the interesting thing is that, of course,
- $538\ 00:26:37.406 \longrightarrow 00:26:39.460$  we all think of the elderly as really vulnerable.
- $539\ 00:26:39.460 \longrightarrow 00:26:43.580$  And what we saw is that for heat related ed visits,
- 540 00:26:43.580 --> 00:26:47.570 in fact, the relative risk was a lot higher,
- $541\ 00:26:47.570 \longrightarrow 00:26:49.952$  so this is excess relative risk.

- $542\ 00:26:49.952 \longrightarrow 00:26:50.785$  So these are percents.
- $543\ 00:26:50.785$  --> 00:26:55.785 So this would be an odds ratio of 1.6, approximately.
- 544 00:26:56.130 --> 00:26:59.420 So that the relative risk was actually higher in
- $545\ 00:26:59.420 \longrightarrow 00:27:02.850$  that study for population of adults of non elderly adults,
- 546 00:27:02.850 --> 00:27:07.210 18 to 64 and with significant for kids also
- 547 00:27:07.210 --> 00:27:10.980 or children and adolescents 18 and under,
- $548\ 00:27:10.980 \longrightarrow 00:27:13.733$  so what to follow that up.
- $549\ 00:27:14.610$  --> 00:27:19.610 More recently we partnered with Ari Bernstein, the Harvard,
- 550~00:27:20.368 --> 00:27:25.310 center for climate health and the global environment.
- $551\ 00{:}27{:}25.310 \dashrightarrow 00{:}27{:}30.310$  and using data from on ed visits from a network
- 552 00:27:30.877 --> 00:27:33.548 of standalone U.S children's hospitals.
- $553\ 00:27:33.548 --> 00:27:35.890$  These are 47 hospitals and the recent Tara
- 554 00:27:36.728 --> 00:27:39.456 with a total of three point million ed visits,
- $555\ 00:27:39.456 \longrightarrow 00:27:41.443$  amongst children and adolescents.
- $556~00{:}27{:}42.304 \dashrightarrow 00{:}27{:}43.750$  And you can see the location of the hospital here
- $557\ 00:27:43.750 \longrightarrow 00:27:47.580$  as well as the relative size and contribution.
- 558 00:27:47.580 --> 00:27:51.601 And so a little bit hard to see here,
- $559\ 00:27:51.601 \longrightarrow 00:27:54.601$  but so what we see is that the overall relationship between,
- 560~00:27:56.770 --> 00:28:00.200 maximum daily temperature and the relative risk
- $561\ 00:28:01.282 \longrightarrow 00:28:03.493$  of ed visits for all causes in
- $562\ 00:28:03.493$  --> 00:28:07.430 this population is a 1.17 or about a 17% increase.
- $563\ 00:28:07.430 --> 00:28:09.630$  And for heat related illness it's about
- $564\ 00:28:09.630 \longrightarrow 00:28:10.830$  a relative risk of 1.83.

- $565\ 00:28:12.450 \longrightarrow 00:28:17.450$  And again, you see it's interesting for all cause ed visits,
- 566 00:28:17.670 --> 00:28:20.528 there's not a lot of heterogeneity by age,
- $567\ 00:28:20.528 --> 00:28:21.670$  but there does seem for heat related illness
- 568~00:28:21.670 --> 00:28:24.690 specifically seem to be somewhat of a stronger effect
- $569\ 00:28:24.690 \longrightarrow 00:28:27.977$  amongst the older adolescents.
- 570 00:28:27.977 --> 00:28:32.240 So that was really interesting.
- $571\ 00:28:32.240 \longrightarrow 00:28:34.262$  And then we wanted to sort
- $572\ 00:28:34.262 --> 00:28:35.690$  of move beyond heat related illness
- $573\ 00:28:35.690 \longrightarrow 00:28:39.484$  to look at a number of potential causes.
- $574\ 00:28:39.484 \longrightarrow 00:28:41.057$  And this is a little bit hard to see.
- $575\ 00:28:41.057 --> 00:28:41.890$  So I just wanna zoom in a little bit.
- $576\ 00:28:41.890 \longrightarrow 00:28:44.790$  So to the, we considered a number
- 577 00:28:44.790 --> 00:28:47.070 of different categories of disease,
- $578\ 00:28:47.070 \longrightarrow 00:28:50.640$  some of them that we sort of had prior hypotheses for,
- $579\ 00{:}28{:}50.640 \dashrightarrow 00{:}28{:}53.101$  and some that seemed like we should just check.
- 580~00:28:53.101 --> 00:28:56.360 And these are adjusted for multiple comparisons
- $581~00{:}28{:}56.360 \dashrightarrow 00{:}28{:}58.940$  in this sort of more agnostic analysis.
- $582~00{:}28{:}58.940 \dashrightarrow 00{:}29{:}01.630$  And you can see that heat related illness of course
- 583 00:29:01.630 --> 00:29:04.390 comes up with a very high relative risk,
- $584\ 00:29:04.390 \longrightarrow 00:29:06.330$  but there's other interesting
- $585\ 00:29:06.330 \longrightarrow 00:29:09.320$  and much less explored associations
- $586\ 00:29:09.320 --> 00:29:11.180$  between different causes of ed visits
- $587\ 00:29:11.180 \longrightarrow 00:29:14.140$  in children and adolescents and temperature.
- $588\ 00:29:14.140 \longrightarrow 00:29:16.623$  So, more to be done there,
- $589\ 00:29:17.470 --> 00:29:20.842$  but we're quite excited by these results.
- 590 00:29:20.842 --> 00:29:23.880 I'll make the point as in the paper

- 591 00:29:23.880 --> 00:29:26.090 I showed you at the beginning by Jennifer Bob
- $592\ 00:29:26.090 \longrightarrow 00:29:30.000$  and colleagues that not all the,
- $593\ 00:29:30.000 \longrightarrow 00:29:32.480$  those conditions with the highest relative risk
- $594~00{:}29{:}32.480 \dashrightarrow 00{:}29{:}35.880$  don't always have the biggest sort of numeric impact.
- 595 00:29:35.880 --> 00:29:38.847 So heat related illness here,
- $596\ 00:29:38.847 --> 00:29:40.739$  you see the attributable fraction.
- $597\ 00:29:40.739 --> 00:29:41.710$  So of the heat related illness
- $598~00{:}29{:}41.710 \dashrightarrow 00{:}29{:}44.810$  a substantial proportion are due to heat.
- 599 00:29:44.810 --> 00:29:49.240 And, but heat related illnesses
- $600\ 00:29:49.240 \longrightarrow 00:29:52.680$  and in frequent or uncommon diagnosis.
- 601 00:29:52.680 --> 00:29:55.640 And so the out of 100,000 ed visits,
- $602\ 00{:}29{:}55.640 {\:-->}\ 00{:}29{:}58.223$  it contributes a relatively small proportion.
- $603\ 00:29:59.190 \longrightarrow 00:30:01.130$  Whereas for injury and poisonings are very,
- 604 00:30:01.130 --> 00:30:03.413 very common diagnosis amongst kids, as,
- $605\ 00:30:04.453 \longrightarrow 00:30:07.830$  so even though the attributable fraction
- $606\ 00:30:07.830 \longrightarrow 00:30:10.400$  is smaller for them the attributable number
- 607 00:30:10.400 --> 00:30:12.660 per 100,00 ed visits total
- $608\ 00:30:12.660 \longrightarrow 00:30:14.660$  is much bigger because it's much common.
- $609\ 00:30:16.597 --> 00:30:19.610$  Okay, so I wanna share with you some,
- $610~00{:}30{:}19.610 \dashrightarrow 00{:}30{:}23.600$  very exciting work that Darren Son in my group is,
- $611\ 00:30:23.600 \longrightarrow 00:30:24.950$  leading and working on.
- $612\ 00{:}30{:}24.950 \dashrightarrow 00{:}30{:}29.950$  So this is now turning to 18 to 64 year old individuals.
- $613\ 00:30:30.273 \dashrightarrow 00:30:32.410$  And this is amongst an insured population,
- $614\ 00:30:32.410 \longrightarrow 00:30:35.313$  working with data from the Optum labs.
- $615\ 00:30:38.769 \longrightarrow 00:30:41.503$  And obviously here you have the number of sorry,
- $616\ 00:30:43.810 \longrightarrow 00:30:45.980$  the average summer maximum temperature.
- $617\ 00{:}30{:}45.980 \dashrightarrow 00{:}30{:}48.290$  And then this just shows you sort of the distribution

- $618\ 00:30:48.290 --> 00:30:52.140$  of where we have information on in this population.
- $619\ 00:30:52.140 \longrightarrow 00:30:54.467$  So it tends to follow,
- $620\ 00:30:54.467 \longrightarrow 00:30:57.380$  the distribution of population
- $621\ 00:30:57.380 --> 00:31:00.980$  focused on obviously more urban locations.
- $622~00{:}31{:}00.980 \dashrightarrow 00{:}31{:}04.320$  But, this particular data set has a more info
- $623\ 00{:}31{:}04.320 \dashrightarrow 00{:}31{:}06.350$  tends to have more information in the Southeast
- $624\ 00:31:06.350 \longrightarrow 00:31:07.983$  and in the Southwest.
- $625\ 00:31:08.960 \longrightarrow 00:31:12.670$  And, you can see here is
- 626 00:31:12.670 --> 00:31:17.361 that overall there's a relative risk of ed visits,
- $627\ 00:31:17.361 \longrightarrow 00:31:22.361$  amongst these non elderly adults an odds ratio of 1.1,
- 628 00:31:24.090 --> 00:31:25.960 let's say about a 9% increase in risk
- $629\ 00:31:25.960 \longrightarrow 00:31:27.700$  and for heat related illness
- $630\ 00:31:27.700 \longrightarrow 00:31:30.793$  it's a relative risk of about 1.9.
- $631\ 00:31:31.670 \longrightarrow 00:31:35.720$  And again, you see some variation in,
- $632\ 00:31:35.720 \longrightarrow 00:31:37.640$  the relative risk by age,
- $633\ 00:31:37.640 \longrightarrow 00:31:40.060$  some heterogeneity by age that we'll explore
- $634\ 00:31:40.060 \longrightarrow 00:31:43.050$  a little bit further to see.
- 635 00:31:43.050 --> 00:31:45.470 It's interesting though that sort of repeatedly
- $636\ 00:31:45.470 --> 00:31:49.410$  we're seeing that although elderly are known to be.
- $637\ 00:31:49.410 \longrightarrow 00:31:50.300$  and there's good evidence
- 638 00:31:50.300 --> 00:31:52.797 that they are a susceptible subgroup,
- $639\ 00{:}31{:}52.797 \dashrightarrow 00{:}31{:}55.580$  that's by no means the only part of the age distribution,
- 640 00:31:55.580 --> 00:31:58.310 where we have sensitivities and in there's,
- $641\ 00{:}31{:}58.310 \dashrightarrow 00{:}32{:}01.260$  we know of from other studies, outdoor workers,
- 642 00:32:01.260 --> 00:32:03.860 children that spend a lot of time outside,
- $643\ 00:32:03.860 --> 00:32:05.130$  perhaps children's spending time
- 644 00:32:05.130 --> 00:32:07.355 in non-air conditioned schools,

- $645\ 00:32:07.355 \longrightarrow 00:32:10.363$  can also be quite a bit at risk.
- $646\ 00:32:12.430 \longrightarrow 00:32:13.263$  Okay.
- 647 00:32:13.263 --> 00:32:15.830 So turning back to the, the bigger, framework.
- $648\ 00:32:15.830 \longrightarrow 00:32:18.090$  So on a global and national scale,
- $649\ 00:32:18.090 \longrightarrow 00:32:20.115$  we think that we understand
- $650\ 00:32:20.115 \longrightarrow 00:32:22.160$  the adverse health impacts of heat.
- $651\ 00:32:22.160 \longrightarrow 00:32:24.160$  But there's been this lack of translation
- $652\ 00:32:24.160 \longrightarrow 00:32:26.627$  of abundance scientific knowledge on the risks
- $653\ 00{:}32{:}26.627 \dashrightarrow 00{:}32{:}30.300$  and to public health action in terms of prevention.
- $654\ 00:32:30.300 \longrightarrow 00:32:32.130$  And so, again,
- $655\ 00:32:32.130 \longrightarrow 00:32:34.690$  this means that there's insufficient evidence
- $656\ 00:32:34.690 \longrightarrow 00:32:36.200$  to guide the public health response
- $657\ 00:32:36.200 \longrightarrow 00:32:38.423$  to present day or future heat.
- $658\ 00:32:39.320 --> 00:32:44.320$  If we were designing, optimal response to heat,
- $659\ 00:32:44.370 \longrightarrow 00:32:47.590$  Jeremy Hess and Kristie Ebi have written nicely about this,
- 660 00:32:47.590 --> 00:32:50.420 you'd define dangerously hot weather,
- 661 00:32:50.420 --> 00:32:52.000 you'd forecast it well,
- $662\ 00{:}32{:}52.000 \dashrightarrow 00{:}32{:}54.670$  you'd identify who's at greatest risk of these effects.
- $663\ 00{:}32{:}54.670 {\:{\mbox{--}}\!>\:} 00{:}32{:}57.850$  You'd intervene to reduce those health impacts,
- $664~00{:}32{:}57.850 \dashrightarrow 00{:}33{:}00.650$  and you'd evaluate the effectiveness of those interventions.
- $665\ 00:33:00.650 \longrightarrow 00:33:02.590$  And you do this on a continuous cycle.
- $666~00{:}33{:}02.590 \dashrightarrow 00{:}33{:}06.423$  You'd do this repeatedly to continue to optimize.
- $667\ 00:33:07.307 --> 00:33:10.710$  So, our broader research agenda
- $668\ 00:33:10.710 \longrightarrow 00:33:14.210$  follows mirrors these image.
- $669\ 00:33:14.210 \longrightarrow 00:33:16.591$  So, the vision that we have is that
- $670\ 00{:}33{:}16.591 \dashrightarrow 00{:}33{:}19.190$  we could provide the evidence needed for any community

- $671\ 00{:}33{:}19.190 \dashrightarrow 00{:}33{:}22.080$  in the U.S to mitigate the adverse health impacts
- $672\ 00:33:22.080 \longrightarrow 00:33:23.320$  of extreme heat.
- 673 00:33:23.320 --> 00:33:25.826 And I'd probably amend that now to say
- 674 00:33:25.826 --> 00:33:27.572 both extreme and moderate heat,
- $675\ 00:33:27.572 \longrightarrow 00:33:28.732$  although we recognize
- 676 00:33:28.732 --> 00:33:30.400 that they require different strategies,
- $677\ 00:33:30.400 -> 00:33:33.370$  the same strategies won't be effective for both,
- 678 00:33:33.370 --> 00:33:36.228 thinking about moderate and extreme heat.
- $679\ 00:33:36.228 --> 00:33:38.900$  The concrete sort of next steps in that is
- $680\ 00:33:38.900 --> 00:33:41.450$  to identify optimal health based and location
- $681\ 00:33:41.450 --> 00:33:44.270$  specific metrics for issuing heat alerts.
- $682\ 00{:}33{:}44.270 {\:{\mbox{--}}\!>}\ 00{:}33{:}49.270$  We wanna follow up our work on the benefits of
- $683\ 00:33:49.360 \longrightarrow 00:33:53.460$  heat alert's heat warnings and heat advisories,
- $684\ 00:33:53.460 \longrightarrow 00:33:54.646$  because I think there's
- $685\ 00{:}33{:}54.646 \dashrightarrow 00{:}33{:}57.580$  they're probably effective in some circumstances
- $686\ 00:33:57.580 --> 00:33:59.430$  in some places and in some populations.
- $687\ 00:33:59.430 \longrightarrow 00:34:01.670$  And if we knew where they are effective
- 688 00:34:01.670 --> 00:34:03.400 and under what conditions,
- $689\ 00:34:03.400 \longrightarrow 00:34:05.820$  then we can presumably provide information
- $690\ 00:34:05.820$  --> 00:34:08.920 that helps other communities replicate that effectiveness.
- 691 00:34:08.920 --> 00:34:11.178 I think there's a lot of potential benefit,
- $692\ 00:34:11.178 --> 00:34:14.123$  to investigating that further.
- $693~00{:}34{:}15.403 \dashrightarrow 00{:}34{:}19.860$  And you, one of the short comings in this line of research
- $694\ 00:34:19.860 \longrightarrow 00:34:21.100$  is that we don't actually have
- 695 00:34:21.100 --> 00:34:24.300 a centralized database of which,
- $696\ 00:34:24.300 \longrightarrow 00:34:26.360$  what local health departments are,
- $697\ 00{:}34{:}26.360 {\: -->\:} 00{:}34{:}29.040$  what actions local health departments are taking

- 698 00:34:29.040 --> 00:34:30.650 in response and preparation for,
- $699\ 00:34:30.650 \longrightarrow 00:34:33.030$  and in response to days of extreme heat.
- 700 00:34:33.030 --> 00:34:35.989 And so one of our goals is to try to,
- $701\ 00:34:35.989 \longrightarrow 00:34:39.916$  catalog that we're working with Jeremy has and Nicole era,
- $702\ 00:34:39.916 \longrightarrow 00:34:42.819$  at university of Washington.
- 703 00:34:42.819 --> 00:34:45.210 And then if we can identify again,
- $704\ 00:34:45.210 \longrightarrow 00:34:47.410$  the key elements of these interventions and
- $705\ 00:34:48.418 \longrightarrow 00:34:49.658$  where they're most effective,
- $706\ 00:34:49.658 --> 00:34:51.092$  then we can share this information back
- 707 00:34:51.092 --> 00:34:52.504 with local health departments and say,
- 708 00:34:52.504 --> 00:34:55.337 "hey, if you have limited resources and you,
- 709 00:34:55.337 --> 00:34:58.247 "here's what has worked in other settings
- $710\ 00:34:58.247 --> 00:34:59.717$  "that are similar to your settings
- 711 00:34:59.717 --> 00:35:02.497 "in terms of whatever characteristics,
- 712 00:35:02.497 --> 00:35:04.593 "we wanna have about the community.
- 713 00:35:06.360 --> 00:35:08.850 Okay, so I wanna acknowledge also that,
- 714 00:35:08.850 --> 00:35:11.247 heat doesn't happen alone.
- $715\ 00:35:11.247 \longrightarrow 00:35:14.223$  This is some great work done by Keith Spangler,
- 716 00:35:14.223 --> 00:35:17.414 who is currently a post-doc in working in my group.
- $717\ 00:35:17.414 \longrightarrow 00:35:19.290$  And this was part of his doctoral dissertation at Brown.
- $718\ 00:35:19.290 \longrightarrow 00:35:24.290$  And what you see here is different hazards across different,
- 719 00:35:25.500 --> 00:35:27.290 across New England, sorry.
- 720 00:35:27.290 --> 00:35:31.660 So, this is a probability of one or more days
- $721\ 00:35:31.660 \longrightarrow 00:35:34.747$  with the heat index above 95 degrees.
- $722\ 00:35:34.747 --> 00:35:37.140$  And so you could see the distribution of that.
- $723\ 00:35:37.140 --> 00:35:40.230$  So there's parts of New England that are more prone
- $724\ 00:35:40.230 \longrightarrow 00:35:42.470$  to getting really hot days.

 $725\ 00:35:42.470 --> 00:35:46.310$  The distribution of getting an inch or more of rainfall

 $726\ 00:35:46.310 \longrightarrow 00:35:48.480$  is quite different.

 $727\ 00:35:48.480 \longrightarrow 00:35:50.550$  And similarly, the distribution of the

 $728\ 00:35:50.550 \longrightarrow 00:35:53.870$  risk of high ozone days is again different.

729 00:35:53.870 --> 00:35:58.070 And we don't have high PM 2.5 levels in New England.

730 00:35:58.070 --> 00:36:01.710 But, if you were to look at where they are highest,

731  $00:36:01.710 \longrightarrow 00:36:04.510$  you can see the distribution again is quite different.

 $732\ 00{:}36{:}04.510 \dashrightarrow 00{:}36{:}09.510$  And so if you integrate those into the percent of days with,

733 00:36:09.950 --> 00:36:12.840 one or more hazards during this time period,

 $734\ 00:36:12.840 \longrightarrow 00:36:16.539$  you see that there's an interesting distribution where,

735 00:36:16.539 --> 00:36:19.140 parts of the Connecticut river Valley

736 00:36:19.140 --> 00:36:22.343 and Southern Connecticut are particularly,

 $737\ 00:36:23.390 \longrightarrow 00:36:26.603$  high risk of being exposed to one or more hazards.

 $738\ 00:36:28.261 \longrightarrow 00:36:31.210$  Interestingly, if you connect this with the

739 00:36:31.210 --> 00:36:33.344 social vulnerability index,

 $740~00:36:33.344 \longrightarrow 00:36:35.130$  this is the CDC social vulnerability index

 $741\ 00:36:35.130 --> 00:36:38.320$  that is also not homogeneously distributed.

 $742\ 00:36:38.320$  --> 00:36:43.237 And interestingly, those high vulnerability locations,

 $743\ 00:36:46.860 \longrightarrow 00:36:51.450$  also tend to have a higher probability

 $744\ 00:36:51.450 \longrightarrow 00:36:54.580$  of having more than one hazard.

 $745\ 00:36:54.580 \longrightarrow 00:36:57.900$  This is primarily driven by the distribution of,

 $746\ 00:36:57.900 \longrightarrow 00:36:59.970$  the hazard of excess heat,

 $747\ 00:36:59.970 \longrightarrow 00:37:02.230$  and somewhat by the excess ozone.

748 00:37:02.230 --> 00:37:06.141 So really interesting to think about

 $749\ 00:37:06.141 --> 00:37:09.750$  how the hazards overlap with each other

 $750\ 00:37:09.750 \longrightarrow 00:37:12.710$  and with social vulnerability

751 00:37:12.710 --> 00:37:15.514 and Keith created a climate risk index,

 $752\ 00:37:15.514 --> 00:37:18.570$  based on this which looks different

753 00:37:18.570 --> 00:37:20.970 depending on the spatial scale that you look at.

754 00:37:21.816 --> 00:37:23.888 So again, if you combine the hazards

755 00:37:23.888 --> 00:37:25.404 and the social vulnerability, again,

 $756\ 00:37:25.404 --> 00:37:28.410$  the Connecticut river Valley at Southern Connecticut,

 $757\ 00:37:28.410 \longrightarrow 00:37:33.410$  coastal Connecticut show up as places of particularly,

 $758\ 00:37:33.800 \longrightarrow 00:37:36.010$  potential pretty high impact.

759 00:37:36.010 --> 00:37:38.840 And if you were to look instead at the,

 $760\ 00:37:38.840 --> 00:37:41.330$  Boston metropolitan area here,

 $761\ 00:37:41.330 --> 00:37:43.930$  you can see that on a very fine spatial scale.

 $762\ 00{:}37{:}43.930 \dashrightarrow 00{:}37{:}47.283$  There's tremendous heterogeneity as well in this.

 $763\ 00:37:48.596 \longrightarrow 00:37:50.680$  Okay, so to close.

 $764\ 00:37:50.680 \longrightarrow 00:37:54.570$  So in order to adapt to current and future climate hazards,

765~00:37:54.570 --> 00:37:57.300 local officials need to know what's the current health risk

 $766\ 00:37:57.300 \longrightarrow 00:37:59.480$  associated with a given hazard,

 $767\ 00:37:59.480 \longrightarrow 00:38:01.070$  what local actions can be taken

 $768\ 00:38:01.070 \longrightarrow 00:38:02.970$  to protect the public health.

769 00:38:02.970 --> 00:38:06.865 Do these actions actually reduce the risk of the hazard?

 $770~00{:}38{:}06.865 \dashrightarrow 00{:}38{:}10.140$  How has the risk likely to change into the future?

771 00:38:10.140 --> 00:38:11.200 I didn't go into that today,

 $772\ 00:38:11.200 \longrightarrow 00:38:16.008$  but obviously we have very good projections of future,

773 00:38:16.008 --> 00:38:20.960 temperature changes under different concentration pathways,

- $774\ 00:38:20.960 \longrightarrow 00:38:24.532$  so we can predict into the future
- $775\ 00:38:24.532 \longrightarrow 00:38:26.700$  under different potential alternative realities.
- 776 00:38:26.700 --> 00:38:28.630 And we can do this in a repetitive way
- $777\ 00:38:28.630 \longrightarrow 00:38:30.623$  to continue to optimize.
- 778 00:38:31.620 --> 00:38:33.810 And so this just Zooming way out,
- $779\ 00:38:33.810 --> 00:38:35.820$  highlights the needs and challenges
- 780 00:38:35.820 --> 00:38:37.630 of translating scientific research
- $781\ 00:38:37.630 --> 00:38:39.293$  into public health benefits.
- $782\ 00:38:40.308 \longrightarrow 00:38:45.308$  So, this none of this would be possible
- $783\ 00:38:45.410 \longrightarrow 00:38:49.503$  without a fantastic team local team in my group,
- $784\ 00:38:51.475 --> 00:38:53.420$  as well as, fantastic collaborators.
- $785~00{:}38{:}53.420 \dashrightarrow 00{:}38{:}55.900$  Kate Weinberger was a former post-doctoral fellow
- $786\ 00:38:55.900 --> 00:38:57.902$  that worked with me and is now
- $787~00{:}38{:}57.902 \dashrightarrow 00{:}38{:}59.340$  at the university of British Columbia.
- $788\ 00:38:59.340 \longrightarrow 00:39:04.340$  We have a terrific team at Boston university and formerly,
- $789\ 00:39:05.820 --> 00:39:07.720$  people were still connected with at Brown
- 790 00:39:07.720 --> 00:39:10.360 and then fantastic collaborators at Harvard,
- 791 00:39:10.360 --> 00:39:11.400 university of Michigan,
- 792 00:39:11.400 --> 00:39:14.923 university of Washington and Mount Sinai.
- 793 00:39:15.839 --> 00:39:17.357 And of course we all need funding,
- 794 00:39:17.357 --> 00:39:19.620 and I'm very grateful to the funding from NHS
- $795\ 00:39:19.620 \longrightarrow 00:39:21.270$  and Wellcome trust.
- 796 00:39:21.270 --> 00:39:24.213 So I will stop there and a welcome your questions.
- $797~00:39:28.699 \dashrightarrow 00:39:33.080$  Great, thanks, Greg, for the very, insightful presentation
- $798\ 00:39:33.080 \longrightarrow 00:39:36.253$  and also sharing with us your latest research.
- 799 00:39:37.890 --> 00:39:41.270 Before we go to the question from the attendees,

 $800\ 00{:}39{:}41.270 \dashrightarrow 00{:}39{:}45.390$  we actually, have already pre collected questions

801 00:39:45.390 --> 00:39:48.880 from the our students who attend the

802 00:39:48.880 --> 00:39:50.580 Climate Change and Health seminar.

 $803\ 00:39:51.460 --> 00:39:54.979$  I'm happy to see actually doing your presentation.

 $804\ 00:39:54.979 \longrightarrow 00:39:56.898$  A lot of questions has been answered.

 $805\ 00:39:56.898 \longrightarrow 00:39:59.923$  So just, pick some of the questions remaining.

 $806\ 00{:}40{:}01.224$  -->  $00{:}40{:}04.330$  One the heat topic that the students are wondering is

 $807\ 00:40:04.330 \longrightarrow 00:40:07.930$  about the effectiveness of the heat index system.

808 00:40:07.930 --> 00:40:09.500 So they're wondering,

809 00:40:09.500 --> 00:40:13.500 like why there's no standard index

 $810\ 00:40:13.500 \longrightarrow 00:40:18.480$  in different places, and why there can be some, action of,

 $811\ 00:40:21.400 \longrightarrow 00:40:23.480$  why there can be some other matrix

 $812\ 00:40:23.480 \longrightarrow 00:40:28.480$  that can be considered like the wet bulb temperature,

 $813\ 00:40:28.680 \longrightarrow 00:40:33.680$  which may shows, more spatial rate disperse,

 $814\ 00:40:33.940 \longrightarrow 00:40:37.493$  varied effect rather than that or temperature.

 $815\ 00:40:39.271 \longrightarrow 00:40:40.894$  - Yeah, it's a great question.

 $816\ 00{:}40{:}40{:}894 \dashrightarrow 00{:}40{:}43.880$  So the national weather service sets up, actually

 $817\ 00:40:45.188 --> 00:40:46.560$  the national level of the national weather service

 $818\ 00:40:46.560 \longrightarrow 00:40:51.560$  makes recommendations of criteria that could be used,

 $819~00{:}40{:}51.940 \dashrightarrow 00{:}40{:}56.102$  to issue heat alerts and then encourages regional offices

 $820\ 00:40:56.102 --> 00:40:58.273$  and even local offices to come up

821 00:40:58.273 --> 00:41:00.540 with their own criteria that,

 $822\ 00{:}41{:}00.540 \dashrightarrow 00{:}41{:}05.140$  are most appropriate for the populations that they serve.

- 823 00:41:05.140 --> 00:41:08.370 And so there isn't exact, it's not,
- 824 00:41:08.370 --> 00:41:11.097 a top-down sort of you must use this,
- 825 00:41:11.097 --> 00:41:12.210 here's a standardized threshold, which,
- 826 00:41:12.210 --> 00:41:14.100 some countries have taken that approach.
- 827 00:41:14.100 --> 00:41:17.187 This is a much more decentralized approach.
- 828 00:41:17.187 --> 00:41:20.690 So many, many, locations do use the heat index.
- 829 00:41:20.690 --> 00:41:25.690 And for approximately, Northern location
- 830 00:41:26.090 --> 00:41:28.240 sort of Northern half of the country
- 831 00:41:29.262 --> 00:41:32.140 uses a heat index of 105 as a threshold for
- $832\ 00:41:32.140 \longrightarrow 00:41:34.903$  issuing heat warnings and,
- $833\ 00:41:37.400 \longrightarrow 00:41:39.667$  a threshold of 100 degrees heat index
- 834 00:41:39.667 --> 00:41:41.545 for issuing, heat advisories,
- $835\ 00:41:41.545 \longrightarrow 00:41:44.994$  and then the Southern half of the country, approximately,
- $836\ 00:41:44.994 \longrightarrow 00:41:48.570$  each of those is five degrees set at five degrees higher,
- 837 00:41:48.570 --> 00:41:50.460 but there's a number of locations,
- 838 00:41:50.460 --> 00:41:52.819 they use their own system, including,
- 839 00:41:52.819 --> 00:41:57.819 Philadelphia is notable for using
- $840\ 00:41:58.664 \longrightarrow 00:42:01.210$  a predictive model of sort of
- $841\ 00:42:01.210 \longrightarrow 00:42:04.040$  how many people are at risk from this heat.
- $842\ 00:42:04.040 --> 00:42:06.493$  New York city has done some terrific work on,
- $843\ 00:42:07.550 \longrightarrow 00:42:09.243$  changing the threshold.
- $844\ 00{:}42{:}10.445 \dashrightarrow 00{:}42{:}12.633$  So there a number of examples around the country where,
- $845\ 00{:}42{:}14.010$  -->  $00{:}42{:}17.330$  local health departments have worked with the community
- $846\ 00:42:17.330 \longrightarrow 00:42:22.200$  to identify what's the most appropriate metric
- 847 00:42:22.200 --> 00:42:25.560 and threshold for issuing heat alerts.
- $848\ 00:42:25.560 \longrightarrow 00:42:27.810$  But the challenge with that approach is that,
- $849\ 00:42:29.105 --> 00:42:30.005$  it's not a systematic investigation

- $850\ 00:42:30.005 \longrightarrow 00:42:33.100$  of what would be work the best.
- 851 00:42:33.100 --> 00:42:36.133 So one of our goals is to think of,
- 852 00:42:37.107 --> 00:42:39.006 well, let's look everywhere in the country
- $853\ 00:42:39.006 --> 00:42:41.810$  and see what either by region or by community
- 854 00:42:41.810 --> 00:42:43.740 or by climate zones,
- $855\ 00:42:43.740 \longrightarrow 00:42:47.640$  what would be the optimal metric for predicting,
- $856\ 00:42:47.640 \longrightarrow 00:42:52.249$  which are the most dangerous days of extreme heat.
- $857\ 00:42:52.249 \longrightarrow 00:42:57.249$  keeping in mind that it's in nobody's interest to issue,
- $858\ 00:42:58.420 \longrightarrow 00:43:00.530$  a very high number of heat alerts each year.
- $859\ 00{:}43{:}00.530 \dashrightarrow 00{:}43{:}02.860$  So you really wanna focus each summer on like,
- $860\ 00:43:02.860 \longrightarrow 00:43:05.130$  what are going to be the worst days,
- 861 00:43:05.130 --> 00:43:06.390 how do we identify those
- 862 00:43:06.390 --> 00:43:08.550 and sort of using a health based perspective
- $863\ 00:43:08.550 \longrightarrow 00:43:10.440$  rather than a weather based perspective?
- $864\ 00:43:10.440 \longrightarrow 00:43:13.400$  So it's not necessarily the hottest days, but rather,
- $865\ 00:43:13.400 \longrightarrow 00:43:16.863$  we know from the work of others that, the,
- $866\ 00{:}43{:}18.400 \dashrightarrow 00{:}43{:}21.620$  vulnerability to heat varies by location,
- $867\ 00:43:21.620 \longrightarrow 00:43:24.820$  by population and by time of year,
- $868\ 00:43:24.820 \longrightarrow 00:43:26.890$  as well as it's been shifting over the years.
- $869\ 00:43:26.890 \longrightarrow 00:43:29.320$  And so taking all that into consideration,
- $870\ 00:43:29.320 --> 00:43:31.100$  can we sort of have a health based metric
- $871\ 00:43:31.100 --> 00:43:35.598$  for issuing heat alerts heat warnings,
- $872\ 00:43:35.598 \longrightarrow 00:43:36.431$  and heat advisory's.
- $873\ 00:43:36.431 \longrightarrow 00:43:39.618$  Wet bulb globe temperature is a really interesting one.
- 874 00:43:39.618 --> 00:43:41.463 There's,
- 875 00:43:43.290 --> 00:43:46.480 I think that it's potentially very interesting,
- $876\ 00:43:46.480 \longrightarrow 00:43:49.320$  and I know that in some occupational settings,

877 00:43:49.320  $\rightarrow$  00:43:54.320 a wet bulb globe temperature is used as the guiding metric.

 $878\ 00:43:55.130 \longrightarrow 00:43:58.422$  It has not been to my knowledge been widely used,

879 00:43:58.422 --> 00:44:03.422 in sort of population level, heat warning work.

880 00:44:03.970 --> 00:44:05.200 But I think it'd be really interesting

 $881\ 00:44:05.200 \longrightarrow 00:44:06.400$  to look at that as well.

 $882\ 00:44:08.021 \longrightarrow 00:44:09.370$  - Great, thanks.

 $883\ 00:44:09.370 --> 00:44:14.160$  Another kind of very detailed technical question

884 00:44:14.160 --> 00:44:16.020 is one students is wondering,

885 00:44:16.020 --> 00:44:21.020 the previous paper,

 $886\ 00:44:21.130 \longrightarrow 00:44:23.273$  where you choose the control days,

887 00:44:24.600 --> 00:44:28.370 because if you have a very higher threshold,

888  $00:44:28.370 \longrightarrow 00:44:31.773$  then it's likely that you don't have enough control days.

889  $00:44:34.360 \longrightarrow 00:44:35.220$  - That's a great question.

 $890\ 00:44:35.220 \longrightarrow 00:44:39.480$  So this refers I believe to Kate's study

 $891\ 00:44:39.480 --> 00:44:43.439$  of looking at the effectiveness of heat warnings.

 $892\ 00:44:43.439 \longrightarrow 00:44:45.830$  And so what we did is we compare days,

893 00:44:45.830 --> 00:44:48.220 of the similar heat index

 $894\ 00:44:48.220 \longrightarrow 00:44:50.430$  and with or without a heat warning.

895 00:44:50.430 --> 00:44:53.615 And you're right, that for very hot days,

896 00:44:53.615 --> 00:44:55.073 like if a day is 110 degrees, heat index,

 $897\ 00:44:55.073 \longrightarrow 00:44:57.810$  that there's not going to be any days

898 00:44:57.810 --> 00:45:00.480 in that same location of 110 degrees,

 $899\ 00:45:00.480 \longrightarrow 00:45:02.520$  that didn't have a heat warning.

 $900\ 00:45:02.520$  --> 00:45:07.520 So, by so we had to limit ourselves to those days in which,

901 00:45:09.090 --> 00:45:12.950 we sometimes saw a heat warning but not always.

902 00:45:12.950 --> 00:45:16.174 And if, a 90 degree day,

- $903\ 00{:}45{:}16.174 {\:\hbox{--}}{>}\ 00{:}45{:}19.401$  nobody's issuing heat alerts and on 110 degree day,
- 904 00:45:19.401 --> 00:45:20.234 everybody's issuing heat alerts.
- $905\ 00:45:20.234 \longrightarrow 00:45:22.110$  And so we had to focus on the middle.
- $906\ 00:45:22.110 \longrightarrow 00:45:24.860$  So one of the limitations of this work is that
- 907 00:45:24.860 --> 00:45:27.779 it is there's no counterfactual,
- 908 00:45:27.779 --> 00:45:30.950 there's no information about the counterfactual of like,
- 909 00:45:30.950 --> 00:45:33.450 what would have happened had we not issued a heat alert
- 910  $00:45:33.450 \longrightarrow 00:45:34.600$  on a very, very hot day?
- 911 00:45:34.600 --> 00:45:38.170 There's just, there's no data is conditional on location.
- $912\ 00:45:38.170 \longrightarrow 00:45:39.930$  So that is one of the challenges.
- 913  $00:45:39.930 \longrightarrow 00:45:42.290$  So we should, our results are generalizable
- 914 00:45:42.290 --> 00:45:44.740 to those days on which you might,
- $915\ 00:45:44.740 \longrightarrow 00:45:46.710$  or sometimes issue heat alerts.
- $916\ 00:45:46.710 \longrightarrow 00:45:51.300$  And not outside of that relatively narrow band
- $917\ 00:45:51.300 \longrightarrow 00:45:52.203$  of temperatures.
- 918 00:45:53.620 --> 00:45:54.750 Thanks.
- 919 00:45:54.750 --> 00:45:59.642 I think we do have a question from the audience,
- 920 00:45:59.642  $\rightarrow$  00:46:01.757 one of the first, so,
- $921\ 00:46:01.757 --> 00:46:06.190$  the question from Stephan Lessen is asking
- 922 00:46:06.190 --> 00:46:09.110 about one third of the Medicaid population
- 923 00:46:10.229 --> 00:46:11.610 has no access to the internet.
- $924~00{:}46{:}11.610$  -->  $00{:}46{:}16.610$  So how, the heat alerts commonly distributed within cities.
- 925 00:46:16.680 --> 00:46:19.275 Yeah, that's a really great question.
- 926 00:46:19.275 --> 00:46:21.760 And again, it varies a little bit by location.
- 927 00:46:21.760 --> 00:46:25.552 The several or many of the national weather service,

- 928 00:46:25.552 --> 00:46:28.523 local offices are actually on social media now, and you,
- 929 00:46:29.380 --> 00:46:31.723 you could follow them on Twitter, there's, also,
- 930 00:46:34.030 --> 00:46:36.830 you can sign up for their email newsletters,
- 931 00:46:36.830 --> 00:46:41.050 that'll warn you of particular, threats,
- 932 00:46:41.050 --> 00:46:43.550 and you're right that those channels,
- 933 00:46:43.550 --> 00:46:46.880 while they might reach some segments of the population,
- 934 00:46:46.880 --> 00:46:50.070 they, probably are focused
- 935 00:46:50.070 --> 00:46:52.000 on those segments of the population
- $936\ 00:46:52.000 \longrightarrow 00:46:53.470$  that are particularly engaged
- 937 00:46:53.470 --> 00:46:56.450 and maybe not particularly at risk,
- 938  $00:46:56.450 \longrightarrow 00:46:57.780$  for heat specifically.
- 939 00:46:57.780 --> 00:47:02.780 So, traditionally this was all through TV and radio,
- 940 00:47:03.130 --> 00:47:05.976 where you would say, national weather service has
- 941 00:47:05.976  $\rightarrow$  00:47:09.040 issued a heat alert for the next two days, or for,
- 942 00:47:09.040 --> 00:47:13.150 this region for tomorrow and advises you to,
- 943 00:47:13.150 --> 00:47:16.270 drink lots of water avoid exposing yourself to
- 944 00:47:16.270 --> 00:47:19.205 your kids to high heat, et cetera.
- 945 00:47:19.205 --> 00:47:24.090 So I think they use a combination of traditional
- 946 00:47:24.090 --> 00:47:27.766 and digital media, channels,
- 947 00:47:27.766 --> 00:47:30.570 but I think it raises a good question of,
- 948 00:47:30.570 --> 00:47:33.106 are we reaching the most vulnerable populations,
- $949\ 00:47:33.106 \longrightarrow 00:47:35.158$  with these alerts?
- 950 00:47:35.158 --> 00:47:37.549 And even if we inform people that there's a risk
- 951 00:47:37.549 --> 00:47:41.220 that doesn't necessarily mean that people are able,

- $952\ 00:47:41.220 \longrightarrow 00:47:44.280$  to protect themselves from that risk.
- 953 00:47:44.280 --> 00:47:45.460 So for instance
- $954\ 00:47:45.460 \longrightarrow 00:47:47.999$  when we think of the most vulnerable populations,
- $955\ 00{:}47{:}47.999 \dashrightarrow 00{:}47{:}52.420$  you're amongst them sort of perhaps outdoor workers,
- $956\ 00:47:52.420 \longrightarrow 00:47:55.960$  so outdoor workers, there are guidelines,
- $957\ 00:47:55.960 --> 00:47:59.738$  in temperatures above which outdoor workers shouldn't work,
- $958\ 00{:}47{:}59.738 {\:{\mbox{--}}}{>}\ 00{:}48{:}02.840$  but your roofers and landscapers and construction workers,
- $959\ 00:48:02.840 \longrightarrow 00:48:05.440$  they're not getting paid if they're not doing the work.
- 960 00:48:05.440 --> 00:48:09.580 So sort of the opportunity for not just
- 961 00:48:09.580 --> 00:48:11.834 reaching and informing people,
- 962 00:48:11.834 --> 00:48:13.290 but actually giving them options
- 963 00:48:13.290 --> 00:48:15.031 of how to protect themselves,
- 964 00:48:15.031 --> 00:48:17.720 is I think a really hard challenge.
- $965\ 00:48:17.720 --> 00:48:19.580$  You see this also with agricultural workers
- $966\ 00:48:19.580 \longrightarrow 00:48:21.010$  and other settings.
- $967~00{:}48{:}21.010 \dashrightarrow 00{:}48{:}25.370$  So I think that there's we have to move from a model
- 968 00:48:25.370 --> 00:48:27.180 where we're just trying to reach people,
- $969\ 00:48:27.180 \longrightarrow 00:48:32.150$  to give them information to discovering, understanding,
- $970\ 00:48:32.150 \longrightarrow 00:48:34.870$  and addressing the hurdles
- 971 00:48:34.870 --> 00:48:37.191 to actually protecting themselves,
- 972 00:48:37.191 --> 00:48:40.230 or helping them protect themselves,
- 973 00:48:40.230  $\rightarrow$  00:48:43.620 rather than sort of just an information deficit model.
- 974 00:48:43.620 --> 00:48:45.181 Yeah thanks.
- 975 00:48:45.181 --> 00:48:49.930 I think, kind of follow up on these detailed questions
- 976 00:48:49.930 --> 00:48:53.215 one of the students is asking like,

- 977 00:48:53.215 --> 00:48:57.170 behind this (indistinct) system exactly.
- $978\ 00{:}48{:}57.170 \dashrightarrow 00{:}49{:}00.980$  Kind of mixture of all multiple different intervention
- 979 00:49:00.980 --> 00:49:05.220 matters such as you said, some including TV,
- $980\ 00:49:05.220 \longrightarrow 00:49:08.760$  some including other informing approaches.
- $981\ 00:49:08.760 \longrightarrow 00:49:13.760$  So, kind of further question is how to,
- 982 00:49:13.770 --> 00:49:17.200 evaluate the cost and effectiveness
- 983 00:49:17.200 --> 00:49:19.890 of different approaches when people, when
- 984 00:49:19.890 --> 00:49:23.813 the public health officials want to inform,
- $985\ 00:49:24.787 \longrightarrow 00:49:26.704$  want to intervene.
- 986 00:49:26.704 --> 00:49:28.872 Yeah, I think it's a really interesting question.
- $987\ 00:49:28.872 \longrightarrow 00:49:30.412$  And so there's two questions.
- 988  $00:49:30.412 \longrightarrow 00:49:32.150$  There is sort of what,
- 989 00:49:32.150 --> 00:49:34.270 how do you evaluate the effectiveness
- 990  $00:49:34.270 \longrightarrow 00:49:36.750$  of these different channels?
- 991 00:49:36.750 --> 00:49:39.292 And I think the broader question is,
- 992 00:49:39.292 --> 00:49:43.020 can we move away from thinking that
- 993 00:49:43.020 --> 00:49:46.849 a channel of communication or a series
- 994 00:49:46.849 --> 00:49:48.090 works on the population as a whole?
- 995 00:49:48.090 --> 00:49:49.313 So, for example, if we,
- $996\ 00{:}49{:}50.175 \dashrightarrow 00{:}49{:}53.910$  if you wanna try to reach and protect outdoor workers,
- $997\ 00:49:53.910 \longrightarrow 00:49:56.120$  there's probably channels of communication
- 998 00:49:56.120 --> 00:49:58.440 and engagement that are different
- 999 00:49:58.440 --> 00:50:01.010 than if you're concerned about seniors
- 1000 00:50:01.010 --> 00:50:02.820 in institutional facilities,
- 1001 00:50:02.820 --> 00:50:04.810 or if you're thinking about kids in school
- $1002\ 00:50:04.810$  --> 00:50:07.550 based environments or summer camp environments.
- $1003\ 00:50:07.550 --> 00:50:11.050$  So I think we probably in our communication strategies

- $1004\ 00:50:11.050 \longrightarrow 00:50:13.190$  and engagement strategies need to move away
- $1005\ 00:50:13.190 \longrightarrow 00:50:16.830$  from thinking that if only we use channel X,
- 1006 00:50:16.830 --> 00:50:18.170 we'll reach more people,
- 1007 00:50:18.170 --> 00:50:19.590 it's not about reaching more people,
- $1008\ 00:50:19.590 \longrightarrow 00:50:23.090$  it's about reaching specific segments of the population
- $1009\ 00{:}50{:}23.090$  -->  $00{:}50{:}28.090$  that in specific ways that are amenable to their needs
- $1010\ 00:50:28.662 --> 00:50:31.930$  and the resources available to them.
- $1011\ 00:50:31.930 \longrightarrow 00:50:34.258$  So I think working with school nurses is a great way
- $1012\ 00:50:34.258 \longrightarrow 00:50:35.870$  to reach kids in school.
- 1013 00:50:35.870 --> 00:50:39.690 I think working with organized kids activities
- 1014 00:50:39.690 --> 00:50:42.920 is a great way to, reach again,
- 1015 00:50:42.920 --> 00:50:46.200 vulnerable children and adolescents.
- $1016\ 00:50:46.200$  --> 00:50:48.550 But those strategies aren't gonna work in other settings.
- 1017 00:50:48.550 --> 00:50:50.800 So I think it has to be much more targeted
- $1018\ 00:50:50.800 \longrightarrow 00:50:51.850$  than we're doing now.
- $1019\ 00:50:54.177 --> 00:50:56.743$  Thanks, yes, those words are insightful.
- $1020\ 00:50:58.140 --> 00:51:00.560\ \mathrm{I}$  do have another question from the audience,
- 1021 00:51:00.560 --> 00:51:04.394 from Alexi, is asking,
- 1022 00:51:04.394 --> 00:51:07.250 is there evidence of political inference,
- $1023\ 00:51:07.250 \longrightarrow 00:51:10.113$  determining the implementation of the warning system?
- $1024\ 00:51:11.900 \longrightarrow 00:51:13.150$  It's a great question.
- 1025 00:51:13.150 --> 00:51:15.730 I actually don't know enough to,
- $1026\ 00{:}51{:}15.730 \dashrightarrow 00{:}51{:}18.630$  so I haven't seen political influence in that, but.
- 1027 00:51:18.630 --> 00:51:21.043 I haven't worked with,
- $1028\ 00{:}51{:}22.225$  -->  $00{:}51{:}27.225$  too many national weather service offices directly.

 $1029~00{:}51{:}27.310 \dashrightarrow 00{:}51{:}29.950$  So I think there's probably others involved

 $1030\ 00:51:31.510 \longrightarrow 00:51:33.520$  that can answer that more.

 $1031\ 00{:}51{:}33.520 {\:{\circ}{\circ}{\circ}}>00{:}51{:}37.890$  One of the interesting linkages is that sort of the

 $1032\ 00:51:37.890 \longrightarrow 00:51:42.890$  whether these heat alerts trigger local action

 $1033\ 00:51:43.654 \longrightarrow 00:51:45.500$  varies across locations.

1034 00:51:45.500 --> 00:51:47.260 So in New York city,

1035 00:51:47.260 --> 00:51:49.170 I understand that every time

 $1036\ 00:51:49.170 \longrightarrow 00:51:52.230$  the national weather service issues a heat warning,

1037 00:51:52.230 --> 00:51:54.110 that triggers a certain number of activities.

1038 00:51:54.110 --> 00:51:56.060 Like there's no intermediate decision,

 $1039~00{:}51{:}56.060 \dashrightarrow 00{:}51{:}58.610$  whereas in the city of Boston I understand that

 $1040\ 00{:}51{:}58.610 \dashrightarrow 00{:}52{:}01.560$  it's when the mayor declares a heat emergency,

 $1041\ 00:52:01.560 --> 00:52:04.200$  which is informed by the national weather service forecast

 $1042\ 00:52:04.200 \longrightarrow 00:52:05.140$  and heat warnings,

1043 00:52:05.140 --> 00:52:07.100 but it's not automatically triggered by.

1044 00:52:07.100 --> 00:52:10.400 So I think there's some differences in,

 $1045\ 00{:}52{:}10.400 {\: -->\:} 00{:}52{:}12.790$  or quite a bit of differences actually around the country

 $1046\ 00{:}52{:}12.790 \dashrightarrow 00{:}52{:}17.370$  as to whether the national weather service heat alerts

1047 00:52:17.370 --> 00:52:19.170 automatically trigger action,

 $1048\ 00:52:19.170 \longrightarrow 00:52:20.750$  or are they informational,

 $1049\ 00:52:20.750$  --> 00:52:23.440 but the action is triggered by some other mechanism.

1050 00:52:23.440 --> 00:52:25.717 And that's one of the things that we need

 $1051\ 00{:}52{:}25.717 {\:{--}{>}\:} 00{:}52{:}28.080$  to get a better handle on across the country is

 $1052\ 00:52:28.080 \longrightarrow 00:52:32.157$  this the right trigger for local heat action plans to,

- $1053\ 00:52:32.157 \longrightarrow 00:52:35.390$  and heat responds plans to be activated.
- $1054~00{:}52{:}35.390 \dashrightarrow 00{:}52{:}38.270$  And, I don't have a preconceived notion
- $1055\ 00:52:38.270 \longrightarrow 00:52:40.440$  as to what the right answer there is.
- $1056\ 00:52:40.440 \longrightarrow 00:52:42.470$  Maybe this is the optimal trigger
- 1057 00:52:42.470 --> 00:52:44.280 or maybe something that it's appropriate
- $1058\ 00{:}52{:}44.280 {\: -->\:} 00{:}52{:}46.350$  to have an intermediate step of somebody else sort
- $1059\ 00{:}52{:}46.350 \dashrightarrow 00{:}52{:}49.940$  of making a judgment call for that local population.
- $1060\ 00:52:49.940 \longrightarrow 00:52:52.290$  So I think that's an exciting area of research.
- $1061\ 00:52:53.320 \longrightarrow 00:52:54.153$  Thanks.
- $1062\ 00:52:54.153$  --> 00:52:56.810 We do have another question from, Rob Tuber.
- 1063 00:52:56.810 --> 00:52:58.382 He's asking,
- 1064 00:52:58.382 --> 00:53:00.120 have you ever looked into the effectiveness
- $1065\ 00:53:00.120 \longrightarrow 00:53:01.663$  of cooling centers?
- $1066\ 00:53:02.870 \longrightarrow 00:53:04.300$  I love cooling centers
- $1067\ 00:53:04.300 \longrightarrow 00:53:06.140$  because they seem like such a great idea.
- $1068~00{:}53{:}06.140 \dashrightarrow 00{:}53{:}11.140$  Oh, people are know dying or or being hurt by heat
- $1069\ 00:53:11.367 --> 00:53:12.560$  let's provide them a cool place to go.
- $1070\ 00:53:12.560 \longrightarrow 00:53:16.616$  And the anecdotal evidence is that,
- $1071\ 00:53:16.616$  --> 00:53:18.800 you open cooling centers and very few people go.
- $1072\ 00:53:18.800 \to 00:53:22.400$  And so again, understanding the hurdles of that.
- 1073 00:53:22.400 --> 00:53:24.518 And I think, again,
- $1074\ 00:53:24.518$  --> 00:53:27.790 I've worked somewhat with people in New York city
- 1075 00:53:27.790 --> 00:53:30.210 and I understand that they provide
- $1076\ 00:53:30.210 --> 00:53:34.590$  transportation assistance for vulnerable populations,
- $1077\ 00:53:34.590 \longrightarrow 00:53:39.590$  because I think one of the hurdles they found was that,

 $1078\ 00:53:39.760 --> 00:53:42.896$  not everybody can get themselves to a cooling center,

 $1079\ 00:53:42.896$  --> 00:53:44.000 so you opened a cooling center and that assumes that

 $1080\ 00:53:44.000 \longrightarrow 00:53:45.023$  somebody can go.

1081 00:53:46.084 --> 00:53:49.210 Okay, so there's cultural barriers to or

 $1082\ 00:53:53.010 \longrightarrow 00:53:55.331$  barriers in terms of like, well,

 $1083\ 00:53:55.331 \longrightarrow 00:53:56.630$  what am I going to do there?

1084 00:53:56.630 --> 00:53:58.245 Is this a place where I'm actually welcome?

 $1085\ 00:53:58.245 \longrightarrow 00:53:59.078$  How do I get there?

1086 00:53:59.078 --> 00:54:01.414 Can I actually afford, like,

1087 00:54:01.414 --> 00:54:03.191 if I work, again,

 $1088\ 00:54:03.191 \longrightarrow 00:54:05.190$  can I take the time to go do that?

 $1089\ 00{:}54{:}05.190 \dashrightarrow 00{:}54{:}09.563$  Or if I have, medication needs will I be able to,

1090 00:54:10.564 --> 00:54:12.732 treat my medical condition while I'm there?

1091 00:54:12.732 --> 00:54:15.431 So I think that cooling centers are really

 $1092\ 00:54:15.431 \longrightarrow 00:54:17.425$  intuitively attractive option.

 $1093\ 00:54:17.425$  --> 00:54:20.616 And I think with so much of what we do in response to heat,

 $1094\ 00:54:20.616$  --> 00:54:23.440 there is not a body of evidence as to what works.

 $1095\ 00:54:23.440 \longrightarrow 00:54:26.142$  And I think that's really where we need to

 $1096\ 00:54:26.142 \longrightarrow 00:54:27.976$  sort of move the field is starting to think

 $1097\ 00:54:27.976 \longrightarrow 00:54:30.187$  about what works in what settings and for whom,

 $1098\ 00:54:30.187 --> 00:54:33.400$  so that we can really provide evidence-based guidance

 $1099\ 00:54:33.400 \longrightarrow 00:54:35.883$  for developing solutions.

 $1100\ 00:54:36.840 \longrightarrow 00:54:38.770$  - Thanks very well said.

 $1101\ 00{:}54{:}38.770 \dashrightarrow 00{:}54{:}41.220$  We do need a lot of these evidence-based research

 $1102\ 00:54:41.220 \longrightarrow 00:54:43.181$  on these policy actions.

- $1103\ 00:54:43.181 \longrightarrow 00:54:47.720\ I$  do have another follow-up question from the students,
- 1104 00:54:47.720 --> 00:54:50.310 is that actually within your next steps?
- $1105\ 00:54:50.310 \longrightarrow 00:54:54.340$  So the students is kind of wondering
- $1106\ 00{:}54{:}54{:}340 {\: -->\:} 00{:}54{:}58.660$  how do you actually verify the causal assumption
- $1107\ 00:54:58.660 \longrightarrow 00:55:01.537$  in evaluating the heater systems?
- $1108\ 00:55:02.770 \longrightarrow 00:55:04.210$  Yeah, that's great.
- $1109\ 00:55:04.210 \longrightarrow 00:55:09.210$  So, the best we can do is use the data,
- 1110~00:55:11.810 --> 00:55:14.300 this isn't a randomized, these aren't randomized studies.
- $1111\ 00:55:14.300 \longrightarrow 00:55:15.993$  So the best we can do is,
- $1112\ 00:55:16.840 \longrightarrow 00:55:19.820$  use observational data to the best of our ability.
- 1113 00:55:19.820 --> 00:55:22.690 So, can we ever prove that we understand
- 1114 00:55:22.690 --> 00:55:24.060 the causal effect of heat alerts?
- $1115\ 00:55:24.060 \longrightarrow 00:55:26.854$  No, but I think we can do,
- 1116 00:55:26.854 --> 00:55:31.730 more detailed, more insightful analysis
- 1117 00:55:31.730 --> 00:55:33.780 of the existing observational data.
- $1118\ 00:55:33.780 \longrightarrow 00:55:38.780$  And I think this idea of there are a range of days.
- 1119 00:55:38.850 --> 00:55:40.790 So going back to the heat warnings,
- 1120 00:55:40.790 --> 00:55:42.170 there's these days where we say,
- 1121 00:55:42.170 --> 00:55:44.475 we're always going to issue a heat warning,
- $1122\ 00:55:44.475 --> 00:55:46.440$  'cause it's just so hot that we just take it for granted
- $1123\ 00:55:46.440 \dashrightarrow 00:55:49.354$  that it's dangerous and we need to do something,
- $1124\ 00:55:49.354 \longrightarrow 00:55:50.454$  so we're going to do it.
- 1125 00:55:50.454 --> 00:55:52.314 And then there's this other bucket,
- 1126 00:55:52.314 --> 00:55:55.219 a days on the other end where like, it's just,
- $1127\ 00:55:55.219$  --> 00:55:57.290 is suing key warnings is just not likely to be effective.

- $1128\ 00:55:57.290 \to 00:55:59.200$  but there's this middle range where you're like,
- 1129 00:55:59.200 --> 00:56:00.610 should I issue a heat warning?
- $1130\ 00:56:00.610 \longrightarrow 00:56:01.890$  Yes or no.
- $1131\ 00{:}56{:}01.890 \dashrightarrow 00{:}56{:}04.610$  And so what we're doing is providing information
- $1132\ 00:56:04.610 \longrightarrow 00:56:07.323$  on that part, the spectrum, and where we say,
- $1133\ 00:56:08.890 --> 00:56:11.468$  should we issue somewhat more heat alerts
- $1134\,00:56:11.468\,\text{--}{>}\,00:56:13.990$  because we can do it right around this threshold,
- 1135 00:56:13.990 --> 00:56:15.510 would that save lives?
- 1136 00:56:15.510 --> 00:56:20.230 And, that's it's not the entire picture.
- 1137 00:56:20.230 --> 00:56:22.350 It would be so interesting to know
- $1138\ 00:56:22.350 \longrightarrow 00:56:25.470$  on these very hot days when we issue heat warnings,
- 1139 00:56:25.470 --> 00:56:28.353 do they actually prevent deaths?
- 1140 00:56:29.314 --> 00:56:31.119 And the problem is as we said before,
- 1141 00:56:31.119 --> 00:56:33.480 that there's no data on the counterfactual,
- 1142 00:56:33.480 --> 00:56:35.295 like what would have happened
- 1143 00:56:35.295 --> 00:56:36.620 had you not issued a heat alert?
- $1144\ 00:56:36.620$  --> 00:56:39.618 So, there's probably other creative ways to do it,
- $1145\ 00:56:39.618 \longrightarrow 00:56:41.069$  but we haven't figured that out yet.
- $1146\ 00:56:41.069 \longrightarrow 00:56:44.060$  So this is really about at the margin,
- $1147\ 00:56:44.060 \longrightarrow 00:56:46.200$  would you do better issuing say 10%
- $1148\ 00:56:46.200 \longrightarrow 00:56:47.633$  more heat alerts each year,
- $1149\ 00:56:48.601 \longrightarrow 00:56:50.270$  or 15% more heat alerts each year?
- $1150\ 00:56:50.270 --> 00:56:53.830$  'Cause you don't wanna issue them if they're not,
- 1151 00:56:53.830 --> 00:56:55.812 there's risks of warning,
- $1152\ 00:56:55.812 --> 00:56:57.893$  fatigue of people not taking it seriously.

- $1153\ 00{:}56{:}57.893 --> 00{:}57{:}00.680$  Because there are too often and there's some costs
- $1154\ 00:57:00.680 \longrightarrow 00:57:03.337$  associated with each time you issue it,
- $1155\ 00:57:03.337 \longrightarrow 00:57:04.514$  if it triggers actions.
- $1156\ 00:57:04.514$  --> 00:57:07.685 So it's again, it's like, no, should we issue a few more?
- 1157 00:57:07.685 --> 00:57:09.840 And in that question, we,
- $1158\ 00:57:09.840 \longrightarrow 00:57:12.140$  so far our evidence suggests
- $1159\ 00:57:12.140 \longrightarrow 00:57:15.733$  that there's not widespread benefit of them, but,
- $1160\ 00:57:17.030 \longrightarrow 00:57:20.233$  sort of with the asterisk that more work is needed on that.
- $1161\ 00:57:21.720 \longrightarrow 00:57:23.521$  Okay, thanks, yeah.
- $1162\ 00:57:23.521 \longrightarrow 00:57:27.730$  I think we have the final comment or question
- $1163\ 00:57:27.730 \longrightarrow 00:57:30.579$  from Donna Spellman.
- $1164\ 00:57:30.579 --> 00:57:34.420$  I've been struggling to see how implementation science
- $1165\ 00:57:34.420 --> 00:57:36.503$  might promote environmental health.
- $1166\ 00:57:37.574$  --> 00:57:39.720 This project is a perfect example of the connection.
- 1167 00:57:39.720 --> 00:57:41.153 Thanks.
- $1168\ 00:57:41.153 \longrightarrow 00:57:42.123$  Thanks Donna.
- $1169\ 00:57:43.062 \longrightarrow 00:57:44.230$  I think that's a great point.
- $1170\ 00{:}57{:}44.230 \dashrightarrow 00{:}57{:}46.940$  And I think that there I have not seen a large amount
- 1171 00:57:46.940 --> 00:57:48.400 on implementation science,
- $1172\ 00:57:48.400 \longrightarrow 00:57:52.000$  specifically oriented towards solutions
- $1173\ 00:57:53.310 \longrightarrow 00:57:55.780$  in environmental health.
- 1174 00:57:55.780 --> 00:57:57.510 We're really great at describing problems
- $1175\ 00:57:57.510 \dashrightarrow 00:58:02.510$  and less good at figuring out and implementing solutions
- $1176\ 00:58:02.844 \longrightarrow 00:58:04.525$  and then evaluating their effectiveness.
- 1177 00:58:04.525 --> 00:58:06.702 So I think that this is right for that

- $1178\ 00:58:06.702 --> 00:58:07.970$  because we know there's a risk there.
- $1179\ 00:58:07.970 --> 00:58:10.689$  We just don't actually know exactly what to do about it.
- 1180 00:58:10.689 --> 00:58:12.430 And there are lots of good ideas,
- 1181 00:58:12.430 --> 00:58:15.007 but we need to move from good ideas to,
- 1182 00:58:15.007 --> 00:58:17.823 good evidence supporting specific ideas.
- $1183\ 00:58:20.093 \longrightarrow 00:58:20.968$  Great.
- $1184\ 00:58:20.968 \dashrightarrow 00:58:24.570$  I think with that we will conclude, this seminar
- $1185~00{:}58{:}24.570 \dashrightarrow 00{:}58{:}27.480$  and thank you Greg, for this wonderful presentation
- $1186\ 00:58:27.480 \longrightarrow 00:58:30.130$  on the science-based actions.
- $1187\ 00:58:30.130 \longrightarrow 00:58:34.320$  And, this seminar will be recorded
- $1188\ 00:58:34.320 \longrightarrow 00:58:36.540$  and will be posted later.
- $1189\ 00:58:36.540 --> 00:58:40.200$  So thank you all for coming and thanks again Greg.
- $1190\ 00{:}58{:}40.200 \dashrightarrow 00{:}58{:}42.440$  Wonderful thanks for the opportunity, by e bye.
- 1191 00:58:42.440 --> 00:58:43.273 Bye.