

# Epidemiology/Biostatistics Working Group Report

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Yutaka Yasui, PhD

Wendy Leisenring, PhD

**CCSS**

Childhood Cancer  
Survivor Study



St. Jude Children's  
Research Hospital

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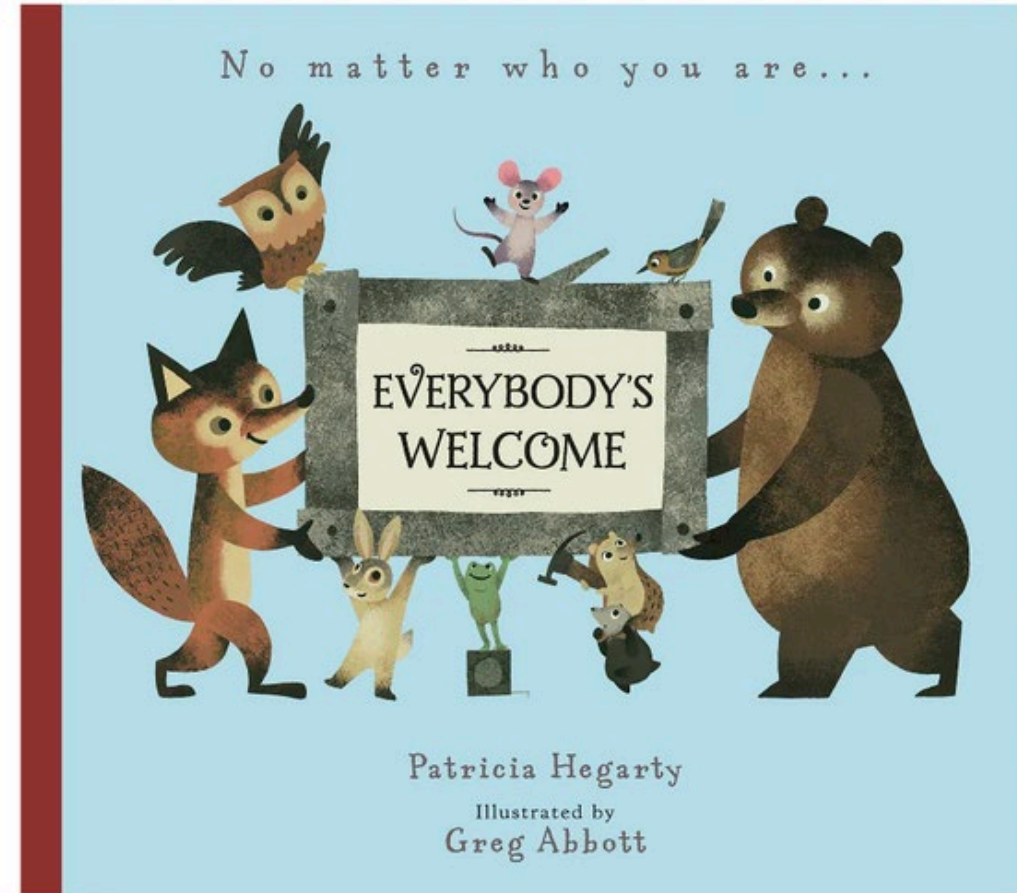
An NCI-funded Resource

- To lead and support investigations on **population sciences** relevant to CCSS, such as mortality, cost-effectiveness, characterization of primary treatment exposures (including temporal changes, radiation dosimetry), and minority populations
- To encourage and support **methodological research** associated with enhancing the follow-up and evaluation of the CCSS cohort

# Working Group Membership

CCSS

Ann Mertens, Emory University  
Kiri Ness, St. Jude Children's Research Hospital  
Greg Armstrong, St. Jude Children's Research Hospital  
Leslie Robison, St. Jude Children's Research Hospital  
Kumar Srivastava, St. Jude Children's Research Hospital  
Sadie Mirzaei Salehabadi, St. Jude Children's Research Hospital  
Yan Yuan, University of Alberta  
Cindy Im, University of Alberta  
Chaya Moskowitz, Memorial Sloan Kettering Cancer Center  
Jennifer Yeh, Boston Children's Hospital  
Arin Madenchi, Boston Children's Hospital  
Stephanie Dixon, St. Jude Children's Research Hospital  
Anne Kirchhoff, University of Utah  
Xu Ji, Emory University  
Rebecca Howell, MD Anderson Cancer Center  
James Bates, Emory University  
Wendy Leisenring (Co-Chair), Fred Hutchinson Cancer Research Center  
Yutaka Yasui (Co-Chair), St. Jude Children's Research Hospital



- 4** Published/In Press Manuscripts (since 1/1/2022)
- 2** Currently Submitted Manuscripts
- 8** Analysis/Manuscript in Process
- 2** Concepts in development
- 1** New AOIs (total, since 1/1/2022)

1. Excess mortality and modifiable risk factors
2. Cardiac substructure dosimetry
3. Tx-specific genetic risk

1. Excess mortality and modifiable risk factors
2. Cardiac substructure dosimetry
3. Tx-specific genetic risk

## Specific causes of **excess late mortality** and association with **modifiable risk factors** among survivors of childhood cancer: a report from the Childhood Cancer Survivor Study cohort

*Stephanie B Dixon, Qi Liu, Eric J Chow, Kevin C Oeffinger, Paul C Nathan, Rebecca M Howell, Wendy M Leisenring, Matthew J Ehrhardt, Kirsten K Ness, Kevin R Krull, Ann C Mertens, Melissa M Hudson, Leslie L Robison, Yutaka Yasui, Gregory T Armstrong*



**Stephanie Dixon**  
St. Jude Children's  
Research Hospital

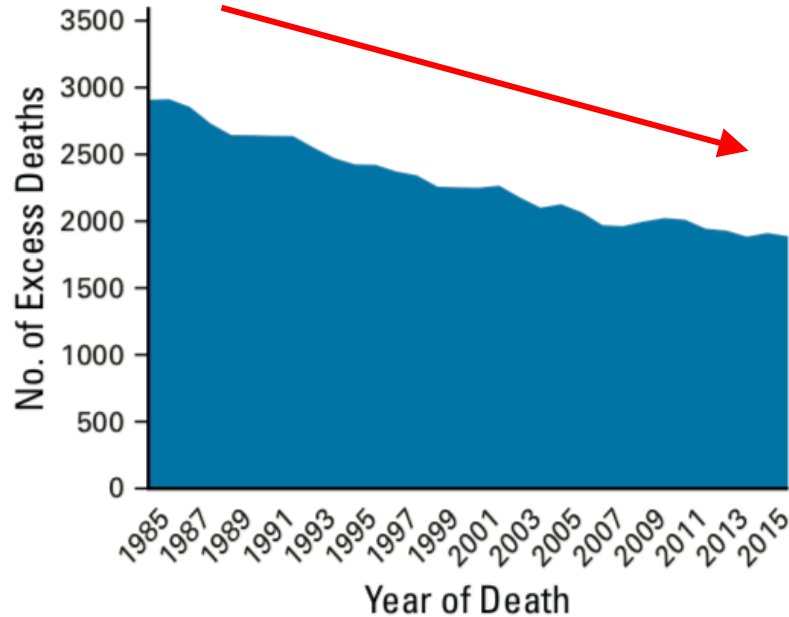
THE LANCET

Volume 401, Issue 10386, 29 April–5 May 2023, Pages  
1447-1457

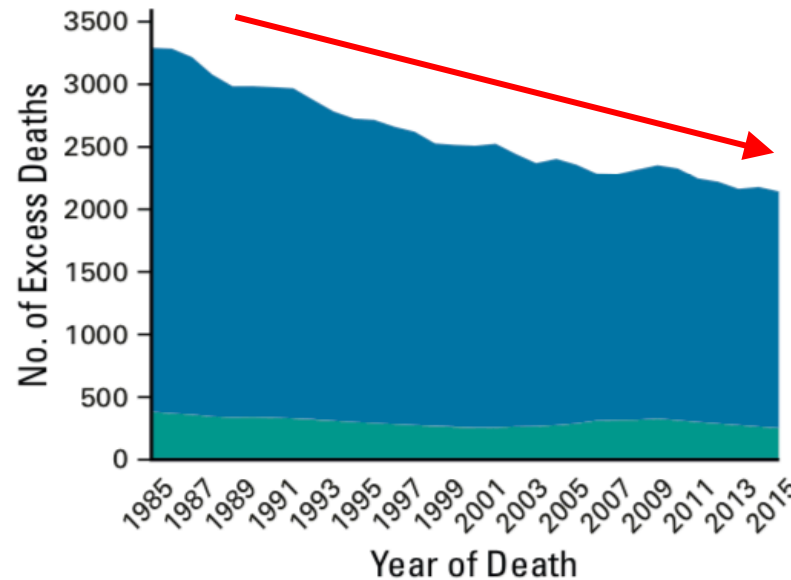
# Excess death compared to the general population

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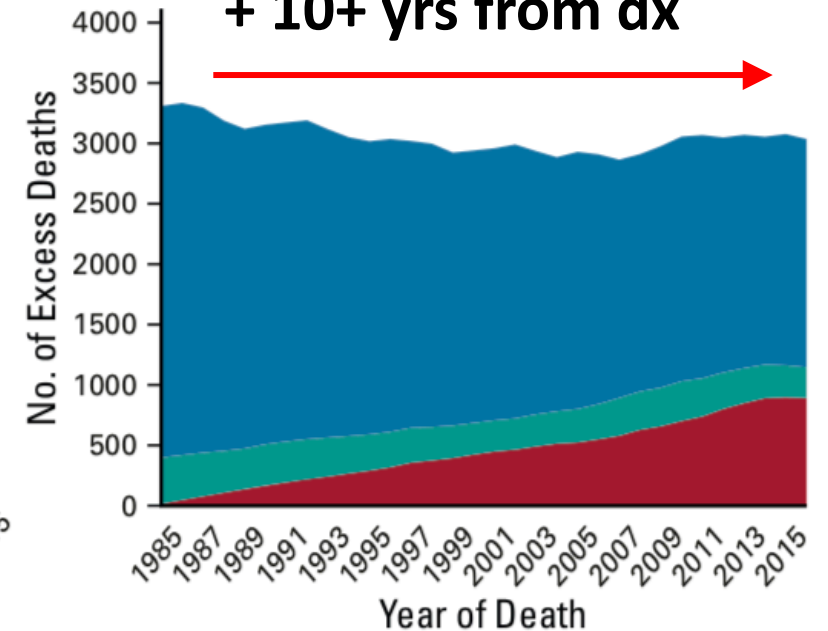
< 5 years from dx



< 5 yrs + 5-9 yrs  
from dx



< 5 yrs + 5-9 yrs  
+ 10+ yrs from dx



**Annalynn M.  
Williams, Ph.D.**  
Univ. of  
Rochester

## Rethinking Success in Pediatric Oncology: Beyond 5-Year Survival

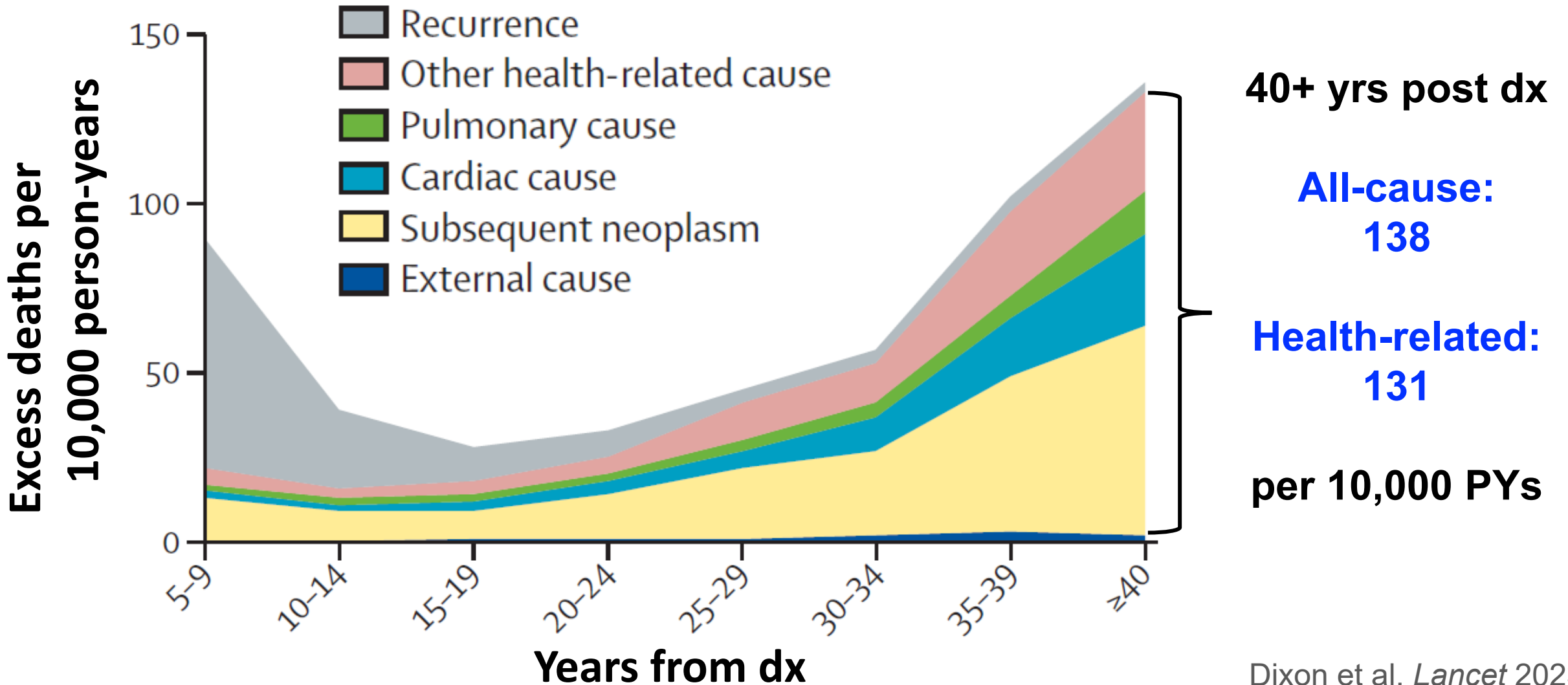
AnnaLynn M. Williams, PhD<sup>1</sup>; Qi Liu, MSc<sup>2</sup>; Nickhill Bhakta, MD, MPH<sup>1,3</sup>; Kevin R. Krull, PhD<sup>1,4</sup>; Melissa M. Hudson, MD<sup>1,5</sup>; Leslie L. Robison, PhD<sup>1</sup>; and Yutaka Yasui, PhD<sup>1</sup>



- **What causes of death are in excess among survivors?**
- **How are they changing over time/aging?**
- **Are lifestyle and modifiable risk factors associated with the excess death?**

# Excess Death in Survivors of Childhood Cancer

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# Excess Cardiovascular Death in Survivors

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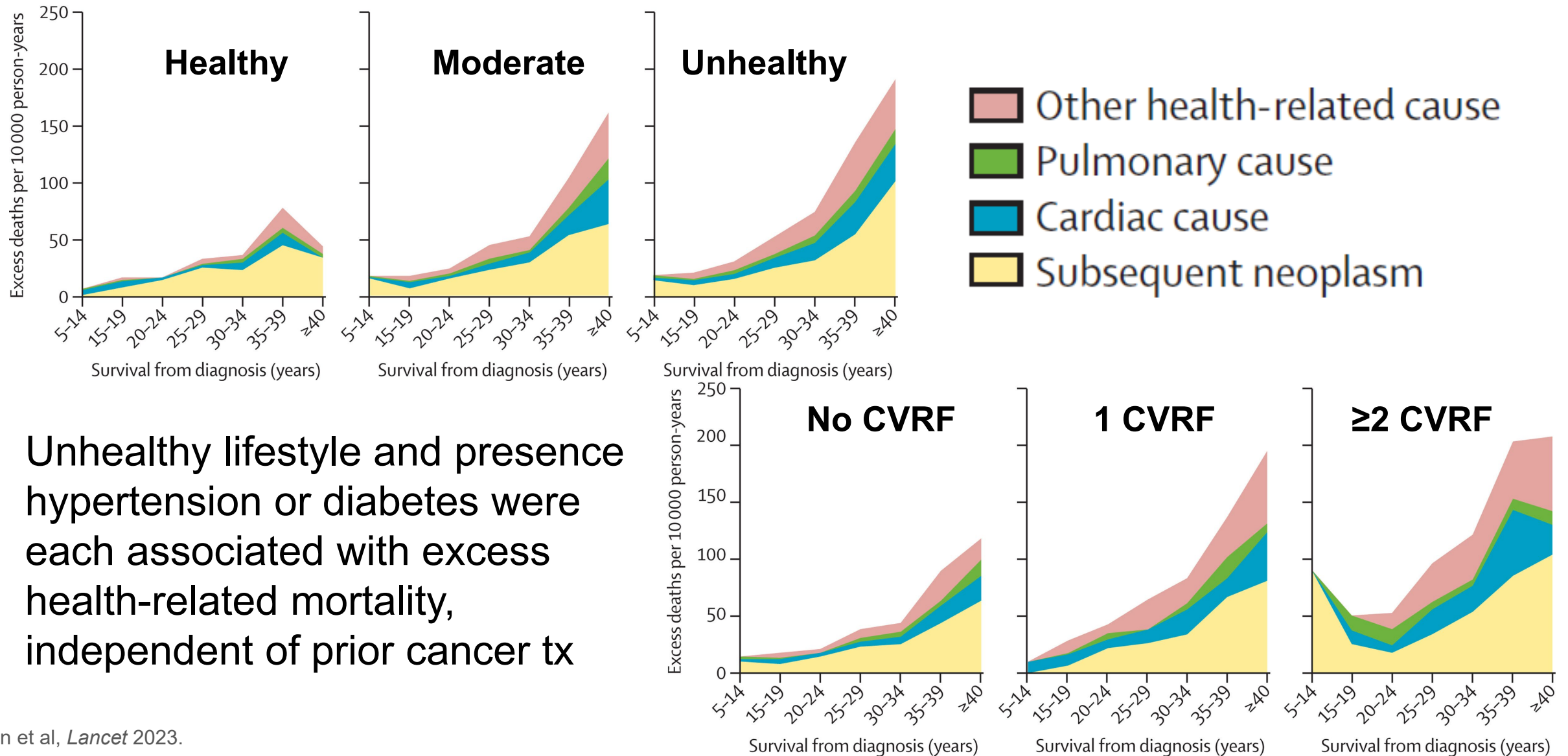
|                      |         | Cardiac          |                         |                                 |            |                            |                         |
|----------------------|---------|------------------|-------------------------|---------------------------------|------------|----------------------------|-------------------------|
|                      |         | Valvular disease | Ischaemic heart disease | Heart failure or cardiomyopathy | Arrhythmia | Hypertensive heart disease | Cerebrovascular disease |
| Years from diagnosis | 5-9     | 0.0              | 0.4                     | 0.8                             | 0.0        | 0.0                        | 0.3                     |
|                      | 10-19   | 0.1              | 0.9                     | 1.2                             | 0.0        | 0.0                        | 0.4                     |
|                      | 20-29   | 0.6              | 1.6                     | 1.0                             | 0.1        | 0.0                        | 1.1                     |
|                      | 30-39   | 2.6              | 3.2                     | 4.8                             | 0.5        | 0.1                        | 2.1                     |
|                      | ≥40     | 8.6              | 9.8                     | 5.8                             | 1.1        | 0.2                        | 10.0                    |
|                      | Overall | 0.6              | 1.4                     | 1.5                             | 0.1        | 0.0                        | 0.9                     |

Absolute excess risk per 10,000 person-years

- Leading causes
  - **Similar to the general population, occurring at a younger age and higher rate**
- The largest non-cancer contributors:
  - **Stroke**
  - **Ischemic heart disease**
  - **Valvular heart disease**
  - **Heart failure**

# Excess Death & Lifestyle and CVRFs

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Unhealthy lifestyle and presence hypertension or diabetes were each associated with excess health-related mortality, independent of prior cancer tx



February 10, 2023

**Original Investigation** | Oncology

## Association of Modifiable Health Conditions and Social Determinants of Health With Late Mortality in Survivors of Childhood Cancer

[Matthew J. Ehrhardt, MD, MS](#); Qi Liu, MS; Stephanie B. Dixon, MD, MS; Eric Caron, MSN; Debbie Redd, MSN; Kyla Shelton, MS; I-Chan Huang, PhD; Nickhill Bhakta, MD, MPH; Kirsten K. Ness, PhD; Daniel A. Mulrooney, MD, MS; Tara M. Brinkman, PhD; Wassim Chemaitilly, MD; Angela Delaney, MD; Gregory T. Armstrong, MD, MSCE; Deo Kumar Srivastava, PhD; Alia Zaidi, MD; Leslie L. Robison, PhD; Yutaka Yasui, PhD; Melissa M. Hudson, MD

1. Excess mortality and modifiable risk factors
2. Cardiac substructure dosimetry
3. Tx-specific genetic risk

# Ancillary Studies: R01

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**Principal Investigator:** Rebecca Howell (MD Anderson), Dan Mulrooney, Yutaka Yasui (St. Jude Children's Research Hospital)

**Title:** Personalized Risk Prediction to Reduce Cardiovascular Disease in Childhood Cancer Survivors

**Proposed Funding Source:** National Institutes of Health (R01)

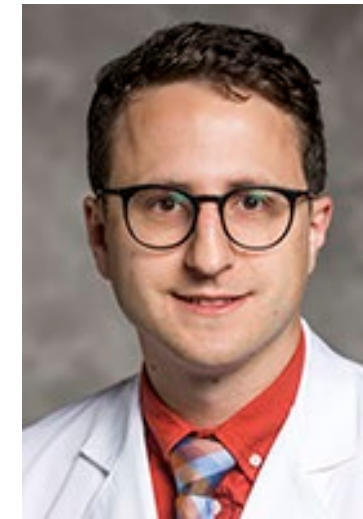
**Study Aims:** Develop a prediction model for cardiac outcomes using cardiac substructures



**Rebecca Howell, PhD**  
MD Anderson Cancer Center

















**Dan Mulrooney, MD, MS**  
St. Jude Children's Res. Hosp.



**James E Bates, MD**  
Emory University

Original Reports | Pediatric Oncology

## Cardiac Substructure Radiation Dose and Risk of Late Cardiac Disease in Survivors of Childhood Cancer: A Report From the Childhood Cancer Survivor Study

James E. Bates, MD<sup>1</sup> ; Suman Shrestha, PhD<sup>2</sup> ; Qi Liu, MSc<sup>3</sup> ; Susan A. Smith, MPH<sup>2</sup> ; Daniel A. Mulrooney, MD, MS<sup>4,5</sup> ; Wendy Leisenring, ScD<sup>6</sup> ; Todd Gibson, PhD<sup>7</sup> ; Leslie L. Robison, PhD<sup>4</sup> ; Eric J. Chow, MD, MPH<sup>6</sup> ; Kevin C. Oeffinger, MD<sup>8</sup> ; Gregory T. Armstrong, MD, MSCE<sup>4</sup>; Louis S. Constine, MD<sup>9,10</sup> ; Bradford S. Hoppe, MD, MPH<sup>11</sup> ; Choonsik Lee, PhD<sup>7</sup> ; Yutaka Yasui, PhD<sup>4</sup> ; and Rebecca M. Howell PhD<sup>2</sup>

**Journal of Clinical Oncology**<sup>®</sup>  
An American Society of Clinical Oncology Journal



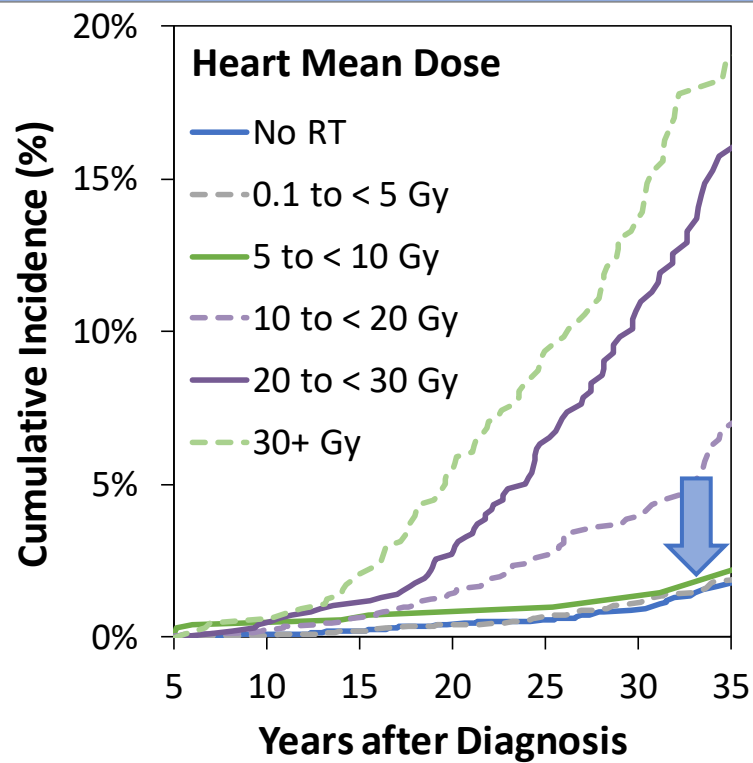
- **How are the RT doses to substructures of the heart associated with cardiac late effects risks?**

**Is there a threshold?**

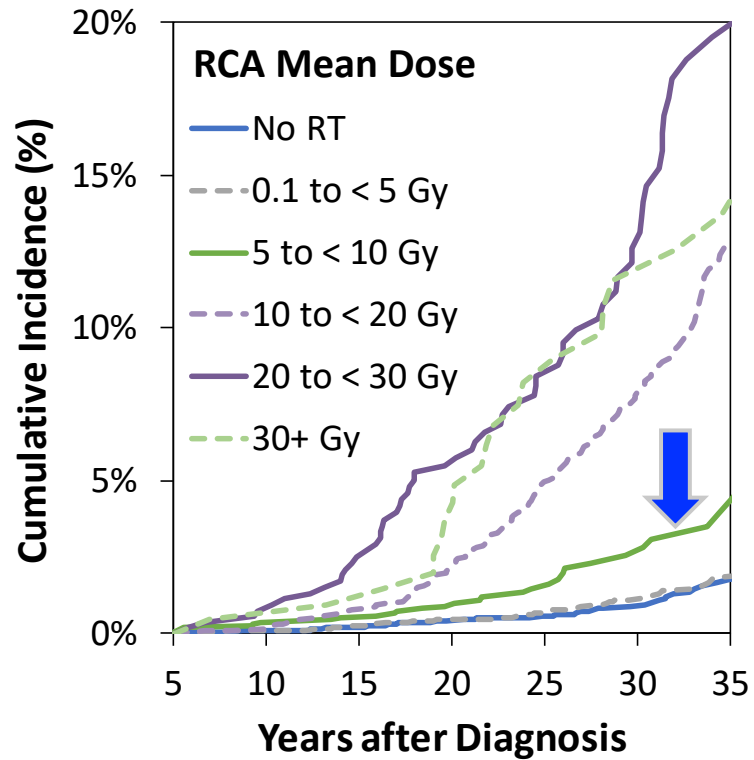
# Coronary Artery Disease & Substructure dose

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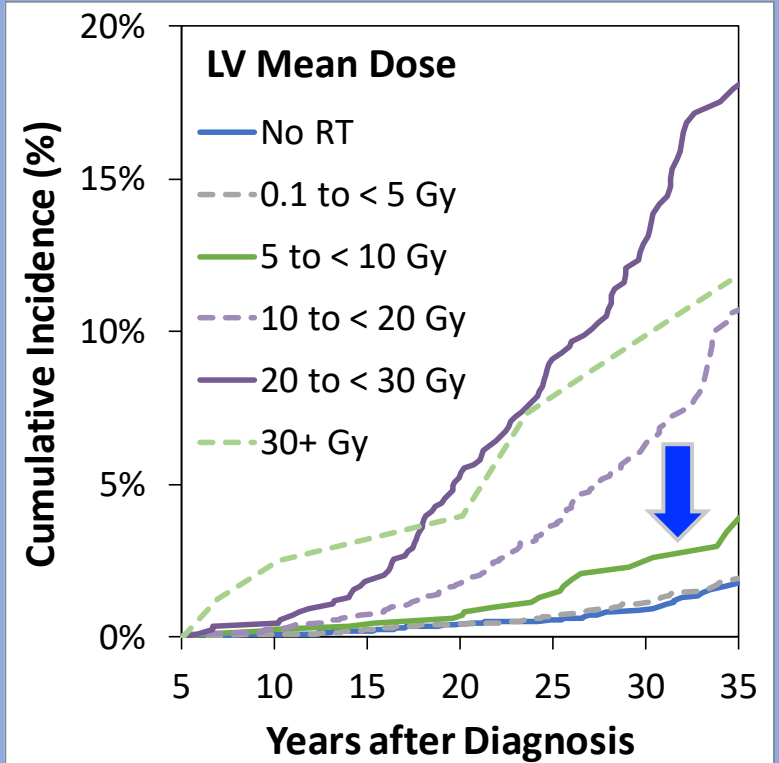
## Whole Heart



## Right Coronary Artery



## Left Ventricle



# Coronary Artery Disease & Substructure dose

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| Mean RT Dose      | Entire Heart           | RCA                            | Left Ventricle                 |
|-------------------|------------------------|--------------------------------|--------------------------------|
| No RT             | Ref                    | Ref                            | Ref                            |
| 0.1 – 4.9 Gy      | 1.1 (0.8 – 1.6)        | 1.1 (0.8 – 1.6)                | 1.1 (0.8 – 1.6)                |
| <b>5 – 9.9 Gy</b> | <b>1.3 (0.6 – 2.9)</b> | <b><u>2.6 (1.6 – 4.1)*</u></b> | <b><u>2.2 (1.3 – 3.7)*</u></b> |
| 10 – 19.9 Gy      | 3.7 (2.6 – 5.2)*       | 5.3 (3.9 – 7.2)*               | 4.8 (3.5 – 6.6)*               |
| 20 – 29.9 Gy      | 6.8 (4.8 – 9.6)*       | 8.5 (5.9 – 12.2)*              | 7.7 (5.5 – 10.9)*              |
| ≥30 Gy            | 8.2 (5.7 – 11.9)*      | 5.1 (2.9 – 8.9)*               | 2.7 (1.0 – 7.9)                |

## Excess Relative Risk(Rate) Model

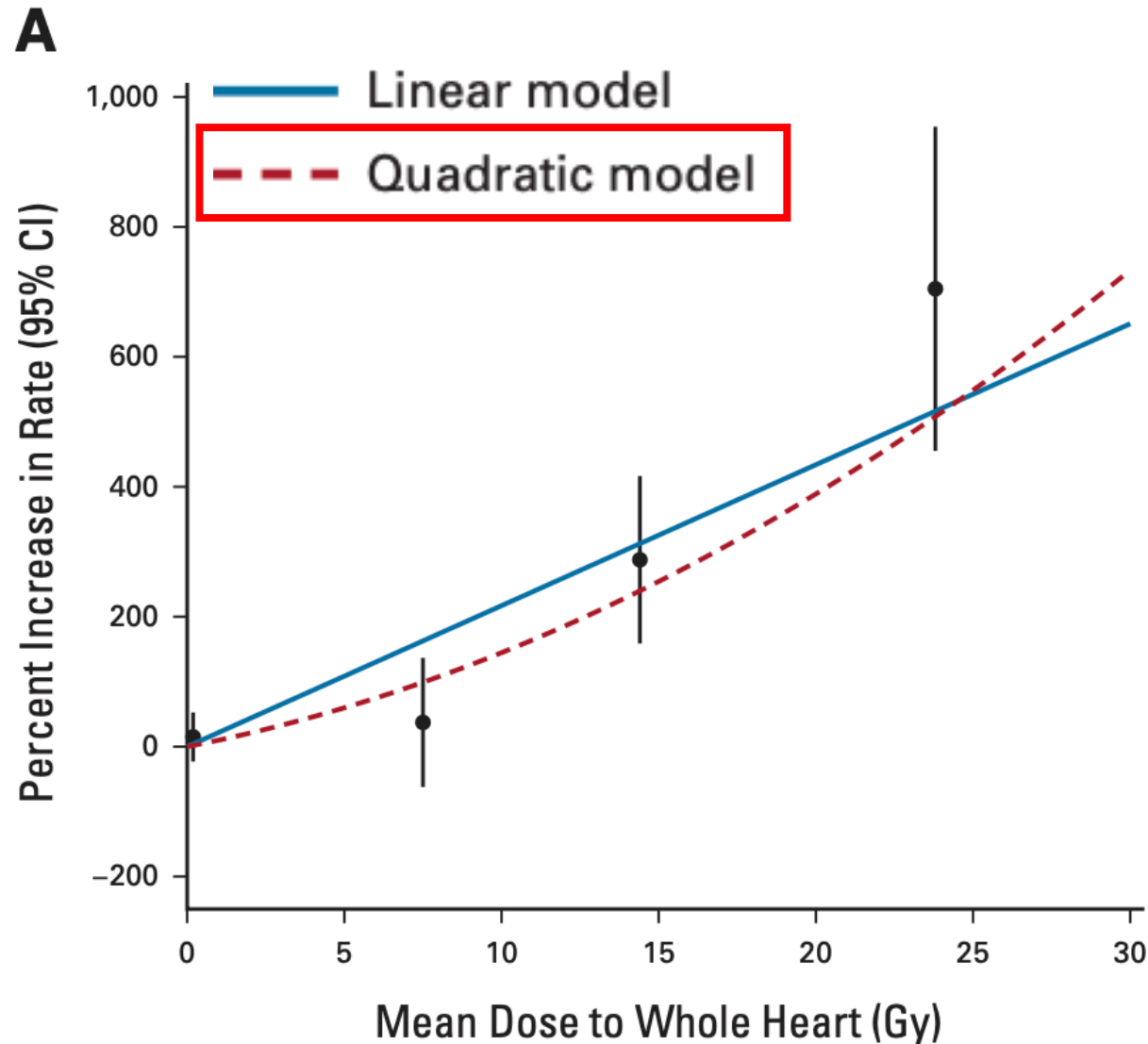
$$\text{Rate} = (\text{non-RT effects}) \times (1 + \text{RT effects})$$

## Cox & Piecewise Exp. Model

$$\text{Rate} = (\text{non-RT effects}) \times (\text{RT effects})$$

# Coronary Artery Disease & Mean Whole Heart Dose

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## Excess Relative Risk(Rate) Model

$$\text{Rate} = (\text{non-RT effects}) \times (1 + \text{RT effects})$$

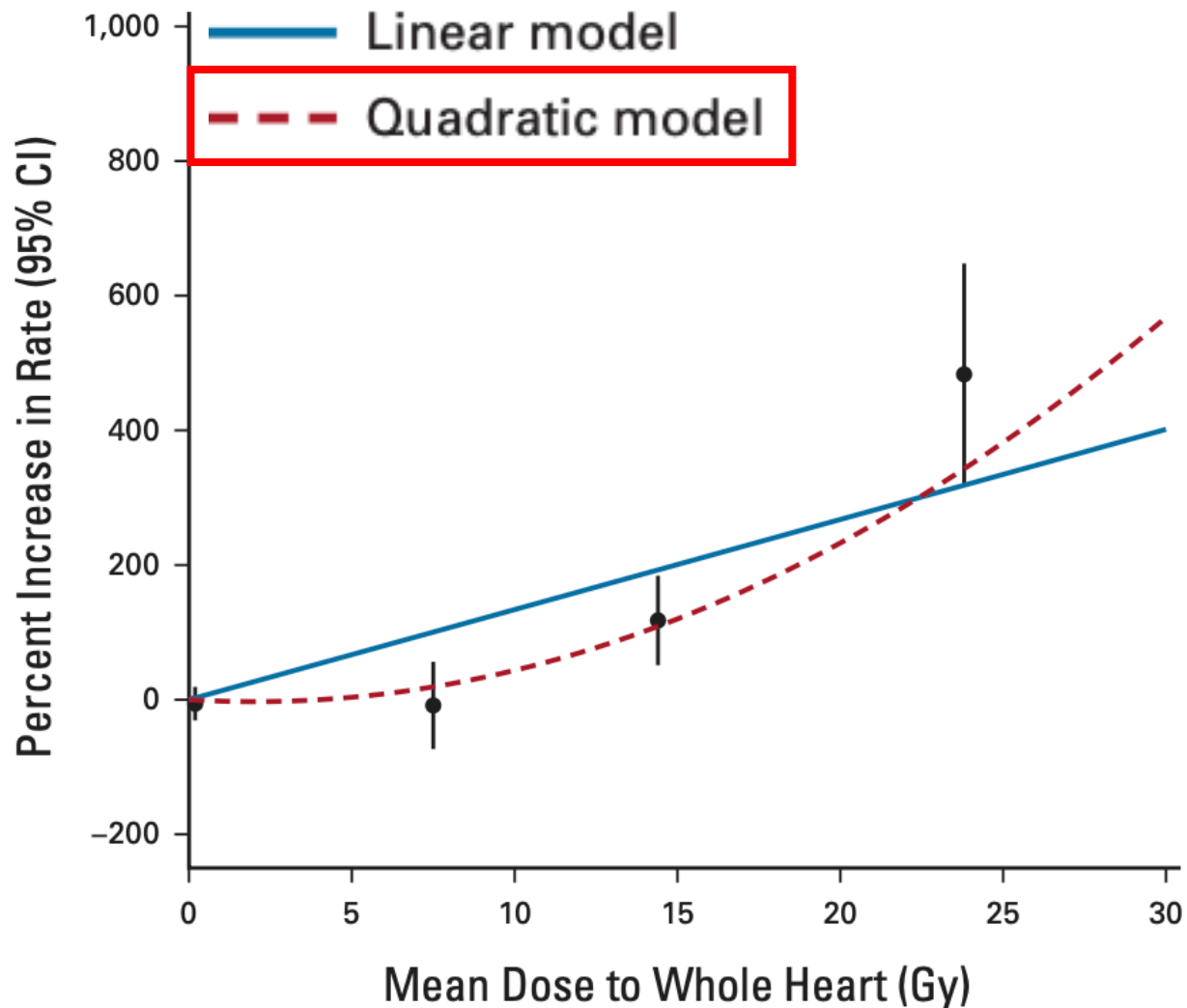
## Cox & Piecewise Exp. Model

$$\text{Rate} = (\text{non-RT effects}) \times (\text{RT effects})$$

# Heart Failure & Mean Whole Heart Dose

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**B**

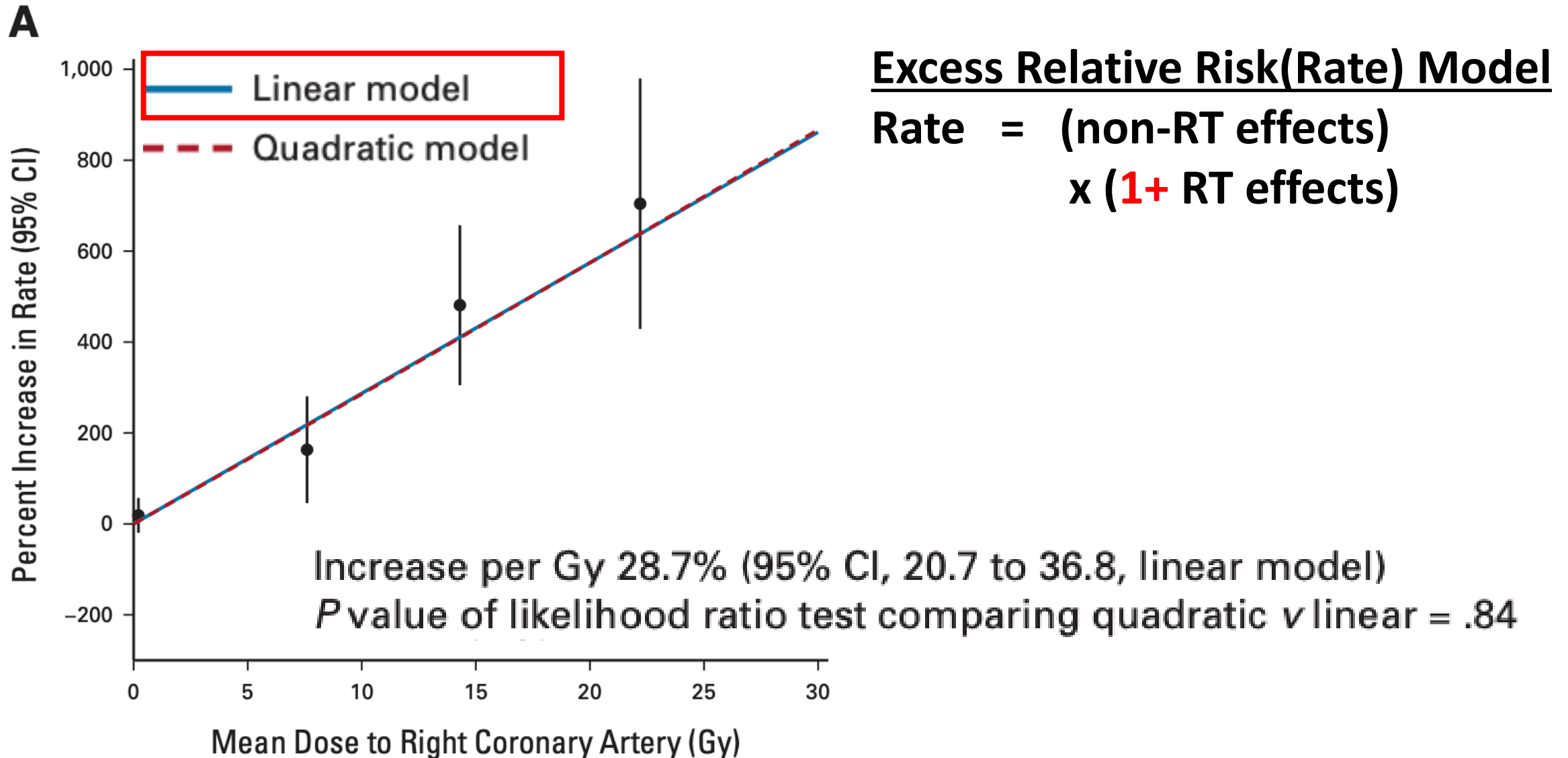


Excess Relative Risk(Rate) Model

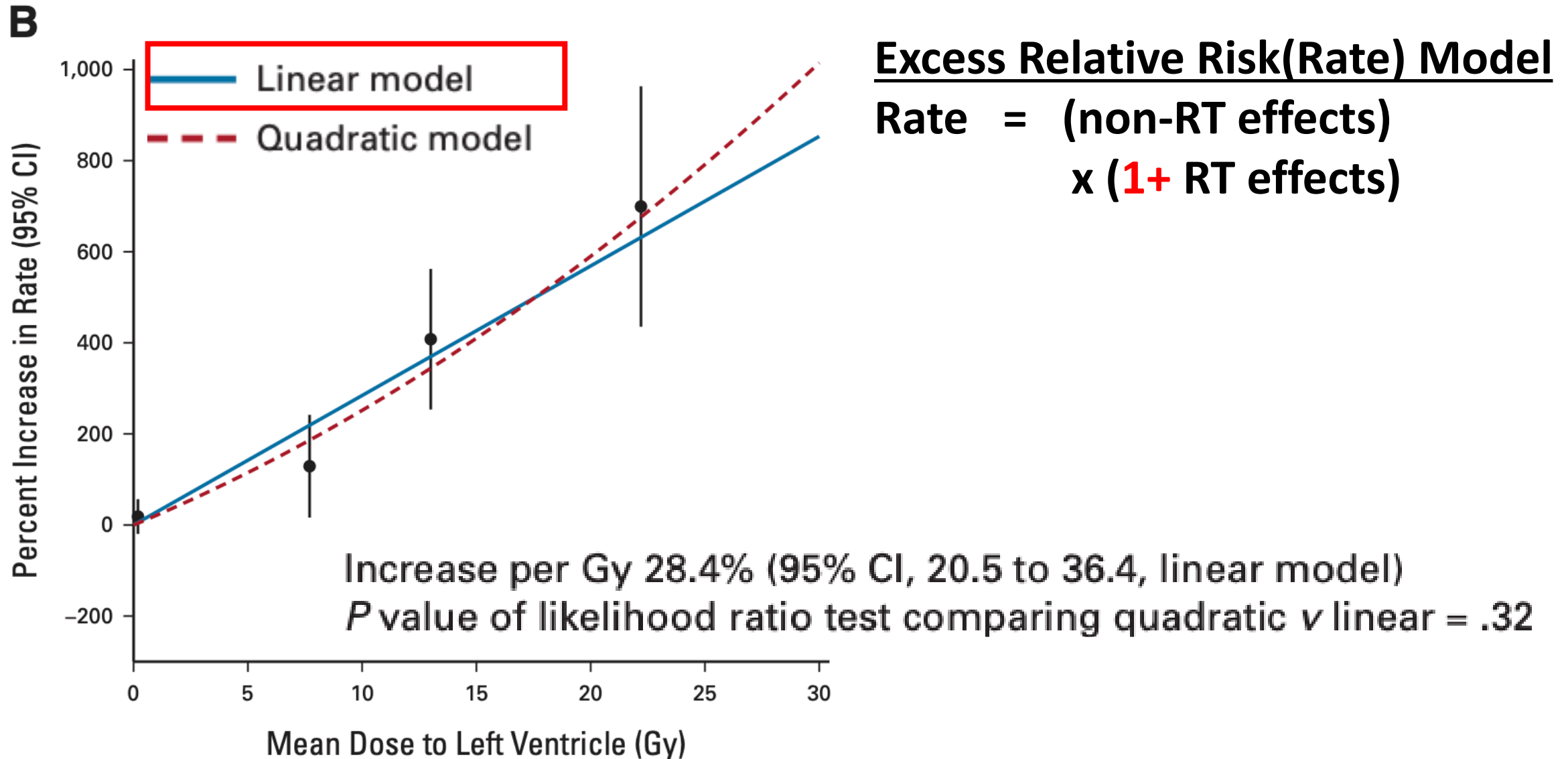
$$\text{Rate} = (\text{non-RT effects}) \times (1 + \text{RT effects})$$

# Coronary Artery Disease & RCA dose

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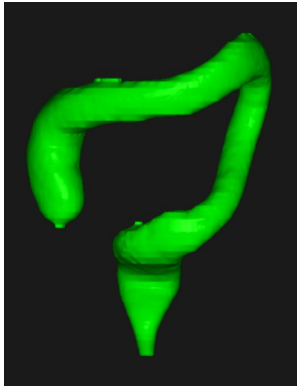
# Coronary Artery Disease & LV dose





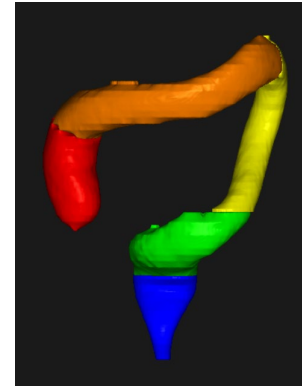
# Colorectal SMN total & substructure dosimetry

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## Total colorectal RT metrics

- Mean dose
- $V_5$ ,  $V_{10}$ ,  $V_{20}$ ,  $V_{30}$ ,  $V_{40}$
- $V_5$  with  $d_{\max} < 20$
- $V_{10}$  with  $d_{\max} < 20$



## Substructure RT metrics

- Mean dose



**Constance Owens, BS**  
MD Anderson Cancer  
Center



**Rebecca Howell, PhD**  
MD Anderson Cancer  
Center

# Highlights of Recently Completed Research

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1. Excess mortality and modifiable risk factors
2. Cardiac substructure dosimetry
3. Tx-specific genetic risk

# Ancillary Studies: R21

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**Principal Investigator:** Cindy Im & Yan Yuan

**Title:** Treatment-specific genetic risk scores for late effects prediction in childhood, AYA cancer survivors

**Dates of Funding:** 9/21 – 8/24

**Funding Source:** National Institutes of Health R21CA261833

**Award:** \$279,068

**Study Aims:** Create a reference TX-G Effects Catalog for a range of treatments and subsequent malignant neoplasm, cardiovascular, and endocrine phenotypes and develop TX-G polygenic risk scores among childhood/AYA cancer survivors.



**Cindy Im, PhD**  
University of  
Minnesota



**Yan Yuan, PhD**  
University of Alberta

## Leveraging **Therapy-Specific Polygenic Risk Scores** to Predict Restrictive Lung Defects in Childhood Cancer Survivors

Cindy Im<sup>1</sup>, Yan Yuan<sup>1</sup>, Eric D. Austin<sup>2</sup>, Dennis C. Stokes<sup>2</sup>, Matthew J. Krasin<sup>3</sup>, Andrew M. Davidoff<sup>4</sup>, Yadav Sapkota<sup>5</sup>, Zhaoming Wang<sup>5</sup>, Kirsten K. Ness<sup>5</sup>, Carmen L. Wilson<sup>5</sup>, Gregory T. Armstrong<sup>5,6</sup>, Melissa M. Hudson<sup>5,6</sup>, Leslie L. Robison<sup>5</sup>, Daniel A. Mulrooney<sup>5,6</sup>, and Yutaka Yasui<sup>1,5</sup>

**Volume 82, Issue 16**

15 August 2022



# General-pop.'s results do not apply to survivors

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AJHG

ARTICLE | [VOLUME 107, ISSUE 4, P636-653, OCTOBER 01, 2020](#)

## Generalizability of “GWAS Hits” in Clinical Populations: Lessons from Childhood Cancer Survivors

[Cindy Im](#)  • [Na Qin](#) • [Zhaoming Wang](#) • [Weiyu Qiu](#) • [Carrie R. Howell](#) • [Yadav Sapkota](#) • [Wonjong Moon](#) •  
[Wassim Chemaitilly](#) • [Todd M. Gibson](#) • [Daniel A. Mulrooney](#) • [Kirsten K. Ness](#) • [Carmen L. Wilson](#) •  
[Lindsay M. Morton](#) • [Gregory T. Armstrong](#) • [Smita Bhatia](#) • [Jinghui Zhang](#) • [Melissa M. Hudson](#) •  
[Leslie L. Robison](#) • [Yutaka Yasui](#) • [Show less](#)

[Open Archive](#) • Published: September 17, 2020 • DOI: <https://doi.org/10.1016/j.ajhg.2020.08.014> •

- **Can we derive useful Tx-specific PRS for survivors?**

Weighted sum of risk alleles:

$$PRS = \sum_{k=1}^K \beta_k X_k$$

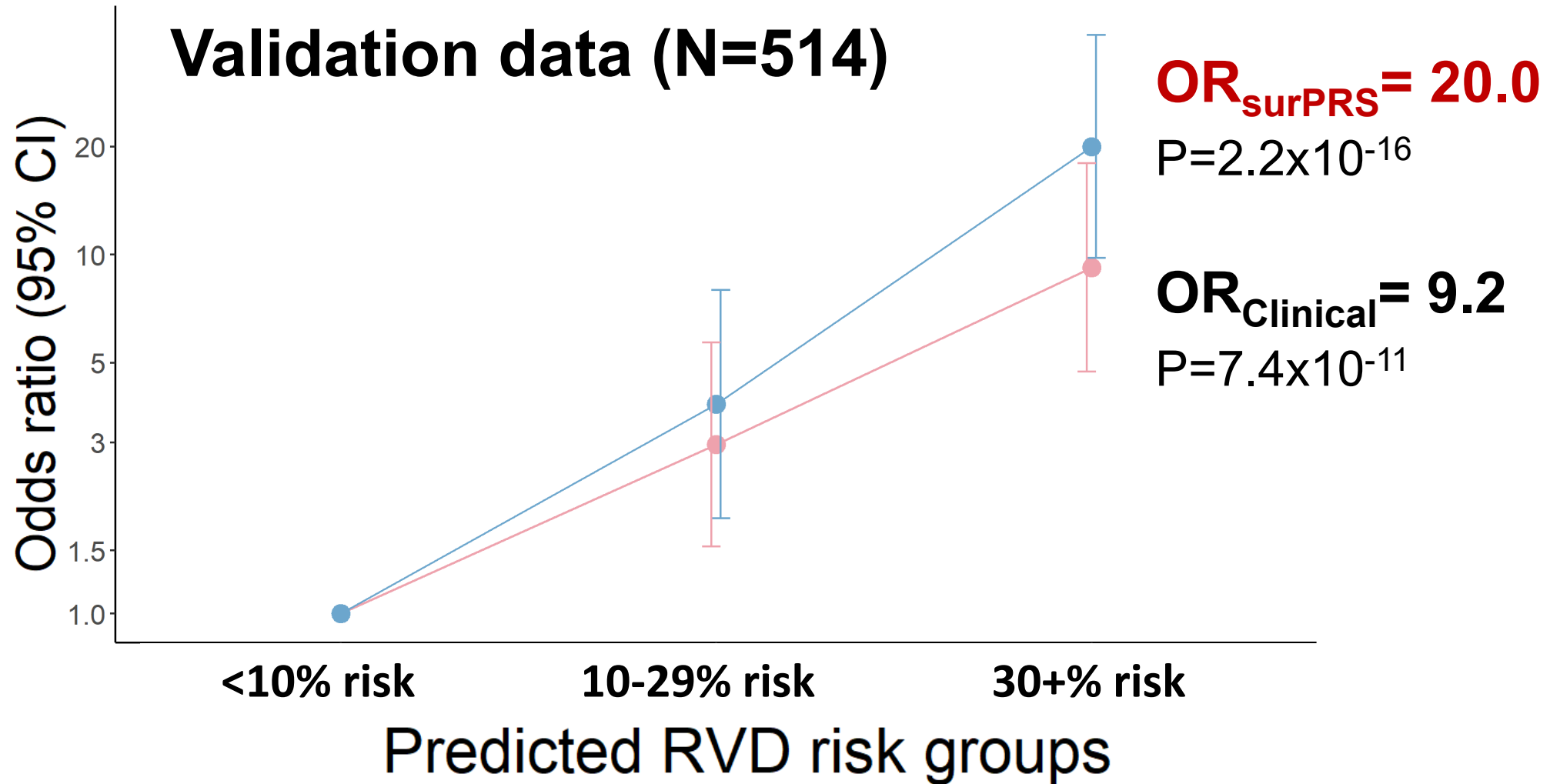
$\beta_k$  = weights (e.g., log odds ratios) estimated in GWAS

$X_k$  = number of risk alleles (0, 1, 2) individual at genetic locus  $k$

Consider this for Tx-specific subgroups of survivors















# Chest-RT-, Bleomycin-, Dactinomycin- specific PRSs

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# Polygenic Risk and Chemotherapy-Related Subsequent Malignancies in Childhood Cancer Survivors: A Childhood Cancer Survivor Study and St Jude Lifetime Cohort Study Report

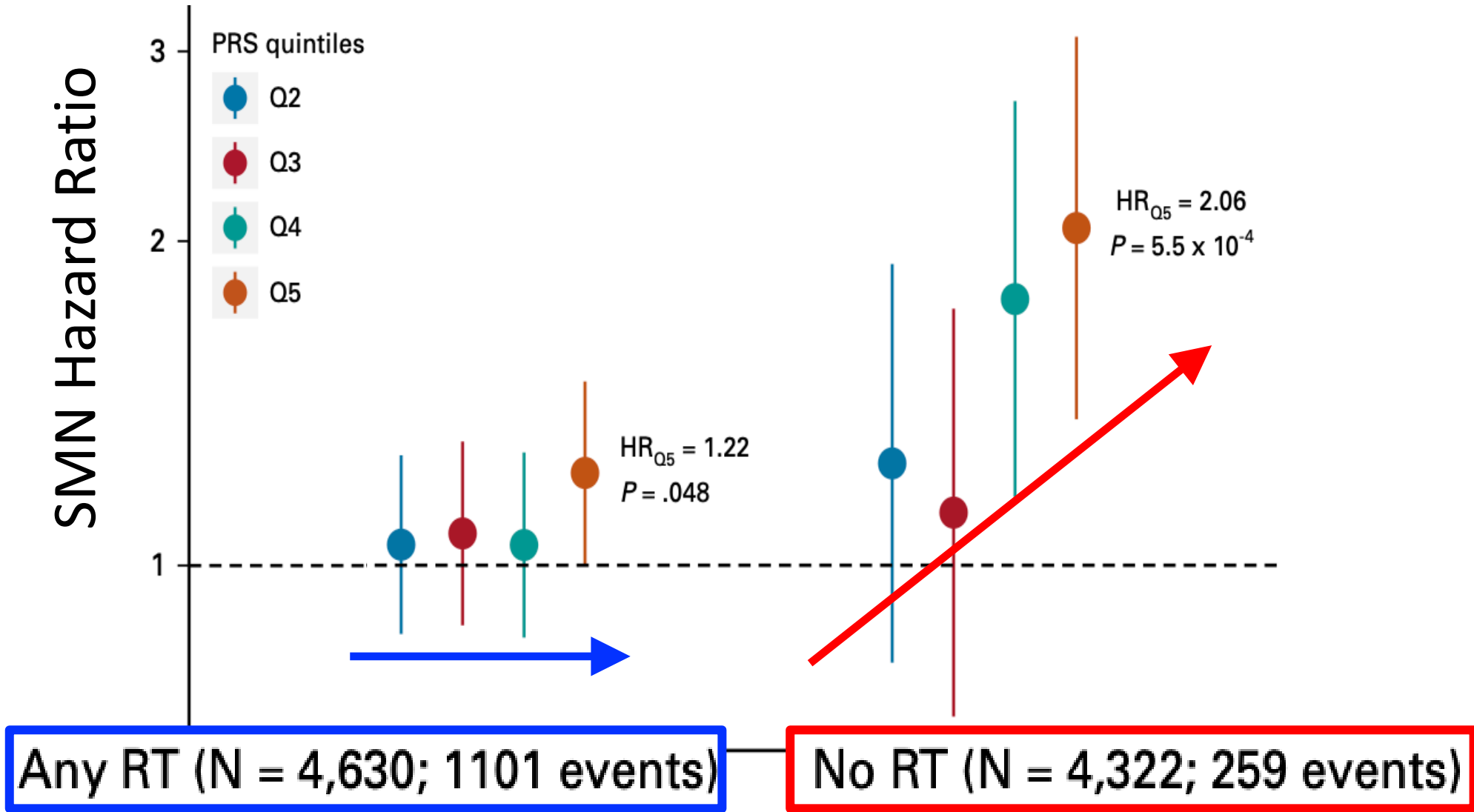
[Cindy Im, PhD<sup>1</sup>](#) ; [Noha Sharafeldin, PhD<sup>2,3</sup>](#) ; [Yan Yuan, PhD<sup>4</sup>](#) ; [Zhaoming Wang, PhD<sup>5,6</sup>](#) ; [Yadav Sapkota, PhD<sup>5</sup>](#) ; [Zhanni Lu, DrPH<sup>1</sup>](#) ; [Logan G. Spector, PhD<sup>1</sup>](#) ; [Rebecca M. Howell, PhD<sup>7</sup>](#); [Michael A. Arnold, MD<sup>8</sup>](#); [Melissa M. Hudson, MD<sup>5,9</sup>](#) ; [Kirsten K. Ness, PhD<sup>5</sup>](#) ; [Leslie L. Robison, PhD<sup>5</sup>](#) ; [Smita Bhatia, MD<sup>3</sup>](#) ; [Gregory T. Armstrong, MD<sup>5,9</sup>](#); [Joseph P. Neglia, MD<sup>1</sup>](#) ; [Yutaka Yasui, PhD<sup>4,5</sup>](#) ; and [Lucie M. Turcotte, MD<sup>1</sup>](#) 



**Lucie Turcotte, MD, MPH, MS**  
University of Minnesota

**Journal of Clinical Oncology**<sup>®</sup>  
An American Society of Clinical Oncology Journal

# General population 179-variant pleiotropic cancer PRS: Associated with SMNs in survivors?



# Similar findings in an ISLCCC talk

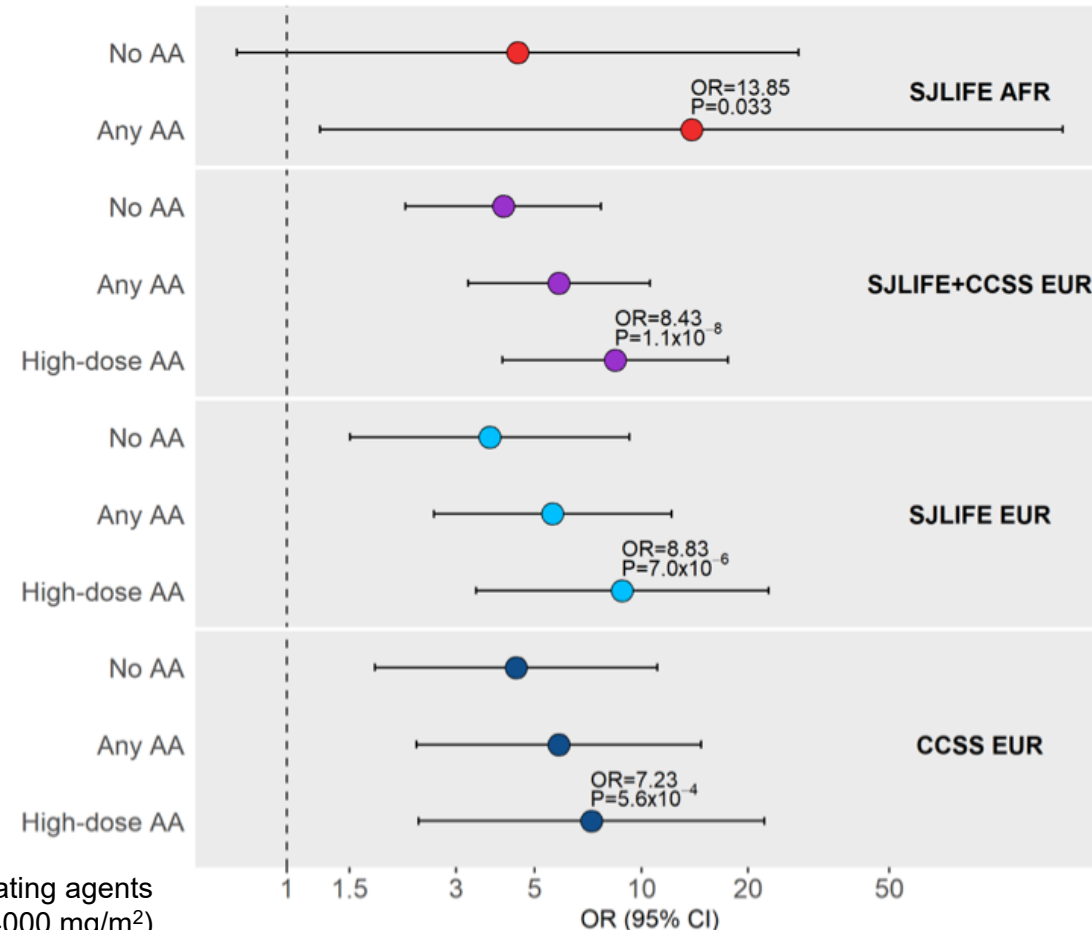


**Yadav Sapkota, PhD**  
St. Jude Children's  
Research Hospital

“Genetic study of **diabetes mellitus risk** in diverse populations of survivors of childhood cancer: a report from the St. Jude Lifetime Cohort (SJLIFE) and the Childhood Cancer Survivor Study (CCSS)”

Cindy Im,<sup>1</sup> Achal Neupane,<sup>2</sup> Jessica L. Baedke,<sup>2</sup> Angela Delaney,<sup>2</sup> Stephanie B. Dixon,<sup>2</sup> Eric J. Chow,<sup>3</sup> Sogol Mostoufi-Moab,<sup>4</sup> Melissa A. Richard,<sup>5</sup> M. Monica Gramatges,<sup>5</sup> Philip J. Lupo,<sup>5</sup> Noha Sharafeldin,<sup>6</sup> Smita Bhatia,<sup>6</sup> Gregory T. Armstrong,<sup>2</sup> Melissa M. Hudson,<sup>2</sup> Kirsten K. Ness,<sup>2</sup> Leslie L. Robison,<sup>2</sup> Yutaka Yasui,<sup>2</sup> Carmen L. Wilson,<sup>2\*</sup> Yadav Sapkota<sup>2\*</sup>

AA=alkylating agents  
(high-dose:  $\geq 4000$  mg/m<sup>2</sup>)



# Approved Concept Proposals

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# Area-level socioeconomic variables

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Geocoded residential &  
local social- and  
physical-environmental  
data



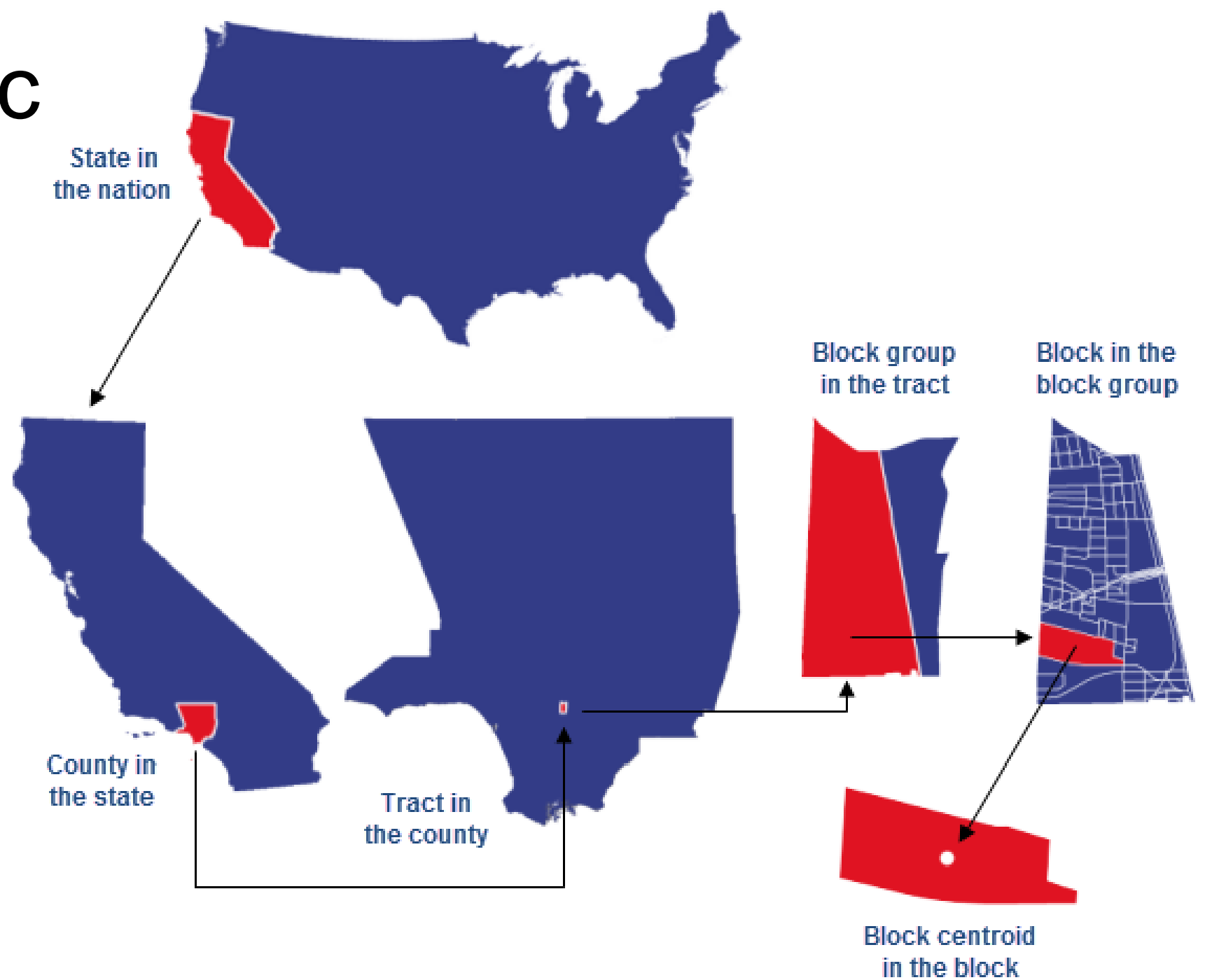
**Carrie Howell, PhD**  
University of Alabama  
at Birmingham



**Lena Winestone, MD**  
University of California,  
San Francisco

- **How do area-level Social Determinants of Health influence survivors' health and survivorship care?**

# Geographic Units



## Rurality (2000, 2010)

- Classified using the USDA Rural-Urban Commuting Codes (RUCA) based on census tract of residence

## Yost SES Index (2000, 2010-2019)

- Uses seven census tract indicator variables
  - Education, employment, income
- Use the weighted linear combination of variables (principle component analysis) to create a value for each census tract
  - Categorized into quintiles from low to high SES



## Social Vulnerability Index (CDC SVI) [2000, 2010, 2014, 2016, 2018]

- Score of 0-100 (national or state rank)
- Higher = more social vulnerabilities in census tract of residence
- Low (0.0-<0.33), moderate (0.33-<0.66), and high vulnerability ( $\geq 0.66$ )
- Overall and 4 subscales: SES, Household composition, Minority, Housing

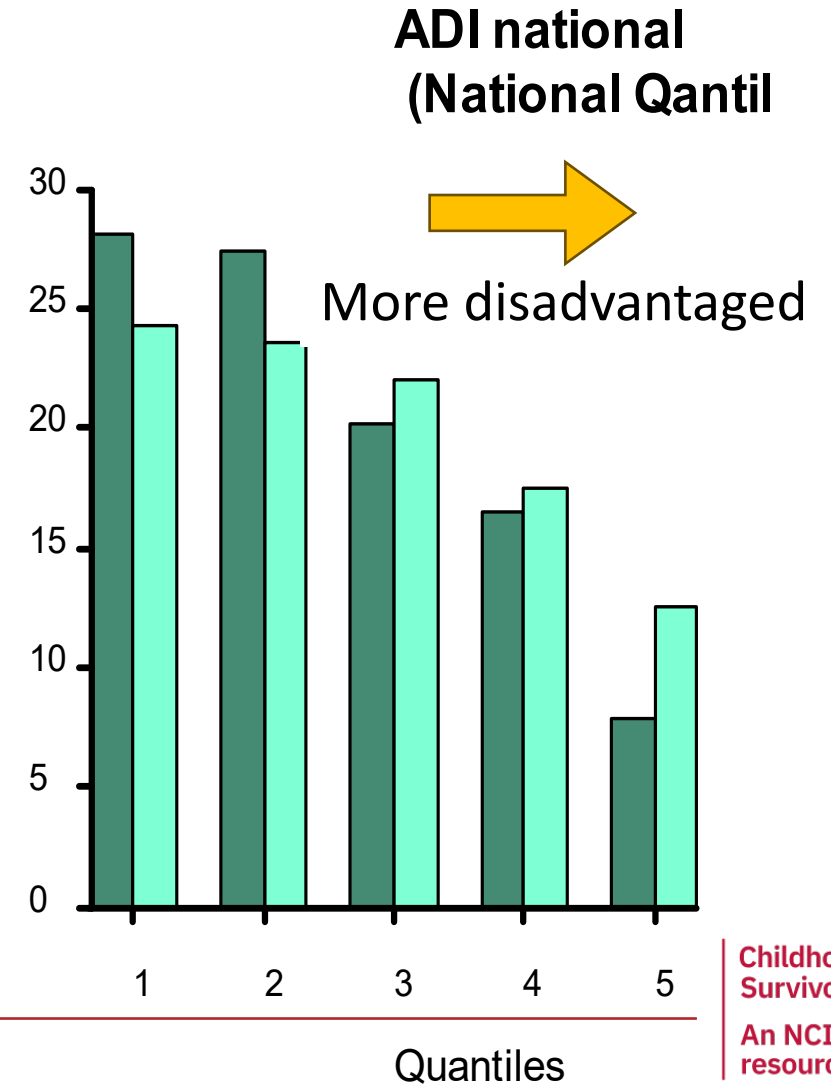
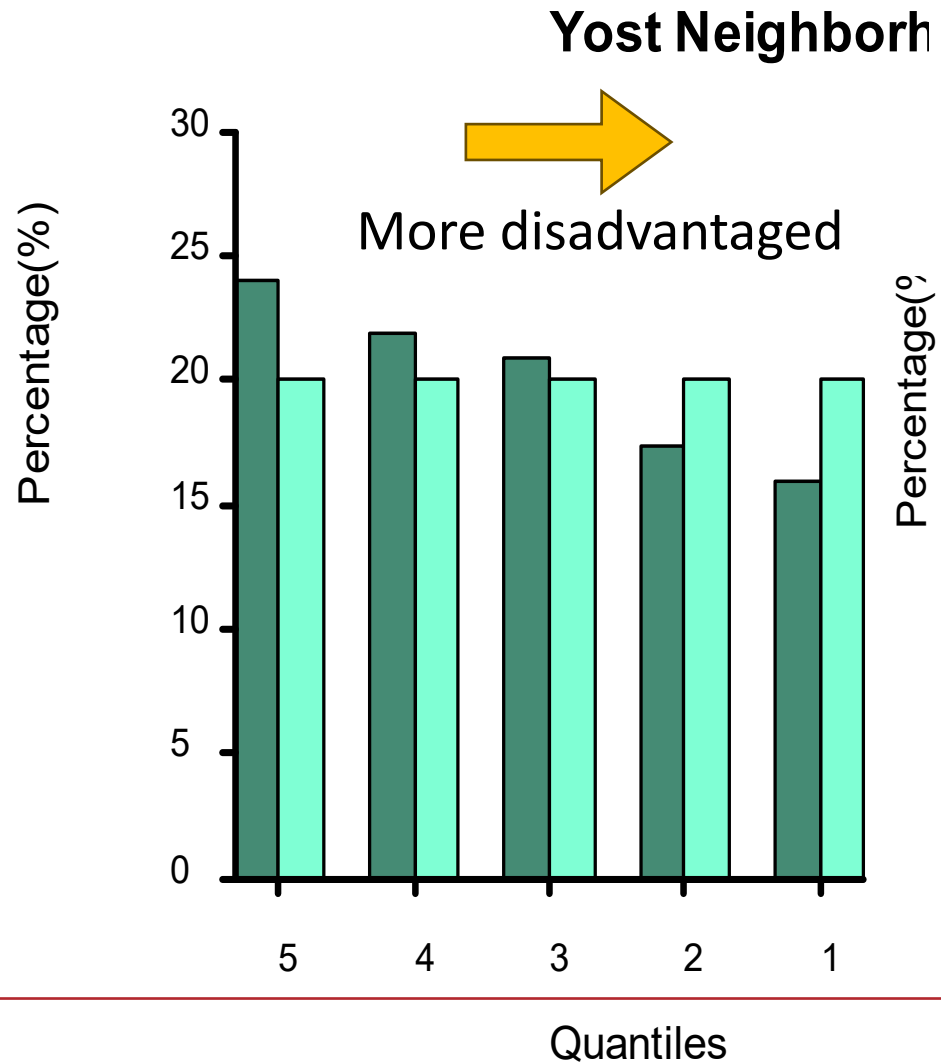
## Area Deprivation Index (ADI) [2015, 2019]

- Census block group
- Not available on those in earlier follow-ups

# Survivors vs. Siblings at FU6/FU5

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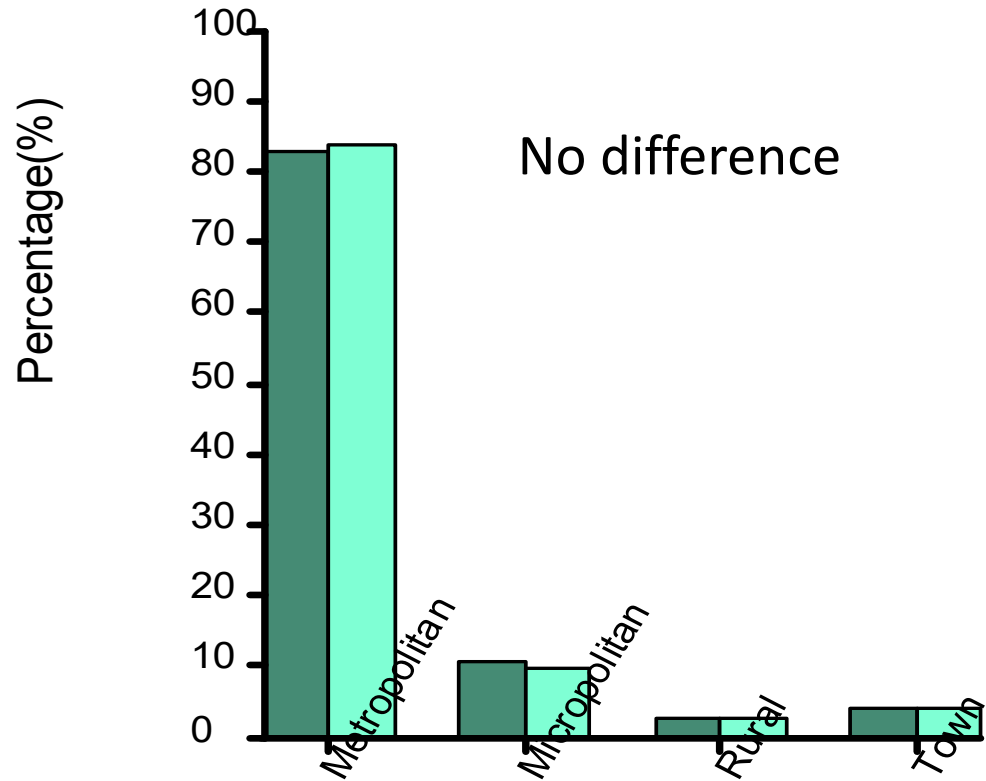
■ Siblings  
■ Survivors



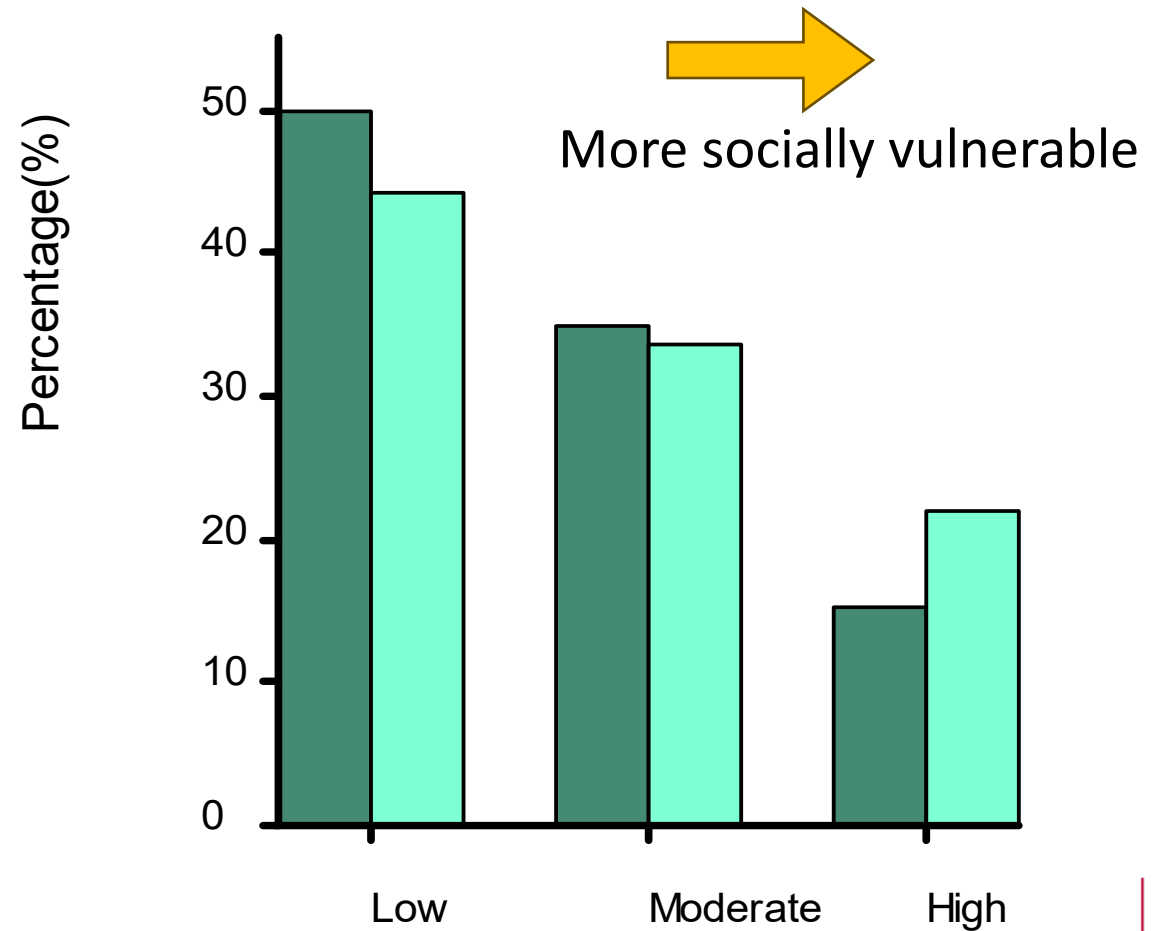
# Survivors vs. Siblings at FU6/FU5

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## Rurality



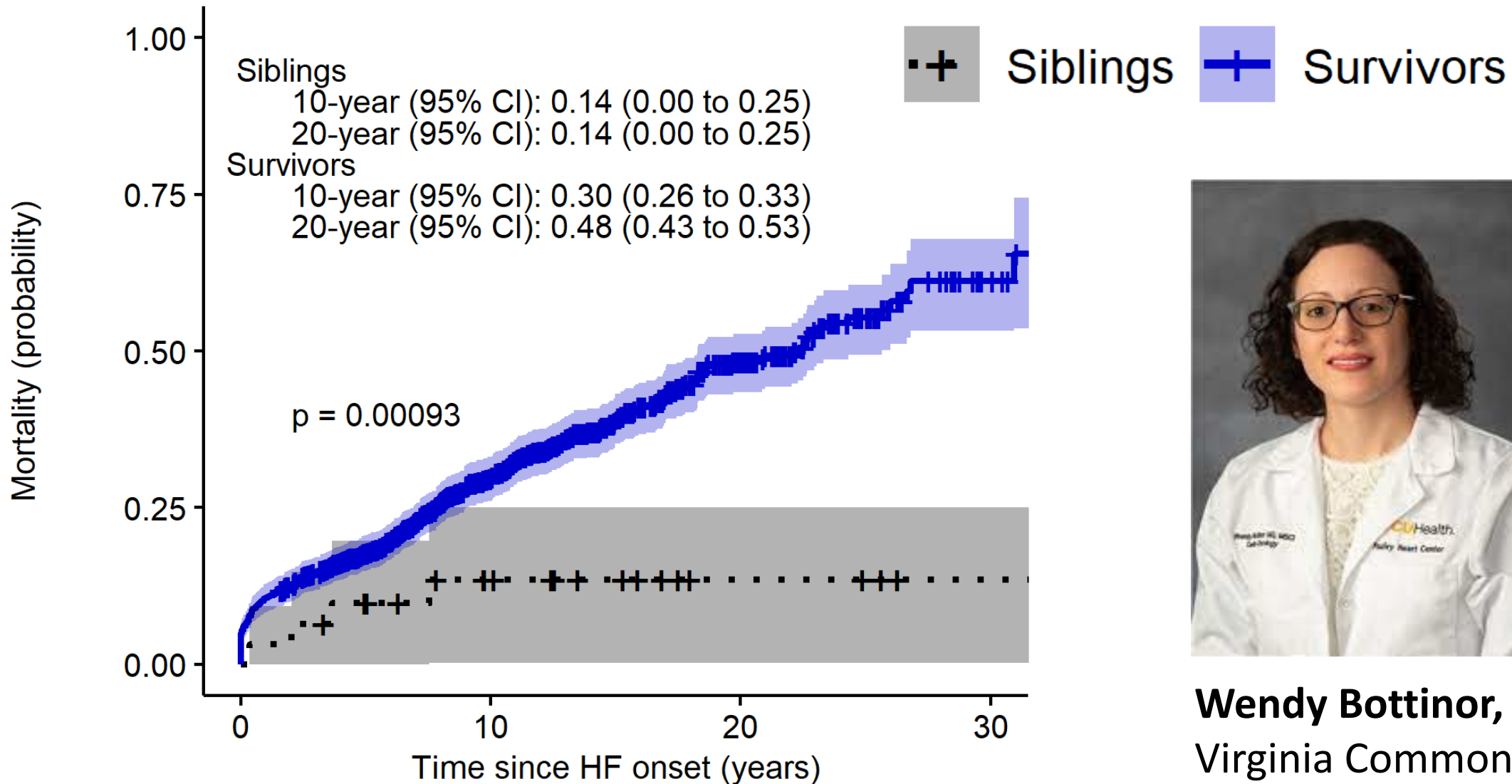
## SVI Overall



- **Do survivors have higher mortality rates than the general population after developing a specific chronic health condition?**

# Mortality after a serious cardiovascular event

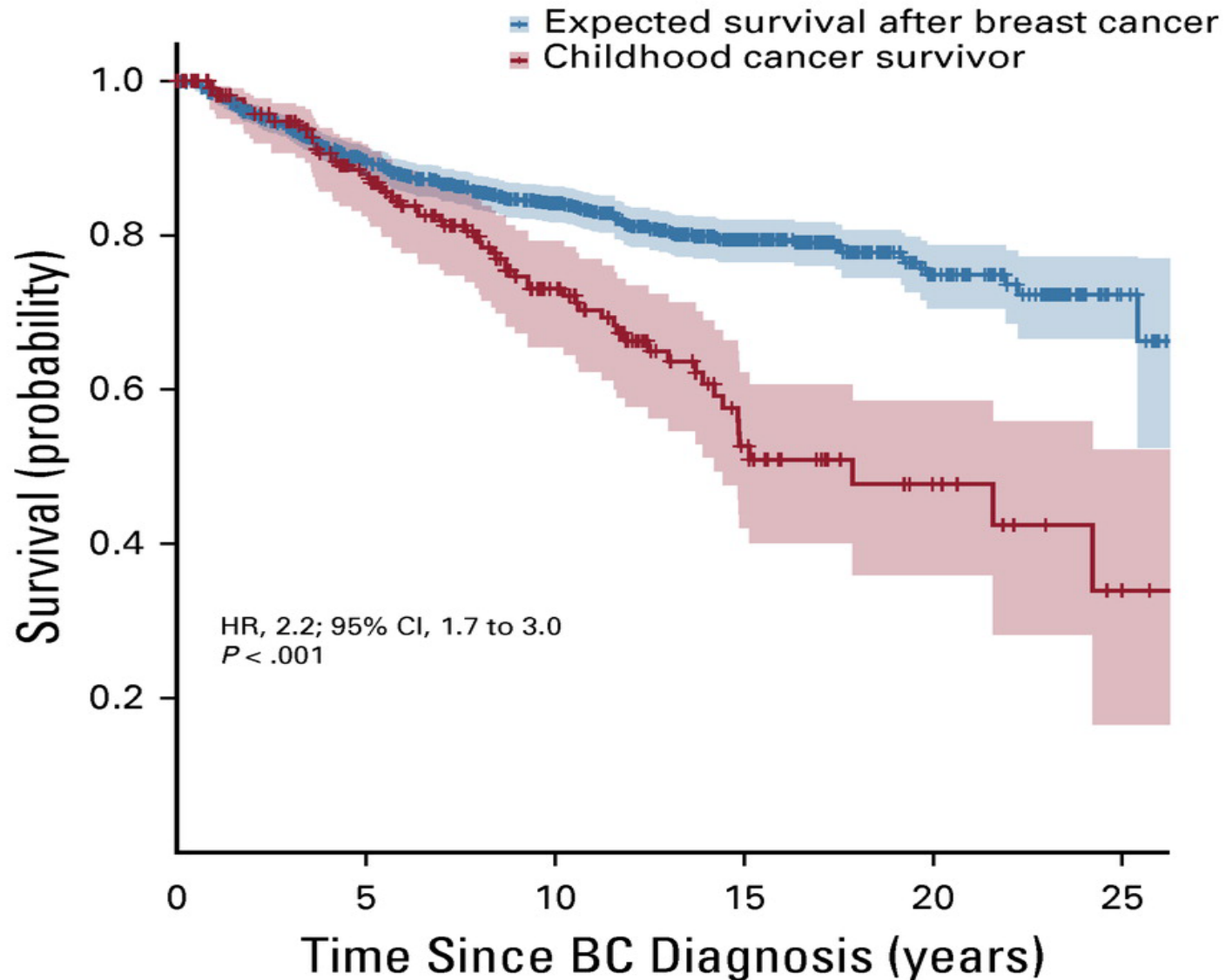
CCSS



**Wendy Bottinor, MD, MSCI**  
Virginia Commonwealth Univ.

# Mortality after a breast subsequent neoplasm

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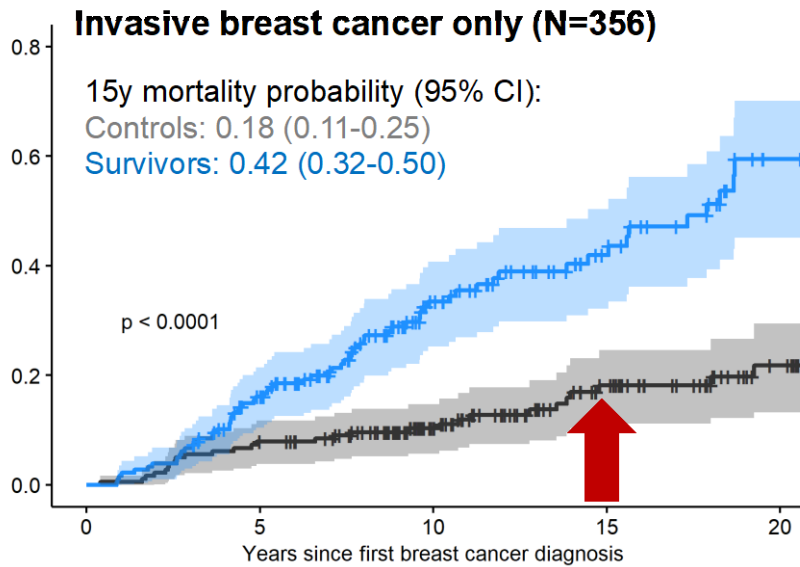
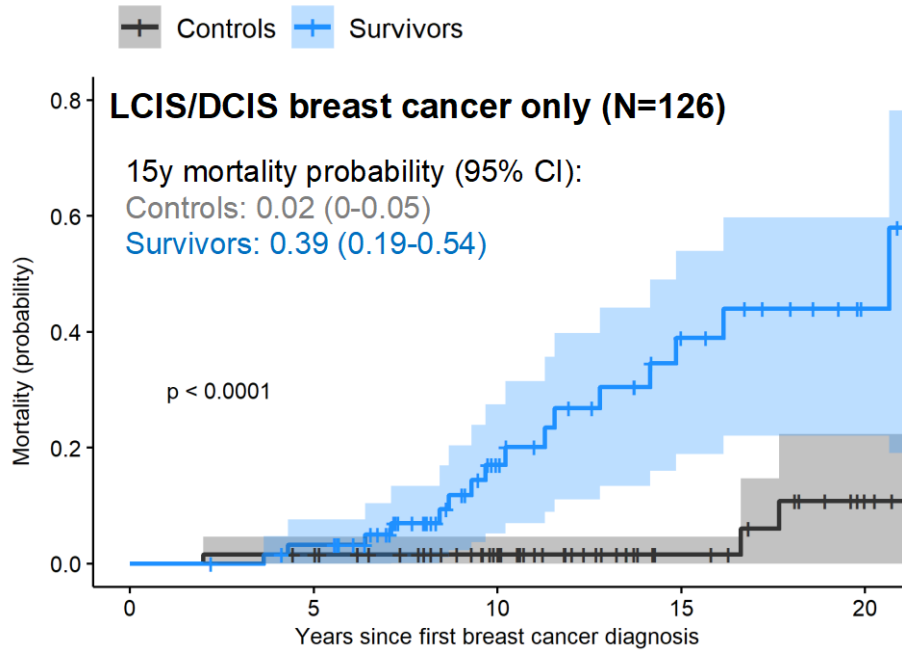


**Chaya Moskowitz, PhD**  
Memorial Sloan Kettering  
Cancer Center

**JCO 2019**

# Mortality after a breast subsequent neoplasm

ccss



**Details of BCa tx  
as well as  
mortality in  
an ISLCCC talk  
by Cindy Im**



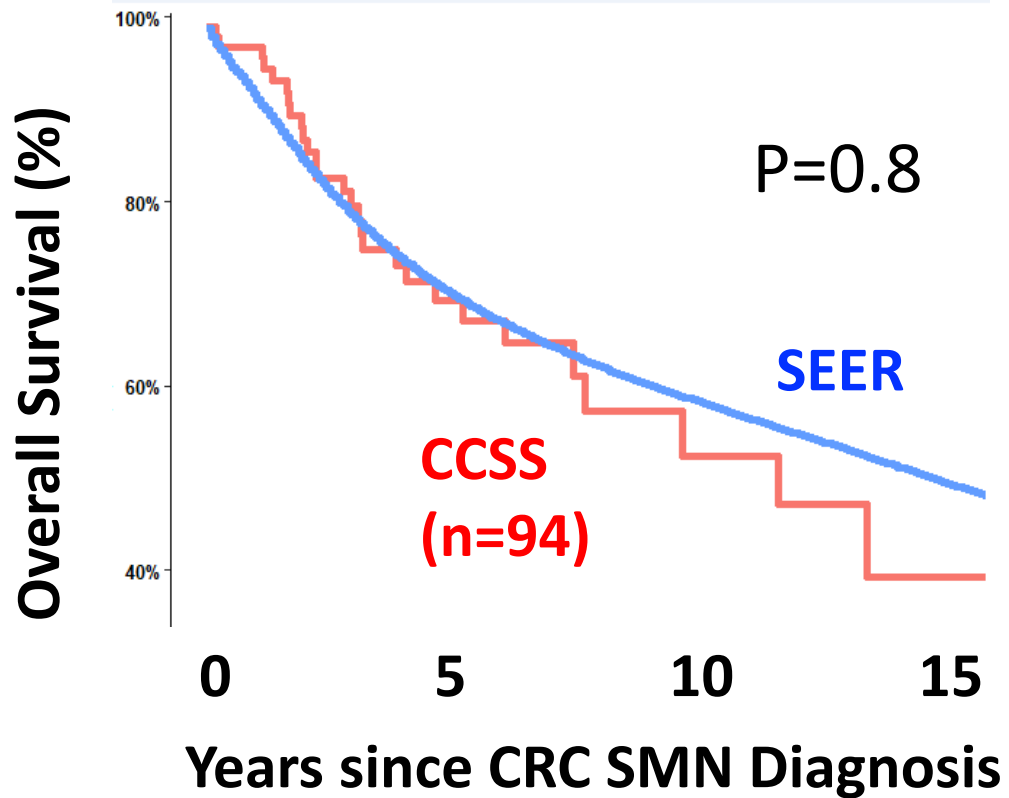
**Cindy Im, PhD**  
University of  
Minnesota



**Lucie Turcotte, MD, MPH, MS**  
University of Minnesota

# Mortality after a colorectal subsequent neoplasm

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**Tara Henderson, MD, MPH**  
University of Chicago

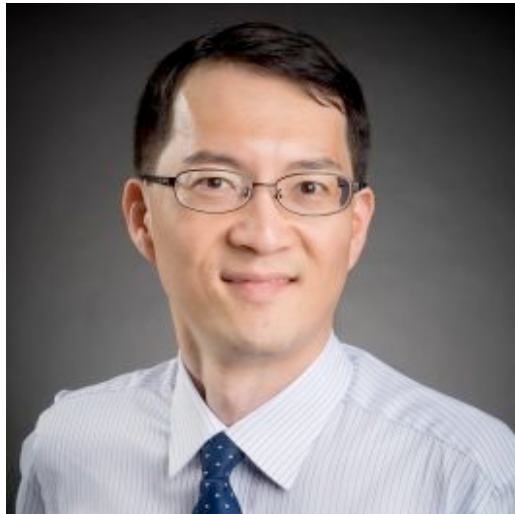


**Chaya Moskowitz, PhD**  
Memorial Sloan Kettering  
Cancer Center

- Median 30 yrs after Childhood Ca. dx
- Abdominal RT (n=45, 52%)
- Pelvic RT (n=41, 47%)



- How can we represent the **longitudinal CHC burden** for evaluating its effect on other survivorship outcomes?



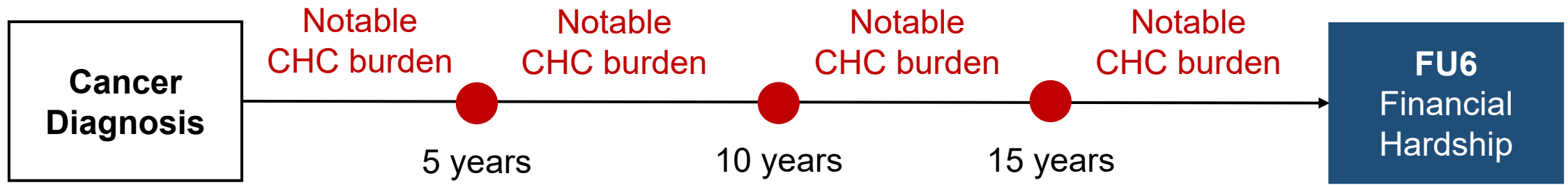
**I-Chan Huang, PhD**  
St. Jude Children's  
Research Hospital

# Severity of Individual Global CHC Burden

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| Global Burden    | CTCAE Grade 4 | CTCAE Grade 3 | CTCAE Grade 2 | CTCAE Grade 1 |
|------------------|---------------|---------------|---------------|---------------|
| Very high burden | ≥2            | Any count     | Any count     | Any count     |
|                  | 1             | ≥2            | Any count     | Any count     |
| High burden      | 1             | 0 or 1        | Any count     | Any count     |
|                  | 0             | ≥2            | Any count     | Any count     |
| Medium burden    | 0             | 1             | Any count     | Any count     |
|                  | 0             | 0             | ≥1            | Any count     |
| Low burden       | 0             | 0             | 0             | ≥1            |
| No burden        | 0             | 0             | 0             | 0             |

*Geenen et al, JAMA 2007*



| Severity of global CHC burden | n (%)       |
|-------------------------------|-------------|
| No/low                        | 1154 (33.8) |
| Medium                        | 1689 (45.5) |
| High                          | 587 (15.5)  |
| Very high                     | 208 (5.2)   |

**“Notable” Global CHC burden**

| Years from Dx to developing notable global CHC burden | n (%)       |
|-------------------------------------------------------|-------------|
| Not present                                           | 1154 (33.8) |
| < 5 years                                             | 1297 (34.6) |
| 5-9.9 years                                           | 252 (7.2)   |
| 10-14.9 years                                         | 250 (6.7)   |
| ≥ 15 years                                            | 685 (17.6)  |

**Early vs. late CHC burden**

# Progression of Global CHC Burden

Change of global CHC burden between 10 years post-diagnosis and before the completion of the hardship survey

| <b>Progression of global CHC burden</b>      | <b>n (%)</b> |
|----------------------------------------------|--------------|
| <b>Persistent no or low burden</b>           | 1154 (31.7)  |
| <b>Persistent medium burden</b>              | 1023 (28.1)  |
| <b>Moderate burden change<sup>†</sup></b>    | 666 (18.3)   |
| <b>Significant burden change<sup>‡</sup></b> | 546 (15.0)   |
| <b>Persistent high or very high burden</b>   | 249 (6.9)    |

<sup>†</sup> From no/low burden to medium burden; <sup>‡</sup> E.g., from no/low burden to high or very high burden

- How can we best **measure prediction performance?**



**Yan Yuan, PhD**  
University of Alberta

\*) Predicting acute ovarian failure in female survivors of childhood cancer: a cohort study in the Childhood Cancer Survivor Study (CCSS) and the St Jude Lifetime Cohort (SJLIFE)

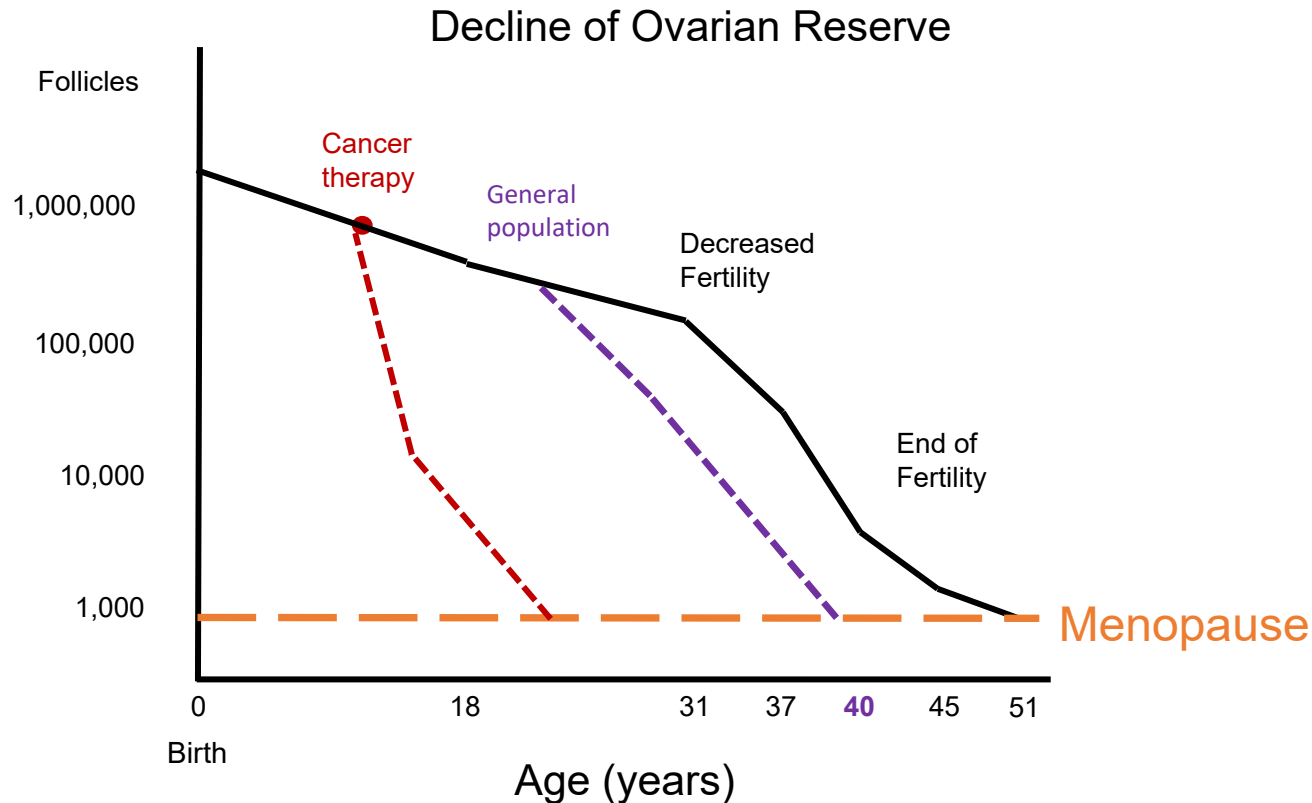
*Rebecca A Clark, Sogol Mostoufi-Moab, Yutaka Yasui, Ngoc Khanh Vu, Charles A Sklar, Tarek Motan, Russell J Brooke, Todd M Gibson, Kevin C Oeffinger, Rebecca M Howell, Susan A Smith, Zhe Lu, Leslie L Robison, Wassim Chemaitilly, Melissa M Hudson, Gregory T Armstrong, Paul C Nathan\*, Yan Yuan\**

THE LANCET  
**Oncology**

Volume 21, Issue 3, March 2020, Pages 436-445

# Prediction of Primary Ovarian Insufficiency

CCSS



## POI

compromised ovarian function before age 40

## Prevalence

General population 1%

*(Torrealday, et al. EMCNA, 2015)*

Childhood Cancer Survivors 15%

*(Levine, et al. Cancer, 2018, Chemaitilly, et al. JCEM, 2006)*

Modified from <http://oncofertility.northwestern.edu/resources/assessing-ovarian-reserve-after-cancer-treatments>

Childhood Cancer Survivor Study  
An NCI-funded resource

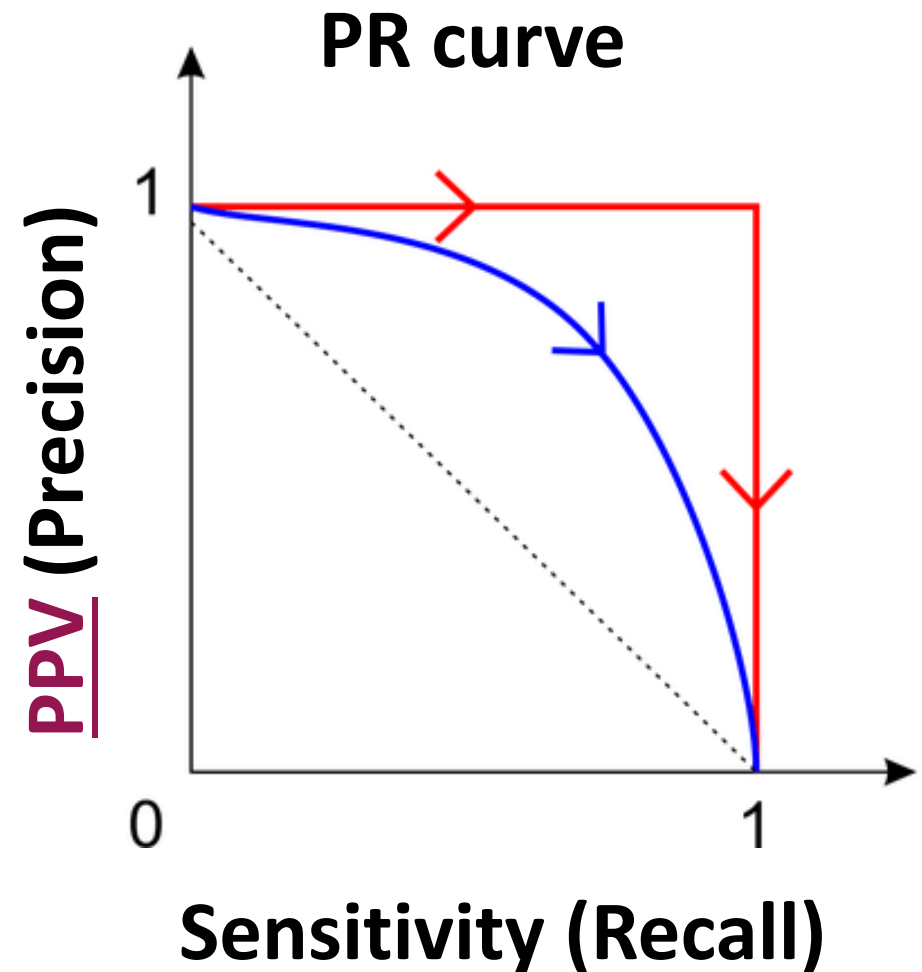
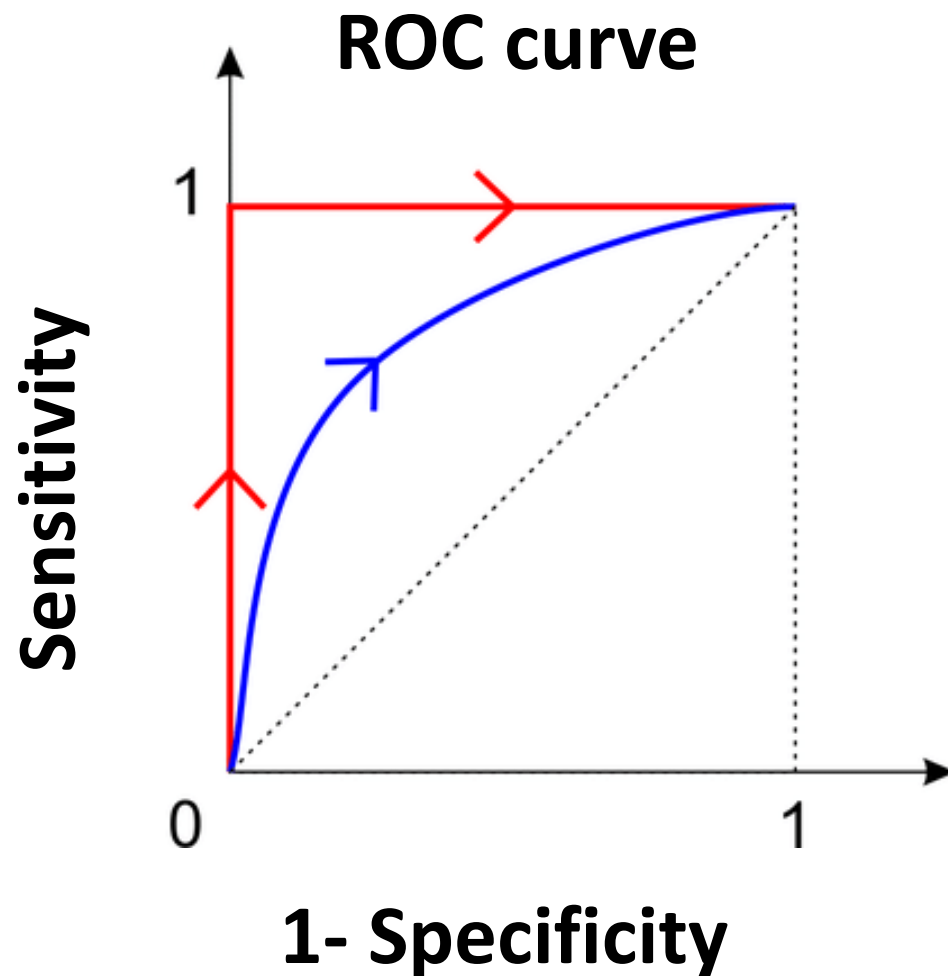
## Survivor-Specific PRS

| Risk prediction metrics                                                       | Without                 | With                  |         |
|-------------------------------------------------------------------------------|-------------------------|-----------------------|---------|
| Any ovarian RT and chemotherapy<br>(n=158; POI prevalence <sup>a</sup> : 58%) |                         |                       | P-value |
| <u>SBrS</u> (95% CI)                                                          | -1.4% (-31.6% to 16.3%) | 20.0% (1.0% to 35.0%) | 0.018   |
| AUPRC (95% CI)                                                                | 0.76 (0.63 to 0.89)     | 0.87 (0.80 to 0.94)   | 0.029   |
| AUROC (95% CI)                                                                | 0.70 (0.57 to 0.82)     | 0.78 (0.70 to 0.87)   | 0.12    |
| <u>Spiegelhalter-z</u> (95% CI)                                               | 2.43 (0.47 to 4.39)     | 1.63 (-0.33 to 3.59)  | 0.98    |
| True positive rate <sup>c</sup>                                               | 38.0%                   | 78.3%                 | --      |
| Positive predictive value <sup>d</sup>                                        | 71.6%                   | 70.2%                 | --      |

## Survivor-Specific PRS

| Risk prediction metrics                                                       | Without                 | With                  |         |
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# Precision Recall vs. Sensitivity Specificity

CCSS

|                                       | <b>Truly Disease</b> | <b>Truly Non-Disease</b> |
|---------------------------------------|----------------------|--------------------------|
| <b>Predicted as<br/>“Disease”</b>     | True Positive        | False Positive           |
| <b>Predicted as<br/>“Non Disease”</b> | False Negative       | True Negative            |

# ROC is based on Sensitivity & Specificity

|                            | Truly Disease        | Truly Non-Disease    |
|----------------------------|----------------------|----------------------|
| Predicted as "Disease"     | <b>True Positive</b> | False Positive       |
| Predicted as "Non Disease" | False Negative       | <b>True Negative</b> |

**Sensitivity (Recall)**      **Specificity**

The diagram illustrates the relationship between the confusion matrix and the metrics Sensitivity (Recall) and Specificity. Two red ovals are drawn around the 'True Positive' and 'True Negative' cells of the matrix. A red line connects the bottom of the 'True Positive' oval to the label 'Sensitivity (Recall)'. Another red line connects the bottom of the 'True Negative' oval to the label 'Specificity'.

# PR is based on PPV & Sensitivity

CCSS

|                            | Truly Disease  | Truly Non-Disease |
|----------------------------|----------------|-------------------|
| Predicted as "Disease"     | True Positive  | False Positive    |
| Predicted as "Non Disease" | False Negative | True Negative     |

Sensitivity (Recall)

Positive Predictive Value  
(Precision)

# PR is based on PPV & Sensitivity

CCSS

|                            | Truly Disease        | Truly Non-Disease    |
|----------------------------|----------------------|----------------------|
| Predicted as "Disease"     | <b>True Positive</b> | False Positive       |
| Predicted as "Non Disease" | False Negative       | <b>True Negative</b> |

**Sensitivity (Recall)**

**Positive Predictive Value  
(Precision)**

- How to address the potential inaccuracy of **self-report vs. clinically-assessed CHCs?**
- How to address **the missing onset age of CHCs?**



**Sadie Mirzaei, PhD**  
St. Jude Children's  
Research Hospital

# Additional Ancillary Studies

# Ancillary Studies

CCSS

**Principal Investigator:** Jennifer Yeh (Harvard University)

**Title:** Can Risk Reducing Medications Improve Breast Cancer Prevention in Childhood and Adolescent Cancer Survivors?  
Comparative Modeling to Inform Care.

**Dates of Funding:** 9/22 – 8/27

**Funding Source:** National Institutes of Health (R01)

**Award:** \$13,228,808



**Jennifer Yeh, PhD**

Boston Children's Hospital  
Harvard Medical School

Childhood Cancer  
Survivor Study  
An NCI-funded  
resource



# Ancillary Studies

CCSS

**Principal Investigator:** Xu Ji (Emory University)

**Title:** Understanding the impact of the Affordable Care Act on Healthcare Coverage, Utilization and Outcomes Among Survivors of Childhood Cancer

**Dates of Funding:** 12/21 - 12/23

**Funding Source:** National Institutes of Health R03CA267456

**Award:** \$171,872

**Study Aims:** Linkage with national Medicaid data to evaluate how the Affordable Care Act Medicaid expansion affects insurance coverage, health service utilization, and mortality for adult survivors of childhood cancer.

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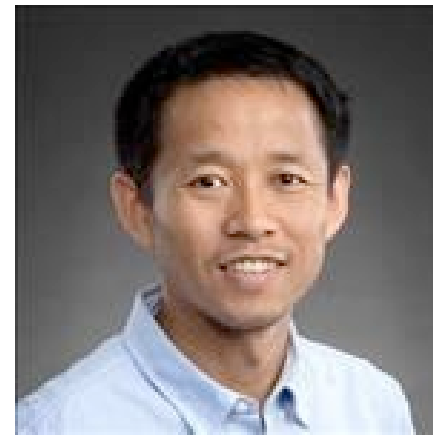


**Xu Ji, PhD**  
Emory University

## Enhance Data Sharing

To maximize access to the CCSS resource we will leverage a cloud-based sharing platform (**SJ Cloud Survivorship Portal**) to develop a data analysis ecosystem with tools for data access, visualization and analysis of genetic, treatment exposure and outcome data.

(<http://survivorship.stjude.cloud/>)






**Xin Zhou, PhD**

St. Jude Children's Res. Hospital

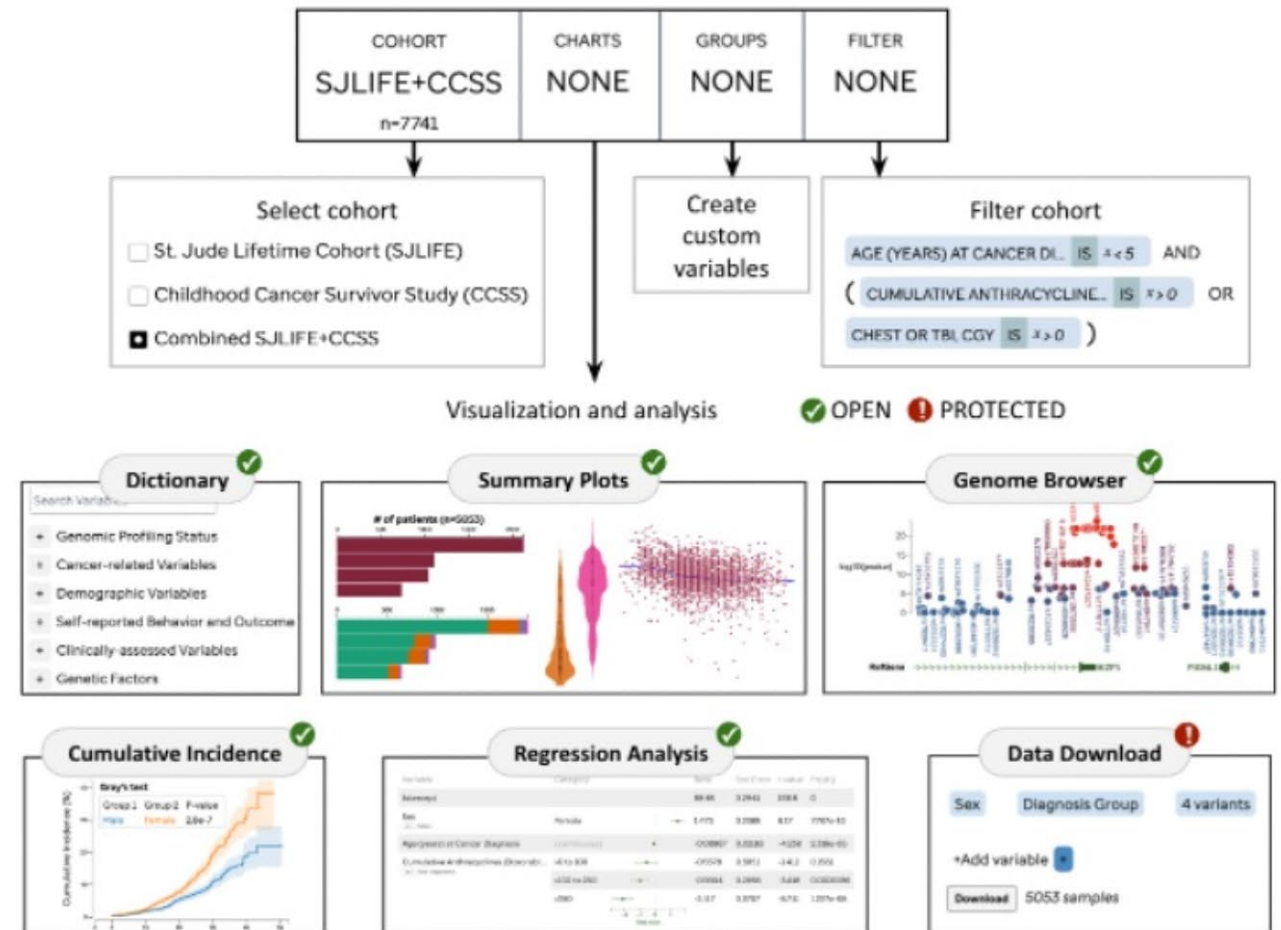
# June 15<sup>th</sup> 5:30pm – 6:00pm Demo (ISLCCC)

CCSS

## Data content

|                                                                                                                                                                                                                     |                                                                                     |
|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------|
| <b>COHORT</b><br>St. Jude Lifetime Study (SJLIFE), n=5,053<br>Childhood Cancer Survivor Study (CCSS), n=2,688                                                                                                       |    |
| <b>PHENOTYPES / EXPOSURES</b><br>Demographics, n=36<br>Cancer diagnosis, n=4<br>Cancer treatment, n=95<br>Clinical assessments, n=350<br>Chronic health conditions, n=400<br>Self-reported and questionnaire, n=776 |    |
| <b>WHOLE-GENOME SEQUENCING</b><br>Genotypes for >400 million variants<br>Polygenic risk scores, >500 traits<br>Genetic ancestries<br>Ancestry principal components<br>Linkage disequilibrium                        |  |

## Visualization and analysis features



Visit the Survivorship Portal on  
St. Jude Cloud

<https://survivorship.stjude.cloud/>

# St. Jude Survivorship Portal

<https://survivorship.stjude.cloud/>

## Xin Zhou, PhD

Assistant member

Department of Computational Biology

## Jinghui Zhang, PhD

Chair/Member

Department of Computational Biology

Astrid Canal

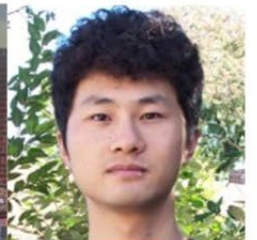


## Zhou Lab

- 5 PhD staffs
- 4 Web developers
- 1 Postdoc
- 1 Student

in collaboration with  
Department of  
Epidemiology & Cancer  
Control

Edgar Sioson Karishma Gangwani Airen Zaldívar Peraza Robin Paul Colleen Reilly Xin Zhou Jian Wang Gavriel Matt Congyu Lu Aleksandar Acic



- Discover/support **junior researchers w/ method interest**
- **Separate tx (era) effects and aging effects** – Application of age-period-cohort models
- **Minority-applicable PRS** – Transferability of PRS
- **Incorporation of other genetic variations (rare variants, haplotypes, CNV, ...)**

- **International comparisons (tx and outcomes)**
- **Address cohort attrition**
- **Recruit/retention of minority survivors and survivors with lower educational attainment**
- **Data linkage (too soon to link to Medicare?)**

# Contact us for any inquiry/interest

CCSS

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- Wendy Leisenring  
[wleisenr@fredhutch.org](mailto:wleisenr@fredhutch.org)

