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An Epidemiologic Analysis of Melanoma Overdiagnosis in the United States, 1975-2017

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Abstract

The primary cause of the increase in melanoma incidence in the United States has been suggested to be overdiagnosis. We used SEER data from 1975 to 2017 to examine epidemiological trends of melanoma incidence and mortality and better characterize overdiagnosis in white Americans. Over the 43-year period, incidence and mortality showed discordant temporal changes across population subgroups; trends most suggestive of overdiagnosis alone were present in females aged 55-74. Other groups showed mixed changes suggestive of overdiagnosis plus changes in underlying disease risk (decreasing risk in younger individuals and increasing risk in older males). Cohort effects were identified for male and female mortality and male incidence but were not as apparent

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for female incidence, suggesting that period effects have had a greater influence on changes in incidence over time in females. Encouraging trends included long-term declines in mortality in younger individuals and recent stabilization of invasive incidence in individuals aged 15-44 and males aged 45-54. Melanoma in-situ incidence, however, has continued to increase throughout the population. Overdiagnosis appears to be relatively greater in American females and for melanoma in-situ.

Introduction

Overdiagnosis refers to the detection of asymptomatic disease that would not have otherwise become clinically apparent during a patient's life. It can occur due to more sensitive or intensive screening or from changing the disease classification threshold or nomenclature (Brodersen et al., 2018). Overdiagnosis is problematic because the patient derives no benefit and can be potentially harmed from both the diagnosis and resultant treatment. Growing evidence suggests that overdiagnosis may be particularly common for some cancers in the United States (US) (Welch and Black, 2010). Welch et al examined incidence and mortality trends of common cancers and identified "epidemiologic signatures" that may indicate overdiagnosis (Welch et al., 2019). In particular, the discordant combination of rising incidence and stable mortality, which was identified in thyroid cancer, kidney cancer, and cutaneous melanoma, was interpreted to primarily indicate overdiagnosis. This has also led to a re-evaluation of the potential causes of the increase in melanoma incidence as well as the efficacy of prevention efforts on mortality (Welch et al., 2021).

There are few published reports examining epidemiologic trends of melanoma in the US through the lens of overdiagnosis considering demographic factors, period effects, and cohort effects. Such an analysis is particularly relevant to melanoma as ultraviolet radiation (UVR) exposure, dermatologic care, and public awareness have changed over time and are heterogenous throughout the population. In addition, effective therapies for metastatic disease have only been available since 2011. We present an analysis of incidence and mortality trends in melanoma stratified by age and sex and consider period and cohort effects to help elucidate relative differences in overdiagnosis among subgroups of the population. These data might allow appropriate changes in prevention strategies that could improve the benefit-to-harm trade-off.

Results

Patient Characteristics

The nine SEER registries reported 268,109 first cases of melanoma in white individuals (55.2% male) from 1975-2017. There were 175,442 first cases of invasive melanoma (55.3% male) and 105,385 first cases of in-situ melanoma (56.3% male). During this same period, there were 291,214 deaths (63.0% male) among white individuals across the entire US attributed to melanoma.

Overall Period Trends

Melanoma incidence increased 41.6 per 100,000 (+459.0%) from 1975-2017; invasive and in-situ incidence increased 20.1 per 100,000 (+235.8%) and 25.4 per 100,000 (+4,675.0%), respectively (Figure 1 and Supplementary Table S1). Mortality increased 0.8 per 100,000 (+34.2%) from 1975-2010 and decreased 0.6 per 100,000 (-20.0%) from 2010-2017.

Discordant Age-Sex Trends in Incidence and Mortality

Not all age-sex groups (Supplementary Figure S1 and Supplementary Table S1) demonstrated rising incidence and stable mortality from 1975-2017 evident in the population-level overall period analysis. Three distinct signatures were identified: (1) rising incidence and stable mortality (for example, females aged 55-74), (2) a disproportionate rise in incidence compared to an increase in mortality (for example, males aged 75+), and (3) a rise in incidence and a decrease in mortality (for example, females aged 15-44) (Figure 2).

Trends in incidence by Breslow thickness from 1988-2017 across age-sex groups showed that most of the increase in incidence occurred in diagnoses of in-situ and thinly invasive (<1mm) disease (Supplementary Figure S2). The only age-sex group with a decline in >1-2mm and >2mm melanoma incidence occurred in males aged 15-44. In all other age-sex groups, it either remained stable or increased. The greatest increase in thick melanoma incidence occurred in males aged 55+ and females aged 65+.

Although invasive incidence continuously increased from 1975-2017 in the overall population, it has plateaued in some age-sex groups: males aged 15-44 (beginning in 1985), males aged 45-54 (beginning in 1995), males aged 55-64 (beginning in 2005), and females aged 15-54 (beginning in 2005). The melanoma in-situ incidence rate, however, has not stabilized in any age-sex group.

Age- and Sex-Related Effects on Mortality, Incidence, and the Incidence-to-Mortality Ratio

Mortality rates increase exponentially with age (Figure 3). These rates are similar in magnitude in males and females until age 25, after which rates are higher in males. Incidence rates also increase with age; however, incidence increases exponentially in males and linearly in females. Unlike mortality, incidence is higher in females than males until age 50. After 50 years, incidence sharply increases in males and is double that of females by age 70. Thus, the ratio of incidence-to-mortality in females is two to three times as high as in males from ages 20 to 40; the difference in ratios becomes smaller with increasing age until it is approximately equal in males and females 80+ years. Age effects were similar over stratified time periods and for melanoma in-situ and invasive melanoma separately, respectively (data not shown).

The incidence-to-mortality ratio increased from 3.9 to 14.0 (+261.4%) from 1975-2010. From 1975-1995, this ratio increased at a similar rate in females [4.7 to 11.0 (+132.5%)] and males [3.3 to 7.4 (+126.2%)] (Supplementary Figure S1). From 1995-2010, the incidence-to-mortality ratio increased more in females [11.0 to 19.1 (+73.9%)] than in males [7.4 to 11.5 (+53.8%)]. This disproportionate temporal increase in the incidence-to-mortality ratio

was driven by a comparatively greater increase in melanoma incidence in females vs. males aged 15-54, despite similar declines in the mortality rate.

Birth Cohort Effects on Incidence and Mortality

Non-parallel changes in age-specific incidence and mortality rates plotted by sex across years of birth suggested that age and period effects alone do not fully account for the trends in these rates and that the variation includes cohort effects (Supplementary Figure S3). The birth cohort residuals and estimated rate ratios for the effect of birth cohort on melanoma incidence and mortality are shown in Figure 4 and Supplementary Table S1. Strong cohort effects on mortality rates among males and females were observed, but the effects were relatively greater in males. After removing the effects of age and period, cohorts born during 1890-1920 and 1960-2000 had lower mortality than those born from 1920-1960, with the highest risk being those born at 1950. Cohort effects were also evident for male incidence. Female incidence showed less pronounced evidence of cohort effects until generations beginning with 1990, at which the risk of diagnosis had declined (independent of age/period effects) compared to those born in 1950.

Discussion

We present an analysis of trends in melanoma incidence and mortality rates in the US from 1975-2017. Overall, there were complex patterns in the trends of these rates. We identified evidence to suggest overdiagnosis, which appeared relatively greater in middle-aged and younger females. We also identified evidence of a true epidemic of disease, which was most apparent in older males. Positive findings include the success in reducing deaths in contemporary cohorts and stabilization of invasive incidence in younger age groups. Of concern, the increase in melanoma in-situ incidence was particularly high and it has not yet stabilized or decreased in any age-sex group.

From 1975 to 2011, females aged 55-74 most clearly demonstrated rising incidence and stable mortality. Overdiagnosis alone could account for these discordant trends, as a true increase in cancer occurrence should be accompanied by an increase in mortality. For mortality to remain stable, a synchronous annual counterbalancing of improved treatment and/or detection would be required to prevent additional deaths. As there was no effective systemic therapy for melanoma prior to 2011 and fewer than 20% of US adults have ever received a screening total body skin examination in their lifetime (Lakhani et al., 2014), a true rise in cancer occurrence appears unlikely. Although the rise in incidence of regional and distant metastatic cases in these individuals could be interpreted as a true increase in cancer occurrence, “up-staging” is a more likely cause due to temporal changes in staging (i.e., use of sentinel lymph node biopsy and whole-body imaging with computed tomography).

Prior to 2011, males aged 75+ had both rising incidence and mortality, suggesting an increase in true cancer occurrence. In line with this observation, the incidence of thicker tumors 1mm also substantially increased in older males. However, the relative increase in incidence compared to mortality was disproportionate, suggesting additional overdiagnosis. Although an incongruent rise in incidence vs. mortality over time might be due to an

increase in true cancer occurrence plus effective secondary prevention mitigating the rise in the observed mortality or causing lead time bias, these factors appear unlikely. First, the penetrance of screening total body skin examinations in the population remains low. Second, the efficacy of physician-based melanoma screening examinations in reducing melanoma-related deaths remains unproven. Although low-to-moderate quality data (Aitken et al., 2010, Bibbins-Domingo et al., 2016, Schneider et al., 2008) suggests that screening could reduce melanoma mortality, this has not yet been proven through a randomized trial, and at present the United States Preventive Task Force considers there to be insufficient evidence to support physician-based screening in the general population.

Females aged 15-54 years had rising incidence but declining mortality. Such a relationship is most commonly found after introduction of effective screening, but young Americans are the least likely to have ever received a total body skin examination (Lakhani et al., 2014). In addition, the magnitude of the decline in mortality (~50%) parallels or surpasses mortality declines found in cancers with widely implemented and effective screening (i.e., breast cancer in women >40 years of age, colon cancer in individuals >50 years of age) (Welch et al., 2019). If effective secondary prevention was the primary factor leading to a decrease in mortality, one would additionally expect a decrease in the incidence of thicker melanomas due to earlier diagnoses. Among females aged 15-54 years, however, the incidence of thicker melanomas increased. Young females may be at particular risk of having a Spitz nevus/tumor be misdiagnosed as melanoma, which could contribute to overdiagnosis of thicker tumors. These lesions are most prevalent in younger females, present as dermal nodules and are associated with false-positive melanoma diagnoses (Dika et al., 2017, Orchard et al., 1997). The absence of improving medical therapy suggests that a decrease in true occurrence risk plus overdiagnosis may be the most likely explanation for these discordant trends. A decline in true occurrence risk could be due to effective primary prevention and possibly the successful removal of potential melanoma precursors (that is, congenital and dysplastic nevi).

The non-concordant temporal changes in incidence and mortality in older and younger individuals suggested that the variance included cohort effects (that is, factors that uniquely affect a birth generation through age-specific exposure or susceptibility). After removing the effects of age and period, male and female generations born in the US from 1920-1960 were found to be at a relatively increased risk of melanoma mortality, consistent with previous analyses (Roush et al., 1992, Scotto et al., 1991). Autier et al (Autier et al., 2015) identified that cohort effects explained changes in melanoma mortality over time better than period effects and postulated that excessive UVR exposure of children and adolescents from 1900-1960 was probably responsible for the epidemic of fatal melanoma (Albert and Ostheimer, 2003). In particular, the 1920-1940s was characterized by a zealous enthusiasm for UVR exposure as a panacea for health (Albert and Ostheimer, 2003, Sorene, 2015) and the skin of young children was not uncommonly exposed to ultraviolet radiation (UVR) lamps by the medical community (Sorene, 2015). Childhood is thought to be a particularly susceptible window for the long-term harmful effects of UVR on melanoma risk (Green et al., 2011).

Cohort effects were similarly present for incidence in males but were not apparent for incidence in females until generations born after 1980. The presence of cohort effects on female mortality and absence of cohort effects on female incidence suggests that changes in female incidence over time are predominantly explained by period effects (that is, factors that affect the entire population during the same period time). A possible explanation is that there is a greater degree of overdiagnosis in females vs. males, which would appear as a period effect. This could result from more scrutiny for melanoma due to higher rates of overall health care use, total body skin examinations, and skin self-examinations in females (Berwick et al., 1996, Lakhani et al., 2014, Manuel, 2018, Xu and Borders, 2003).

The incidence-to-mortality ratio was higher in younger women vs. men; with increasing age, the ratios became more similar until equivalency at ages 80+. The primary reason for this discrepancy is a higher incidence, but lower mortality, in younger females vs. younger males. Multiple factors could contribute to these observations. First, there may be a paradoxical age-dependent sex difference (Natale et al., 2018) in melanoma risk and survival. Indeed, higher overall melanoma survival in females compared to males (Hieken et al., 2020, Scoggins et al., 2006) has been suggested to be related to intrinsic biologic sex differences (Natale et al., 2018). Unique age-related differences in melanoma risk by sex could be due to indoor tanning, which is more prevalent in young females (2012). An alternative explanation is that there is a greater degree of overdiagnosis in females vs. males.

There are likely multiple contributing factors to the disproportionate rise of in-situ melanoma. First, the diagnostic criteria used by pathologists have changed over time (1992, Davis and Little, 1977, Dubow and Ackerman, 1990, Elder et al., 2020, Hirst, 1977). Second, population-based ecological studies have shown that increased skin biopsies are associated with increased diagnoses of in-situ, but not invasive, melanoma (Weinstock et al., 2017, Welch et al., 2005). Third, newer diagnostic technologies have allowed detection of clinically featureless tumors (Brouha et al., 2021, Carli, 2007, Kittler et al., 2006). Concerningly, a large study of pathologists in the US demonstrated that the diagnosis of in-situ melanoma is neither reproducible nor accurate (Elmore et al., 2017).

There are limitations to this study. First, mortality and incidence data were drawn from unique datasets that differ in geographical coverage of the country. To mitigate race/ethnicity accounting for disparate trends in incidence and mortality we limited analyses to white individuals. Analyses assumed that the completeness of case reporting has been similar over time. Reporting of incident cases of melanoma to registries has previously shown to be sub-optimal and there has been a recent trend toward electronic reporting (Cockburn et al., 2008, Raji et al., 2015). If the reporting of incident melanoma cases to registries improved over time, it could lead to the appearance of an artificial rise in incidence and the false interpretation of overdiagnosis. Inferences made from examining trends in incidence and mortality should be cautiously interpreted; as this study was descriptive, we can only speculate about potential explanations for the observed melanoma trends. Ultimately, the most reliable method to identify overdiagnosis is through a randomized trial (Carter et al., 2015, Duffy et al., 2010).

In conclusion, long-term trends in melanoma incidence and mortality vary among subsets of the population, suggesting an interplay of age, sex, period, and cohort effects. There is evidence to suggest overdiagnosis throughout the population. Time-varying factors, however, make it challenging to precisely quantify overdiagnosis but it appears greater in females. Further research is needed to identify how to limit overdiagnosis. A re-evaluation of the benefits and harms of diagnosing and treating melanoma in-situ may be a starting point. Taken together, these data argue for the need to refocus detection pressure to groups at highest risk of death from melanoma and to improve diagnosis of potentially lethal disease, perhaps through the use of more objective triage and diagnostic tests (Fried et al., 2020, Marchetti et al., 2021). Refining the ability to risk-stratify patients diagnosed with melanoma may also limit overtreatment (Grossman et al., 2020, Marchetti et al., 2020).

Materials and Methods

The study was exempt from Institutional Review Board review under federal regulation because the data were publicly available. All data were obtained from the Surveillance, Epidemiology, and End Result Program (SEER). Incidence data were drawn from SEER 9, which includes the states of Connecticut, Hawaii, Iowa, New Mexico, and Utah, and the cities of Detroit, Atlanta, San Francisco-Oakland, and Seattle-Puget Sound (~9.8% of the US population). New instances of cutaneous melanoma were defined from International Classification of Diseases (ICD)-0-3 histology codes 8720-8799 with ‘in-situ’ or ‘malignant’ behavior codes and primary sites C44.0-C44.9, and only those with a known patient age were included. Distinctly for each reported outcome, if a patient had more than one instance in the registry, only the first record was included. Data for mortality attributed to ‘Melanoma of the Skin’ is provided by the National Center for Health Statistics and covers the entire US population. Year-, age-, and sex-specific incidence and mortality rates were extracted and age-adjusted to the 2000 US standard population. Additionally for each recorded case of melanoma, the year and age (19-category in 5 year age groups) at diagnosis, sex, tumor staging, and Breslow thickness were extracted. Tumor staging was defined according to SEER historic stage A, which is derived from various schemas used during the period. Breslow thickness data was not available prior to 1988. Instances of in-situ melanoma by ICD-0-3 codes were considered in-situ even when a thickness of >0 mm was indicated (2.2% of cases). The analyses were limited specifically to white individuals, the more susceptible population, to account for potential racial-demographic shifts in the overall US population (Crombie, 1979, Hobbs and Stoops, 2002).

Relationships between melanoma incidence rates [invasive, in-situ, and combined invasive or in-situ], mortality rates, and the combined incidence-to-mortality ratio were assessed over the period of 1975-2017. Estimated rates were stratified by sex and five age classes as previously recommended (Corazziari et al., 2004) for standardized cancer survival analysis (15-44, 45-54, 55-64, 65-74, and 75+). Rates are reported in terms of per 100,000 individuals per year. The presence of overdiagnosis was estimated by qualitatively examining temporal trends in incidence and mortality for previously described epidemiological signatures attributed to cancer (Oke et al., 2018, Welch et al., 2019). In addition, five-year recorded ages were used to analyze birth cohort effect as well as continuous age-specific effects. Given the identification problem with age-period-cohort

analyses, birth cohort effects were conceptualized as a partial interaction between age and period rather than an independent effect (Keyes and Li, 2010). Median polish was used to remove the log-additive components of age and period effects (Keyes and Li, 2010). The resulting residuals were modelled by 10-year period birth cohorts using linear regression (ordinary least squares). Relative birth cohort rate ratios were derived by exponentiating the resulting coefficients from the linear regression model.

Breslow thickness was undefined for 6.6% of cases in SEER (ranging from 19% of cases in 1988 to <4% of cases in 2017) and imputed using multivariable imputation with chained equations (MICE). Similar imputation methods were used for regional and distant staging (undefined in 12% of cases in 1975 to <2% of cases in 2015). Both tumor staging and thickness were defined as ordinal categorical variables, and a proportional odds model was selected as the MICE imputation method, which controlled for year, sex, and age (19-category in 5-year age groups) as independent factors.

Data were exported from SEER and statistical analyses were performed in R using base, stats, dplyr, tidyr, readxl, ggplot2, mice, wesanderson, extrafont, grid, gridExtra, and reshape2 packages. Periodic trend was approximated with locally estimated scatterplot smoothing, using a smoothing parameter of $\frac{1}{2}$ and reported rates and relative rates estimated from the smoothed trends.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Data availability:

All data used in the preparation of this manuscript are publicly available.

Abbreviations:

SEER	Surveillance, Epidemiology, and End Result Program
US	United States
UVR	ultraviolet radiation
ICD	International Classification of Diseases

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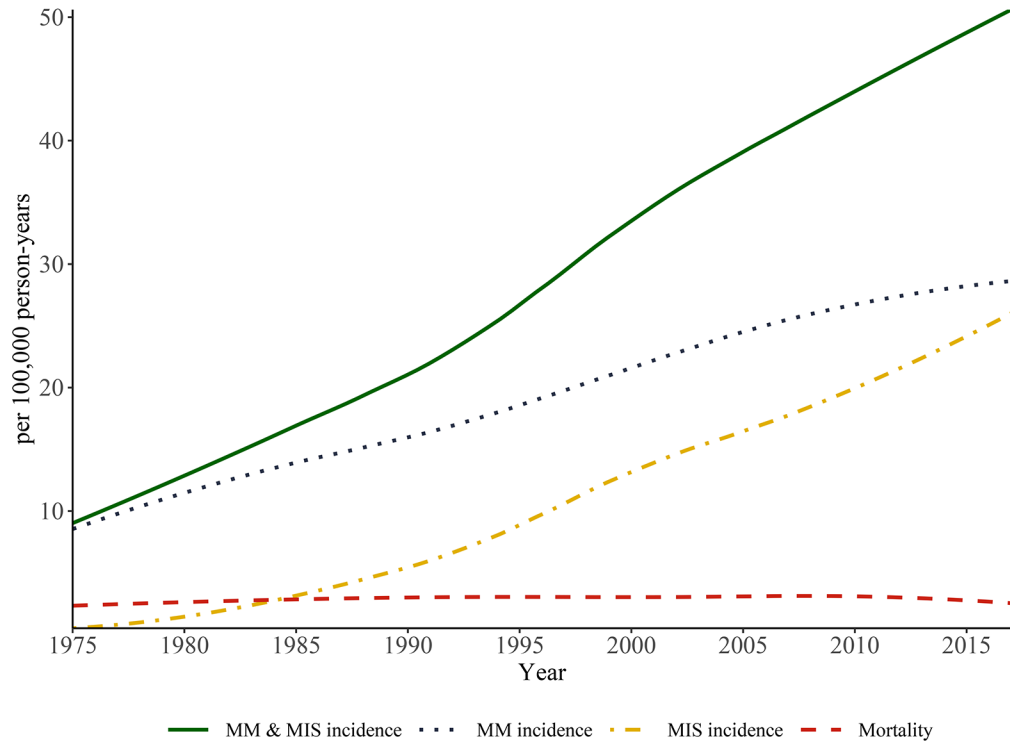


Figure 1: Age-adjusted rates of melanoma incidence and mortality in the United States, 1975-2017.

Incidence data are from the SEER Program, SEER 9 Registries (five states [Connecticut, Hawaii, Iowa, New Mexico, and Utah] and four metropolitan areas [Atlanta, Detroit, San Francisco, and Seattle]). All ages are included, and all rates are age-adjusted to the 2000 U.S. standard population. Mortality data are from the National Vital Statistics System maintained by the National Center for Health Statistics. Incidence = cases of invasive and in-situ melanoma. MM incidence = cases of invasive melanoma. MIS incidence = cases of in-situ melanoma. Mortality = cases of melanoma death.

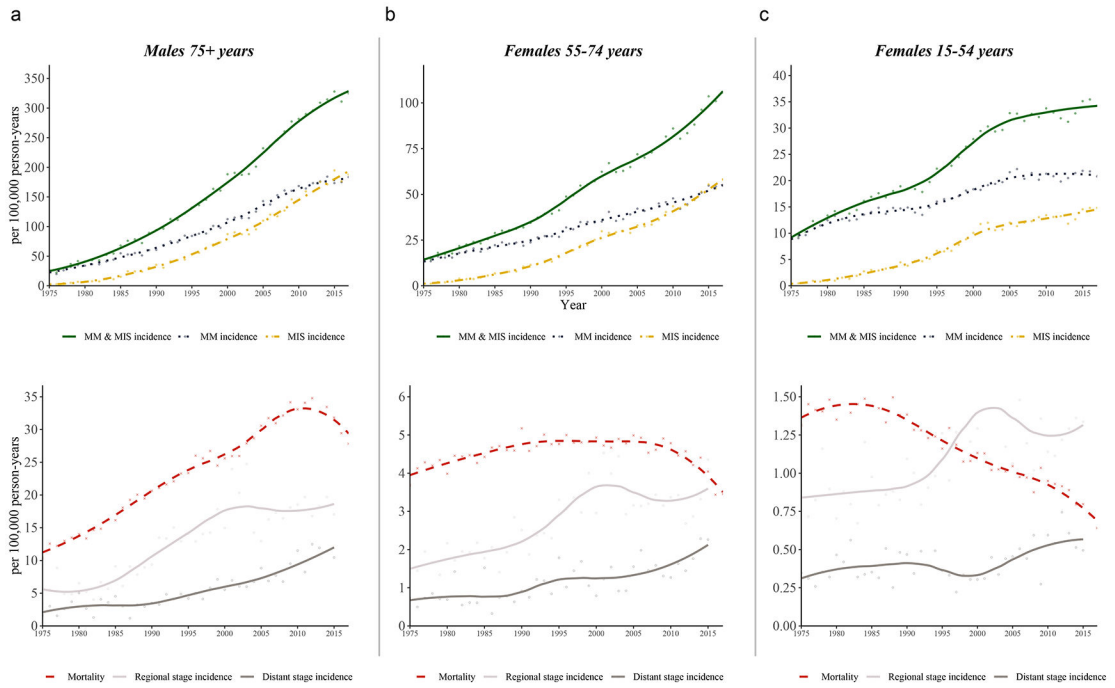


Figure 2: Representative epidemiological signatures in age-sex groups.

The age-sex group that showed trends most suggestive of melanoma overdiagnosis alone were in females, aged 55-74 years (B). Other groups showed mixed effects, suggestive of overdiagnosis plus changes in underlying disease risk. For example, males aged 75+ years (A) had a disproportionate increase in incidence compared to the increase in mortality (increase in true melanoma risk plus overdiagnosis). Females aged 15-44 years (C) had rising incidence but declining mortality (decrease in true melanoma risk plus overdiagnosis). Changes in the incidence of regional and distant cases over time are most likely due to differences in staging practices over time (that is, “up-staging” due to increased use of imaging and sentinel lymph node biopsy).

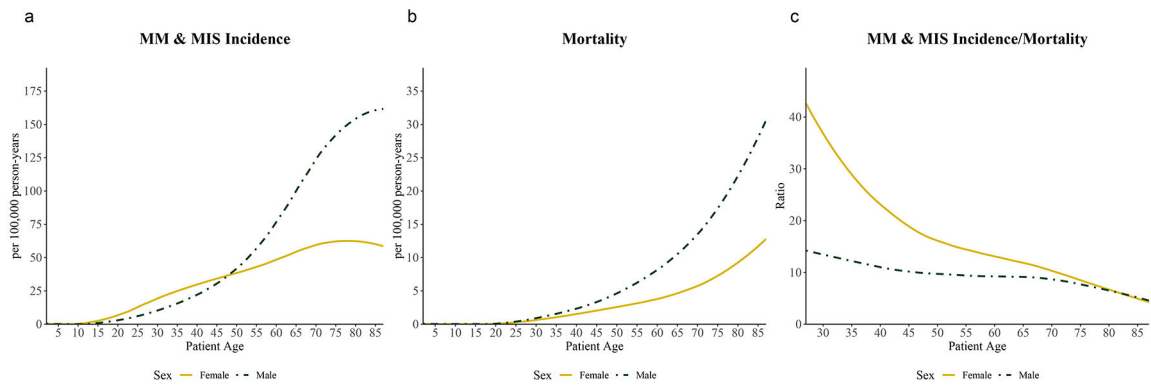


Figure 3: Effect of age on average melanoma incidence and mortality rates from 1975-2017. Incidence rate (A), mortality rate (B), and incidence-to-mortality ratio (C) stratified by sex and 5- year-grouped age categories, averaged from 1975-2017. Curves fit with LOESS regression.

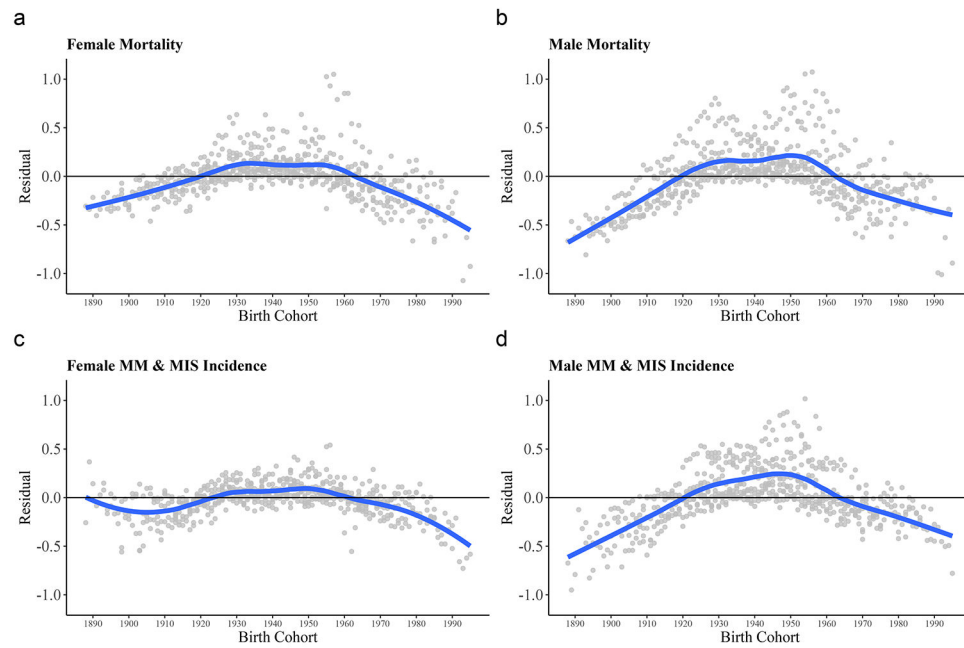


Figure 4: Birth cohort residuals of the median polish analysis

Dots represent the residuals from the median polish procedures plotted against year of birth. Four median polish procedures modelled absolute age-adjusted male and female mortality (A, B), and incidence (C, D) by adult (> 20 years) 5-year-grouped age categories and year of occurrence from 1975-2017. The curve fit of the residuals is produced from LOESS regression. Rates were transformed by taking natural logarithms prior to fitting the median polish models to analyze the interaction of age and period on the multiplicative scale. Systematic deviation from 0.0 suggests the presence of a birth cohort effect.