# Breast Cancer Risk and Historical Exposure to Pesticides from Wide-Area Applications Assessed with GIS

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Pesticides are of interest in etiologic studies of breast cancer because many mimic estrogen, a known breast cancer risk factor, or cause mammary tumors in animals, but most previous studies have been limited by using one-time tissue measurements of residues of only a few pesticides long banned in the United States. As an alternative method to assess historical exposures to banned and current-use pesticides, we used geographic information system (GIS) technology in a population-based case-control study of 1,165 women residing in Cape Cod, Massachusetts, who were diagnosed with breast cancer in 1988-1995 and 1,006 controls. We assessed exposures dating back to 1948 (when DDT was first used there) from pesticides applied for tree pests (e.g., gypsy moths), cranberry bogs, other agriculture, and mosquito control on wetlands. We found no overall pattern of association between pesticide use and breast cancer. We found modest increases in risk associated with aerial application of persistent pesticides on cranberry bogs and less persistent pesticides applied for tree pests or agriculture. Adjusted odds ratios for these exposures were 1.8 or lower, and, with a few exceptions, confidence intervals did not exclude the null. The study is limited by uncertainty about locations of home addresses (particularly before 1980) and unrecorded tree pest and mosquito control events as well as lack of information about exposures during years when women in the study lived off Cape Cod and about women with potentially important early life exposures on Cape Cod who were not included because they moved away. Key words: agriculture, breast cancer, endocrine-disrupting compound, geographic information system, organochlorine, pesticide, residential exposure. Environ Health Perspect 112:889-897 (2004). doi:10.1289/ehp.6845 available via http://dx.doi.org/[Online 11 March 2004]

Pesticides, a class of chemicals that includes insecticides, herbicides, and fungicides, have been of interest in etiologic studies of breast cancer because many pesticides or their breakdown products mimic estrogen, which is known to increase breast cancer risk or otherwise disrupt hormones, and some cause mammary tumors in animals (Andersen et al. 2002; Bennett and Davis 2002; Brody and Rudel 2003; Davis et al. 1993; Wolff et al. 1996). Previous investigations include a small number of occupational and ecologic studies, with both positive and null findings (Abdalla et al. 2003; Band et al. 2000; Dolapsakis et al. 2001; Fleming et al. 1999a, 1999b; Hopenhayn-Rich et al. 2002; Janssens et al. 2001; Kettles et al. 1997; Kogevinas et al. 1993; Manz et al. 1991), and a larger number of population-based studies of serum and adipose measurements of dichlorodiphenyltrichloroethane (DDT), its metabolite dichlorodiphenyldichloroethene (DDE), and a few other persistent organochlorines [reviewed by Brody and Rudel (2003)]. Many of the serum studies failed to find an association with breast cancer (Gammon et al. 2002; Laden et al. 2001; Snedeker 2001); however, a few have shown positive associations (Charlier et al. 2003; Cohn et al. 2002; Hoyer et al. 1998, 2000, 2002).

This available epidemiologic evidence is inadequate to resolve the question of whether pesticides contribute to breast cancer. Ecologic studies have well-known limitations (Rothman and Greenland 1998), and the occupational literature is problematic because it is sparse and vulnerable to confounding by demographic and lifestyle factors, such as physical exercise [discussed by Brody and Rudel (2003)]. Serum studies are limited by their a) use of a single measurement to represent lifetime exposure or exposure during a relevant stage of development, b) use of serum DDE measures to reflect exposure to the more estrogenic parent DDT (this relationship is affected by individual differences in metabolism and excretion and relative intake of the DDT vs. DDE in foods), and c) focus on a small number of pesticides compared with the hundreds currently or historically in use.

Because pesticide exposure is widespread in the general population (Centers for Disease Control and Prevention 2003; Rudel et al. 2003), and breast cancer is the most common cancer in women and the leading cause of cancer death in women 35–54 years of age [National Center for Health Statistics 1997; Surveillance Epidemiology and End Results (SEER) 2004], it remains important to determine whether pesticide exposure contributes to breast cancer risk. Additional studies are needed to assess a wider range of compounds using measurements that capture exposures over different periods in the life course.

Geographic information systems (GIS) are a promising tool for exposure assessment that meets this need, because they can efficiently integrate a) records of locations where

pesticides were used; b) models of how these compounds travel in the environment via aerial drift at the time of application or in surface water, groundwater, and soil; and c) locations of individuals at the times and places of likely exposure (Brody et al. 2002; Stellman et al. 2003b; Ward et al. 2000). This approach has several strengths compared with other exposure assessment techniques, such as self-report, which is prone to error and recall bias, and biologic or environmental sampling, which is expensive, limited in the number of agents that can be measured, and typically limited to single and recent samples available for testing.

GIS-based exposure assessment has been used in a small number of epidemiologic studies of pesticides to date. Using the California database of registered pesticide applications, Bell et al. (2001) found an association between risk of fetal death due to congenital anomalies and large-scale pesticide use near the mother's residence. Using remote sensing to identify areas of crop cultivation, Xiang et al. (2000) found an association between low birth weight and proximity of the mother's residence to crops. Stellman et al. (2003a) report perhaps the most detailed reconstruction of pesticide exposure using GIS in a study of U.S. troops and Vietnamese civilians exposed to Agent Orange and herbicides in Vietnam.

Pesticide use and breast cancer on Cape Cod, Massachusetts. Cape Cod is a sandy peninsula on the Massachusetts coast. The year-round population of 227,000 (U.S. Census Bureau 2000) is roughly doubled by vacationers in the summer (Cape Cod Commission 1998). The population has grown rapidly since the 1980s, with an influx of retirees and, to a lesser extent, Boston commuters (Cape Cod Commission 2003).

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The possible role of pesticides in breast cancer etiology is of particular interest on Cape Cod because of a history of elevated breast cancer incidence and distinctive pesticide use. Three different data sources analyzed in the Cape Cod Breast Cancer and Environment Study (Cape Cod Study) provide evidence of elevated risk that is not explained by mammography or established breast cancer risk factors. Massachusetts Cancer Registry (MCR) data showed age-adjusted breast cancer incidence was approximately 20% higher on Cape Cod compared with the rest of the state from 1982, when MCR began, through 1994 (Silent Spring Institute 2000). The Collaborative Breast Cancer Study showed 21% higher risk for Cape Cod women 50-74 years of age compared with other Massachusetts women after controlling for a comprehensive list of established and suggested risk factors, including family history, reproductive history, use of pharmaceutical hormones and alcohol, and aspects of diet (Silent Spring Institute 1997). The Cape Cod Study showed higher breast cancer risk associated with longer years of residence on Cape Cod after controlling for established risk factors (McKelvey et al. 2004).

Mortality has not been elevated on Cape Cod. Although this suggests the logical possibility that increased incidence could be due to a higher rate of diagnoses through greater mammography use rather than to a higher underlying rate of disease, existing evidence does not support this explanation. A Massachusetts state survey in the mid-1990s showed that 88% of Cape Cod women had ever had a mammogram compared with 89% in the rest of Massachusetts, and Cape Cod women were about 6% less likely to report a mammogram within the last year (Massachusetts Department of Public Health 1997). The proportion of cases diagnosed at earlier stages (an indicator of mammography use) was lower on Cape Cod than in the rest of the state in years when incidence was most elevated (Silent Spring Institute 1998).

Previous research also has shown that pesticides were applied widely on Cape Cod to support tourism, cranberry cultivation, and other agriculture (Brody et al. 2002). Forests were repeatedly sprayed for gypsy moths and other tree pests, and wetlands were sprayed for mosquito control. Other wide-area uses include golf course and rights-of-way management. Persistent organochlorine chemicals were used from the late 1940s to the mid-1970s, and less persistent compounds, including carbaryl, malathion, and carbamates, have been applied in more recent years (Brody et al. 2002). Table 1 lists pesticides applied by type of use. Maps of pesticide use areas and residential land use are accessible in the study's on-line atlas (Silent Spring Institute 2000). Testing of air and dust samples from 120 Cape Cod homes identified 27 pesticides (Rudel et al. 2003). A comparison of dust samples from Cape Cod; Detroit, Michigan; Iowa; Long Island, New York; Los Angeles, California; Seattle, Washington; and Yuma County, Arizona, indicates that household levels of DDT, carbaryl, chlordane, methoxychlor, propoxur, and pentachlorophenol were higher on Cape Cod, whereas levels of diazinon and permethrin were lower (Rudel et al. 2003).

The present study. We investigated breast cancer risk associated with residential proximity to wide-area pesticide use on Cape Cod in a case-control study of 1,165 women diagnosed with breast cancer in 1988–1995 and 1,016 controls. Exposure was assessed by historical reconstruction and GIS-based modeling of pesticide applications for tree pests, cranberry bogs, other agriculture, and mosquito control. This approach adds to previous studies by including a wide range of persistent organochlorine pesticides and less persistent current-use compounds, assessing exposures yearly based on historical pesticide application data and residential history dating back to 1948, evaluating risk in a region with a history of unexplained higher incidence, and demonstrating the use of newly developed GIS exposure assessment methods that can be applied in other studies.

## **Materials and Methods**

*Study population.* Women who were permanent residents of Cape Cod for at least 6 months at the time of an invasive breast cancer diagnosis in 1988–1995 and whose diagnosis was reported to the MCR were eligible cases. MCR verifies diagnoses by medical and pathologic record review and reports nearly complete ascertainment for breast cancer (Massachusetts Department of Public Health 1995).

Controls were selected from women who were permanent residents of Cape Cod for at least 6 months in 1988–1995. They were frequency matched to cases on date of birth in decades and vital status. Living controls

 Table 1. Pesticides applied on Cape Cod, Massachusetts, for tree pests, cranberry cultivation, and mosquito control, 1948–1995.

Use	Pesticides
Tree pests	DDT, daconil, dieldrin, gardona, malathion, methoxychlor, Sevin, Sevin-4-oil, Sevin XLR, Sevin XLR Plus
Cranberry cultivation	2,4-D, 2,4,5-T, 2,4,5-TP, acephate, aldrin, aminotriazole, azinphos-methyl, carbaryl, chlordane, chlorothalonil, chlorpropham, chlorpyrifos, cupric hydroxide, dalapon, DDT, diazinon, dichlobenil, dieldrin, diquat, ethephon, ferbam, fluazifop-butyl, glyphosate, heptachlor, kerosene/fuel oil as agent, malathion, mancozeb, methoxychlor, napropamide, naptalam, norflurazon, <i>p</i> -dichlorobenzene, parathion, phaltan, piperonyl butoxide, propargite, pyrethrum soap/dust, rotenone, ryania, sethoxydim, simazine, Stoddard solvent, thiram, triclopyr, zineb, ziram
Mosquito control	Abate (temephos), DDT, methoxychlor

Abbreviations: 2,4-D, 2,4-dichlorophenoxyacetic acid; 2,4,5-T, 2,4,5-trichlorophenoxyacetic acid; 2,4,5-TP, 2-(2,4,5-trichlorophenoxy)propionic acid.

			Controls			
	Cases	Medicare	Deceased	Random-digit-dial		
Study characteristics	No. (%)	No. (%)	No. (%)	No. (%)		
Full study						
Selected and eligible	1,578	806	355	342		
Excluded						
Never located or contacted	228 (14)	71 (9)	56 (16)	—		
Refused	185 (12)	239 (30)	51 (14)	70 (20)		
Interviewed	1,165 (74)	496 (62)	248 (70)	272 (80)		
Interviewed in PCE study						
Selected and eligible	704	348	175	167		
Excluded						
Never located or contacted	74 (11)	16 (5)	20 (11)	—		
Refused in PCE study	53 (8)	77 (22)	19 (11)	33 (20)		
Unable to contact for sharing	28 (4)	13 (4)	14 (8)	NA <sup>a</sup>		
Refused to share	22 (3)	27 (8)	2 (1)	NA <sup>a</sup>		
Interviewed	527 (75)	215 (62)	120 (69)	134 (80)		
Interviewed in Cape Cod Study						
Selected and eligible	876	453	178	175		
Excluded						
Never located or contacted	128 (15)	39 (09)	20 (11)	—		
Refused	110 (13)	133 (29)	30 (17)	37 (21)		
Interviewed	638 (73)	281 (62)	128 (72)	138 (79)		

----, The random digit dialing procedure did not allow us to determine the number of eligible women whose telephone numbers were randomly selected but who were not reached by interviewers.

<sup>a</sup>MCR allowed sharing of information regarding PCE study subjects who were identified by random-digit dialing without an additional consent procedure, because we had no identifying information to recontact these subjects.

< 65 years of age were selected using random digit dialing. Living controls  $\geq$  65 years of age were selected randomly from lists of Medicare beneficiaries from the Centers for Medicare and Medicaid Services (CMS; Baltimore, MD). Deceased controls were selected randomly from Massachusetts Registry of Vital Records and Statistics (Boston, MA) death certificates for residents in the appropriate age categories who died after January 1988.

For cases and controls not identified by random digit dialing, addresses were obtained from MCR, CMS, the National Death Index (NDI; Hyattsville, MD), town books, telephone books, Internet directories, telephone directory assistance, and the Massachusetts Registry of Motor Vehicles (Boston, MA). Next of kin were identified from death certificates and obituaries as proxies for deceased participants and traced using similar methods. Cases, controls, and proxies for whom addresses were obtained were sent a letter about the study before telephone contact. Informed consent was obtained at the outset of telephone interviews.

Cases diagnosed in 1988-1993 in eight towns and their controls were interviewed in 1997-1998 in a study of breast cancer and tetrachloroethylene (PCE) in drinking water (Aschengrau et al. 2003). Cases diagnosed in 1994-1995 in those towns and in 1988-1995 in the remaining seven towns and their controls were interviewed in 1999-2000. Permissions to use confidential data were obtained from the Massachusetts Department of Public Health Human Research Review Committee, MCR, CMS, NDI, the Boston University Institutional Review Board, and review boards at hospitals where cases were diagnosed. In accordance with MCR policies, Boston University recontacted participants in

Table 3. Geocoding	accuracy fo	r participant
addresses by decade.4	9	

Address match status	No. (%)
≤ 1960	
Rooftop, parcel	85 (37)
Cross street, landmark, street	108 (47)
Not geocoded	38 (16)
1961–1970	
Rooftop, parcel	135 (50)
Intersection, landmark, street	103 (38)
Not geocoded	31 (12)
1971–1980	
Rooftop, parcel	322 (62)
Intersection, landmark, street	141 (27)
Not geocoded	59 (11)
1981–1990	
Rooftop, parcel	1,205 (90)
Intersection, landmark, street	105 (8)
Not geocoded	27 (2)
1991–2000	
Rooftop, parcel	1,396 (97)
Intersection, landmark, street	31 (2)
Not geocoded	8 (1)

<sup>a</sup>Each participant's address is classified by the most recent year she lived there.

the PCE study to obtain their informed consent to use data in the present study.

Among 1,578 eligible cases, 1,165 (74%) participated, 228 (14%) were never located or contacted, and 185 (12%) refused to participate. Among 1,503 eligible controls, 1,016 (68%) participated. Data on selection and participation of study participants are shown in Table 2. Participants and nonparticipants were similar in age, race, and town of residence. Among PCE study participants, 9% of cases and 14% of controls could not be located or refused permission to use their data. Aschengrau compared PCE study participants who were included versus not included in the present study and found the groups similar for vital status at interview, age at diagnosis or reference year, family history of breast cancer, age at first live or stillbirth, and race (data not shown). PCE study participants included in the present study had somewhat lower occurrence of a prior breast cancer than those not included (5 vs. 10%; p = 0.09) and were more educated (10% of included and 20% of not included participants had less than high school education; p = 0.01).

After interviewing, controls were assigned reference years according to the distribution of diagnosis years among the cases. If a control had moved to Cape Cod after the randomly assigned reference year, she was considered ineligible and excluded from analyses (n = 71). Exposures after diagnosis (for cases) or reference year (for controls) were excluded as not etiologically relevant.

Interviews. Trained interviewers asked about women's Cape Cod addresses and years of residence from birth or 1948 (whichever was later) to the interview date. We chose 1948 as the beginning of the exposure period because it was the first year of spraying with DDT on Cape Cod (Brody et al. 2002). Interviews included established and hypothesized risk factors for breast cancer: family history of breast cancer (in a mother, sister, or daughter), menstrual and reproductive history, height and weight, alcohol and tobacco use, physical activity, pharmaceutical hormone use, and education. Interviews assessed home pesticide use, which will be reported separately and is considered here as a possible confounder.

GIS assessment of exposure from widearea pesticide application. Exposure was assessed using historical records and GIS (Brody et al. 2002). Records include locations and other data (e.g., dates, specific agents, application rates) for tree pest control, mosquito control on wetlands, cranberry cultivation, other agriculture (typically truck farms growing vegetables), golf courses, and rightof-way maintenance. Locations of spraying for tree pest control were obtained from town, state, and federal agencies. Locations for the other uses were obtained from aerial photographs taken in 1951, 1971, 1984, and 1990 (MacConnell 1975; MacConnell et al. 1984; Massachusetts Executive Office of Environmental Affairs 2001).

*Geocoding of residential addresses.* Women's residential addresses on Cape Cod were incorporated into the GIS by "geocoding" each address to a latitude and longitude. We mapped addresses wherever possible to the center of a visible residential rooftop using town parcel maps and the state base map for Massachusetts, which is 0.5 m resolution Color Ortho Imagery (Massachusetts Executive Office of Environmental Affairs 1995). Mapping to a rooftop has the advantage of more accurately defining residential positions in larger parcels, which are common on Cape Cod.

Addresses that could not initially be geocoded were researched using county deeds, telephone books, town books, and vital statistics records and then geocoded. If the house could not be identified on the orthophotos, the address was geocoded, if possible, to the center of a cluster of rooftops in the parcel or the center of the parcel if no rooftops were visible. Addresses identified by a cross street or landmark rather than a numerical address were geocoded using the following rules in descending order: to the nearest rooftop, to the center of the nearest parcel, or to the middle of the street if the street was less than a mile long. Addresses that could not be located with this level of accuracy were not geocoded.

Among 3,794 addresses reported, 83% were geocoded to exact addresses. Of these, 90% were matched to a rooftop and 10% to the center of the parcel. The accuracy of geocoding is better for more recent than earlier addresses, because street numbers became more common (Table 3). "Move in" and "move out" years were linked to each address to allow for analysis of exposures during intervening years.

*Exposure calculations.* Relative exposure intensities were calculated for the six wide-area pesticide uses, based on modeling of drift and deposition. The modeling and development of exposure measures is fully described by Brody et al. (2002) and summarized here. Relative exposure intensity is a proxy for exposures via all routes and is designed to be proportional to actual exposures in order to rank exposures correctly.

We attempted to aggregate "like" exposures and differentiate "unlike" exposures. Exposure variables are shown in Table 4. We calculated exposures separately by the purpose of use, because these categories correspond to typically different sets of chemicals and frequency and method of application. For example, tree pest spraying was typically a single active ingredient applied once or twice a year, whereas cranberry bogs were typically treated many times a season with multiple active ingredient mixtures. We separately aggregated exposures corresponding to persistent organochlorine chemicals and less persistent compounds because these classes differ in their environmental fate and toxicologic properties. For many tree pest applications, records identify the specific pesticide, and the spray event was appropriately categorized regardless of date. If the active ingredient was not known, we grouped pesticides applied in 1948-1974 as persistent organochlorines, and in 1975 and later as less persistent (Brody et al. 2002). We estimated exposures to residues from persistent pesticides during the years after they were applied. For cranberry bogs and other agriculture, we estimated exposure with and without taking into account whether homes were protected from pesticide drift (i.e., were unexposed or less exposed) by a tree buffer of at least 10 m between the pesticide use area and the residence.

We used different algorithms to calculate exposures from predominantly aerial- and ground-based applications (Brody et al. 2002). For aerial applications, which were used for tree pests and cranberry bogs, we used local climate data, the Spray Drift Task Force AgDRIFT model (Teske et al. 1997), and the U.S. Environmental Protection Agency (EPA) Industrial Source Complex Short-Term (ISCT3) air model (Kumar et al. 1999; U.S. EPA 1995) to develop the following algorithm:

$$RE = bX^{(c\ln A + d)},$$
 [1]

where RE = relative exposure; X = distance from edge of sprayed area; A = size of sprayed area; and b, c, d = direction-dependent constants derived to account for northeast, southeast, northwest, and southwest wind directions. These constants differ between the cranberry bog and tree pest models because aircraft height, which affects drift distance, is higher above trees than above bogs. We used wind direction data for early morning hours in spring when pesticides were applied, and the wind pattern is similar for July through August. We tested the sensitivity of the algorithm to assumptions about the droplet size distribution, and model output differed by a factor of  $\leq 2$ . For uses that were typically ground based (mosquito control and agriculture other than cranberries; Sakolski G, personal communication), we calculated relative exposure intensity as the inverse distance squared from a residence to the edge of the pesticide use area. Exposures from golf courses and rights-of-way were not calculated, because few women were exposed from these sources.

Relative exposure intensity was calculated for each type of pesticide use for each residence in each year the woman lived at that address. A woman's exposures were then summed for each type of use across all of her Cape Cod addresses during the exposure assessment years (1948 to diagnosis/reference year). These scores ( $\Sigma$  relative exposure intensity at an address multiplied by years at that address) are the exposure estimates used in odds ratio (OR) analyses.

We did not calculate exposures for residues from tree pest spraying, because these exposures are dominated by two Cape-wide spray events in the late 1940s and mid-1950s. Because all Cape Cod addresses were exposed, relative exposure does not vary geographically and simply represents the number of years a woman lived on Cape Cod, which has been analyzed separately (McKelvey et al. 2004).

We imputed exposure at addresses that were geocoded to the middle of a street. We identified residential parcels on the street from the land use map for the closest year, calculated relative exposure intensity for residential parcels, and assigned the mean. Weinberg

Table 4. Wide-area pesticide exposure variables, by chemical class, for which ORs were calculated.

et al. (1996) describes a similar method in a

logistic regression to calculate crude and

adjusted ORs and 95% confidence intervals

(CIs) for each source of pesticide exposure and

breast cancer. Statistical tests for trend were

conducted to assess a dose-response relation-

ship. The reference group for each exposure

consisted of women classified as unexposed for

that variable. The following matching variables

and potential confounders were controlled

in all adjusted OR analyses based on a priori

consideration of the research design, well-

established breast cancer risk factors, and the

completeness of data: age as a continuous term,

birth decade (six categories), PCE versus Cape

Cod Study, vital status, year of diagnosis/

reference year, prior breast cancer, age at first

Data analysis. We used unconditional

radon study.

Source	Persistent organochlorines at the time of application, 1948–1974	Residues of persistent organochlorines in years after they were applied, 1949–1995	Less persistent compounds at the time of application, 1975–1995			
Aerial application						
Tree pests	Yes	a	b			
All cranberry bogs	Yes	Yes	b			
Cranberry bogs not buffered by trees	Yes	Yes	Yes			
Ground application						
Other agriculture	Yes	Yes	Yes			
Mosquito control in wetland	ds Yes	Yes	C			
Other agriculture not buffered by trees	Yes	Yes	Yes			

<sup>a</sup>Not calculated because Cape-wide spraying results in lack of geographic variation in relative exposure intensity within the Cape. <sup>b</sup>Models assuming 5-year latency and 5-year tumor promotion periods were also analyzed. <sup>c</sup>Not calculated because biologic pest control was adopted during this period.

Risk factor	<u>Cases (<i>n</i> = 1,165)</u> No. (%)	<u>Controls (<i>n</i> = 1,016)</u> No. (%)	Adjusted OR (95% CI) <sup>a</sup>
Family history of breast cancer <sup>b</sup>			
No	795 (68)	769 (76)	1.0 (referent)
Yes	293 (25)	192 (19)	1.4 (1.2–1.8)
Unknown	77 (7)	55 (5)	
Prior breast cancer <sup>c</sup>			
No	1,074 (92)	919 (90)	1.0 (referent)
Yes	80 (7)	89 (9)	0.7 (0.5–0.9)
Unknown	11 (1)	8 (1)	
Education < High school graduate High school graduate 1–3 years college/vocational school College graduate Graduate work/degree Unknown	76 (6) 380 (33) 355 (30) 199 (17) 144 (12) 11 (1)	90 (9) 332 (33) 308 (30) 166 (16) 119 (12) 1 <sup>d</sup>	1.0 (referent) 1.5 (1.0–2.0) 1.5 (1.0–2.1) 1.5 (1.1–2.3) 1.5 (1.0–2.3)
Age at first live or stillbirth < 20	80 (7)	83 (8)	1.0 (referent)
20–29	646 (56)	634 (62)	
≥ 30	175 (15)	121 (12)	1.5 (1.2–1.8) <sup>e</sup>
Nulliparous	246 (21)	169 (17)	
Unknown	18 (2)	9 (1)	

<sup>a</sup>Adjusted ORs calculated from a model include age as a continuous term, decade of birth (six categories), PCE study versus Cape Cod Study, vital status, year of diagnosis/reference year, education (five categories), family history of breast cancer, previous diagnosis of breast cancer, age at first birth ( $\ge$  30 years of age or nulliparous vs. < 30 years of age). Women with missing values for education or age at first birth were excluded (n = 36); missing values for family history or previous diagnosis of breast cancer were assumed to be negative. <sup>b</sup>First-degree female relative diagnosed with breast cancer. <sup>c</sup>For cases, prior breast cancer is a diagnosis before the diagnosis that resulted in selection for this study; for controls, prior breast cancer er 30 years of age compared with < 30 years.

birth ( $\geq$  30 years or nulliparous vs. < 30 years), family history of breast cancer in a first-degree female relative, education (five categories), and years of residence on Cape Cod during the exposure period. Each type of exposure is controlled for all others in the model. Missing values for family history or prior breast cancer were assumed to be "no." Participants were excluded if they were missing data for the main exposures (n = 2) or the other potential confounders listed above (n = 36).

We considered years of residence on Cape Cod a potential confounder because length of residence is associated with increased breast cancer risk (McKelvey et al. 2004), and our exposure variables are a function of length of residence. We also interpret results from analyses that control for years of residence as suggestive of the role that exposure intensity plays independent of duration.

Additional potential confounders were also considered: mammography use, medical radiation, lactation, hormone replacement therapy, oral contraceptive use, diethylstilbestrol exposure, body mass index, smoking, alcohol consumption, teen and adult physical activity, race, marital status, religion, and home pesticide use. None of these variables changed the OR estimates by  $\geq$  10%, and they are not included in final models.

We estimated ORs for the entire data set and for the subset of 309 women who spent 80% of the exposure years on Cape Cod. Adjusted analyses were performed if there were at least five exposed cases and five exposed controls. We estimated ORs ignoring latency and assuming a 5-year latency period and a 5-year promotion period. In the latency analysis, we consider only exposures > 5 years before diagnosis/reference year. In the promotion analysis, we consider only exposures ≤ 5 years before diagnosis/reference year. The latency and promotion analyses are limited to less persistent pesticides, because use of the persistent pesticides ended > 5 years before the earliest breast cancer diagnosis.

#### Results

*Characteristics of cases and controls.* Study participants were predominantly white (98%), 60–80 years of age with a high school or higher education; 72% of cases and 76% of controls were living at the time of interview. As expected, more cases (25%) than controls (19%) reported a family history of breast cancer. Most (59%) were born in Massachusetts, including 6% of cases and 7% of controls born on Cape Cod. Characteristics of cases and controls and ORs for potential confounders included in adjusted models are shown in Table 5.

Years of Cape Cod residence at geocoded addresses. We assessed missing exposure data by examining the number and percentage of years during the relevant exposure period that women lived *a*) on Cape Cod, *b*) at addresses where wide-area pesticide exposure could be assessed (including addresses with imputed exposure), and c) at addresses geocoded to a rooftop or parcel (excluding addresses with imputed exposures). Results are shown in Table 6. On average, the women lived on Cape Cod for 17 (controls) to 18 (cases) years of the exposure period, representing 40% (controls) to 42% (cases) of the exposure period. More than 95% of the exposure years when women lived on Cape Cod were geocoded to a rooftop or parcel. Ten percent of participants lived at least 90% of exposure years on the Cape; about half lived at geocoded addresses for 15 continuous years before diagnosis or reference year.

Breast cancer risk. Associations between wide-area pesticide application and breast cancer were inconsistent across different exposure sources and statistically unstable. Results did not change much after adjustment for possible confounders, so only adjusted ORs are presented. Results are shown in Table 7.

Considering ORs for pesticide exposure during the persistent pesticide years (1948– 1974), breast cancer risk is somewhat increased with exposure from some sources but not others. For exposure from living near cranberry bogs, adjusted ORs show increasing risk for increasing exposure across the three exposure levels for relative intensity  $\ge 0.001$  (ORs = 1.2, 1.4, and 1.8); however, risk estimates are statistically unstable. For exposure from tree pest spraying, adjusted ORs are slightly elevated and unstable (ORs = 1.3 and 1.2). No consistent pattern is observed for proximity to mosquito

**Table 6.** Number and percentage of possible exposure years when women lived on Cape Cod and at an address geocoded to a rooftop or parcel (*n* = 1,139 cases, 1,006 controls).

				Perc	entile	le	
	Mean ± SD	Minimum	25th	50th	75th	90th	Maximum
No. of exposure years							
Possible exposure years <sup>a</sup>							
Cases	43 ± 3	28	41	43	45	47	47
Controls	43 ± 3	27	41	43	45	47	47
Exposure years when women lived on Cape Cod							
Cases	18 ± 13	0.50	0.50	16	25	40	47
Controls	17 ± 13	0.50	0.50	15	24	39	47
Years for which relative exposure was assessed <sup>b</sup>							
Cases	18 ± 12	0.50	0.50	16	25	40	47
Controls	17 ± 12	0.50	0.50	14	23	39	47
Exposure years at an address geocoded to							
a rooftop or parcel							
Cases	17 ± 12	0.00	0.00	8.0	24	38	47
Controls	16 ± 12	0.00	0.00	6.0	22	36	47
Percent of exposure years <sup>c</sup>							
Exposure years when women lived on Cape Cod							
Cases	42 ± 29	1.0	18	36	58	95	100
Controls	40 ± 29	1.0	16	34	55	93	100
Years for which relative exposure was assessed <sup>b</sup>							
Cases	42 ± 29	1.0	18	36	57	93	100
Controls	$39 \pm 29$	1.0	16	33	54	93	100
Exposure years at an address geocoded to							
a rooftop or parcel							
Cases	$40 \pm 28$	0.0	18	36	54	99	100
Controls	37 ± 28	0.0	15	32	52	84	100

<sup>a</sup>Years from the beginning of exposure assessment period in 1948 (or the woman's birth year if later) to diagnosis/reference year; the maximum value of 48 years occurs for a woman born in 1947 or earlier and diagnosed in 1995. <sup>b</sup>Includes addresses where the exposure was imputed because the address could not be geocoded to a rooftop or parcel. <sup>c</sup>Percentage is calculated for an individual woman based on her own "possible exposure years."

control or agricultural land other than bogs; adjusted ORs are mostly less than one and unstable.

No consistent association is seen between breast cancer and residues from persistent

pesticides. These adjusted ORs are generally below one and statistically unstable.

For less persistent pesticides (1975–1995), n adjusted ORs are statistically unstable and not consistent across exposure sources. For

 Table 7. Associations between exposure to wide-area pesticide application on Cape Cod, Massachusetts, and breast cancer.

Exposure source	Σ RE intensities across years <sup>a</sup>	Cases	Controls	Adjusted OR (95% CI) <sup>b</sup>	<i>p</i> -Trend
Persistent pesticides at application	•				<u> </u>
Aerial application Cranberry bogs	Not exposed < 0.001 0.001 to < 0.01	1,027 15 36	908 24 31	1.0 (referent) 0.8 (0.4–1.6) 1.2 (0.7–2.1)	0.69
Tree pests	0.01 to < 0.1 ≥ 0.1 Not exposed < 18	41 20 949 83	29 14 866 57	1.4 (0.7–2.5) 1.8 (0.7–4.5) 1.0 (referent) 1.3 (0.8–2.0)	0.91
Ground application	≥ 18	107	83	1.2 (0.7–1.8)	
Other agriculture	Not exposed < 0.001 0.001 to < 0.01 0.01 to < 0.1 ≥ 0.1	1,030 72 19 8 10	908 56 19 12 11	1.0 (referent) 0.9 (0.6–1.4) 0.6 (0.3–1.4) 0.5 (0.2–1.4) 0.8 (0.3–2.3)	0.50
Wetlands	Not exposed < 0.01 0.01 to < 0.1 ≥ 0.1	1,077 30 23 9	945 36 14 11	1.0 (referent) 0.8 (0.4–1.6) 1.6 (0.7–3.7) 0.4 (0.1–1.5)	0.83
Residues from persistent pesticides					
Aerial application Cranberry bogs	Not exposed < 0.01	822 33	700 42	1.0 (referent) 0.7 (0.4–1.2)	0.26
	0.01 to < 0.1 0.1 to < 1 1 to < 10 10 to < 100 ≥ 100	59 132 71 17 5	71 112 54 21 6	0.8 (0.5–1.2) 1.1 (0.7–1.6) 0.9 (0.5–1.7) 0.4 (0.1–1.2) 0.6 (0.2–2.5)	
Ground application Other agriculture	Not exposed < 0.001 0.001 to < 0.01	640 67 187	567 67 152	1.0 (referent) 0.9 (0.6–1.3) 1.0 (0.7–1.3)	0.55
	0.01 to < 0.1 0.1 to < 1 1 to < 10 10 to < 100 ≥ 100	138 45 8 23 31	99 42 17 26 36	1.1 (0.8–1.5) 1.0 (0.6–1.7) 0.5 (0.2–1.2) 0.7 (0.4–1.4) 0.8 (0.4–1.3)	
Wetlands	Not exposed < 0.1 0.1 to < 1 1 to < 10 10 to < 100	1,012 47 48 14 10	881 47 54 9 8	1.0 (referent) 1.1 (0.7–1.9) 0.7 (0.5–1.2) 1.1 (0.4–3.0) 1.7 (0.6–5.5)	0.43
Less persistent pesticides	≥ 100	8	7	1.8 (0.5–6.8)	
Aerial application Cranberry bogs	Not exposed < 0.001 0.001 to < 0.01 0.01 to < 0.1 ≥ 0.1	929 36 59 82 33	802 41 68 64 31	1.0 (referent) 1.1 (0.6–2.0) 0.8 (0.5–1.3) 1.1 (0.6–1.8) 1.2 (0.6–2.8)	0.24
Tree pests	≥ 0.1 Not exposed < 1 ≥ 1	1,107 20 12	987 11 8	1.2 (0.0–2.8) 1.0 (referent) 1.7 (0.8–3.7) 1.6 (0.6–4.0)	0.26
Ground application Other agriculture	Not exposed < 0.001 0.001 to < 0.01 ≥ 0.01	921 191 22 5	844 140 14 8	1.0 (referent) 1.5 (1.1–1.9) 1.8 (0.9–3.7) 0.9 (0.3–3.0)	0.63

<sup>a</sup>RE is defined by equation 1. <sup>b</sup>Adjusted for age as a continuous term, birth decade (six categories), PCE study versus Cape Cod Study, vital status, year of diagnosis/reference year, age at reference year, previous breast cancer diagnosis, age at first birth ( $\geq$  30 years of age or nulliparous vs. < 30 years of age), family history of breast cancer, education (five categories), exposure-relevant years on Cape Cod, and other exposures listed in this table.

cranberry bogs, adjusted ORs vary around the null. For tree pest spraying, adjusted ORs are 1.7 (95% CI, 0.8–3.7) and 1.6 (95% CI, 0.6–4.0) for the two exposed groups. For agriculture other than cranberry bogs, ORs are elevated for the second (OR = 1.5; 95% CI, 1.1–1.9) and third (OR = 1.8; 95% CI, 0.9–3.7) exposure levels but not for the highest (OR = 0.9; 95% CI, 0.3–3.0).

We calculated ORs limited to women who had lived  $\ge 80\%$  of their eligible years on Cape Cod (n = 167 cases; n = 142 controls). However, the numbers of women in the reference groups are small, ranging from 15 cases unexposed to active spraying of persistent pesticides for tree pests to 118 cases unexposed from active spraying of persistent pesticides on cranberry bogs; and the small numbers result in very unstable ORs (data not shown).

We expected to see stronger associations between breast cancer and models that classify as "unexposed" those residences that are protected from pesticide drift by a tree buffer in comparison with models that classify these homes as "exposed." For exposure to persistent pesticides from proximity to cranberry bogs, we did observe higher adjusted ORs for three of the four exposure levels in a model that classifies buffered locations as "unexposed" (for increasing relative exposure intensity due to living near a cranberry bog with no tree buffer, adjusted ORs = 1.3, 0.5, 1.9, and 2.0). For agriculture and wetlands, residues, and less persistent pesticides, considering a tree buffer did not make a difference. Numbers of participants in the higher exposure categories are small (data not shown).

When we considered a 5-year latency period and a 5-year tumor promotion period for the less persistent pesticides, results were similar to analyses without these assumptions. Results are shown in Table 8.

We considered alternative definitions of the reference group to balance the dual goals of maximizing statistical power by including more women and restricting the reference group to truly unexposed women. The exposure variables (Table 4) do not cleanly differentiate exposed and unexposed women, because a) the same chemicals were used for multiple purposes (e.g., a woman unexposed to persistent pesticides from tree spraying may have been exposed to them from their use in agriculture) and b) persistent and less persistent chemicals may have similar toxicologic properties and some overlap in their years of use. Thus, we tested models with a reference group of women classified as unexposed for multiple related exposure variables. For example, we analyzed the cranberry bog variables using a reference group of women who were classified as not exposed for any cranberry bog variable. This strategy excluded many women, so we also tested models that defined the reference group for each exposure as women unexposed for that variable, and we controlled in these models for possible confounding by the other exposures. Results of these two methods were similar, so only the results for the less restrictive reference group are shown in Tables 6 and 7, because these models include more women.

### Discussion

Results of this population-based case-control study do not show an overall pattern of association between residential exposure to widearea pesticide application on Cape Cod since 1948 and breast cancer diagnosed there in 1988-1995. We did not find consistent dose-response trends or consistency within categories of exposure, including the chemical type (persistent, residue from persistent, or less persistent), method of application (aerial or ground), and type of use (e.g., cranberry cultivation, tree pest control). These findings are consistent with results of many recent studies of certain organochlorine pesticides and breast cancer (Gammon et al. 2002, Laden et al. 2001; Snedeker 2001), although associations have been reported in some others (Charlier et al. 2003; Cohn et al. 2002; Hoyer et al. 1998, 2000, 2002). The present study adds to this literature by using novel GIS-based methods that assess exposures to mixtures of many chemicals from multiple types of use over many years. Other strengths of the study include the relatively large number of participants and the extensive interview data that allow for control of confounding.

Although there was lack of consistency overall, we observed some suggestive associations. These are reviewed below, followed by discussion of the strengths and weaknesses of the GIS exposure assessment.

*Persistent pesticides.* We observed somewhat increased risk associated with persistent pesticides applied aerially (i.e., for cranberry bogs and tree pests), and risk increased with increasing exposure across the top three of four exposure categories for cranberry bogs (adjusted ORs = 0.8, 1.2, 1.4, and 1.8), although not for tree pests (adjusted ORs = 1.3 and 1.2). As expected, risk was higher for women in residences with no tree buffer to protect them from pesticide drift. However, no increased risk was seen for exposure to persistent pesticides from ground application (i.e., for other agriculture and mosquito control in wetlands).

The differing results for aerial and groundbased persistent pesticides could be because cranberry bog and tree pest applications used chemicals similar to each other and different from the ground-based preparations, because application practices resulted in higher exposures, or because of chance. The increased risk associated with living near a cranberry bog at the time of persistent pesticide application was greater than was observed in a previous study that reported a 20–30% increased breast cancer risk for women diagnosed in 1983–1986 and living within 2,600 ft of a cranberry bog in the five towns of Upper Cape Cod, with no latency (adjusted OR = 1.2; 95% CI, 0.8–1.6) and with 15 years latency (adjusted OR = 1.3; 95% CI, 0.9–2.0; Aschengrau et al. 1996). Results may be different because the earlier study did not distinguish between exposures to persistent and less persistent pesticides.

**Residual exposure from persistent pesti**cides. We found no pattern of association between breast cancer and residual exposures from persistent pesticides. Residual exposures are not well modeled in this study, however, because we did not account for rates of decay or transformation of the originally applied compounds to compounds with different toxicologic characteristics.

Less persistent current-use pesticides. For exposures to less persistent current-use pesticides, we found some evidence of increased risk associated with exposure from spraying for tree pests and agriculture other than cranberry bogs, although we saw no increased risk for the small number of women (n = 13) with the highest exposure from agriculture. Although results provide only weak evidence of an association and may be attributed to chance, they warrant follow-up because the current-use pesticides result in ongoing and common exposures and have not been studied much by others. In one study that did include currentuse pesticides, Duell et al. (2000) reported elevated risk among women who reported being in fields during or shortly after application (OR = 1.8; 95% CI, 1.1-2.8) and for those who said they did not use protective clothing while applying the chemicals (OR = 2.0; 95% CI, 1.0-4.3). The lack of an association in the present study for current-use pesticides applied on cranberry bogs may be due to the adoption of chemigation (application via irrigation systems) during this time period, which most likely reduces the extent of exposure.

Strengths and weaknesses of GIS exposure assessment. The GIS-based exposure assessment represents a new approach with a different set of strengths and weaknesses than the predominant method for studying pesticides and breast cancer, which has relied on one-time serum measures of persistent organochlorines, notably DDT/DDE, chlordane, and dieldrin. Serum measures have the advantage of reflecting individual-level biologic processes and all sources of exposure, including wide-area, home-use, occupational, and dietary sources. However, serum measurements are limited to a small number of persistent compounds and leave many plausibly relevant exposures unstudied because of cost and intrusiveness, lack of chemical analytical methods for some compounds, and the rapid elimination of current-use pesticides from the body. Individual differences in metabolism and excretion result in measures that may not represent original exposure levels, particularly when the assessment is many years after exposure.

In contrast, the GIS measures in this study assess exposures to real-world mixtures of many chemicals. Both current-use and banned pesticides were included, and exposures were

 Table 8. Associations between exposure to wide-area application of less persistent pesticides on Cape

 Cod, Massachusetts, and breast cancer, with 5-year latency and 5-year tumor promotion assumptions.

Exposure source	Σ RE intensities across years <sup>a</sup>	Cases	Controls	Adjusted OR (95% CI) <sup>b</sup>	<i>p</i> -Trend
Assuming 5-year latency period					
Cranberry bogs	Not exposed	975	859	1.0 (referent)	0.40
, .	< 0.001	26	31	0.8 (0.5-1.4)	
	0.001 to < 0.01	53	47	1.0 (0.7–1.5)	
	0.01 to < 0.1	66	51	1.2 (0.8–1.7)	
	≥ 0.1	19	18	0.9 (0.5–1.8)	
Tree pests	Not exposed	1,117	989	1.0 (referent)	0.54
	> 0	22	17	1.2 (0.6–2.2)	
Other agriculture	Not exposed	971	880	1.0 (referent)	0.41
	< 0.001	150	110	1.3 (1.0–1.7)	
	≥ 0.001	18	16	1.2 (0.6–2.4)	
Assuming 5-year tumor promotion period					
Cranberry bogs	Not exposed	963	825	1.0 (referent)	0.46
	< 0.001	34	43	0.7 (0.4–1.1)	
	0.001 to < 0.01	69	70	0.9 (0.6–1.3)	
	0.01 to < 0.1	59	52	1.0 (0.7–1.5)	
	≥ 0.1	14	16	0.8 (0.4–1.6)	
Tree pests	Not exposed	1,127	1,001	1.0 (referent)	0.54
	>0	12	5	2.6 (0.9–7.7)	
Other agriculture	Not exposed	944	862	1.0 (referent)	0.90
	< 0.001	181	127	1.4 (1.1–1.8)	
	≥ 0.001	14	17	0.8 (0.4–1.6)	

<sup>a</sup>RE is defined by equation 1. <sup>b</sup>Adjusted for age as a continuous term, birth decade (six categories), PCE study versus Cape Cod Study, vital status, year of diagnosis/reference year, age at reference year, previous breast cancer diagnosis, age at first birth (≥ 30 years of age or nulliparous vs. < 30 years of age), family history of breast cancer, education (five categories), exposure-relevant years on Cape Cod, and other exposures listed in this table. assessed for multiple sources, including applications for tree pests, cranberry bogs, other agriculture, and mosquito control in wetlands. Golf course and right-of-way maintenance was assessed, and we found few women affected by residential exposure.

Although the assessment of mixtures has the advantage of reflecting real exposures, it has the drawback of combining chemicals with different toxicologic properties, perhaps obscuring effects. This limitation may be mitigated by separating exposures that correspond to time periods when particular chemicals dominated (e.g., the organochlorine years 1948–1974) and to types of use (e.g., cranberry cultivation) characterized by relatively consistent use of certain agents.

Limitations in the application of GIS in this study. Some of the theoretical strengths of GIS exposure assessment were not fully realized because of limitations in the data. The most significant limitations derive from missing information *a*) in the underlying GIS database describing pesticide use on the Cape, b) about exposures during years when women lived off Cape Cod, and c) about address locations before universal use of street numbers. Assumptions in environmental models that link environmental data with exposure to individuals and health effects models that link individual exposure to breast cancer are another source of error. For example, our analysis models breast cancer risk as a function of cumulative exposure, but exposure during a particular life stage may be important. These sources of error may lead to exposure misclassification and misspecification of causal relationships.

As described by Brody et al. (2002), the pesticide use database comes from aerial photography and from written records of tree pest spraying, often including maps used by the pilots. We can be confident that the events mapped in the GIS occurred. However, other, unmapped pesticide use is also known to have occurred, so exposure is generally underestimated. The most serious gaps are likely to be town and private spraying for tree pests and mosquitoes. There is an opportunity in future research to evaluate completeness by testing sediment core samples from wetlands. Because sediments are laid down in successive years and remain undisturbed, these samples would provide information about the temporal as well as spatial history of pesticide deposition. Concordance between core samples and GIS exposure measures would support inferences about exposure.

Information about exposures is further limited by the restriction of the GIS to addresses on Cape Cod. We are somewhat reassured about the impact of missing off-Cape exposure data by the finding that adjustment for the number of years women lived on Cape Cod has little impact on the pesticide risk estimates, indicating that the number of years off-Cape is not confounded with pesticide exposure estimates even though women with longer years of residence on the Cape are at higher risk of breast cancer (McKelvey et al. 2004).

We expect greater error in exposure estimates for addresses that were not geocoded to a rooftop or parcel, and lack of street numbers in earlier years means that this type of error is most common during the years of persistent pesticide use. We conducted analyses with and without imputed exposures, and results were similar.

Participants also were exposed to pesticides from sources other than wide-area application on or near their homes, including diet, home use, and occupation. Few women in the study worked in occupations with likely pesticide exposure (5% of cases and 13% of controls). Home pesticide use was common, with 90% of women reporting "frequent" use of at least one type of home pesticide. However, we saw no evidence that home use confounds the relationship between breast cancer and wide-area pesticide exposure, and we had no a priori expectation of confounding. In addition, exposure misclassification results from missing information about other personal behaviors, for example, time spent outside, housekeeping practices, and activities like gardening or golf.

A variety of elements in the environmental models could also lead to exposure misclassification. Although others have validated the aerial drift model, and we tested its sensitivity to changes in certain input parameters, such as spray droplet size and selection of climate data, the model was not tested on Cape Cod. We expect that uncertainties due to application of the drift model to Cape Cod are small compared with uncertainties due to incomplete ascertainment of spray events. Others have demonstrated that a tree buffer reduces exposure, but our assumption that a 10-m tree buffer reduces exposure to zero is imprecise.

Despite these limitations, this GIS method represents the application of advanced computing capability to a long-standing public health approach: examining geographic patterns of disease using proximity as an indicator of exposure. The premise that proximity to pesticide application areas results in residential exposure has been demonstrated in a variety of settings (Fenske et al. 2002; Lu et al. 2000; Simcox et al. 1995). The environmental models we used, borrowing from models developed and validated for regulatory purposes, take advantage of GIS capability to incorporate more complex algorithms than simple distance.

These GIS methods have the potential to address questions about exposures with long latency to disease and during critical periods in the life cycle, because exposure is estimated for every year. For example, in a breast cancer study, we would like to analyze only exposures that occurred before a first pregnancy, when the breast is believed to be more vulnerable. However, in this study, the number of women in subgroups restricted by latency or critical exposure period assumptions was too small to have confidence in these analyses. Failure to take the timing of exposure into account may misspecify causal relationships and produce misleading null results. Similarly, the number of women was too small to pursue the possibility that exposure results in higher risk only for participants with a family history of disease, as was found in a study of pesticides and prostate cancer (Alavanja et al. 2003).

A related limitation is the effect of studying women who lived on Cape Cod in recent years while excluding those who lived there in earlier years and moved away. Out-migration of girls born and raised on the Cape means that information about exposures during early years when more persistent, and perhaps more toxic, compounds were in use and exposures earlier in the life cycle is lost. The GIS contains specific records of selected spray events, including the date, location, chemical, volume, and application method. These records could be used to assess exposures during gestation or girlhood, which are hypothesized to affect future breast cancer risk. Women exposed during gestation were  $\leq$  47 years of age during the diagnosis years in this study and are now  $\leq$  55, so such a study is somewhat premature.

Furthermore, by studying only women on Cape Cod, we may reduce variability in exposures, because wide-area spraying was extensive, and in outcome, because breast cancer risk is known to be elevated on the Cape. Limited variability could result in failure to detect a real relationship in a study restricted to this region.

Future use of GIS in health studies. The environmental data developed here may be used in studies of other health effects on Cape Cod, and the GIS methods are applicable in other settings. They will be most effective when the population remains relatively stable within the geographic extent of the GIS. GIS methods may become more useful as geographically based environmental and health effects databases, such as the California pesticide reporting system and the proposed national health and environment tracking infrastructure, become available (California Environmental Protection Agency 1995; Wakefield 2000). Modernization of cancer registries to incorporate residential history data would improve GIS exposure assessment (Hurley et al. 2003).

#### REFERENCES

- Abdalla MH, Gutierrez-Mohamed ML, Farah IO. 2003. Association of pesticide exposure and risk of breast cancer mortality in Mississippi. Biomed Sci Instrum 39:397–401.
- Alavanja MC, Samanic C, Dosemeci M, Lubin J, Tarone R, Lynch CF, et al. 2003. Use of agricultural pesticides and

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prostate cancer risk in the Agricultural Health Study cohort. Am J Epidemiol 157:800–814.

- Andersen HR, Vinggaard AM, Rasmussen TH, Gjermandsen IM, Bonefeld-Jorgensen EC. 2002. Effects of currently used pesticides in assays for estrogenicity, androgenicity, and aromatase activity *in vitro*. Toxicol Appl Pharmacol 179:1–12.
- Aschengrau A, Ozonoff D, Coogan P, Vezina R, Heeren T, Zhang Y. 1996. Cancer risk and residential proximity to cranberry cultivation in Massachusetts. Am J Public Health 86:1289–1296.
- Aschengrau A, Rogers S, Ozonoff D. 2003. Perchloroethylenecontaminated drinking water and the risk of breast cancer: additional results from Cape Cod, Massachusetts, USA. Environ Health Perspect 111:167–173.
- Band PR, Le N, Fang R, Deschamps M, Gallagher R, Yang P. 2000. Identification of occupational cancer risks in British Columbia: a population-based case-control study of 995 incident breast cancer cases by menopausal status, controlling for confounding factors. J Occup Environ Med 42:284–310.
- Bell E, Hertz-Picciotto I, Beaumont JJ. 2001. A case-control study of pesticides and fetal death due to congenital anomalies. Epidemiology 12:148–156.
- Bennett L, Davis B. 2002. Identification of mammary carcinogens in rodent bioassays. Environ Mol Mutagen 39:150–157.
- Brody JG, Rudel RA. 2003. Environmental pollutants and breast cancer. Environ Health Perspect 111:1007–1019.
- Brody JG, Vorhees DJ, Melly SJ, Swedis SR, Drivas PJ, Rudel RA. 2002. Using GIS and historical records to reconstruct residential exposure to large-scale pesticide application. J Expo Anal Environ Epidemiol 12:64–80.
- California Environmental Protection Agency. 1995. Pesticide Use Reporting: An Overview of California's Unique Full Reporting Systems. Sacramento, CA:California Environmental Protection Agency, Department of Pesticide Regulation, Information Systems Branch.
- Cape Cod Commission. 1998. Cape Trends. 5th ed. Barnstable, MA:Cape Cod Commission. Available: http://www. capecodcommission.org/data/trends98.htm [accessed 1 March 2004].
- Cape Cod Commission. 2003. Cape Cod Demographic and Economic Data. Barnstable, MA:Cape Cod Commission. Available: http://www.capecodcommission.org/data/ home.htm [accessed 1 March 2004].
- CDC. 2003. Second National Report on Human Exposure to Environmental Chemicals. Atlanta, GA:Centers for Disease Control and Prevention.
- Charlier C, Albert A, Herman P, Hamoir E, Gaspard U, Meurisse M, et al. 2003. Breast cancer and serum organochlorine residues. Occup Environ Med 60:348–351.
- Cohn BA, Wolff MS, Cirillo PM, Sholtz RI, Christianson R, van den Berg BJ, et al. 2002. Timing of DDT exposure and breast cancer before age 50 [Abstract]. Epidemiology 13(4):S197.
- Davis DL, Bradlow HL, Wolff M, Woodruff T, Howl DG, Anton-Culver H. 1993. Medical hypothesis: xenoestrogens as preventable causes of breast cancer. Environ Health Perspect 101:372–377.
- Dolapsakis G, Vlachonikolis IG, Varveris C, Tsatsakis AM. 2001. Mammographic findings and occupational exposure to pesticides currently in use on Crete. Eur J Cancer 37:1531–1536.
- Duell EJ, Millikan RC, Savitz DA, Newman B, Smith JC, Schell MJ, et al. 2000. A population-based case-control study of farming and breast cancer in North Carolina. Epidemiology 11:523–531.
- Fenske RA, Lu C, Barr D, Needham LL. 2002. Children's exposure to chlorpyrifos and parathion in an agricultural community in Central Washington State. Environ Health Perspect 110:549–553.
- Fleming LE, Bean JA, Rudolph M, Hamilton K. 1999a. Cancer incidence in a cohort of licensed pesticide applicators in Florida. J Occup Environ Med 41:279–288.

Fleming LE, Bean JA, Rudolph M, Hamilton K. 1999b. Mortality

in a cohort of licensed pesticide applicators in Florida. Occup Environ Med 56:14–21.

- Gammon MD, Wolff MS, Neugut AI, Eng SM, Teitelbaum SL, Britton JA, et al. 2002. Environmental toxins and breast cancer on Long Island. II. Organochlorine compound levels in blood. Cancer Epidemiol Biomarkers Prev 11:686–697.
- Hopenhayn-Rich C, Stump ML, Browning SR. 2002. Regional assessment of atrazine exposure and incidence of breast and ovarian cancers in Kentucky. Arch Environ Contam Toxicol 42:127–136.
- Hoyer A, Gerdes A, Jorgensen T, Rank F, Hartvig H. 2002. Organochlorines, p53 mutations in relation to breast cancer risk and survival. A Danish cohort-nested case-control study. Breast Cancer Res Treat 71:59–65.
- Hoyer A, Jorgensen T, Grandjean P, Hartvig H. 2000. Repeated measurements of organochlorine exposure and breast cancer risk (Denmark). Cancer Causes Control 11:177–184.
- Hoyer AP, Grandjean P, Jorgensen T, Brock JW, Hartvig HB. 1998. Organochlorine exposure and risk of breast cancer. Lancet 352:1816–1820.
- Hurley SE, Saunders TM, Nivas R, Hertz A, Reynolds P. 2003. Post office box addresses: a challenge for geographic information system-based studies. Epidemiology 14:386–391.
- Janssens JP, Van Hecke E, Geys H, Bruckers L, Renard D, Molenberghs G. 2001. Pesticides and mortality from hormone-dependent cancers. Eur J Cancer Prev 10:459–467.
- Kettles MA, Browning SR, Prince TS, Horstman SW. 1997. Triazine herbicide exposure and breast cancer incidence: an ecologic study of Kentucky counties. Environ Health Perspect 105:1222–1227.
- Kogevinas M, Saracci R, Winkelmann R, Johnson ES, Bertazzi PA, Bueno de Mesquita BH, et al. 1993. Cancer incidence and mortality in women occupationally exposed to chlorophenoxy herbicides, chlorophenols, dioxins. Cancer Causes Control 4:547–553.
- Kumar A, Bellam N, Sud A. 1999. Performance of an industrial source complex model: predicting long-term concentrations in an urban area. Environ Proor 18:93–100.
- Laden F, Collman G, Iwamoto K, Alberg AJ, Berkowitz GS, Freudenheim JL, et al. 2001. 1,1-Dichloro-2,2-bis(pchlorophenyl)ethylene and polychlorinated biphenyls and breast cancer: combined analysis of five US studies. J Natl Cancer Inst 93:768–776.
- Lu C, Fenske RA, Simcox NJ, Kalman D. 2000. Pesticide exposure of children in an agricultural community: evidence of household proximity to farmland and take home exposure pathways. Environ Res 84:290–302.
- MacConnell W, Swartout D, Stone J. 1984. Land Use Update for Cape Cod and the Islands with Area Statistics for 1951, 1971, and 1980. Amherst, MA:University of Massachusetts at Amherst, Massachusetts Agricultural Experiment Station.
- MacConnell WP. 1975. Remote Sensing 20 Years of Change in Massachusetts 1952-1972: Classification Manual, Land Use and Vegetative Cover Mapping. Amherst, MA:University of Massachusetts at Amherst, Massachusetts Agricultural Experiment Station.
- Manz A, Berger J, Dwyer JH, Flesch-Janys D, Nagel S, Waltsgott H. 1991. Cancer mortality among workers in chemical plant contaminated with dioxin. Lancet 338:959–964.
- Massachusetts Department of Public Health. 1995. Cancer Incidence in Massachusetts 1982–1992, City and Town Supplement. Boston, MA:Bureau of Health Statistics, Research and Evaluation.
- Massachusetts Department of Public Health. 1997. Chronic Disease Surveillance Program, Behavioral Risk Factor Surveillance System. Boston, MA:Bureau of Health Statistics, Research and Evaluation.
- Massachusetts Executive Office of Environmental Affairs. 1995. 1:5000 Scale Digital Orthophoto Images. Boston, MA:Massachusetts GIS (MassGIS).

Massachusetts Executive Office of Environmental Affairs. 2001.

The MassGIS Statewide 1:25,000 Land Use Datalayer. Boston, MA:Massachusetts GIS (MassGIS).

- McKelvey W, Brody JG, Aschengrau A, Swartz CH. 2004. Association between residence on Cape Cod, Massachusetts, and breast cancer. Ann Epidemiol 14(2):89–94.
- National Center for Health Statistics. 1997. Multiple Cause-of-Death File 1993. SETS Version 1.22a. Atlanta, GA:Centers for Disease Control and Prevention.
- Rothman KJ, Greenland S. 1998. Modern Epidemiology. 2nd ed. Philadelphia:Lippincott Williams & Wilkins.
- Rudel RA, Camann DE, Spengler JD, Korn LR, Brody JG. 2003. Phthalates, alkylphenols, pesticides, polybrominated diphenyl ethers, and other endocrine disrupting compounds in indoor air and dust. Environ Sci Technol 37:4543–4553.
- SEER (Surveillance Epidemiology and End Results). 2004. Number of Incidence Cases, 1997–2001, by Primary Cancer Site, Race and Sex. SEER Goegraphic Areas. Available: http://seer.cancer.gov/csr/1975\_2001/results\_ single/sect\_a\_table.01.pdf [accessed 16 April 2004].
- Silent Spring Institute. 1997. Cape Cod Breast Cancer and Environment Study: Final Report. Newton, MA:Silent Spring Institute.
- Silent Spring Institute. 1998. The Cape Cod Breast Cancer and Environment Study: Results of the First Three Years of Study. Newton, MA:Silent Spring Institute.
- Silent Spring Institute. 2000. Cape Cod Breast Cancer and Environment Atlas. Newton, MA:Silent Spring Institute. Available: http://www.silentspring.org/atlas/atlas.htm [accessed 28 October 2003].
- Simcox NJ, Fenske RA, Wolz SA, Lee IC, Kalman DA. 1995. Pesticides in household dust and soil: exposure pathways for children of agricultural families. Environ Health Perspect 103:1126–1134.
- Snedeker SM. 2001. Pesticides and breast cancer risk: a review of DDT, DDE, and dieldrin. Environ Health Perspect 109(suppl 1):35–47.
- Stellman JM, Stellman SD, Christian R, Weber T, Tomasallo C. 2003a. The extent and patterns of usage of Agent Orange and other herbicides in Vietnam. Nature 422:681–687.
- Stellman JM, Stellman SD, Weber T, Tomasallo C, Stellman AB, Christian R. 2003b. A geographic information system for characterizing exposure to Agent Orange and other herbicides in Vietnam. Environ Health Perspect 111:321–328.
- Teske M, Bird S, Esterly D, Ray S, Perry S. 1997. A User's Guide for AgDRIFT 1.0: A Tiered Approach for the Assessment of Spray Drift of Pesticides. CDI Technical Note No. 95-10, prepared for DR Johnson, Project Manager, Spray Drift Task Force. Ewing, NJ:Continuum Dynamics.
- U.S. Cenus Bureau. 2000. USA Quickfacts: Barnstable County, Massachusetts. Washington, DC:U.S. Census Bureau. Available: http://quickfacts.census.gov/qfd/states/ 25/25001.html [accessed 2 March 2004].
- U.S. EPA. 1995. User's Guide for the Industrial Source Complex (ISC3) Dispersion Models. Vol. 1: User Instructions. Research Triangle Park, NC:U.S. Environmental Protection Agency, Office of Air Quality Planning and Standards.
- Wakefield J. 2000. Human exposure: the key to better risk assessment. Environ Health Perspect 108:A559–A565.
- Ward MH, Nuckols JR, Weigel SJ, Maxwell SK, Cantor KP, Miller RS. 2000. Identifying populations potentially exposed to agricultural pesticides using remote sensing and a geographic information system. Environ Health Perspect 108:5–12.
- Weinberg CR, Moledor ES, Umbach DM, Sandler DP. 1996. Imputation for exposure histories with gaps, under an excess relative risk model. Epidemiology 7:490–497.
- Wolff MS, Collman GW, Barrett JC, Huff J. 1996. Breast cancer and environmental risk factors: epidemiological and experimental findings. Annu Rev Pharmacol Toxicol 36:573–596.
- Xiang H, Nuckols JR, Stallones L. 2000. A geographic information asessment of birth weight and crop production patterns around mother's residence. Environ Res 82:160–167.