# Evaluation of the 4-Digit Social Security Number Algorithm Used for the 2011 Linked Mortality Files 

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## Background

Special Projects Branch (SPB) employed a matching methodology for the 2011 Linked Mortality Files similar, but not identical, to the method offered by the National Death Index (NDI)

- NCHS survey records were matched with NDI records using the following identifying information, as available:
-Social Security Number (SSN), First name, Middle initial, Last name, Month of birth, Day of birth, Year of birth, Sex, Father's surname, State of birth, Race, State of residence, Marital status


## Background: SSN

## SSN is often a key identifier used in the matching process

- Increasing reluctance to provide a full 9 digit SSN
- Since 2007, National Health Interview Survey (NHIS) requests only the last 4 digits of SSN - Less identifying
- Requires modified linkage method
- SPB developed a variant algorithm to determine "Class" and "Score" for respondents with only last 4 digits of SSN


## Background: Score

SPB assigned a score to each potential match reflecting degree of agreement between the identifying information on the survey record and the NDI death record

- Score based on probabilistic weights assigned to each identifying data item used in the NCHS-NDI record match
- Weights could be positive, negative, or zero
- Score for SSN based on sum of the individual digit weights
- Total score for each potential match was sum of weights for each item


## Background: Class

- After scoring potential matches, each was categorized into one of five mutually exclusive classes
- Classes reflect that some items are more important for determining true matches than others (e.g. SSN vs state of birth) and that non-changing information is more important than information that can change over time (e.g. birth surname vs marital status)
- Class and score used to determine final mortality status


## Class, Score, and Mortality Status

| Class | Match | Score |
| :--- | :--- | :--- |
| 1 | At least 8 (of 9) or 4 (of 4) digits of SSN, FN, MI, LN, birth year (+/- 3 <br> years), birth month, sex, and state of birth | All True <br> Matches |
| 2 | At least 7 (of 9) or 4 (of 4) digits of SSN at least 5 more of the <br> following items: LN, MI, LN, birth year (+/-3 years), birth month, sex, <br> and state of birth | True Match <br> Score >=44 |
| 3 | A: SSN is unknown, but LN matched and at least 7 of the following <br> items agreed: FN, MI, LN, birth year (+/- 3 years), birth day, sex, race, <br> marital status and state of birth. <br> B: SSN was known but 3 or more (of 9) and 1 or more (of 4) digits <br> did not agree, but at least 8 of the following items agreed: FN, MI, LN, <br> birth year, birth day, sex, race, marital status, and state of birth. <br> Switched from Class 5 to Class 3 - SSN was recorded incorrectly or <br> spouse's SSN was recorded. Scores adjusted to reflect that SSN was <br> missing (assigned value of 0). | True Match <br> Score >=45 |
| 4 | SSN was unknown pn either the NCHS survey submission record or <br> the NDI record and fewer than 8 of the items listed in Class 3 matched | True Match <br> Score >=42 |
| 5 | SSN was present but fewer than 7 (of 9) or 4 (of 4) digits on SSN <br> agreed | None True <br> Matches |

## Evaluation of 4-Digit SSN Processing

Compare Class, Score, and Final Status when 4 digit algorithm is used instead of the 9 digit algorithm

Methods

- Data from NHIS 1999-2006 and NHANES 1999-2010
- All 9 digits were requested
- Censored first 5 digits and recalculated class and score as though only the last 4 digits were collected
- Censored all 9 digits and recalculated class and score
- 398,518 records for NHIS and 37,864 records for NHANES (Total $n=436,382$ )
- 106,286 records for NHIS and 23,187 records for NHANES (total $n=129,473$ ) had SSN (29.7\%)
- Agreement assessed using percent agreement and Kappa statistics


## Total Score 4-Digit vs 9-Digit SSN

$\square$ NHANES SSN-9 $\quad$ NHANES SSN-4 ■ NHIS SSN-9
$\square$ NHIS SSN-4 $\quad$ NHANES SSN-0 $\quad$ NHIS SSN-0


## Class Agreement: NHANES and NHIS

| Class SSN4 | Class SSN 9 |  |  |  |  | Total | \% in class |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1 | 2 | 3 | 4 | 5 |  |  |
| 1 | 17003 | 72 | 10 | 0 | 1 | 17086 | 3.92 |
| 2 | 0 | 5238 | 4 | 0 | 7 | 5249 | 1.2 |
| 3 | 262 | 200 | 29991 | 0 | 0 | 30453 | 6.98 |
| 4 | 0 | 0 | 1 | 278155 | 0 | 278156 | 63.74 |
| 5 | 16 | 167 | 0 | 0 | 105255 | 105438 | 24.16 |
| Total | 17281 | 5677 | 30006 | 278155 | 105263 | 436382 |  |
| \% in class | 3.96 | 1.3 | 6.88 | 63.74 | 24.12 |  |  |

Agreement on Class: 99.8\% , 435642 out of 436382 Kappa = . 9956 (95\% Cl: .9953, .9960)

## Final Status Agreement: NHANES and NHIS

|  | SSN 9 |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| SSN 4 | Alive | Dead | Total | Status\% |
| Alive | $\mathbf{3 8 8 , 5 2 9}$ | 383 | 388,912 | $\mathbf{8 9 . 1 2}$ |
| Dead | 3 | $\mathbf{4 7 , 4 6 7}$ | 3,761 | $\mathbf{1 0 . 8 8}$ |
| Total | 388,532 | 47,850 | 436,382 |  |
| Status\% | $\mathbf{8 9 . 0 3}$ | $\mathbf{1 0 . 9 7}$ |  |  |

Agreement on Status: 99.9\% , 435996 out of 436382

$$
\text { Kарра = . } 9955 \text { (95\% Cl: .9950, .9959) }
$$

# Class Agreement: NHANES and NHIS Only Records with SSN Present 

|  | Class SSN 9 |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Class SSN4 | 1 | 2 | 3 | 5 | Total | \% in class |
| 1 | 17003 | 72 | 10 | 1 | 17,086 | 13.20 |
| 2 | 0 | 5238 | 4 | 7 | 5,249 | 4.05 |
| 3 | 262 | 200 | 1238 | 0 | 1,700 | 1.31 |
| 5 | 16 | 167 | 0 | 105255 | 105,438 | 81.44 |
| Total | 17,281 | 5,677 | 1,252 | 105,263 | 129,473 |  |
| \% in class | 13.35 | 4.38 | 0.97 | 81.30 |  |  |

Agreement on Class: 99.4\% , 128734 out of 129473 Kарра = . 9903 (95\% Cl: .9896, .9911)

# Final Status Agreement: NHANES and NHIS Only Records with SSN Present 

|  | SSN 9 |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| SSN 4 | Alive | Dead | Total | Status\% |
| Alive | $\mathbf{1 0 6 , 0 1 0}$ | 383 | 106,393 | $\mathbf{8 2 . 1 7}$ |
| Dead | 3 | $\mathbf{2 3 , 0 7 7}$ | 3,761 | $\mathbf{1 7 . 8 3}$ |
| Total | 106,013 | 23,460 | 129,473 |  |
| Status\% | $\mathbf{8 1 . 8 8}$ | $\mathbf{1 8 . 1 2}$ |  |  |

Agreement on Status: 99.7\% , 129087 out of 129,473 Kappa = . 9899 (95\% CI: .9889, .9909)

## Number of Deaths using 9 digit SSN, 4 digit SSN and No SSN

- Consider deaths identified by 9 digit SSN as true matches
- Number of false positives and false negatives is considerably smaller for 4 digit SSN algorithm compared to no SSN [numbers comparing no SSN to 4 digit SSN]

| All Records |  |  |  | Only Records with SSN |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | SSN 9 | SSN 4 | No SSN | SSN 9 | SSN 4 | No SSN |
| Number of Deaths | 47,850 | 47,470 | 46,550 | 23,460 | 23,080 | 22,601 |
| False Positive <br> (Dead by <br> Alternative) |  | 3 | $\begin{array}{\|l\|} \hline 629 \\ {[693]} \end{array}$ |  | 3 | $\begin{array}{\|l\|} \hline 629 \\ {[693]} \end{array}$ |
| False Negative <br> (Alive by Alternative) |  | 383 | $\begin{aligned} & 1929 \\ & {[1613]} \end{aligned}$ |  | 383 | $\begin{aligned} & 1488 \\ & {[1172]} \end{aligned}$ |

## Summary

4 digit SSN algorithm performed well compared to the 9 digit algorithm

- Overall agreement on final status was high
- In general, agreement was not different based on survey, respondent sex, or race/ethnicity
- A relatively small number of deaths (383) identified using 9-digit SSN were not identified using 4-digit algorithm
Compared to status determined without SSN, the 4 digit algorithm resulted in fewer false negatives and false positives


## Conclusions

The 4 digit SSN algorithm provided results very similar to those obtained using the 9 digit algorithm
The additional matching information provided by the last 4 SSN digits could be beneficial in determining true matches

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## Percent of Records with SSN Present by Survey, Sex, and Race/Ethnicity



