Multilaboratory Assessment of Threshold versus Fold-Change Algorithms for Minimizing Analytical Variability in Multiplexed Pneumococcal IgG Measurements

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Pneumococcal vaccination is frequently used to evaluate a patient’s humoral immune function. The comparison of pre- and postvaccination levels of antipneumococcal antibodies is widely held to be the gold standard for documenting a response. However, many of the published criteria for defining an adequate response are based on assays that are no longer widely available. We compared the clinical classification of patient response by multiplex pneumococcal assays currently performed at three large reference laboratories using a variety of published criteria for defining responses in adults. The classification of responders agreed for 79% of the patients when using a threshold-based algorithm compared to 57 to 96% of the patients when using various fold-change-based algorithms. The highest rate of discordance was seen when the most stringent criteria for response were used (4-fold increase postvaccination in 70% of serotypes). The discordant samples tended to show similar patterns of response across all three assays, with small variations in the final number of serotypes converting postvaccination. We conclude that the use of published cut points for documenting response to pneumococcal vaccination can be affected by interlaboratory differences in pneumococcal assays, particularly for algorithms that require large fold changes for a response to be documented. However, the overall patterns of response were similar in virtually all samples, regardless of the assay used.

Pneumococcal vaccination is often used to evaluate a patient’s response to polysaccharide antigens during a workup for deficiencies in antibody production. The adequacy of the specific vaccine response can be assessed by measuring postvaccination levels of antipneumococcal antibodies and by comparing these levels against predetermined cut points for either the absolute antibody level or the fold change relative to the baseline value. Measurements can be performed by a variety of analytical methods, including enzyme-linked immunosorbent assays (ELISAs) for total pneumococcal antibody level (1), ELISAs for antibodies against specific pneumococcal serotypes (2), and multiplex assays which measure the levels of a panel of serotype-specific antibodies (3–5). Because the vast majority of assays used for this purpose are lab–developed tests (LDTs) that were created and characterized by individual laboratories, the potential for interlaboratory variation in results exists. This may lead to difficulties when trying to interpret analytical results compared to the literature-based definitions for a therapeutic response to vaccination.

The assessment of a patient’s response when only a single (postvaccination) sample is available is usually done by comparing serotype-specific results against a “protective” threshold (6). However, the use of paired pre- and postvaccination samples is preferred because of the additional information provided for evaluating humoral immune function, which is the primary objective of these assays. Approaches for evaluating response from paired specimens can be broadly divided into threshold-based and fold-change-based algorithms. For threshold-based approaches, the levels of antibody in the postvaccination specimen are compared against a predetermined threshold to demonstrate response (6, 7). While similar to the approach used for single specimens, the availability of the baseline sample helps to ensure that conversion of individual serotypes from a nonprotected to a protected status is due to vaccination, not to prior exposure to pneumococcal infection and/or nonspecific assay interferences for individual serotypes. For the fold-change approaches, the absolute level of pneumococcal antibody in the postvaccination specimen is expressed as a ratio to the baseline level to quantify the increase following vaccination (8). This approach is particularly helpful in patients who have protective levels of antibody prior to vaccination, because it allows one to quantify the response above what was present at baseline.

Many different recommendations for what constitutes an adequate vaccine response have been published. Historically, the most commonly recommended criteria for an adequate vaccination response in adults have been either an absolute level of >1.3 μg/ml or a 4-fold change in antibody levels postvaccination, usually in 70% of serotypes (6, 9–11). However, clinical data on the relative performance of these thresholds are limited, and as a result, there is not a universal consensus on these recommendations. Lower thresholds have been suggested for the percentage of serotypes (50% versus 70%) and the fold change (2-fold versus 4-fold) required (10, 12) for a response to be documented.

An additional complication is the fact that many of the recommendations in the literature are based on analytical methods that...
TABLE 1 Between-assay correlations in absolute pneumococcal antibody levels

<table>
<thead>
<tr>
<th>Laboratory comparison</th>
<th>Slope (95% CI)</th>
<th>Intercept</th>
<th>Bias</th>
<th>% bias</th>
<th>n</th>
</tr>
</thead>
<tbody>
<tr>
<td>A vs C</td>
<td>0.9599</td>
<td>0.979 (0.913 to 1.046)</td>
<td>-0.057</td>
<td>-0.176</td>
<td>-3.1</td>
</tr>
<tr>
<td>3</td>
<td>0.8725</td>
<td>0.833 (0.733 to 0.933)</td>
<td>-0.348</td>
<td>-1.057</td>
<td>-28.5</td>
</tr>
<tr>
<td>4</td>
<td>0.9729</td>
<td>0.868 (0.823 to 0.913)</td>
<td>-0.213</td>
<td>-0.429</td>
<td>-30.2</td>
</tr>
<tr>
<td>6B</td>
<td>0.9442</td>
<td>1.433 (1.315 to 1.552)</td>
<td>-2.93</td>
<td>2.34</td>
<td>17.6</td>
</tr>
<tr>
<td>7F</td>
<td>0.9659</td>
<td>1.076 (1.016 to 1.136)</td>
<td>-0.664</td>
<td>-0.262</td>
<td>-5.0</td>
</tr>
<tr>
<td>8</td>
<td>0.9025</td>
<td>1.242 (1.120 to 1.365)</td>
<td>0.037</td>
<td>1.284</td>
<td>22.2</td>
</tr>
<tr>
<td>9N</td>
<td>0.9608</td>
<td>1.099 (1.027 to 1.171)</td>
<td>-0.607</td>
<td>-0.044</td>
<td>-0.8</td>
</tr>
<tr>
<td>9V</td>
<td>0.9484</td>
<td>1.119 (1.070 to 1.274)</td>
<td>-1.176</td>
<td>-0.277</td>
<td>-6.0</td>
</tr>
<tr>
<td>12F</td>
<td>0.9404</td>
<td>1.167 (1.055 to 1.278)</td>
<td>-1.165</td>
<td>0.143</td>
<td>1.8</td>
</tr>
<tr>
<td>14</td>
<td>0.9565</td>
<td>1.184 (1.104 to 1.263)</td>
<td>-1.214</td>
<td>0.258</td>
<td>3.2</td>
</tr>
<tr>
<td>18C</td>
<td>0.9652</td>
<td>1.203 (1.125 to 1.280)</td>
<td>-0.604</td>
<td>-0.062</td>
<td>-2.3</td>
</tr>
<tr>
<td>19F</td>
<td>0.3473</td>
<td>8.933 (7.092 to 10.774)</td>
<td>-42.688</td>
<td>2.066</td>
<td>31.0</td>
</tr>
<tr>
<td>23F</td>
<td>0.9605</td>
<td>1.294 (1.210 to 1.378)</td>
<td>-0.548</td>
<td>0.345</td>
<td>-10.8</td>
</tr>
</tbody>
</table>

A vs B | 0.6634 | 0.666 (0.534 to 0.798) | 1.661 | -0.002 | 0.0 | 82 |
| 3 | 0.7889 | 0.521 (0.435 to 0.608) | -0.097 | -1.814 | -67.7 | 74 |
| 4 | 0.7399 | 0.679 (0.564 to 0.795) | 0.2 | -0.246 | -19.4 | 82 |
| 6B | 0.7852 | 0.651 (0.536 to 0.766) | 1.07 | -1.783 | -24.5 | 63 |
| 7F | 0.6731 | 0.468 (0.375 to 0.561) | 0.612 | -2.088 | -51.8 | 90 |
| 8 | 0.675 | 0.889 (0.726 to 1.052) | 0.841 | 0.385 | 9.0 | 82 |
| 9N | 0.5103 | 0.314 (0.212 to 0.416) | 1.368 | -1.706 | -47.0 | 76 |
| 9V | 0.6744 | 1.117 (0.922 to 1.312) | -0.961 | -0.458 | -11.3 | 84 |
| 12F | 0.8121 | 0.255 (0.215 to 0.294) | 1.074 | -1.728 | -59.7 | 82 |
| 14 | 0.6983 | 0.685 (0.557 to 0.813) | -0.442 | -2.846 | -45.8 | 80 |
| 18C | 0.6609 | 3.925 (3.232 to 4.619) | -2.437 | 4.749 | 98.3 | 74 |
| 19F | 0.2223 | 5.84 (4.584 to 7.096) | -22.998 | 2.275 | 35.8 | 84 |
| 23F | 0.7496 | 0.939 (0.776 to 1.102) | 0.07 | -0.052 | -2.6 | 69 |

B vs C | 0.582 | 0.404 (0.296 to 0.513) | 3.124 | -0.698 | -11.5 | 75 |
| 3 | 0.7661 | 0.548 (0.455 to 0.641) | 0.332 | -0.916 | -39.8 | 78 |
| 4 | 0.8504 | 1.024 (0.899 to 1.148) | 0.249 | 0.27 | 26.6 | 82 |
| 6B | 0.7465 | 0.354 (0.283 to 0.425) | 2.467 | -3.663 | -47.9 | 70 |
| 7F | 0.6902 | 0.304 (0.241 to 0.366) | 1.448 | -2.676 | -58.4 | 89 |
| 8 | 0.4425 | 0.296 (0.185 to 0.407) | 2.947 | -1.668 | -29.1 | 76 |
| 9N | 0.5121 | 0.305 (0.207 to 0.404) | 1.459 | -1.466 | -42.1 | 77 |
| 9V | 0.7287 | 0.522 (0.429 to 0.615) | 1.584 | -1.025 | -20.7 | 86 |
| 12F | 0.8043 | 0.188 (0.149 to 0.228) | 1.667 | -3.24 | -73.2 | 51 |
| 14 | 0.8061 | 0.422 (0.359 to 0.484) | 1.197 | -6.302 | -64.2 | 86 |
| 18C | 0.6582 | 0.686 (0.548 to 0.823) | 4.825 | 2.362 | 26.2 | 80 |
| 19F | 0.7766 | 1.738 (1.495 to 1.981) | 0.267 | 3.767 | 56.9 | 85 |
| 23F | 0.9102 | 0.772 (0.693 to 0.850) | 0.225 | -0.203 | -11.4 | 73 |

*a All possible pairwise comparisons of the three assays are shown for each serotype. Regression statistics were calculated by Deming analysis.

* Average bias is presented as the absolute bias and the percent bias for each comparison.

* Number of samples which fell within the quantifiable range of the assays in question for a given pairwise comparison.

are not commercially available for current use, which calls into question how relevant these cut points will be with the current methodologies. Bead-based multiplex immunoassays are the most widely available technique in commercial U.S. laboratories for measuring pneumococcal antibody levels (13), but most assays are LDTs that are unique to a particular laboratory. As a result, it is not clear how the clinical classification of a response would be affected by interlaboratory variability in the assays. To address this, we have evaluated the performance of three multiplex pneumococcal IgG assays in a large series of paired pre- and postvaccination samples to determine what impact analytical variability has on the final clinical classification of these patients under a variety of algorithms for defining a response.

MATERIALS AND METHODS

Sample acquisition. Serum samples used for this study were residual material from specimens submitted to ARUP Laboratories for pneumococcal antibody testing. All samples were deidentified according to protocols approved by the University of Utah Institutional Review Board. Paired pre- and post-pneumococcal vaccination samples were obtained from 47 individuals who ranged in age from 2 to 82 years (median age, 42 years).

Pneumococcal IgG testing. The samples were tested by three reference laboratories using different assays for measuring serotype-specific pneumococcal IgG antibody levels. Although all three assays were based on the same bead-based multiplex immunoassay platform, the specific analytical methods varied among the laboratories. Laboratory A used the
that serotype.

Detection, a fold change of 1 was entered to represent a lack of response for

fold change). For patients in whom both samples fell below the limit of
detection for the assay (which would represent a minimum estimate of the
sample), the ratio was calculated by using the corresponding limit of de-
cetion sample or above the limit of detection for the postvaccination
fell out of range (i.e., a result below the limit of detection for the prevac-

ation values for all serotypes for which the results fell within the
reportable range of the respective assays. Correla-
tion coefficients varied widely between the laboratories and be-

between serotypes, with \( r \) values ranging from 0.22 to 0.96 (Table 1).

This was similar to the results seen in our prior study, which com-
pared a different set of LDTs in single specimens (16). However,

unlike the prior study, no systematic bias was seen for any assay
relative to the others, and the median values were not significantly
different between laboratories for the majority of serotypes (data
not shown). Serotypes 18C and 19F showed the most variation
between laboratories.

Clinical classification of response using a threshold-based algo-
rithm. Responders were defined as patients in whom 70% of
the serotypes achieved an absolute level of \( >1.3 \mu g/\text{mL} \) in the
postvaccination sample. Based on previously published rec-

ommendations from Paris and Sorensen (6). In the individual
specimens tested, 86% (81/94) were classified in the same way by all
three laboratories. However, there was a notable difference in
agreement rates between the pre- and postvaccination samples,
with a higher degree of concordance in the pretreatment samples
(Fig. 1). As a result, 79% (34/43) of the evaluable patients received
the same final classification from all 3 laboratories (22 responders
and 12 nonresponders). The response patterns were fairly consis-
tent between laboratories, although the exact number of serotypes
converting varied slightly in some samples (Fig. 2A and B). The
majority of the nine discrepant patients were those in whom the
overall trends of serotype conversion were similar across all labo-

atories but whose samples narrowly missed the 70% threshold in
one of the three assays (Fig. 2C).

Clinical classification of response using a fold-change algo-
rithm. We next calculated fold-change ratios for each pneumo-
coccal serotype (using the criteria described in Materials and

xMAP Pneum 14 pneumococcal immunity panel in vitro diagnostic
(IVD) kit previously marketed by Luminex (Austin, TX). This assay de-
tects antibodies against 14 pneumococcal serotypes, i.e., 1, 3, 4, 6B, 7F, 8,
9N, 9V, 12F, 14, 18C, 19A, 19F, and 23F. Standard values for the assay are

alibrated to FDA-89 reference serum, and assay buffers incorporate cell
wall polysaccharide and polysaccharide type 22F as blocking agents. The
performance characteristics of this assay have been reported (14, 15). The
samples assayed by laboratories B and C were tested using LDTs based on
the Luminex platform, which measures antibodies against 14 pneumo-
coccal serotypes, i.e., 1, 3, 4, 5, 6B, 7F, 8, 9N, 9V, 12F, 14, 18C, 19F, and
23F. As with the IVD assay, the LDTs are calibrated to FDA-89 reference
serum and utilize buffers containing cell wall polysaccharide and polysac-
charide type 22F to minimize nonspecific binding. All samples were tested
once, and the assays were run according to the standard protocols in place
at the performing laboratory.

Definition of vaccination response. A threshold-based response was
defined as a response in a patient in whom 70% of the serotypes achieved
an absolute level of \( >1.3 \mu g/\text{mL} \) in the postvaccination sample (6, 10).
Response calculations were performed for 43/47 patients (four patients
were excluded from threshold-based analysis because their prevaccina-
tion samples already exceeded the threshold). Fold-change response cal-
culations were performed by dividing the postvaccination values by the
prevaccination values for all serotypes for which the results fell within the
reportable range of the assay. For patients in whom one of the two samples
fell out of range (i.e., a result below the limit of detection for the prevac-

ination sample or above the limit of detection for the postvaccination
sample), the ratio was calculated by using the corresponding limit of de-
tection for the assay (which would represent a minimum estimate of the
fold change). For patients in whom both samples fell below the limit of
detection, a fold change of 1 was entered to represent a lack of response for
that serotype.

Statistical analysis. Method comparisons and correlation statistics for
quantitative results were calculated using EP Evaluator software (release
9). Correlations were calculated using Deming regression.

RESULTS
Quantitative variation in pneumococcal IgG measurements be-
tween assays. The absolute pneumococcal antibody levels re-
ported for each serotype were directly compared across laborato-

ries for the 13 serotypes common to all the assays. A total of 3,666
individual serotype results were generated from the 94 samples in
the test set. Pairwise comparisons were performed for all possible
combinations of laboratories using specimens in which the values
fell within the reportable range of the respective assays. Correla-
tion coefficients varied widely between the laboratories and be-

between serotypes, with \( r \) values ranging from 0.22 to 0.96 (Table 1).

This was similar to the results seen in our prior study, which com-
pared a different set of LDTs in single specimens (16). However,

unlike the prior study, no systematic bias was seen for any assay
relative to the others, and the median values were not significantly
different between laboratories for the majority of serotypes (data
not shown). Serotypes 18C and 19F showed the most variation
between laboratories.
Methods) and classified patients as responders or nonresponders based on the magnitude of increase in antibody level in the postvaccination sample. Because several different cutoffs have been recommended in the literature, we evaluated multiple response criteria by varying the fold change required for response (2-fold versus 4-fold) and the percentage of serotypes showing this change (50% versus 70%). Interassay agreement was >90% when using the least stringent definition of response (a 2-fold increase in 50% of the samples), but it dropped with increasing stringency of response criteria (Table 2). The disparity at higher cut points was largely driven by samples identified as consensus responders at the 2-fold/50% cut point that shifted to nonresponders at a higher threshold in one or more laboratories.

Comparison of fold-change- and threshold-based classifications. Finally, we examined whether the choice of response algorithm had an impact on final patient classification by comparing the results for each patient across all the methods (Fig. 3). Forty-three percent of the patients were classified identically across all the laboratories using all the algorithms (6 nonresponders [Fig. 3, red areas] and 14 responders [Fig. 3, green areas]). The majority of the discrepant samples fell into several distinct categories (Fig. 4).

### Table 2: Interassay agreement using fold-change approach

<table>
<thead>
<tr>
<th>Fold change</th>
<th>% agreement</th>
<th>All R</th>
<th>2 R</th>
<th>2 NR</th>
<th>All NR</th>
</tr>
</thead>
<tbody>
<tr>
<td>2 x increase in 50% of serotypes</td>
<td>96</td>
<td>37</td>
<td>2</td>
<td>0</td>
<td>8</td>
</tr>
<tr>
<td>2 x increase in 70% of serotypes</td>
<td>79</td>
<td>29</td>
<td>9</td>
<td>1</td>
<td>8</td>
</tr>
<tr>
<td>4 x increase in 50% of serotypes</td>
<td>68</td>
<td>23</td>
<td>14</td>
<td>1</td>
<td>9</td>
</tr>
<tr>
<td>4 x increase in 70% of serotypes</td>
<td>57</td>
<td>16</td>
<td>12</td>
<td>8</td>
<td>11</td>
</tr>
</tbody>
</table>

* Fold change was calculated as the postvaccination level/prevaccination level ratio for each serotype.

* Percent agreement is based on the total number of samples classified by all three laboratories as being from a responder or nonresponder.

* R, responder.

* NR, nonresponder.
Seven patients were classified as nonresponders by all the methods using the threshold approach but were called responders by most methods using the fold-increase definitions (Fig. 3, group A). These were primarily patients with 5 to 8 serotypes who achieved a level of >1.3 g/ml postvaccination and therefore narrowly missed the 70% needed to reach the threshold but had widespread increases in levels across most titers (Fig. 4). Two patients were classified as nonresponders by all the labs by the fold-change method but had mixed results by the threshold method (Fig. 3, group B). These patients had high baseline levels of antibody in multiple serotypes in their prevaccination samples and showed minimal changes postvaccination (Fig. 4). Finally, an additional 8 patients were classified as consistent responders in most cases using the threshold and fold-change criteria, but their levels failed to meet the 4-fold threshold for response in laboratory B (Fig. 3, group C). However, the overall patterns of increased levels postvaccination in this group were similar across all the laboratories (Fig. 4), and the patient would likely have been called responders based on the combined trend across all serotypes. The remaining seven discordant samples showed mixed responses across the various laboratories and algorithms.

**DISCUSSION**

Multiplex immunoassays are some of the most analytically complex techniques in clinical use. As such, they can be prone to substantial analytical variability between laboratories, particularly for LDTs that are independently developed in different locations. Multiplex pneumococcal IgG measurements are no exception to this. As demonstrated in this study and elsewhere (13, 16), interassay agreements in quantitative antibody levels can show substantial variation, agreeing well for some serotype-assay combinations while disagreeing for others. However, this variability can be
somewhat mitigated by the use of clinical algorithms that consider the serotype profile as a whole.

Overall, threshold-based algorithms for defining response were less affected by interlaboratory variability than algorithms based on fold change. The interlaboratory agreement in response classification was 79% when using a threshold-based definition of response, which is similar to the 82% agreement in protective status seen in our prior study, which used single specimens (16). The results for algorithms that used a 2-fold cutoff were also fairly consistent between laboratories, ranging from 79 to 96% agreement. However, increasing the definition of response to a 4-fold increase led to more disparity between the methods. Interestingly, individual analysis of the paired results in these discordant patients showed that many of these patients actually had very similar patterns of serotype response. Many of the postvaccination samples that failed to meet a given response criteria (threshold or fold change) in 70% of the serotypes clearly showed an increase above baseline samples in the results from all laboratories and usually reached the 50% threshold. As a result, they would likely have been considered responders based on the overall pattern if interpreted as a whole.

One area where interassay differences had a noticeable impact was the magnitude of the fold change calculated, which can vary from 10- to 100-fold in some cases. The primary factors underlying this effect were differences in the reportable ranges of the various assays, particularly on the low end. For example, laboratory C had the lowest reportable range of the three assays, reporting results as low as 0.01 μg/ml for some serotypes (Fig. 4). As a result, this lower denominator resulted in larger calculated fold changes in many cases compared to those for laboratories A and B. For the most part, this had very little impact on the final clinical classification, because strongly responding serotypes would consistently meet the response criteria in all assays. However, assay-specific differences such as this may make it difficult to directly apply literature-derived cut points for fold-change data that are generated using different assays.

One potential limitation to this study is that all of the assays tested were based on a single underlying technology (the Luminex-based multiplex bead array). As a result, these assays may show a better level of agreement than one would see when comparing LDTs based on differing analytical platforms. From a practical standpoint, multiplex bead arrays are the primary technology utilized for most commercially available tests in the United States, so these results should be applicable to current clinical practice. However, clinical implementation of other multiplex methodologies for pneumococcal serotyping, such as plate-based arrays (17–19), may introduce an additional level of potential variability between laboratories.

While the use of predefined algorithms can be helpful in providing standardized definitions for response to vaccination, caution must be used in adhering too rigidly to these criteria. This can be seen in several instances of this study. For example, most of the patients classified as nonresponders according to the threshold approach clearly showed substantial increases in the number of protective serotypes postvaccination, which demonstrates some capacity for response to the specific vaccine (Fig. 2). Likewise, many of the patients whose results were discordant between laboratories showed very similar overall patterns of response between the assays and differed only in a small percentage of the serotypes measured (i.e., 7 responsive serotypes versus 9). This further emphasizes the need to apply guidelines in the full context of all findings, both laboratory and clinical, as stressed in a recent consensus document (10). An important point is that this study focused solely on the use of pneumococcal vaccination as a method.
for defining immune responsiveness in adults. The use of multiplex assays for defining protective immunity, particularly in pediatric patients, was not addressed. The level of interlaboratory agreement in clinical classifications for those types of applications may differ because of the generally lower cut points used in those algorithms (0.2 or 0.35 μg/ml) (20, 21) and the differing levels of immune responses in pediatric patients versus older adults. Further study in a pediatric population of samples is needed to address this issue.

Laboratories will always strive to maximize the analytical performance of the testing that they perform, but some level of intermethod variability is often unavoidable, particularly for complex assays. With the withdrawal of the Luminex xMAP Pneumococcal IVD assay, the only options available to clinicians in the United States for pneumococcal testing are LDTs developed and validated by individual laboratories. The results of this study suggest that the impact of interlaboratory variability on determining responses to pneumococcal vaccination is relatively small when using paired samples, particularly under less-stringent response criteria. The presence of multiple measurements within the same sample allows one to assess the overall trend, minimizing the impact of analytical variability on any single measurement.

REFERENCES