Original Research Lung Cancer



PODCAST

Physician Assessment of Pretest Probability of Malignancy and Adherence With Guidelines for Pulmonary Nodule Evaluation

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BACKGROUND: The annual incidence of pulmonary nodules is estimated at 1.57 million. Guidelines recommend using an initial assessment of nodule probability of malignancy (pCA). A previous study found that despite this recommendation, physicians did not follow guidelines.

METHODS: Physician assessments (N = 337) and two previously validated risk model assessments of pretest probability of cancer were evaluated for performance in 337 patients with pulmonary nodules based on final diagnosis and compared. Physician-assessed pCA was categorized into low, intermediate, and high risk, and the next test ordered was evaluated.

RESULTS: The prevalence of malignancy was 47% (n = 158) at 1 year. Physician-assessed pCA performed better than nodule prediction calculators (area under the curve, 0.85 vs 0.75; P < .001 and .78; P = .0001). Physicians did not follow indicated guidelines when selecting the next test in 61% of cases (n = 205). Despite recommendations for serial CT imaging in those with low pCA, 52% (n = 13) were managed more aggressively with PET imaging or biopsy; 12% (n = 3) underwent biopsy procedures for benign disease. Alternatively, in the high-risk category, the majority (n = 103 [75%]) were managed more conservatively. Stratified by diagnosis, 92% (n = 22) with benign disease underwent more conservative management with CT imaging (20%), PET scanning (15%), or biopsy (8%), although three had surgery (8%).

CONCLUSIONS: Physician assessment as a means for predicting malignancy in pulmonary nodules is more accurate than previously validated nodule prediction calculators. Despite the accuracy of clinical intuition, physicians did not follow guideline-based recommendations when selecting the next diagnostic test. To provide optimal patient care, focus in the areas of guideline refinement, implementation, and dissemination is needed.

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KEY WORDS: guideline adherence; nodule management; nodule risk prediction; pulmonary nodules

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ABBREVIATIONS: AUC = area under the curve; pCA = probability of malignancy

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The estimated annual incidence of pulmonary nodules detected on chest CT imaging in the United States is 1.6 million cases.¹ This is in large part due to scans being increasingly ordered for a variety of clinical presentations. In one large integrated health system, the number of scans performed over a 7-year period increased by 53%.¹ This calculation, which was done before the advent of lung cancer screening, is likely to increase further as screening is implemented in the United States.¹

The management of pulmonary nodules is driven by the importance of distinguishing those that are malignant from those that are not by balancing the desire to intervene quickly for malignant nodules while avoiding and limiting procedures for ones that are benign. Guidelines for pulmonary nodule management encourage physicians to use estimates of pretest probability for malignancy as determined by clinical intuition or validated prediction models.^{2,3} Based on this

Methods

These data were collected as part of a prospective multicenter observational trial evaluating a plasma proteomics test for pulmonary nodules. It was approved by the Institutional Review Board of the Medical University of South Carolina (Pro00020287).

Site Selection

Thirty-three North American (31 US, two Canadian) sites qualified and agreed to participate. Three hundred thirty-seven physicians participated in the trial: 278 pulmonologists, 47 surgeons, and 12 oncologists.

Patient Selection

Eligibility included patients ≥ 40 years of age referred to a pulmonologist or a thoracic surgeon, or both, for evaluation of a lung nodule ≥ 8 mm and ≤ 30 mm identified on a baseline CT scan and first detected within 60 days of enrollment. Those with CT scans identifying the same nodule > 60 days prior to enrollment and those with a current or prior diagnosis of any cancer within the previous 2 years, with the exception of nonmelanomatous skin cancer, were excluded. Consecutive patients meeting criteria and agreeing to participate were enrolled.

Data Collection

Patient data, including demographics, imaging, and procedures performed, were collected until a definitive diagnosis, nodule resolution, or at least 1 year of radiographic stability. At the time of enrollment, the treating physician was asked to indicate his/her assessment of nodule pretest probability of malignancy (pCA) (eg, 0%-5%, 6%-10%, 11%-20%, 21%-30%). Physician assessment of malignancy was individually determined, taking into account patient and nodule characteristics. Nodule characteristics, including size, contour, and location as determined by the interpreting radiologist,

risk assessment, guidelines recommend surveillance in nodules with low risk, PET imaging \pm biopsy in those with intermediate risk, and surgery in those at high risk.

Despite guideline recommendations, however, a previous study of nodules managed by community pulmonologists found that biopsy and surgery rates were no different between patients at low, intermediate, and high risks of malignancy.⁴ This study was limited by the inability to obtain clinician-assessed pretest probability at the time of the management decision. Therefore, no direct link between physician-documented knowledge of pretest probability of cancer and downstream decisionmaking could be established. We undertook this study to prospectively compare intuitive estimates of pretest probability to validated nodule malignancy prediction calculators. In addition, we sought to determine how often appropriate guideline-recommended diagnostic testing was used based on clinician assessment of malignancy.

were documented on baseline and subsequent scans. Data were collected in patients who underwent subsequent evaluation with PET scanning. These scans were further categorized as those performed within 30 days of surgery and those not associated with surgery. Data on procedure use, including bronchoscopy, transthoracic needle biopsy, and surgery, were collected.

Pretest pCA

Two previously developed and validated models were used to estimate the pCA in each patient.^{5,6} Model accuracy and clinician-estimated pretest probabilities were determined by comparing the pCA with the final diagnosis. Receiver operating characteristic curves and the area under the curve (AUC) were generated for both models and physician pCA with 95% CIs. Differences between the AUCs were calculated using standard error incorporating covariance and large sample Wald approximation. Physician-provided pCA for each patient was categorized into three groups based on the 2007 American College of Chest Physician (ACCP) guidelines for pulmonary nodule management (< 5%, 5%-60% and > 60%). Procedure use by categories of risk was examined for the next test ordered after the baseline CT scan identifying the nodule and the most invasive test ordered over the entire course of nodule management.

Data Analysis

 χ^2 or analysis of variance tests were used to compare subgroups, and P values of .05 were considered significant. A nodule was classified as benign based on confirmed benign pathologic features, radiographic resolution, or the absence of growth seen on radiographs as determined by the managing physician during surveillance of at least 1 year and up to 2 years. Statistical analyses were performed using MATLAB, version 8.3.0.532 (MathWorks) and MedCalc, version 16.4 (MedCalc Software).

Results

A total of 685 patients were enrolled in this multicenter prospective observational study. Figure 1 shows the reasons patients were excluded from the final analysis. Results are reported for the final cohort of 337 patients.

The prevalence of cancer in this cohort was 47% (n = 158). The demographics of participants stratified by diagnosis are presented in Table 1. The average age of all participants was 66 years (\pm 1.1 year) with a relatively even distribution of men and women. The majority (82%) were ever smokers with an average pack-year smoking history of 45.4 (\pm 3.8). Fifty-four (16%) had a previous history of cancer. There was no difference in the average pack-years between subjects with malignant nodules and those with benign nodules, although those with benign causes were twice as likely to be never smokers as opposed to those with malignancy. Twenty-one percent of nodules ≤ 11 mm in size were malignant, whereas 68% of nodules between 15 and 30 mm were malignant (P < .001) (e-Fig 1). The majority of diagnosed malignant nodules were primary lung cancers, with only one metastatic melanoma.

To better compare clinician baseline pCA assessment to prediction models, we calculated pretest probability for each individual in the study using two previously validated models (e-Appendix 1). Physician assessment of pCA was concordant with Veterans Administration (VA)- and Mayo-model-calculated pCA in 64% and 65% of cases, respectively (e-Table 1).

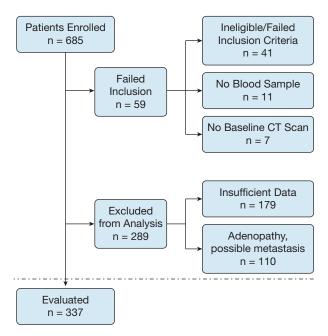


Figure 1 - Consort diagram.

Physicians were significantly better at predicting malignancy than either model (AUC, 0.85 vs 0.75 [VA model]; 95% CI, 0.70- 0.79 and AUC, 0.78 [Mayo model], 95% CI, 0.73- 0.82) (Fig 2). Physician-indicated pretest probability (pCA) at baseline CT scanning was categorized based on the 2007 version of the American College of Chest Physicians guidelines for nodule management, including low pCA < 5%, intermediate pCA 5% to 60%, and high pCA > 60%. Despite more accurately predicting malignancy, physician management differed from guideline recommendations on the next step in nodule evaluation in 61% of cases (n = 205). More than half of nodules (n = 177 [53%]) were managed more conservatively, whereas 8% (n = 28) were managed more aggressively compared with guideline recommendations.

Of the 25 nodules in which physician pCA was < 5%, the vast majority (n = 22) were ultimately found to be benign (Table 2). In this risk category, for which CT surveillance is recommended, management strategies were more aggressive in 52% of cases (n = 13), with three patients (12%) undergoing biopsy for benign disease. The three patients diagnosed with malignancy underwent PET scanning as the first test. Physician-assessed pCA placed 138 nodules in the high-risk (> 0.60) category; 114 (83%) were ultimately diagnosed as malignant. Although guidelines recommend surgery as the next step for most patients in this category, the majority (n = 103 [75%])were managed more conservatively (Table 2). Among those with benign disease, 92% (n = 22) underwent more conservative management with serial CT scanning (20%), PET scanning (63%), or biopsy (8%), and ultimately only two patients (8%) went on to have surgery for benign disease. Of those with malignancy, 33 (29%) went straight to guideline-recommended surgery, whereas 81 (71%) were managed by serial CT imaging (4%), PET scanning (55%), or biopsy (11%). VA- and Mayo-model risk assessment and guideline concordance are presented in e-Tables 2 and 3, respectively.

The next diagnostic procedure ordered following clinician assessment, as well as the most invasive procedures used over the course of nodule management, are presented in Table 3. There was no difference in the immediate use of surgery between the intermediate- and high-risk pCA groups; however, those with a low pCA did not go on to surgery initially. Biopsy as the first diagnostic procedure was used similarly among all categories of clinician-assessed pCA. As the pretest probability for malignancy increased, so did the use of PET scans (P < .001). As the pCA decreased, the use of CT surveillance as the initial management step increased

TABLE 1] D	emographics and	d Procedure	Use Stratified by	[,] Diagnosis
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Variable	All Patients	Cancer	Benign	P Value
No. of patients	337	158	179	
Age, y	66.3 (± 1.1)	67.5 (± 1.4)	65.3 (± 1.5)	.042
Sex, No. (%)				
Male	176 (52.2)	74 (46.8)	102 (57.0)	.063
Female	161 (47.8)	84 (53.2)	77 (43.0)	
Smoking history status, No. (%)				
Never	61 (18.1)	19 (12.0)	42 (23.5)	.004
Former	178 (52.8)	82 (51.9)	96 (53.6)	
Current	98 (29.1)	57 (36.1)	41 (22.9)	
Pack-year, mean	45.4 (± 3.8)	46.6 (± 4.4)	44.3 (± 6.3)	.560
Lung nodule size (millimeters)	15.8 (± 0.6)	18.4 (± 0.9)	13.6 (± .7)	< .001
Next procedure after initial CT scan, No. (%)				
Surgery	8 (2.37)	5 (3.16)	3 (1.68)	.376
Biopsy	30 (8.90)	14 (8.86)	16 (8.94)	.981
CT scan	96 (28.49)	12 (7.59)	84 (46.93)	< .001
$PET \le 30 \text{ d before surgery}$	43 (12.76)	37 (23.42)	6 (3.35)	< .001
PET ^a	160 (47.48)	90 (56.96)	70 (39.11)	.018
Procedure use, No. (%)				
Surgery	84 (24.9)	68 (43.0)	16 (8.9)	< .001
Biopsy	66 (19.6)	37 (23.4)	29 (16.2)	.135
Biopsy and surgery	58 (17.2)	50 (31.6)	8 (4.5)	< .001
CT imaging only	129 (38.3)	3 (1.9)	126 (7.4)	< .001
PET use, No. (%)				
Overall PET	227 (67.4)	142 (89.9)	85 (47.5)	< .001
\leq 30 d before surgery	44 (13.1)	38 (24.1)	6 (3.4)	< .001
\leq 30 d after biopsy	7 (2.1)	7 (4.4)	0 (0.0)	.005
\leq 30 d after biopsy and \leq 30 d before surgery	3 (0.9)	3 (1.9)	0 (0.0)	.065
No relation to biopsy/surgery	173 (51.3)	94 (59.5)	79 (44.1)	.050

^aPET not performed within 30 d of biopsy or surgery

(P < .001); however, 7% of subjects (n = 10) in the high-pCA category had CT imaging performed as the next step, contrary to guideline recommendations.

Discussion

The identification of incidentally detected pulmonary nodules is rising exponentially due to widespread use of CT scans. Although guidelines exist to aid in the management of pulmonary nodules, these continue to pose a diagnostic dilemma for clinicians. To our knowledge, this is the first study to prospectively follow the diagnostic odyssey of incidentally detected pulmonary nodules in the context of clinician assessed pretest pCA. It expands on a previously published analysis on nodule management by community pulmonologists and has several important findings. First, clinician-assessed pCA is better at predicting malignancy than two previously validated nodule calculators. Second, despite being more accurate at predicting malignancy, the majority of clinicians did not follow pCA-based guideline recommendations for nodule management when ordering the next test. Finally, clinicians were more aggressive than recommended for subjects in the low-risk category, in whom the vast majority of nodules were benign and serial surveillance was indicated. However, they were more conservative in their management decisions for patients in the high-risk category and thereby avoided recommending unnecessary surgery in a significant proportion of subjects with benign disease.

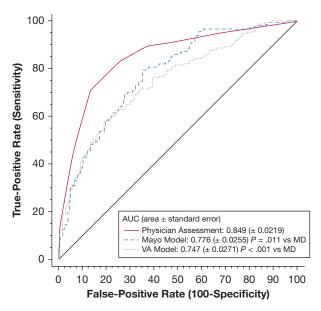


Figure 2 – *Physician and model receiver operator characteristic curve accuracy.*

Clinical practice guidelines have been available for more than a decade to assist clinicians in the management of pulmonary nodules.^{3,7,8} For patients with larger nodules (\geq 8 mm), management decisions are based on an assessment of the pretest probability of cancer, which is determined by either the use of validated nodule prediction models or physician assessment. The two most widely used models include the Mayo Clinic model and the VA model.^{5,6} These incorporate clinical and radiographic factors, including size, border contour, location, patient age, smoking history, and prior history of cancer. They are partially dependent on the prevalence of cancer in the cohort in which they were originally developed. For example, the Brock model, developed from a screened population, had a prevalence of malignancy of 5.5% and performs well in smaller nodules (AUC, 0.91 in nodules < 10 mm).⁹ The prevalence of malignancy in this cohort of patients was 47% and most closely mirrors the VA prediction model, in which prevalence was 54%.⁶ Overall, these models have been shown to be both accurate and useful in predicting the probability of cancer in pulmonary nodules. Although they have been compared with one another,¹⁰ to our knowledge, this is the first study that prospectively compares internally derived physician assessment to validated models and finds that physicians are highly accurate at predicting whether or not a nodule is malignant. These findings differ from a previous study in which physicians were presented with clinical vignettes and accompanying radiographs of patients with pulmonary nodules.¹¹ That study showed that although clinicians and validated models had similar accuracy for characterizing pulmonary nodules, the accuracy was only fair to good for both.¹¹ Another study compared predictions of the Mayo model with that of four expert clinicians (chest radiologist, pulmonologist, internist, and thoracic surgeon). Each clinician reviewed clinical information and plain chest radiographs from 100 selected cases and made a prediction of malignancy on a 10-point scale. In this study, there was no difference between the two; however, the accuracy was good for both.¹²

In a previous study, we compared model-assessed pCA and guideline-directed management of pulmonary nodules in a geographically diverse sample of

Physician-Assessed Pretest Probability	All n = 25 (%)	Cancer $n = 3$ (%)	Benign n = 22 (%)
Pretest probability $\leq 5\%$			
Guideline concordant CT surveillance	12 (48.0)	0 (0.0)	12 (54.5)
More aggressive	13 (52.0)	3 (100.0)	10 (45.5)
PET	9 (36.0)	2 (66.7)	7 (31.8)
$PET \le 30 \text{ d}$ before surgery	1 (4.0)	1 (33.3)	0 (0.0)
Biopsy	3 (12.0)	0 (0.0)	3 (13.6)
	All n = 138 (%)	Cancer n = 114 (%)	Benign n = 24 (%)
Pretest probability $\geq 60\%$	All n = 138 (%)	Cancer n = 114 (%)	Benign n = 24 (%)
Pretest probability $\ge 60\%$ Guideline-concordant surgery ^a	All n = 138 (%) 35 (25.4)	Cancer n = 114 (%) 33 (28.9)	Benign n = 24 (%) 2 (8.3)
Guideline-concordant surgery ^a	35 (25.4)	33 (28.9)	2 (8.3)
Guideline-concordant surgery ^a More conservative	35 (25.4) 103 (74.6)	33 (28.9) 81 (71.1)	2 (8.3) 22 (91.7)

TABLE 2] Physician Risk Assessment and Guideline Concordance

^aPET performed within 30 d of surgery was considered a staging PET scan and concordant with guidelines.

Demographics and Characteristics	< 0.05 (n = 25)	0.05 to $<$ 0.60 (n $=$ 174)	\geq 0.60 (n = 138)	P Value
Physician risk	2.5 (N/A)	26.0 (± 2.4)	78.9 (± 1.9)	
VA risk for same group	34.1 (± 8.8)	36.5 (± 3.2)	59.8 (± 3.4)	
Mayo risk for same group	24.8 (± 8.6)	29.8 (± 3.1)	53.1 (± 4.1)	
Outcome, No. (%)				
Benign	22 (88.0)	133 (76.4)	24 (17.4)	< .001
Cancer	3 (12.0)	41 (23.6)	114 (82.6)	
Age, y	67.5 (± 4.7)	65.3 (± 1.5)	67.4 (± 1.5)	.144
Sex, No. (%)				
Male	14 (56.0)	92 (52.9)	70 (5.7)	.862
Female	11 (44.0)	82 (47.1)	68 (49.3)	
Smoking history status, No. (%)				.003
Never	7 (28.0)	41 (23.6)	13 (9.4)	
Former	13 (52.0)	92 (52.9)	73 (52.9)	
Current	5 (20.0)	41 (23.6)	52 (37.7)	
Pack-year, mean	40.6 (± 15.9)	41.6 (± 5.0)	49.5 (± 5.0)	.106
Abstinence, y	10.6 (± 6.3)	9.6 (± 2.2)	5.7 (± 1.7)	.020
Lung nodule size	12.2 (± 1.2)	14.2 (± 0.8)	18.5 (± 1.0)	< .001
Next procedure after initial CT scan, No. (%)				
Surgery	0 (0.0)	3 (1.7)	5 (3.6)	.409
Biopsy	3 (12.0)	12 (6.9)	15 (1.9)	.453
CT scan	12 (48.0)	74 (42.5)	10 (7.2)	< .001
$PET \leq 30 \text{ d before surgery}$	1 (4.0%)	12 (6.9)	30 (21.7)	< .001
PET ^a	9 (36.0)	73 (42.0)	78 (56.5)	< .001
Total procedure use, No. (%)				
Surgery only	2 (8.0)	29 (16.7)	52 (37.7)	< .001
Biopsy only	3 (12.0)	32 (18.4)	31 (22.5)	.496
Biopsy and surgery	2 (8.0)	12 (6.9)	44 (31.9)	< .001
Biopsy or surgery	5 (20.0)	61 (35.1)	83 (60.1)	< .001
PET	10 (40.0)	95 (54.6)	122 (88.4)	< .001
CT scan only	18 (72.0)	99 (56.9)	11 (8.0)	< .001
Procedure use category, No. (%)				
Most invasive = surgery	4 (16.0)	41 (23.6)	96 (69.6)	< .001
Most Invasive = biopsy	3 (12.0)	32 (18.4)	31 (22.5)	.496
Surveillance	19 (72.0)	99 (56.9)	11 (8.0)	< .001

TABLE 3	Physician Pretest Probability	Assessment and Procedure Use Across Tertiles of Risk
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^aPET not performed within 30 d of biopsy or surgery

community pulmonologists.⁴ That study demonstrated that despite recommendations for management based on risk, physicians did not follow guidelines. For example, 44% of patients with low pCA underwent invasive testing when surveillance with serial CT imaging was indicated. Further, there was no difference in the frequency of surgery among patients with a low, intermediate, or high risk of cancer, and surgery was performed in 35% of patients with benign disease.⁴ This

finding was not seen in the current study, in which the use of surgery appropriately increased as the probability of cancer increased, and surveillance proportionally decreased. An important limitation to the previous study was the fact that there was no way of discerning if clinicians used their clinical intuition, a model, both, or neither to direct nodule management decisions. The findings of both of these studies are consistent with the literature published from the VA hospital system, in which half of patients with incidentally detected nodules and a pCA < 65% received guidelineconcordant care.¹³ It may be that clinicians do not find the guidelines valuable, given that many of the recommendations for nodule management are grade 2C (weak recommendation, low-quality evidence).^{3,14}

In the current study, clinician assessment of pCA was collected prospectively and prior to nodule management decisions. Despite accurate clinical intuition, physicians did not follow guideline-based recommendations for nodule management when selecting the next diagnostic test. They "erred" in both directions. In the low-risk category, they were more aggressive when serial imaging would suffice. In this category of risk, all but three patients had benign disease, yet 52% were managed more aggressively than recommended with either PET or biopsy. Thus, using physician intuition and following the guidelines would have provided more optimal care.

Conversely, in patients in whom the pCA exceeded 60% and guidelines recommend surgery, clinicians opted for more conservative management with biopsy, CT imaging, or PET scanning 75% of the time. In doing so, surgery was avoided in 22 of 24 patients with benign nodules. However, there was a trade-off in that 11% of those with cancer (n = 13) underwent an unnecessary biopsy procedure prior to surgery. The British Thoracic Society guidelines differ from the third iteration of the ACCP guidelines for nodule management in that the threshold for high risk is set at > 70% vs \ge 65%.^{2,3} One study using Markov modeling to determine appropriate thresholds for deciding management strategies for patients unfit for surgery suggested that $pCA \ge 85\%$ is appropriate to proceed to treatment without biopsyproven cancer.¹⁵ Our findings support the higher threshold for categorizing a nodule as high risk and suggest that further adjustment to the current guidelines may be indicated. For example, shifting the cutoff of pCA that categorizes a nodule as high risk (direct to surgery with no further testing) to 80% or greater would decrease the number of operations performed for patients with benign nodules if clinicians were to strictly follow the guidelines. This would come at the expense of a few additional biopsies in those with cancer. Models using this and other data could optimize nodule management by better defining low-, intermediate-, and high-risk categories and should be an area of future research.

This study has a number of limitations. First, we were unable to ascertain the degree to which patient preference may have played a role in management decisions regarding the nodule. Future studies should capture patient preferences and willingness to follow guidelines for nodule management. Second, the overall study was designed to test a blood biomarker, and thus the physicians at those study sites may have had more expertise in nodule management, perhaps limiting the generalizability of these findings. In addition, patient comorbidities were not accounted for in the rationale behind management decisions; it is possible that those with a high-risk pretest probability for malignancy were not surgical candidates and therefore underwent a biopsy procedure prior to radiation treatment or were managed more conservatively with imaging. Finally, there are additional nodule prediction models that incorporate PET information (Herder) and volumetric measurements (Bayesian Inference Malignancy Calculator) that may be more accurate than the prediction models used here; however, we did not have PET data on all patients, and volumetric measurements were not provided.¹⁶⁻²⁰ The strengths of the study include the fact that it is a geographically diverse sample with prospective data collected from patients with pulmonary nodules. In addition, an important attribute of this study was that physician assessment of pCA prior to diagnostic testing was provided.

In conclusion, clinicians are adept at distinguishing benign from malignant pulmonary nodules; however, they do not apply that data to the guidelines for nodule management consistently. In some instances, straying from the guidelines subjected patients to unnecessary testing, whereas in others, it appeared to prevent surgery for benign nodules. These findings have implications for patients presenting with pulmonary nodules, an increasingly common problem facing clinicians and patients. Enhancing existing prediction calculators by including novel radiographic measurements and exhaled, serum, and bronchoscopic biomarkers may aid in distinguishing benign from malignant disease and is an area of ongoing research.²¹⁻²⁴ Until these technologies become available or more widely used, more focus is needed in the areas of guideline refinement, implementation, and dissemination to provide optimal patient care.

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Additional information: The e-Appendix, e-Figure, and e-Tables can be found in the Supplemental Materials section of the online article.

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