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Clinical and laboratory data-based nomograms for neurosyphilis diagnosis in non-HIV syphilis patients: a cross-sectional study

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Abstract

Background:

The diagnosis of neurosyphilis (NS) is challenging due to the requirement of lumbar puncture and time-consuming cerebrospinal fluid tests. Therefore, a convenient high-accuracy diagnostic nomogram for NS is warranted.

Methods:

This cross-sectional study (108 patients) aimed to construct diagnostic models for diagnosing NS with data gathered between September 2015 and January 2020 at Western China Hospital of Sichuan University. We constructed two types of diagnostic models using 108 training samples: 1) symptoms and toluidine red unheated serum test (TRUST) (basic model) and 2) the combined model of symptoms, serum TRUST, and findings of CSF routine tests including CSF protein concentration and CSF glucose concentration (combined model). The clinical usefulness of the diagnostic models was assessed through the comparison of a receiver operating characteristic (ROC) and decision curve analysis (DCA), which adopted bootstrap resampling 500 times.

Results:

A total of 108 patients were analysed (82% males, mean age: 46 years). Of those, 76 were diagnosed as having reactive neurosyphilis under the criteria of positive results in both CSF treponemal and non-treponemal tests. Psychiatric symptoms and serum TRUST were the strongest diagnostic indicators in serum. A diagnostic model

was constructed to readily provide the probability of diagnosis at point of care and presented as two nomograms. The basic model reached 79% specificity, 74% sensitivity and 0.82 Area Under the Curves (AUC) (95% CI, 0.72-0.91), while the combined model showed 82% specificity, 90% sensitivity and 0.88 AUC (95% CI, 0.80-0.94). The integrated discrimination improvement (IDI) index was 0.05 in comparison of two models.

Conclusions:

A convenient model using serum TRUST titre and presence of psychiatric symptoms was developed to indicate diagnostic results in patients suspected of NS. Two simple nomograms can be offered to clinicians to facilitate their assessment of patient diagnosis, strengthen the diagnostic decision making, enhance patient stratification, and inform patients in the clinic.

Trial registration:

This research was retrospectively registered in Ethics committee on biomedical research, West China Hospital of Sichuan University.

Keywords:

Neurosyphilis, Diagnostic model, HIV-negative patient, Serum TRUST,
Psychiatric symptoms

Background

Neurosyphilis (NS) is one of the most feared complications of syphilis [1], and the dissemination of the pathogenic bacterium of NS, *Treponema pallidum* (TP), to the cerebrospinal fluid (CSF) and meninges can occur at any stage of the infection [1]. Importantly, the injury of brain tissues caused by TP invasion is irreversible [1]. Trend results from syphilis notification data of the 25 countries with comprehensive surveillance systems showed an increase, especially in Europe, of up to 70% since 2000 [2, 3]. However, the proportion of NS among syphilis patients is undetermined due to diagnostic limitations, requiring skilful doctors to perform lumbar puncture and lab operators for special tests [4]. Resources are usually not available to primary community healthcare centres of urban districts or common hospitals in smaller areas [5].

Prior to the advent of antibiotics, the typical symptoms of NS, such as pupil constriction when the eyes focus on a nearby object but not when the pupil is illuminated (Argyll Robertson pupils), were used to diagnose NS [1]. However, access to antibiotics has greatly increased, affecting the disease process and manifestation of NS [6]. Whether signs and symptoms can facilitate NS identification remains controversial. In recent years, headache and blurred vision are reported as supportive factors of NS diagnosis [7,8], while other reports suggest various clinical manifestations of NS lack of specificity [9]. Furthermore, most of the descriptions of

NS symptoms come from reports on American cohorts co-infected with HIV [8,10], which lack information on non-HIV NS patients, which constitute the majority of NS patients in Europe and Asia [9, 11].

The laboratory diagnosis of NS was putatively based on positive results from serum and CSF serologic tests, as well as elevations in CSF white-cell count and protein levels [12,13]. In 2015, an American guideline from Centers for Disease Control and Prevention (CDC), U.S. department of health and human services suggested the use of a decision tree for NS diagnosis, sequentially requiring a positive or reactive definition of non-specific, specific, or alternative tests in CSF for suspected NS patients [12]. A European guideline on European Academy of Dermatology and Venerology recommends the cut-off value of CSF treponemal tests in patients co-infected with HIV [13]. In fact, even the best threshold and combined usage of diagnostic tests for NS needs extra validation in post-antibiotics era [14].

Furthermore, combining continuous variables with clinical parameters and presenting them in a visual graph, a nomogram, which transforms a multivariable regression equation into a single numerical estimate of the probability of an event and widely used in the field of cancer diagnosis or prognosis, makes the results of a diagnostic model more simple-to-use and facilitates the evaluation of NS patients, especially in poor areas that lack expert operators and the ability to perform time-consuming tests [15]. Unfortunately, Chinese guidelines do not elaborate on the relationship between treponemal test titre and NS diagnosis, although they do recommend using CSF

nucleated cells (>5 cells/ul, positive) or CSF protein concentration (>0.45 g/l, positive) as binary variables [16]. Recent studies estimating serologic cut-off values have found that the accuracy of NS diagnosis depends on the choice of controls with various clinical characteristics. In fact, both serum tests and CSF assessments have been validated as objective indicators supporting diagnosis [8,17]. The present study was designed to verify and explore the association between these factors and diagnostic confirmation using data from patients at the West China Hospital, Medical College of Sichuan University, from September 2015 to September 2019. Using clinical and laboratory characteristics, we developed two feasible diagnostic nomograms in order to assess the possibility of NS in an HIV-negative population with an unknown syphilis duration.

Methods

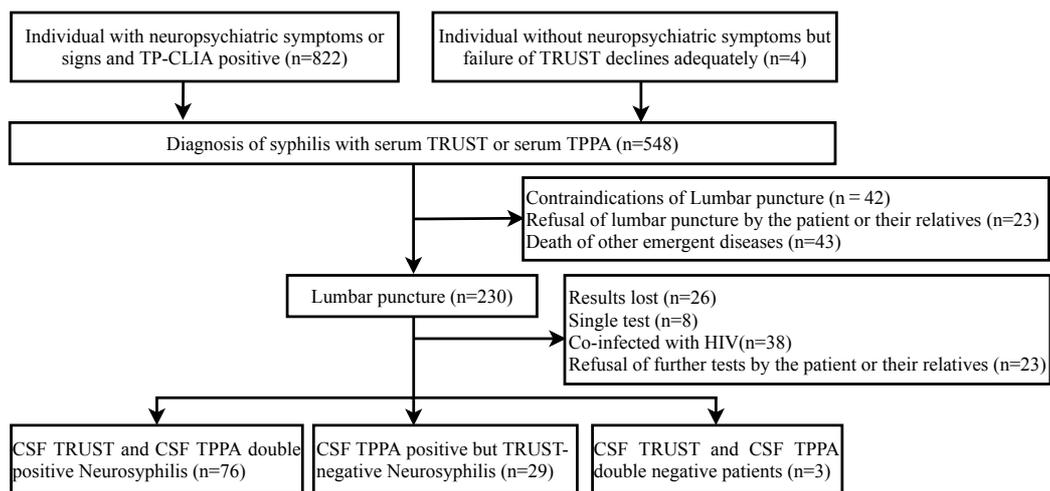
This study included consecutive patients presenting with positive results of serum non-treponemal (Treponema Pallidum chemiluminescence assay [TP-CLIA] or Treponema Pallidum particle agglutination assay [TPPA]), and a treponemal serological test (toluidine red unheated serum test [TRUST]) from the West China Hospital, Medical College of Sichuan University from September 2015 to September 2019. Patients met one of the following criteria: neurological or ophthalmological symptoms or signs during any stage of syphilis (such as headache, photophobia, blurred vision, confusion, sleep disorders, vertigo, hearing loss, vision loss, confusion, lethargy, memory change, progressive dementia, psychiatric symptoms, personality change, numbness, fatigue or pain in limbs and trunk, seizure, tremor) and no symptom) or syphilis of unknown duration, or failure of antibiotic treatment in syphilis patients (titre of serum non-treponemal test fail to decrease and fix after antibiotic treatment).

There were two types of diagnostic models: Model 1 (basic model), clinical parameters other than CSF test findings and Model 2 (combined model), combined model of both clinical parameters and CSF test findings.

Diagnostic criteria

Subjects were enrolled at West Hospital of Sichuan University (n=230). One hundred and eight patients fulfilled all of the following criteria: (1) positive in serum TPPA and TP-CLIA; (2) positive in both CSF-TRUST and CSF-TPPA; (3) exclusion of HIV diagnosis (Figure 1). We applied a strict diagnostic criterion in combination of two laboratory methods to ensure the specificity and diagnose neurosyphilis in the suspected participants. Thus, patients with double positive results of both CSF-TRUST and CSF-TPPA were assigned into the confirmed reactive NS group, and the others to the control group.

Figure 1. Participant flow diagram



Laboratory methods

Baseline serum samples were collected within four days of the lumbar puncture [8]. Serum non-treponemal test, TRUST (Rongsheng, Shanghai, China) and treponemal test, TPPA (Fujirebio, Tokyo, Japan) or chemiluminescence assay (CLIA), and Lumipulse G TP-N syphilis (Fujirebio, Tokyo, Japan) were performed.

Statistics

Associations between categorical variables were assessed using a chi-squared test or Fisher's exact test. Associations between continuous variables and categorical variables were assessed using a Mann-Whitney U test. Diagnostic factors were analysed using univariable and multivariable regression models for confirmation of reactive NS or not –including non-reactive and not NS– as binary classification out of clinical consideration. A two-tailed P value >0.05 was used for removal of variables. Indicators having great clinical relevance were forced back into the model. CSF items from clinical guidelines were assessed for possible additional effects. Boot strapping was resampled 500 times to obtain a 95% confidence interval and quantify the effects of diagnostic indicator selection strategies on the model development. Performance measures included the average area under the ROC curve, sensitivity, and specificity. All analyses were weighted according to the analytical guidelines. P -values < 0.05 were considered statistically significant. R software (version 3.3.1; <http://www.R-project.org>) were used for analysis.

Results

Table 1 Baseline characteristics of the participants

Diagnosis	Not NS	Non-reactive NS	Reactive NS	P-value*
	CSF TPPA- CSF TRUST- (n=3)	CSF TPPA + CSF TRUST - (n=29)	CSF TPPA + CSF TRUST+ (n=76)	
Age, mean (sd), year	32.3 ± 11.0	45.0 ± 14.2	47.3 ± 11.8	0.095
Gender (Male: Female), n	1:2	24:5	63:13	0.151
Height, mean (sd), cm	164.3 ± 7.8	165.8 ± 7.0	160.6 ± 22.8	0.899
Weight, mean (sd), kg	59.0 ± 18.2	64.7 ± 7.4	62.1 ± 12.4	0.686
Address, n (%)				0.034
City	1 (33.3%)	16 (57.1%)	26 (36.6%)	
Urban-rural fringe area	2 (66.7%)	1 (3.6%)	10 (14.1%)	
Village and town	0 (0.0%)	11 (39.3%)	32 (45.1%)	
Others	0 (0.0%)	0 (0.0%)	3 (4.2%)	
Treatment history (yes:no), n	0:3	21:8	55:19	0.020
Clinical Signs or Symptoms, n (%)				

No symptom	0 (0.0%)	4 (13.8%)	7 (9.2%)	0.660
Psychiatric or behaviour disorders	0 (0.0%)	9 (31.0%)	39 (51.3%)	0.051
memory change	0 (0.0%)	7 (24.1%)	30 (39.5%)	0.150
Sleeping difficulties	0 (0.0%)	4 (13.8%)	21 (27.6%)	0.203
Photophobia	0 (0.0%)	6 (20.7%)	8 (10.5%)	0.304
Blurred vision	4 (13.8%)	6 (7.9%)	0 (0.0%)	0.553
Serum tests,				
TP-CLIA >100, n	2	29	76	-
Serum TPPA (+:-), n	21:0	68:0	3:0	0.068
Serum TRUST, Median (Q1-Q3)	1:16 (1:2-1:32)	1:2 (1:2-1:16)	1:8 (1:6-1:16)	<0.001
Serum creatine kinase 1, (sd), U/L				
Serum creatine kinase	81.7 (20.2)	112.9 (160.9)	250.4 (748.3)	0.219
Serum IgG, mean (sd), g/L				
Serum IgG, mean (sd)	11.3 (2.2)	11.8 (3.6)	11.9 (2.6)	0.689
Serum albumin, mean (sd), g/L				
Serum albumin, mean (sd)	43.3 (2.4)	38.3 (3.3)	36.9 (5.2)	0.031
CSF tests,				

CSF Protein, mean (sd),	0.3 (0.1)	0.5 (0.2)	0.8 (0.4)	<0.001
g/L				
Low level (0.22 -	3 (100.0%)	17 (58.6%)	12 (15.8%)	<0.001
0.5), n				
Middle level (0.51 -	0 (0.0%)	7 (24.1%)	33 (43.4%)	
0.79), n				
High level (0.8 - 2), n	0 (0.0%)	5 (17.2%)	31 (40.8%)	
CSF Glucose, mean	3.4 (0.1)	3.7 (0.6)	3.4 (0.7)	0.011
(sd), g/L				
CSF Nucleated cell	3.7 (5.5)	28.9 (62.2)	37.1 (86.4)	0.081
(sd), cells/L				
x<=5, n	2 (66.7%)	17 (60.7%)	30 (39.5%)	0.098
X>5, n	1 (33.3%)	11 (39.3%)	46 (60.5%)	
CSF IgG, mean (sd),	0.1 (0.0)	0.2 (0.2)	0.3 (0.3)	<0.001
g/L				
CSF IgG Synthesis Rate	13.2 (18.8)	57.3 (89.7)	137.7 (120.1)	<0.001
CSF Albumin, mean	0.2 (0.0)	0.3 (0.1)	0.4 (0.2)	<0.001
(sd), g/L				
CSF Generate index,	1.1 (0.8)	1.9 (1.5)	3.0 (2.1)	0.008
mean (sd)				

Note: sd, standard deviation; Q, Quartile; Neurosyphilis, NS; TRUST, Toluidine red unheated serum test; TPPA, Treponema pallidum particle agglutination assay; Immunoglobulin, IgG. *Data with normal distribution was described using mean (sd).

Basic characteristics

Baseline characteristics of the 108 clinically suspected NS patients with complete information of treponemal, non-treponemal serum and CSF examination over a four-year period are summarised in Table 1. The median age of all study participants was 46 years old (range 17– 84 years). Men accounted for 82.9% of the 76 reactive NS patients (mean age, 47 years). The most common symptom of NS was cognitive dysfunction (31.0%), which was mainly presented as memory change. Other symptoms included sleep disorders, photophobia, blurred vision and et al. In addition, among 108 patients 11(10.2%) were non-symptomatic patients and required a CSF test. Seventy-six patients (73.8%) did not receive any prior antibiotic treatment. Twenty-seven patients were unsuccessfully treated with nonspecific therapy for neuropsychiatric symptoms before the correct diagnosis was reached.

Table 2. Association between each indicator and diagnostic outcome

Characteristic	Univariable Analysis		
	Odds Ratio	95% CI	P value
Female	0.74	0.26-2.06	0.5610

Age	1.02	0.99-1.06	0.1969
Treatment	0.76	0.31-1.89	0.5551
before			
Psychiatric	2.69	1.10-6.57	0.0295
symptoms			
No symptom	0.71	0.19-2.62	0.6071
Serum TPPA >	2.83	0.96-8.38	0.0599
1:320			
Serum TRUST			
Negative	Ref		
1	0.00	0.00-Inf	0.9942
2	inf.	0.00-Inf	0.9963
4	1.14	0.17-7.60	0.8901
8	5.33	0.78-36.33	0.0873
16	15.11	2.48-92.11	0.0032
32	21.33	3.56-127.68	0.0008
64	18.67	2.55-136.41	0.0039
128	inf.	0.00-Inf	0.9925
Creatine kinase	1.00	1.00-1.01	0.2396
Serum IgG	1.02	0.87-1.20	0.8258
Serum albumin	0.90	0.79-1.01	0.0745

CSF	1.00	1.00-1.01	0.0029
albumin*100			
CSF synthesis	1.55	1.10-2.20	0.0134
index			
CSF Protein	96.54	9.52-978.55	0.0001
Low level (0.22	Ref		
- 0.5 g/L)			
Middle level	7.86	2.65-23.25	0.0002
(0.51 - 0.79			
g/L)			
High level (0.8	10.33	3.16-33.80	0.0001
- 2 g/L)			
CSF Glucose	0.55	0.31-0.99	0.0448
CSF Nucleated	1.00	1.00-1.01	0.5379
cells			
<=5	Ref		
>5	2.43	1.03-5.72	0.0424
CSF IgG*100	1.05	1.02-1.08	0.0014

TPPA, Treponema pallidum particle agglutination assay; TRUST, Toluidine red unheated serum test; Cerebrospinal fluid, CSF; Immunoglobulin, IgG. *Data with normal distribution was described using mean (sd).

Laboratory findings and diagnostic yield

The univariable logistic regression revealed significant differences in CSF protein levels between the reactive neurosyphilis group and the control group (odds ratio [OR], 96.54; 95% confidence interval [CI], 9.52–978.55, $P < 0.0001$; Table 2). Non-specific treponemal test (serum TRUST) findings showed incremental associations with neurosyphilis diagnosis at titre $> 1:16$ (OR, 15.11; 95% CI, 2.48-92.11; Table 2). However, no difference in creatine kinase levels was observed between the confirmed reactive neurosyphilis and control groups (OR, 1.0; 95% CI, 1.00-1.01). Moreover, there were no significant differences between these two groups in serum IgG and albumin levels, which contribute to the calculation of a potential effective CSF synthesis index (OR, 1.55; 95% CI 1.10-2.20)

Table 3. Multivariable logistic analysis for the construction of diagnostic models

	Multivariable Analysis			Assigned score
	OR	95% CI	P	
Model 1				
Psychiatric	4.66	1.33-16.28	0.0160	5
Serum TRUST				

0	1.0			
8	7.61	1.27-45.73	0.0266	8
16	22.57	4.28-119.10	0.0002	23
32	23.12	4.72-113.10	0.0001	23
64	32.16	5.16-200.43	0.0002	32
Model 2				
Psychiatric	4.74	1.09-20.56	0.0375	5
Serum TRUST				
0	1.0			
8	9.63	1.37-67.51	0.0226	10
16	21.55	3.46-134.36	0.0010	22
32	17.17	2.98-98.86	0.0015	17
64	71.42	7.22-706.72	0.0003	71
CSF protein				
0	1.0			
>5.1	5.28	1.33-21.00	0.0183	5
CSF glucose	0.31	0.12-0.78	0.0137	-

TRUST, Toluidine red unheated serum test; Immunoglobulin, IgG; Cerebrospinal fluid, CSF

Multivariable logistic analyses (model 1) indicated that the following factors were more likely related to confirmed NS: serum TRUST 1:8 (OR, 7.61; 95% CI, 1.27-45.73), 1:16 (OR, 22.57; 95% CI, 4.28-119.10), 1:32 (OR, 23.12; 95% CI, 4.72-113.10), and 1:64 (OR, 32.16; 95% CI, 5.16-200.43) and psychiatric symptoms (OR, 4.66; 95% CI, 1.33-16.28) (Table 3). Based on model 2, when CSF protein > 5.1 (OR, 5.28; 95% CI, 1.33-21.00) and CSF glucose (OR, 0.31; 95% CI, 0.12-0.78) were added into the calculation, serum TRUST and psychiatric symptoms remained significantly associated with confirmed NS ($P < 0.05$).

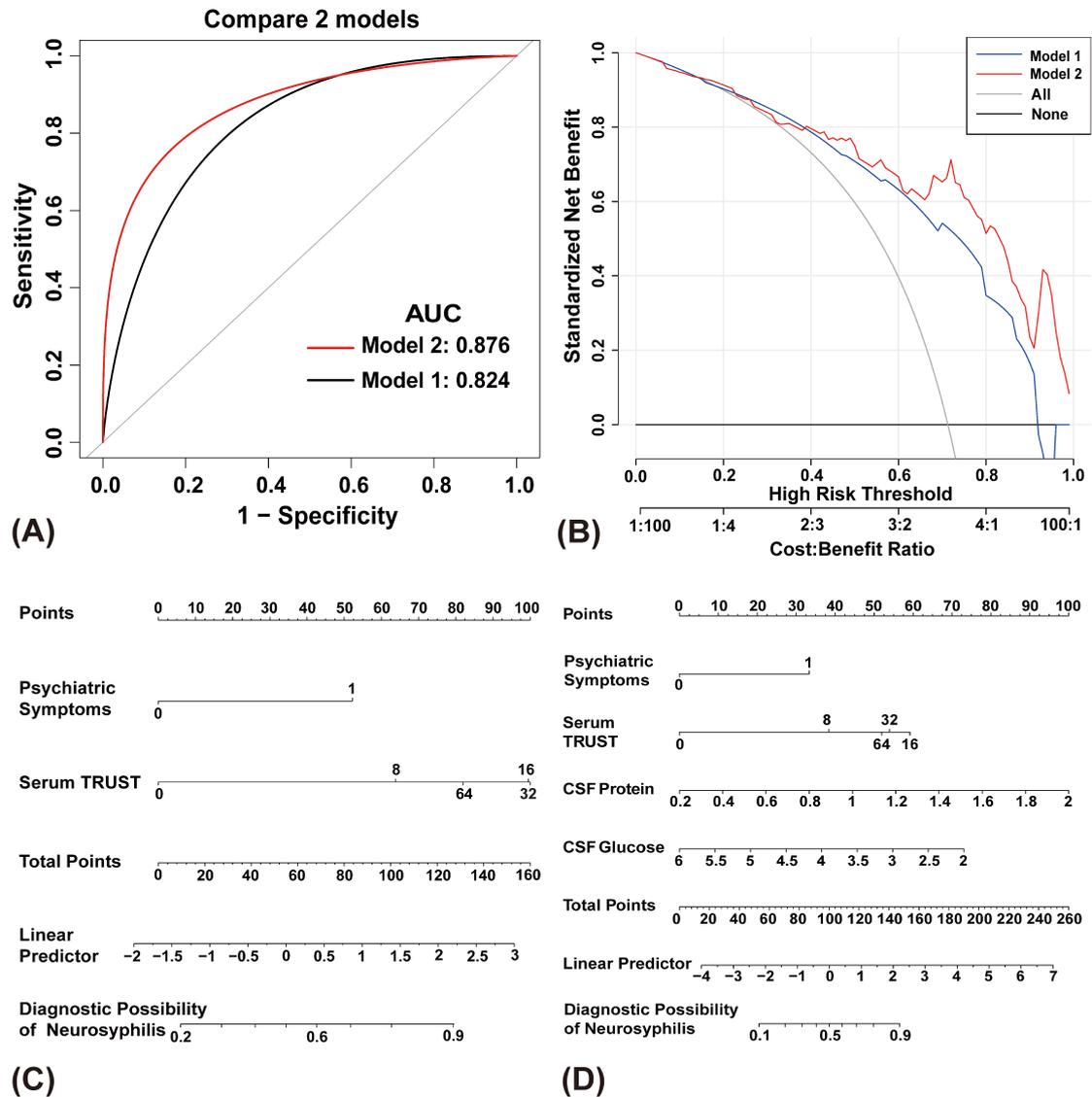
Table 4. ROC Curves, AUC and nomograms of models for NS diagnosis using multivariable logistic regression modelling

Test	ROC area (AUC) 95% CI	Best thres hold	Specificity	Sensitivity	Accuracy	Diagnose-OR	Positive-pv	Negative-pv	P
Model 1	0.8236 (0.72-0.909)	1.093 3	0.7931	0.7361	0.7525	10.693	0.8983	0.5476	0.0542
Model 2	0.8764 (0.55-0.9369)	0.955 7	0.8966	0.8194	0.8416	39.333 3	0.9516	0.6667	

Receiver operating characteristics (ROC) curve of model 1 (basic model) was generated using psychiatric symptoms and serum TRUST, and that of model 2 (combined model) was generated using CSF protein and CSF glucose for predicting neurosyphilis. Diagnose-odds ratio (OR), positive predictive value (pv), and negative pv were calculated. *Area Under Curve (AUC) confidence interval and significance test adopted 500-time bootstrap resampling

The sensitivity of model 1 (73.61%) was lower than model 2 (81.94%), as was the specificity of model 1 (79.31%) versus model 2 (89.66%). The accuracies of model 1 and model 2 were 0.7525 and 0.8614, respectively (table 4). The positive predictive values of model 1 and model 2 were 0.8983 and 0.9516, while their negative predictive values were 0.5476 and 0.6667, respectively.

Figure 2. ROC curve, DCA and nomograms



(A) AUC of Model 1 (Basic model) and Model 2 (Combined model). P value = 0.02

in comparison between Model 1 and Model 2. (B) DCA of Model 1 and 2 (C) A

nomogram visualizing the multi-variable diagnostic model of Model 1. (D)

Nomogram of Model 2. *AUC confidence interval and significance test adopt

Bootstrap resampling 500 times

Both models were useful between ROC 72%-93%. Figure 2 illustrates the decision curves for Models 1 and 2 for the diagnostic probability of NS. The integrated discrimination improvement (IDI) index was 0.19 (95% CI, 0.00-0.37) (p= 0.04, standard error, 0.02).

Discussion

In this study, two important clinical findings were achieved. First, serum TRUST was a useful indicator for the diagnosis of NS. Second, diagnostic models combining clinical parameters and CSF protein had clinical value. A diagnostic model based on nanogram of NS using clinical characteristic and laboratory tests was built as well.

High serum TRUST is common in syphilis patients, but in this study, serum TRUST differentiated reactive NS patients from suspected NS patients. As compared with non-reactive NS and precluded patients, the levels of serum TRUST were higher in reactive NS. Cai et al. also indicated a 5-fold increased likelihood of asymptomatic NS in patients with a serum TRUST titre $\geq 1:64$ [17]. Researchers noted that an increase in serum TPPA titre and serum creatine kinase could serve as a surrogate for CSF clinical abnormalities after lumbar punctures [17,18]. Unfortunately, we were unable to determine titre grades of serum TPPA, since the laboratory system of our hospital automatically sets and reports serum TPPA $>1:320$ as positive. Nonetheless, once infected, serum TPPA remains positive during a patient's lifetime, so we did not include this item in order to minimize the false positive rate. Xiao et al. indicated elevated serum creatine kinase may indicate neurosyphilis among HIV-negative syphilis patients [18]. However, our data showed no significant difference in serum creatine kinase among reactive NS, non-reactive NS and not NS.

We then constructed diagnostic models for NS, combining clinical parameters and serum TRUST. When combined with clinical parameters, the diagnostic performance improved compared to the use of serum TRUST alone. NS was relatively common among males in our cohort, which is similar to British reports from Public Health England [19]. However, the rate of NS diagnosis was not significantly different. Instead, the significant clinical parameters were psychiatric symptoms and memory deterioration.

A DCA was executed to assess diagnostic model performance. The net benefit of Model 2 was better than that of the other model with threshold probabilities of 40-80%. When we consider that lumbar puncture may be difficult for patients, using Model 1 and having about 80% diagnostic probability may be sufficient to diagnose a patient with NS. However, in most cases, an 80% threshold probability is not sufficient, especially in cases with a high threshold to perform continuous intravenous antibacterial therapy. In such cases, it is better to complete CSF tests and conduct more specific diagnostic tests, such as Venereal Disease Research Laboratory (VDRL) in CSF, a well-known specific test, broadly used to diagnose idiopathic NS in America but time-consuming and with low feasibility, especially in countries with high rates of sick patients [20]. The results of this study offer a sensitive screening nomogram for choosing candidates to undergo lumbar puncture, complete CSF regular tests or measure CSF-VDRL.

This study had several limitations. First, the study might suffer from sampling bias. We did not exclude patients who received insufficient antibiotic therapy before lumbar puncture. The number of *Treponema pallidum* correlated with disease activity in patients, but we did not exclude such cases. Among those, the diagnosis was set as a binary variable. Under this criterion of group assignment, false negatives were possible due to non-reactive NS cases. In theory, disease duration should have been analysed as a risk factor for NS, but it is difficult for patients with neuropsychological symptoms to provide the exact time of syphilis infection or information on sexual activities. Additionally, another limitation was the small sample size and that the sophisticated pathological categories of NS were not employed here. Whether patients in each dedicated category had a different prognosis or not remains unknown due to lack of follow-up investigation. We are building up a systematic database and prospectively designing new studies to improve the quality of the evidence and facilitate more comprehensive patient care. Lastly, in order to verify the validity of this model, future studies are warranted.

Conclusions

The present study showed that psychiatric symptoms, serum TRUST, and CSF protein correlated with a diagnosis of NS in non-HIV NS. Further, a convenient score model was developed to indicate diagnostic results in suspected NS patients with or without a lumbar puncture. Importantly, two nomograms can be offered to clinicians

to improve their abilities to assess patient diagnosis, strengthen diagnostic decision making and inform patients in the clinic. To increase its applicability, future studies should focus on internal improvement and external validation.

List of abbreviations:

CSF: cerebrospinal fluid

NS: neurosyphilis

TP: *Treponema pallidum*

TPCA: Treponema pallidum chemiluminescence assay

TPPA: Treponema pallidum particle agglutination assay

TRUST: toluidine red unheated serum test

VDRL: Venereal Disease Research Laboratory

Declarations:

Ethics approval and consent to participate

All methods were carried out in accordance with Transparent Reporting of a multivariable prediction model for Individual Prognosis or Diagnosis (TRIPOD) guidelines and regulations.

Ethics committee on biomedical research, West China Hospital of Sichuan University approved the study and waived informed consent from all subjects. The committee's reference number was 1163 in 2020 approval.

Consent for publication

Not applicable

Availability of data and materials

The datasets used and/or analysed during the current study available from the corresponding author on reasonable request.

Competing interests

The authors declare that they have no competing interests

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Authors' contributions

Wenjing Ge analysed and interpreted the patient data regarding neurosyphilis and was a major contributor in writing the manuscript. Yang Zhang and Li He instructed the study design of clinical research. Chao Peng performed part of lumbar puncture.

Dongdong Li instructed the interpretation of laboratory tests. Lijie Gao instructed the data processing. Jiajia Bao and Changling Li helped process ethics profile. Chen Ning

and Li He provided the support of project grants. Dong Zhou proposed the study direction of neurosyphilis. All authors read and approved the final manuscript.

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Not applicable

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Figures

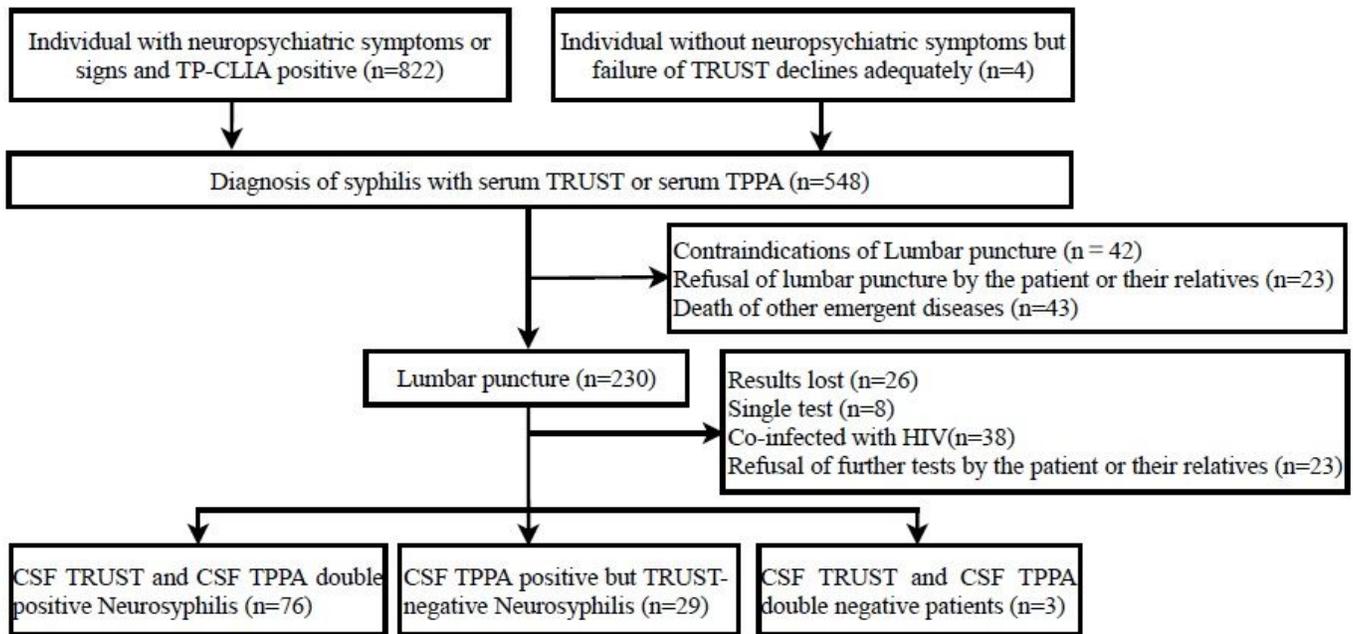


Figure 1

Participant flow diagram

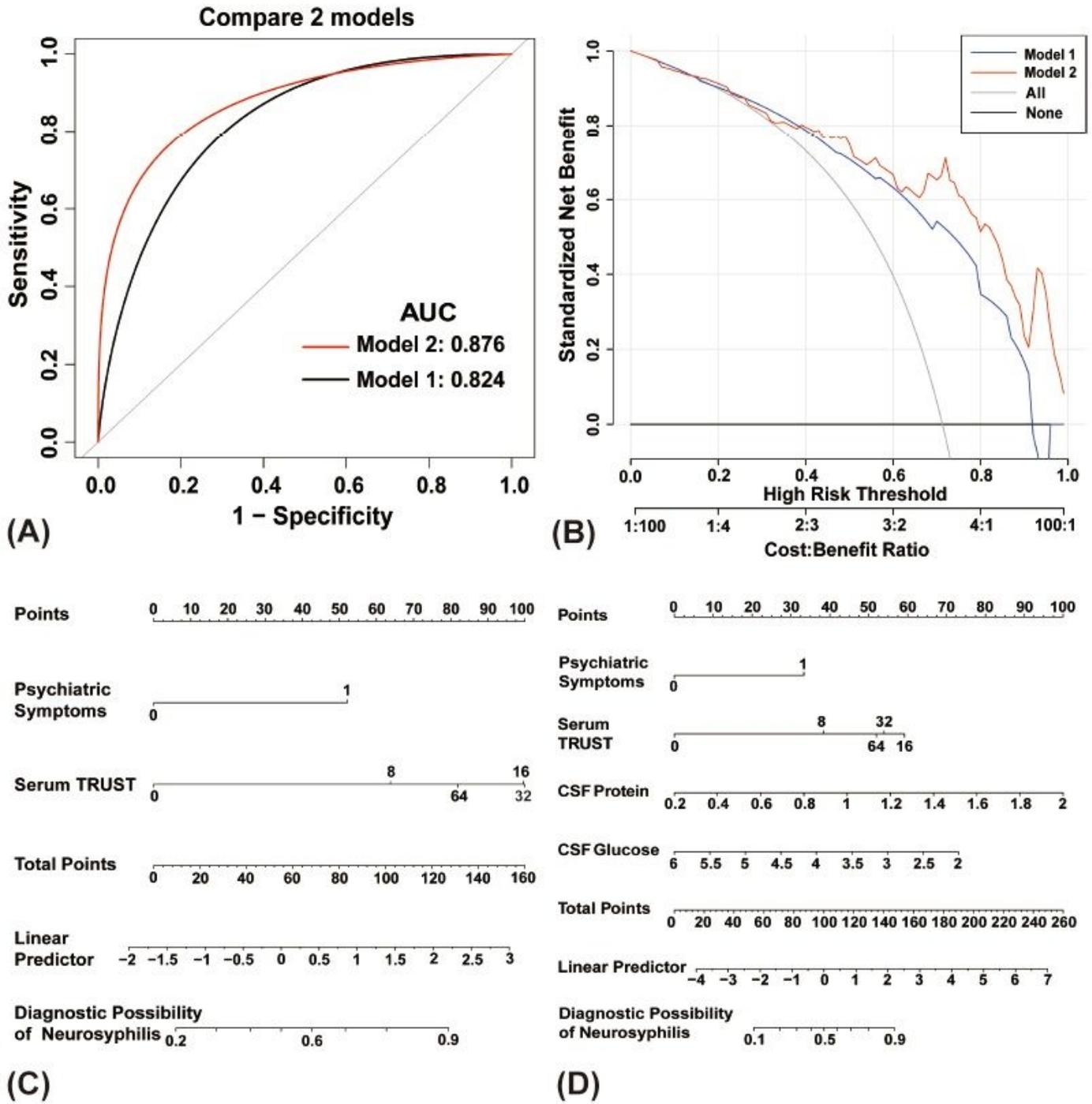


Figure 2

ROC curve, DCA and nomograms. (A) AUC of Model 1 (Basic model) and Model 2 (Combined model). P value = 0.02 in comparison between Model 1 and Model 2. (B) DCA of Model 1 and 2 (C) A nomogram visualizing the multi-variable diagnostic model of Model 1. (D) Nomogram of Model 2. *AUC confidence interval and significance test adopt Bootstrap resampling 500 times