

Title

Additional information of evaluation results

Title of main manuscript

Design, Implementation, and Evaluation of the Computer-aided Clinical Decision Support System based on Learning-to-Rank:
Collaboration between physicians and machine learning in the differential diagnosis process

Version

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Evaluation: Differential Diagnosis performance

Evaluation results and Discussion

Disease with characteristic symptoms

Cited case:

- Acute intermittent porphyria [25]

Table 1 shows the Inputted symptoms and predicted diseases: case of the acute intermittent porphyria.

Table 2 shows the Inputted symptoms and the target disease's ranking: case of the acute intermittent porphyria.

Difficult-to-diagnose case with few characteristic symptoms

Cited case:

- Acute HIV-1 infection [26]

Table 3 shows the Inputted symptoms and predicted diseases: case of the acute HIV-1 infection.

Table 4 shows the Inputted symptoms and the target disease's ranking: case of the acute HIV-1 infection.

Case with diagnostic errors

Cited case:

- Subacute bacterial endocarditis caused by bartonella [27]

Table 5 shows the Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: In progress: n = 5.

Table 6 shows the Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: In progress: n = 9.

Table 7 shows the Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: In progress: n = 14.

Table 8 shows the Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: Final: n = 18.

Figures and Tables

Table 1 Inputted symptoms and predicted diseases: case of the acute intermittent porphyria

Inputted symptoms		Predicted diseases			MSE	
			A-NDCG			
a	Abdominal pain	1	1.41	Acute intermittent porphyria	9.25	Acute intermittent porphyria
b	Constipation	2	1.21	Diabetic coma imminent state	8.17	Enterohemorrhagic e. coli (EHEC) infection
c	Hyponatremia	3	0.56	Pesticide poisoning, Organophosphate toxicity	7.64	Visceral rupture
d	Abdominal tenderness	4	0.51	Lead poisoning (almost chronic)	7.56	Fibromyalgia (fibrositis)
e	Elevated serum liver enzyme	5	0.45	Heat stroke (hyperthermia)	7.53	Cancerous peritonitis
f	Tachycardia	→ 6	0.31	Cytomegalovirus infection	7.29	Withdrawal symptoms of alcohol and drugs
g	Photophobia	7	0.25	Visceral rupture	7.28	Colorectal cancer
h	Thirsty	8	0.16	Hyponatremia	7.26	Irritable bowel syndrome, Functional dyspepsia (FD)
i	Borborygmus	9	0.13	Portal vein obstruction	7.23	Drugs (laxatives, etc.)
j	Dehydration	10	0.12	Acetaminophen poisoning	7.07	Eating disorder
k	Confusion			...		

Cited case: Acute intermittent porphyria [25]

Loss functions: A-NDCG: Approximate NDCG loss

MSE: Mean Squared Error

Table 2 Inputted symptoms and the target disease's ranking: case of the acute intermittent porphyria

Inputted symptoms	Target disease	Ranking	
		AIP	MSE
	Loss functions	A-NDCG	
a Abdominal pain			---
b Constipation	→		---
c Hyponatremia			1
d Abdominal tenderness	→→		1
e Elevated serum liver enzyme			1
f Tachycardia	→→→		1
g Photophobia			1
h Thirsty	→→→→		1
i Borborygmus			1
j Dehydration	→→→→→		1
k Confusion			1

Cited case: Acute intermittent porphyria [25]
 Target disease: AIP: acute intermittent porphyria
 Loss functions: A-NDCG: Approximate NDCG loss
 MSE: Mean Squared Error
 ---: 20th and lower

Table 3 Inputted symptoms and predicted diseases: case of the acute HIV-1 infection

Inputted symptoms			Predicted diseases		MSE	
			A-NDCG			
a	Fever	1	1.61	Acute HIV-1 infection	10.16	Epidemic hepatitis A
b	Headache	2	1.51	Polyneuropathy	9.93	Acute Q fever
c	Sore throat	3	0.91	Acute viral meningitis	9.75	Acute pharyngitis
d	Consciousness indistinctness	4	0.88	West Nile fever	9.66	Polyneuropathy
e	Chills	5	0.77	Cat-scratch disease	9.28	Lymphocytic choriomeningitis
f	Muscles ache	6	0.46	Acute Q fever	9.17	Herpes labialis
g	Swallowing pain	→ 7	0.23	Epidemic hepatitis A	8.99	Side effects of interferon
h	Pharyngolaryngeal abnormality	8	0.21	Chronic fatigue syndrome	8.86	Sepsis
i	Aphasia	9	0.13	Sepsis	8.74	Chronic fatigue syndrome
j	Apraxia	10	0.12	Toxoplasmosis	8.73	Retropharyngeal infection
k	Fatigue			...		
l	Muscle weakness					
m	Anorexia					
n	Weight loss					
o	Dementia					

Cited case: Acute HIV-1 infection [26]

Loss functions: A-NDCG: Approximate NDCG loss

MSE: Mean Squared Error

Table 4 Inputted symptoms and the target disease's ranking: case of the acute HIV-1 infection

Inputted symptoms		Ranking				
		Target diseases	HIV-1		AVM	
		Loss functions	A-NDCG	MSE	A-NDCG	MSE
a	Fever			---	---	---
b	Headache			---	---	9
c	Sore throat			14	---	10
d	Consciousness indistinctness	→		---	---	3
e	Chills			---	---	2
f	Muscles ache	→→		---	---	3
g	Swallowing pain			14	---	5
h	Pharyngolaryngeal abnormality	→→→		---	---	9
i	Aphasia			---	---	6
j	Apraxia	→→→→		---	---	2
k	Fatigue			---	---	2
l	Muscle weakness	→→→→→		12	---	2
m	Anorexia			12	---	1
n	Weight loss			1	---	3
o	Dementia			1	---	3

Cited case: Acute HIV-1 infection [26]

Target diseases: HIV-1: acute HIV-1 infection

AVM: acute viral meningitis

Loss functions: A-NDCG: Approximate NDCG loss

MSE: Mean Squared Error

---: 20th and lower

Table 5 Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: In progress: n = 5

Inputted symptoms				Predicted diseases	Classification
a	Weight loss	1	0.78	Hodgkin lymphoma	
b	Itching	2	0.60	Heart tumor	
c	Fatigue	3	0.41	Mitral valve stenosis	
d	Tachypnea	4	0.32	Infectious endocarditis	Related disease
e	Heart murmur	5	0.17	Aortic stenosis	
		6	0.16	Acute Q fever	
		7	0.04	Hyperthyroidism	
		8	0.03	Immunoblastic lymphadenopathy	
		→ 9	0.03	Hepatic amyloidosis	
		10	0.03	Hashimoto's disease and autoimmune thyroiditis	
				...	

Cited case: Subacute bacterial endocarditis caused by bartonella [27]

Loss functions: A-NDCG: Approximate NDCG loss

In progress: Number of inputted symptoms = 5

Table 6 Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: In progress: n = 9

Inputted symptoms		Predicted diseases		Classification		
a	Weight loss	1	1.61	Zieve syndrome		
b	Itching	2	1.35	Disseminated intravascular coagulation		
c	Fatigue	3	0.94	Chronic hepatitis		
d	Tachypnea	4	0.77	Wilson's disease		
e	Heart murmur	5	0.76	Acute hepatitis		
f	Purpura	6	0.69	Hepatic amyloidosis		
g	Anemia	7	0.59	Infectious endocarditis	Related disease	
h	Elevated serum liver enzyme	8	0.59	(Compensated / uncompensated) liver cirrhosis		
i	Hyperbilirubinemia	→	9	0.53	Subacute bacterial endocarditis	Related disease
			10	0.53	Gastric cancer	
				...		

Cited case: Subacute bacterial endocarditis caused by bartonella [27]

Loss functions: A-NDCG: Approximate NDCG loss

In progress: Number of inputted symptoms = 9

Table 7 Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: In progress: n = 14

Inputted symptoms		Predicted diseases		Classification		
a	Weight loss	1	1.78	Subacute bacterial endocarditis	Related disease	
b	Itching	2	1.35	Hepatic amyloidosis		
c	Fatigue	3	1.32	Chronic hepatitis		
d	Tachypnea	4	1.29	Infectious endocarditis	Related disease	
e	Heart murmur	5	1.16	Disseminated intravascular coagulation		
f	Purpura	6	1.15	<i>Mixed cryoglobulinemia</i>	Misdiagnosed disease	
g	Anemia	7	1.10	Acute bacterial endocarditis	Related disease	
h	Elevated serum liver enzyme	8	0.99	Idiopathic (or secondary) retroperitoneal fibrosis		
i	Hyperbilirubinemia	→	9	0.98	Tuberculosis or syphilis	
j	ESR elevation	10	0.90	Thrombotic thrombocytopenic purpura		
k	RA/RF positive			...		
l	Hematuria					
m	Bacteriuria					
n	Proteinuria					

Cited case: Subacute bacterial endocarditis caused by bartonella [27]

Loss functions: A-NDCG: Approximate NDCG loss

In progress: Number of inputted symptoms = 14

Table 8 Inputted symptoms and predicted diseases: case of the subacute bacterial endocarditis caused by bartonella: Final: n = 18

Inputted symptoms		Predicted diseases		Classification	
a	Weight loss	1	2.70 <i>Mixed cryoglobulinemia</i>	Misdiagnosed disease	
b	Itching	2	2.62 Chronic hepatitis		
c	Fatigue	3	2.03 Subacute bacterial endocarditis	Related disease	
d	Tachypnea	4	1.48 Hepatic amyloidosis		
e	Heart murmur	5	1.47 Rapidly progressive glomerulonephritis syndrome		
f	Purpura	6	1.34 Acute bacterial endocarditis	Related disease	
g	Anemia	7	1.27 Infectious endocarditis	Related disease	
h	Elevated serum liver enzyme	8	0.94 Polyarteritis nodosa		
i	Hyperbilirubinemia	→	9	0.78 Autoimmune hemolytic anemia	
j	ESR elevation	10	0.75 Disseminated intravascular coagulation		
k	RA/RF positive		...		
l	Hematuria				
m	Bacteriuria				
n	Proteinuria				
o	Hypocomplementemia				
p	Angiitis				
q	Nephritis				
r	Animal Origin Infections				

Cited case: Subacute bacterial endocarditis caused by bartonella [27]

Loss functions: A-NDCG: Approximate NDCG loss

Final: Number of inputted symptoms = 18