# Applying a clinical algorithm on real world EMR data for patient risk stratification of undiagnosed **Amyotrophic Lateral Sclerosis (ALS)**

# INTRODUCTION

- Amyotrophic lateral sclerosis ("ALS") is a progressive neurodegenerative disease that affects nerve cells in the brain and the spinal cord
- It is characterized by progressive loss of upper and lower motor neurons
- Initial symptoms are often subtle and can cause delays in diagnosis or misdiagnosis
- Early diagnosis of ALS and referral to a specialized multidisciplinary centre has proven to improve quality of life and prolong survival while misdiagnosis can result in unnecessary interventions including surgery<sup>1</sup>

We investigated the feasibility of developing a clinical algorithm to screen electronic medical record data for patients in which follow-up investigations for ALS was clinically appropriate (the "Algorithm") <b>METHODS</b> • An algorithm was developed by Ensho Health in consultation with ALS clinicians				Clinical LMN Findings	<ul> <li>Weakness</li> <li>Atrophy</li> <li>Wasting</li> <li>Fasciculations/twitching</li> <li>Palsy</li> <li>Hypotonia</li> <li>Decreased reflexes (absent or 1+)</li> <li>Muscle denervation</li> <li>Declining mobility</li> </ul>	<ul> <li><b>RESUI</b></li> <li>1,332 pa and/or sp Risk, 3% Risk and queried (</li> <li>129 of th explanat</li> </ul>
The Algorithm categorizes patients into four risk groupings based on evidence of upper motor neuron ("UMN") degeneration, lower motor neuron ("LMN") degeneration and spinal region involvement ( <b>Figure 1</b> ) <b>Tigure 1. ALS Risk Straitifcation Algorithm Spinal Region</b>		EMG LMN Findings	<ul> <li>MRC less than 5/5</li> <li>Reduced recruitment</li> <li>Reduced interference pattern</li> <li>Large motor unit action potentials</li> <li>Voluntary motor unit potentials</li> <li>Large amplitude</li> <li>Long duration</li> <li>Fibrillation potentials</li> <li>Fasciculation(s)</li> <li>Desitive share waves</li> </ul>			
		Linit Degeneration	Involvement		<ul> <li>Combined muscle action potential</li> </ul>	Of the 31     sensitivit
Very High Risk	Yes	Yes	≥2	Clinical UMN Findings	<ul> <li>Spasticity</li> <li>Pathologic reflex(es) (e.g. Hoffman)</li> </ul>	
High Risk	Yes	Yes	1	<ul> <li>Increased deep tendon reflexes (3+ or 4+)</li> <li>Extensor plantar response (e.g., Babinski)</li> <li>Pyramidal weakness</li> </ul>		out in pri previous
Moderate Risk	Yes	No	≥2		<ul><li>Pronator drift</li><li>Contracture</li></ul>	Clinical r
Low Risk       All other combinations         • The Algorithm was encoded in software and applied to the electronic medical records of 3,372 patients of a single community neurology practice in Ontario, Canada using			ectronic medical records Ontario. Canada using	Spinal Region Involvement	<ul> <li>Bulbar, including bulbar related symptoms         <ul> <li>(swallowing/drooling, speaking/speech abnormalities, chewing, facial weakness, dyspnea, dysphagia, vision abnormality)</li> <li>Cervical</li> <li>Thoracic</li> <li>Lumbosperal</li> </ul> </li> </ul>	was high

### Figure 2. Overview of Ensho Health's Apollo Electronic Data Capture System



 Apollo is an integrated set of computing tools and systems designed to extract clinical features from structured and unstructured electronic health record data with high fidelity (**Figure 2**)

• Patients were risk-stratified based on the results of sequential queries for (1) clinical or electromyographic ("EMG") evidence of UMN and LMN degeneration and (2) involvement of the bulbar, cervical, thoracic or lumbosacral regions of the spine (**Figure 3**)

• Past investigations or clinical features inconsistent with ALS were subsequently queried to exclude patients whose symptoms had alternative explanations (Figure 4)

### **Figure 3. Clinical Features Queried**

### **Figure 4. Clinical Features Inconsistent with ALS**

**Findings Inco** ALS

# ESULTS

### Figure 5. Outcomes of Application of Algorithm



## **AUTHORS AND AFFILIATIONS**

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 The medical records of patients in the Very High Risk group were reviewed to determine whether ALS was likely and/or referral to a specialized multidisciplinary team was appropriate

### Figure 6. Results of Clinical Review of Very High Risk Patients

onsistent with	Sensory dysfunction (pain)	Alternative explana
	Abnormal quantitative sensory testing (QST)	
	Abnormal skin biopsy	
	Muscle biopsy of fatty replacement	
	Sphincter abnormalities	ALS
	Autonomic nervous system dysfunction - orthostatic	
	hypotension, abnormal tilt table test	
	Anterior visual pathway abnormalities	
	Movement abnormalities consistent with Parkinson's disease	A
	Other common explanatory diagnoses such as stroke,	
	myasthenia gravis, MVA and TBI, multiple sclerosis,	
	radiculopathy, functional disorder, seizure disorder,	
	spinocerebellar ataxia, CIDP, essential tremor, Parkinson's	Pr
	and other neurodegenerative disorders)	

1,332 patients (39%) had evidence of UMN degeneration, LMN degeneration and/or spinal region involvement of which 12% were categorized as Very High Risk, 3% were categorized as High Risk, <1% were categorized as Moderate Risk and 84% were categorized as Low Risk before exclusionary findings were queried (**Figure 5**)

129 of the 160 patients (81%) in the Very High Risk group had alternative explanations for UMN and/or LMN degeneration

Of the 31 remaing patients (19%), 3 (10%) had a diagnosis of ALS (100%) sensitivity), 7 (23%) had a pending workup for ALS and 9 (29%) had ALS ruled out in prior clinical investigations leaving 12 patients in which ALS was not previously considered for clinical review (Figure 6)

Clinical review of the remaining 12 patients identified one (8%) in which ALS was high likely and rejected the potential diagnosis in 11 (92%)



• We demonstrated that clinical algorithms can practically screen electronic medical record data for patients with ALS when deployed through software capable of analyzing structured and unstructured data

- investigation

Reference **1.** Williams, J.R., Fitzhenry, D., Grant, L. *et al.* Diagnosis pathway for patients with amyotrophic lateral sclerosis: retrospective analysis of the US Medicare longitudinal claims database. BMC Neurol 13, 160 (2013). https://doi. org/10.1186/1471-2377-13-160

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### DISCUSSION

• The Algorithm correctly identified all three patients diagnosed with ALS prior to the study but its sensitivity and specificity could not be calculated without comprehensive workups in all 3,372 patients whose records were analyzed

• The positive predictive value of being categorized as Very High Risk was 17% and could likely be improved on by deriving optimal weights for the features of the Algorithm from a larger data set and emphasizing objective (EMG) over subjective (symptom-related) findings

• A limitation of the practice setting was that complex neurological patients were being referred to a tertiary neurological centre for management, potentially limiting the number of undiagnosed Very-High risk patients for subsequent

• Further refinements to the Algorithm are planned as is a more comprehensive prospective validation at additional community neurology practices in Canada