



# Development of Risk Assessment Models for Carpal Tunnel Syndrome

---

Heecheon You

**Industrial and Manufacturing Engineering  
Wichita State University**





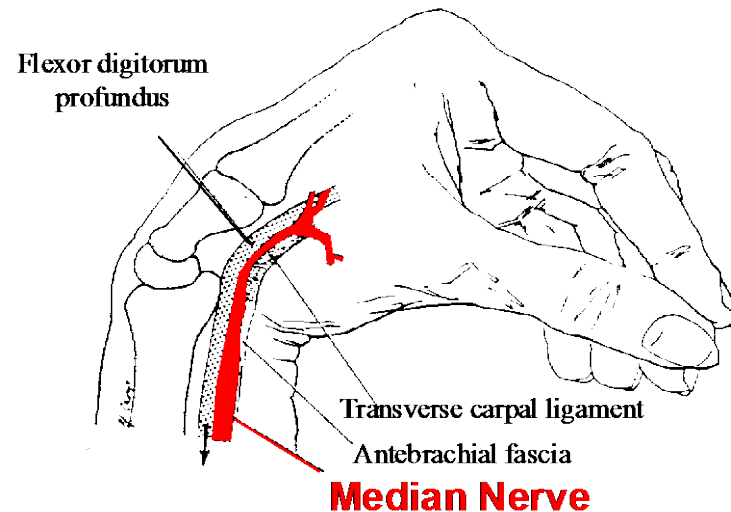
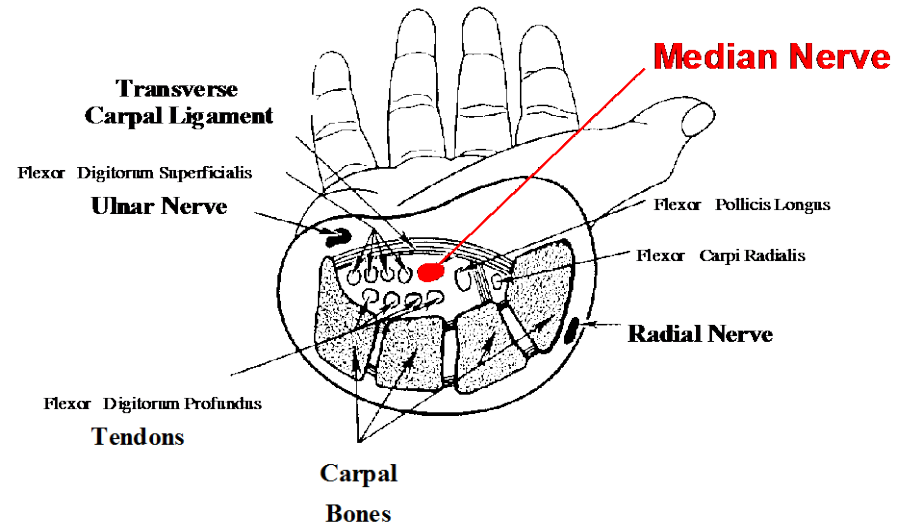
# Agenda

---

- Introduction
  - ✓ Carpal Tunnel Syndrome
  - ✓ Problem Statement
  - ✓ Objectives
- Study Design & Materials
  - ✓ Case-Reference Design
  - ✓ Risk Exposure Assessment Method
- Model Development & Validation
- Conclusions

# Carpal Tunnel Syndrome

Peripheral neuropathy  
due to localized  
compression to the  
median nerve within  
the carpal tunnel  
at the wrist.



# Limitations of Previous CTS Research

- **Incomprehensiveness:** Included a partial set of CTS risk factors.

## Physical Factors

- *task factors* (posture, force, repetitiveness, duration, stress concentration)
- *environmental factors* (vibration, temperature, ventilation)

## Psychosocial Factors

- *physical demands* (time pressure, attention demand, monotony, responsibility)
- *organization factors* (autonomy, worker participation, job security)
- *social support* (family support, colleague support, safety awareness)

**Carpal Tunnel Syndrome Development**



## Personal Factors

- *sociodemographic factors* (age, gender, exercise, hobby)
- *medical history*
- *anthropometric factors* (wrist size, obesity)

⇒ Insufficient understanding of the **relative contributions** of risk factors to the development of CTS

- Differences in research protocol
- Qualitative findings



# Limitations of Previous CTS Research (cont'd)

---

- Differences in research protocol

- ✓ Case definition criteria

- ✓ Risk exposure assessment methods

- ⇒ Difficult to compare and integrate various study results.

- Qualitative findings

- ✓ Females, heavy individuals ⇒ more susceptible to CTS

- ✓ Awkward postures, excessive grip forces,  
repetitive motions ⇒ increasing the risk of CTS

- ⇒ Need quantitative models explaining the relationship between risk exposure and CTS development.



# Objectives

---

- Examine relative contributions of risk factors to the development of CTS by contrasting the risk exposures of case group with those of reference group.
- Develop quantitative risk assessment models for CTS.
  - ⇒ Estimate the likelihood of developing CTS for an individual exposed to certain occupational risks.

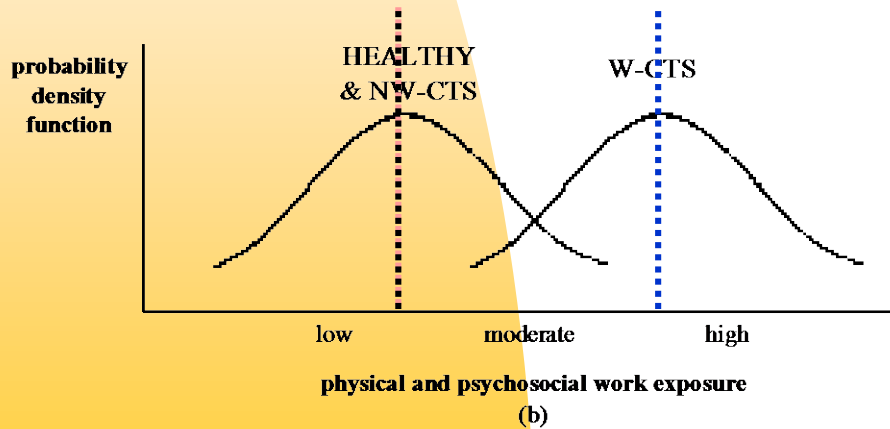
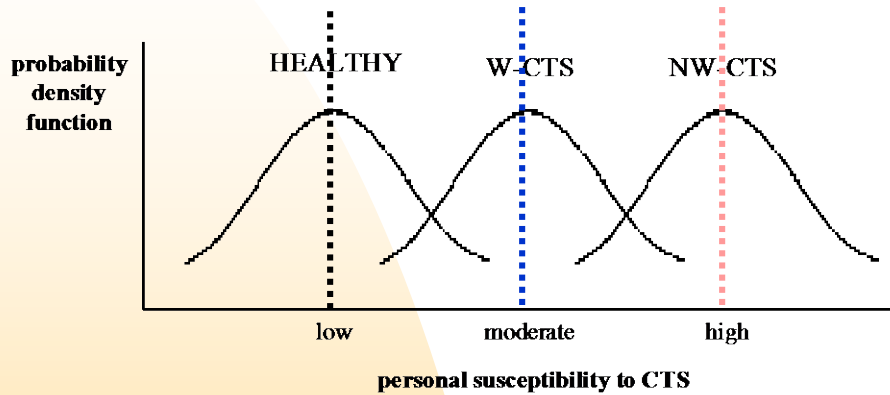
# Study Design

## ■ Case-reference design

Group		Size	Remarks
Case	Work-related CTS patients (W-CTS)	22	• Symptomatic CTS patients • Classification based on the type of medical insurance (W-CTS: workers' comp.; NW-CTS: others)
	Non-work related CTS patients (NW-CTS)	25	
Reference	Healthy workers (HEALTHY)	50	• No CTS symptom history

- ✓ Work experience on the current job > 1 year
  - Exclude cases due to pre-existing CTS conditions.
  - Obtain more valid occupational risk exposure assessment.

# Hypothetical Features of Study Groups



## Causation Matrix

Cause \ Case	Personal susceptibility	Occupational exposure
W-CTS	●	●
NW-CTS	●	





# Risk Exposure Assessment

- Used a CTS risk assessment questionnaire developed by You (1999).
  - ✓ Time: 1 to 1.5 hr/participant
  - ✓ Retrospective assessment of risk exposures
  - ✓ Contents

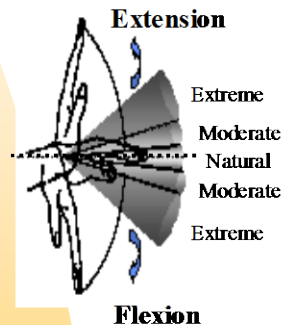
Risk Factor Category	# factors	Instruments adapted
Personal	29	Edinburgh handedness inventory, Bortner scale
Psychosocial	7	Kasl & Amick's questionnaire
Physical	9	Dynamometers

# Physical Risk Assessment (example)

1. Daily Hours of Work: 8 hours/day

## 2. Daily Hand-Wrist Use

	Right hand						
	Almost Never (< 1%)	Rarely (1-10%)	Occasionally (11-20%)	Often (20-40%)	Frequently (40-60%)	Most of the time (60-80%)	Almost always (> 80%)
No use of the hands	<input type="checkbox"/> 1	<input checked="" type="checkbox"/> 2	<input type="checkbox"/> 3	<input checked="" type="checkbox"/> 4	<input type="checkbox"/> 5	<input type="checkbox"/> 6	<input type="checkbox"/> 7
Use of the hands	<input type="checkbox"/> 1	<input type="checkbox"/> 2	<input type="checkbox"/> 3	<input type="checkbox"/> 4	<input type="checkbox"/> 5	<input type="checkbox"/> 6	<input checked="" type="checkbox"/> 7



Risk exposure level  
=  $f$  {duration,  
frequency, severity}

## 3. Wrist Flexion/Extension

	Right hand						
	Almost never (< 1%)	Rarely (1-10%)	Occasionally (11-20%)	Often (20-40%)	Frequently (40-60%)	Most of the time (60-80%)	Almost always (> 80%)
Use of the hands	<input type="checkbox"/> 1	<input type="checkbox"/> 2	<input type="checkbox"/> 3	<input type="checkbox"/> 4	<input type="checkbox"/> 5	<input type="checkbox"/> 6	<input checked="" type="checkbox"/> 7
Natural (within 5 degrees)	<input type="checkbox"/> 1	<input type="checkbox"/> 2	<input type="checkbox"/> 3	<input checked="" type="checkbox"/> 4	<input type="checkbox"/> 5	<input type="checkbox"/> 6	<input type="checkbox"/> 7
Moderate (5 to 30 degrees)	<input type="checkbox"/> 1	<input type="checkbox"/> 2	<input type="checkbox"/> 3	<input checked="" type="checkbox"/> 4	<input type="checkbox"/> 5	<input type="checkbox"/> 6	<input type="checkbox"/> 7
Extreme (above 30 degrees)	<input type="checkbox"/> 1	<input type="checkbox"/> 2	<input checked="" type="checkbox"/> 3	<input type="checkbox"/> 4	<input type="checkbox"/> 5	<input type="checkbox"/> 6	<input type="checkbox"/> 7



# Risk Scale & Reliability

- Defined 106 risk exposure scales.

(e.g.) smoking

(1) smoking status (never/ex-smoker/current smoker)

(2) smoking experience (no/yes)

(3) smoking history during last 5 years (no/yes)

(4) current status of smoking (no/yes)

(5) years of smoking (never smoked/1-10/11-20/>20)

(6) years of smoking (years)

(7) smoking level (never smoked/1-10/11-20/>20 cigarettes/day)

- Screened 98 reliable risk scales.

- ✓ Test-retest (>1 week apart) for 20 participants

- ✓ correlation  $\geq .7$



# Model Development Procedure

No	Phases	Technique
1	Variable screening	<ul style="list-style-type: none"><li>• Pseudo-univariate logistic regression</li></ul>
2	Risk prediction model development	<ul style="list-style-type: none"><li>• Multiple logistic regression</li></ul>
3	Model adequacy checking	<ul style="list-style-type: none"><li>• Hosmer-Lemeshow test</li></ul>
4	Classification model development	<ul style="list-style-type: none"><li>• ROC analysis</li></ul>
5	Model cross-validation	<ul style="list-style-type: none"><li>• Jack-knife technique</li></ul>

# Pseudo-Univariate Logistic Regression

- Conducted multiple logistic regression for each risk scale including age, gender, and age×gender (common confounders for CTS risk).
- Screened risk scales if:
  - OR (odds ratio) agrees with previous findings
  - $P < .25$  (Afifi and Clark, 1990)

Risk Scale	NW-CTS / HEALTHY									
	Frequency				Adjusted for age and gender			$\chi^2$ test		
	Cases		Referents		Odds Ratio	<i>P</i>	95% CI	$\chi^2$	<i>d.f.</i>	<i>P</i>
<b>Repetitive use of the hands and wrists for recreational activity</b>										
Minimal (<1 hr/week)	6	24%	20	40%						
Low (1-3 hrs/week)	7	28%	8	16%	<b>3.87</b>	0.076	0.87 - 17.32	4.30	3	<b>0.231</b>
Moderate (3-5 hrs/week)	5	20%	14	28%	2.21	0.320	0.46 - 10.50			
Heavy (>5 hrs/week)	7	28%	8	16%	<b>3.91</b>	0.084	0.83 - 18.41			

Increased  
CTS risk

# Multiple Logistic Regression

- Conducted multiple logistic regression with the screened risk scales.

Risk Scales	NW-CTS / HEALTHY					
	Coefficient ( $\beta$ )	Standard Error (SE( $\beta$ ))	Wald ( $W$ )	<i>d.f.</i>	<i>P</i>	Partial Correlation ( $R$ )
Age (AGE)						
Gender (GENDER)						
<b>Hard Driving and Competitiveness (HD)</b>			5.91	2	0.05	0.14
Low (<= 3.7)						
Moderate (3.8 to 4.7)	1.29	0.814	2.52	1	0.11	0.07
High (> 4.7)	1.97	0.818	5.81	1	0.02	0.20
Weight (WT)						
<b>Wrist ratio - right hand (WR_R)</b>	0.23	0.090	6.80	1	0.01	0.22
<b>Female by WT</b>	0.01	0.0041	6.40	1	0.01	0.21
<b>AGE by WR_R</b>	0.0012	0.0005	5.55	1	0.02	0.19
Constant	-23.46	6.974	11.32	1	<.01	

relative contribution

(risk scales whose  $R > .1$  are bolded)

- Risk prediction: 
$$p = \frac{1}{1 + e^{-(\alpha + \beta_1 X_1 + \beta_2 X_2 + \dots + \beta_p X_p)}}$$

# CTS Risk Assessment Models

Risk Factors	Multiple Logistic Regression Models		
	W-CTS/ HEALTHY	NW-CTS/ HEALTHY	C-CTS/ HEALTHY
Personal Factors	<ol style="list-style-type: none"> <li>1. <b>gender</b> (GENDER)</li> <li>2. <b>wrist ratio of the right hand</b> (WR_R)</li> <li>3. <b>musculoskeletal disorder history during last 5 years at the hands/wrists</b> (MD_5_D)</li> </ol>	<ol style="list-style-type: none"> <li>1. age (AGE)</li> <li>2. gender (GENDER)</li> <li>3. <b>behavioral pattern-hard driving and competitiveness</b> (HD)</li> <li>4. weight (WT)</li> <li>5. <b>wrist ratio of the right hand</b> (WR_R)</li> </ol>	<ol style="list-style-type: none"> <li>1. <b>age</b> (AGE)</li> <li>2. gender (GENDER)</li> <li>3. light of use of the hands/wrists for recreational activity (LU)<sup>†</sup></li> <li>4. weight (WT)</li> <li>5. <b>wrist ratio of the right hand</b> (WR_R)</li> <li>6. <b>musculoskeletal disorder history during last 5 years at the hands/wrists</b> (MD_5_D)</li> </ol>
Psychosocial Factors	-	-	-
Physical Factors	<ol style="list-style-type: none"> <li>1. use of heavy power grip forces (&gt;20 lbs.) of the dominant hand (PW_20_D)</li> <li>2. use of heavy pinch grip forces (&gt;5 lbs.) of the dominant hand (PC_5_D)</li> <li>3. very highly repetitive motions (&lt;1 sec./operation) of the dominant hands (RE_1_D)</li> </ol>	-	<ol style="list-style-type: none"> <li>1. use of heavy pinch grip forces (&gt;5 lbs.) of the dominant hand (PC_5_D)</li> <li>2. very highly repetitive motions (&lt;1 sec./operation) of the dominant hands (RE_1_D)</li> <li>3. <b>exposure of the hands/wrists to extremely cold temperature (&lt;50 deg. F)</b> (CO_E)</li> </ol>

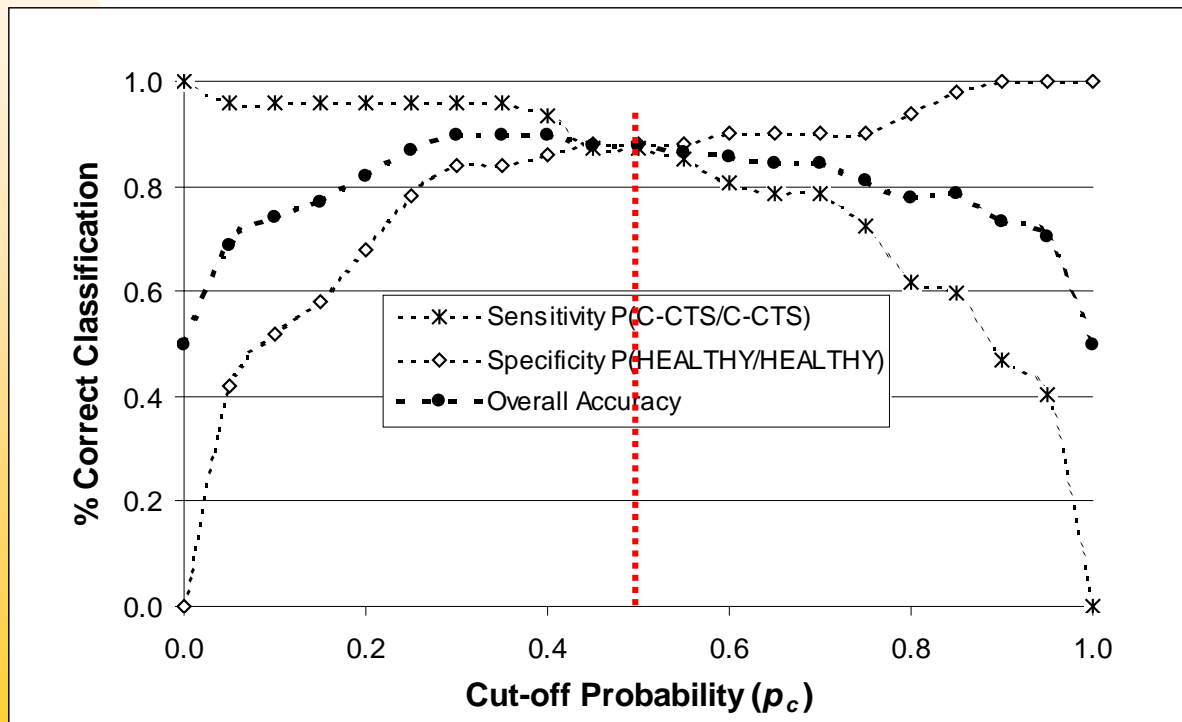
Causation Matrix

Cause \ Case	Personal susceptibility	Occupational exposure
W-CTS	●	●
NW-CTS	●	



# Classification Model

- Determined the **cut-off probability** ( $p_c$ ) for each model which maximizes both **sensitivity** ( $\text{Pr}(\text{case}/\text{case})$ ) and **specificity** ( $\text{Pr}(\text{referent}/\text{referent})$ ) in an equal manner.





# Classification Performance

Model	$P_c$	Sensitivity [P(case/case)]	Specificity [P(referent/ referent)]	Overall accuracy	$d'$
W-CTS/ HEALTHY	.35	91%	88%	89%	2.5
NW-CTS/ HEALTHY	.37	84%	82%	83%	1.9
C-CTS/ HEALTHY	.50	87%	88%	88%	2.3



# Model Cross-Validation

Model	Overall accuracy		Difference
	Original	Cross-validation (by Jack-knife method)	
W-CTS/ HEALTHY	89%	84%	-5%
NW-CTS/ HEALTHY	83%	76%	-7%
C-CTS/ HEALTHY	88%	86%	-2%



# Conclusions

---

- Three multiple logistic models for CTS risk assessment were developed by a holistic approach.
- The risk assessment models showed a satisfactory discriminability and high classification accuracy.
- The assessment models indicates the significant variation in relative contribution of CTS risk factors depending on the work-relatedness of the nerve injury.
- Future work is needed to improve the CTS risk assessment models with more elaborated study group definitions and risk exposure assessment methods.



# Q & A

---



Thank you for your attention!

