

# Effect of Frequency and Similarity Neighborhoods on Pharmacists' Visual Perception of Handwritten Drug Names

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# Drug Name Confusions

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- Account for 15-25% of all reported medication errors in the US
- Specifically identified by IOM in their report on medical errors
- Mandated initiatives underway at FDA to address the problem
- Several ongoing 'disasters' involving high-profile products



# Why Do These Errors Happen?

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- Similarity- and frequency-based errors in cognitive processing
- Memory (recall and recognition)
- Perception (visual and auditory)
- Motor control
- This study focused on *visual perception of handwritten names*



# Examples (from USP-MERP)

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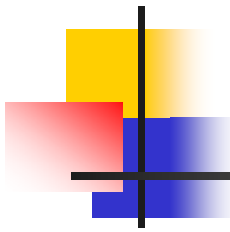
- Lamisil<sup>®</sup> vs. Lamigel<sup>®</sup>
- Accupril<sup>®</sup> vs. Accutane<sup>®</sup>
- Celebrex<sup>®</sup> vs. Celexa<sup>®</sup>
- Cisplatin vs. carboplatin
- Hydroxyzine vs. Hydralazine
- Zosyn<sup>®</sup> vs. Zofran<sup>®</sup>
- Prilosec<sup>®</sup> vs. Prozac<sup>®</sup>
- Pediapred<sup>®</sup> vs. Pediaprofen<sup>®</sup>
- Prepridil<sup>®</sup> vs. Bepridil<sup>®</sup>



# Need for Improved Pre-Approval Screening

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- FDA and manufacturers rely heavily on subjective measures and/or untested quasi-objective measures
- Handwritten and oral orders are examined by FDA-employed health professionals
- Insufficient practitioner review, no objective analysis of multiple attributes



# Objective Measures of Name Similarity

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- N-gram measures of spelling similarity (e.g., bigram, trigram)
- Edit Distance
- Phonetic measures
- Phonological measures
- These measures have been validated in several peer-reviewed publications

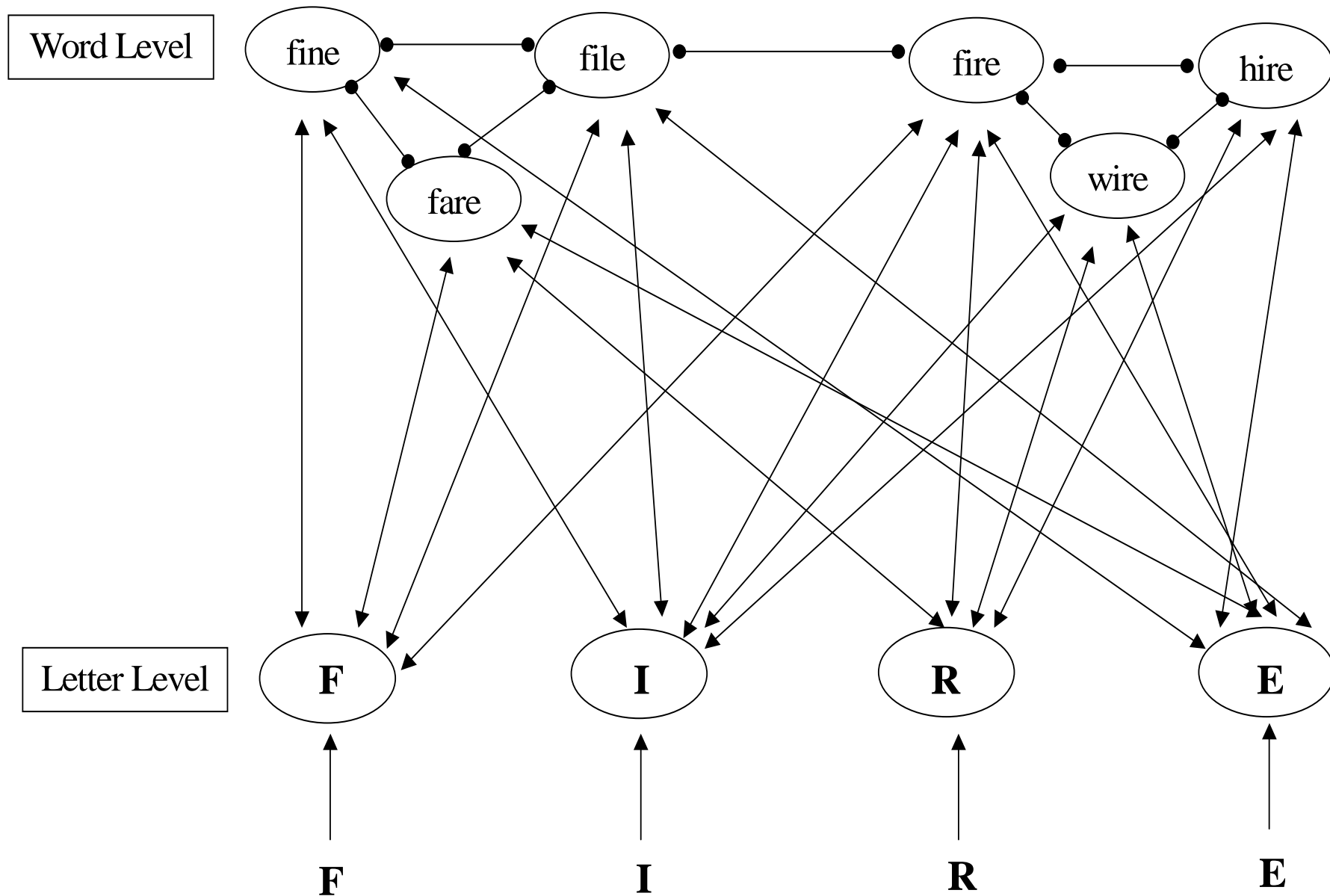


# Visual Perception of Drug Names

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- Perceptual features at multiple layers of abstraction (e.g., segment, letter, word)
- Spreading activation between layers
- **Competition between similar words**
- Activation/competition models
- Influence of similarity and frequency

# Interactive Activation Model







# Similarity and Frequency

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- In general, frequency (of prescribing) increases perceptual accuracy
- In general, similarity (to other names) decreases perceptual accuracy

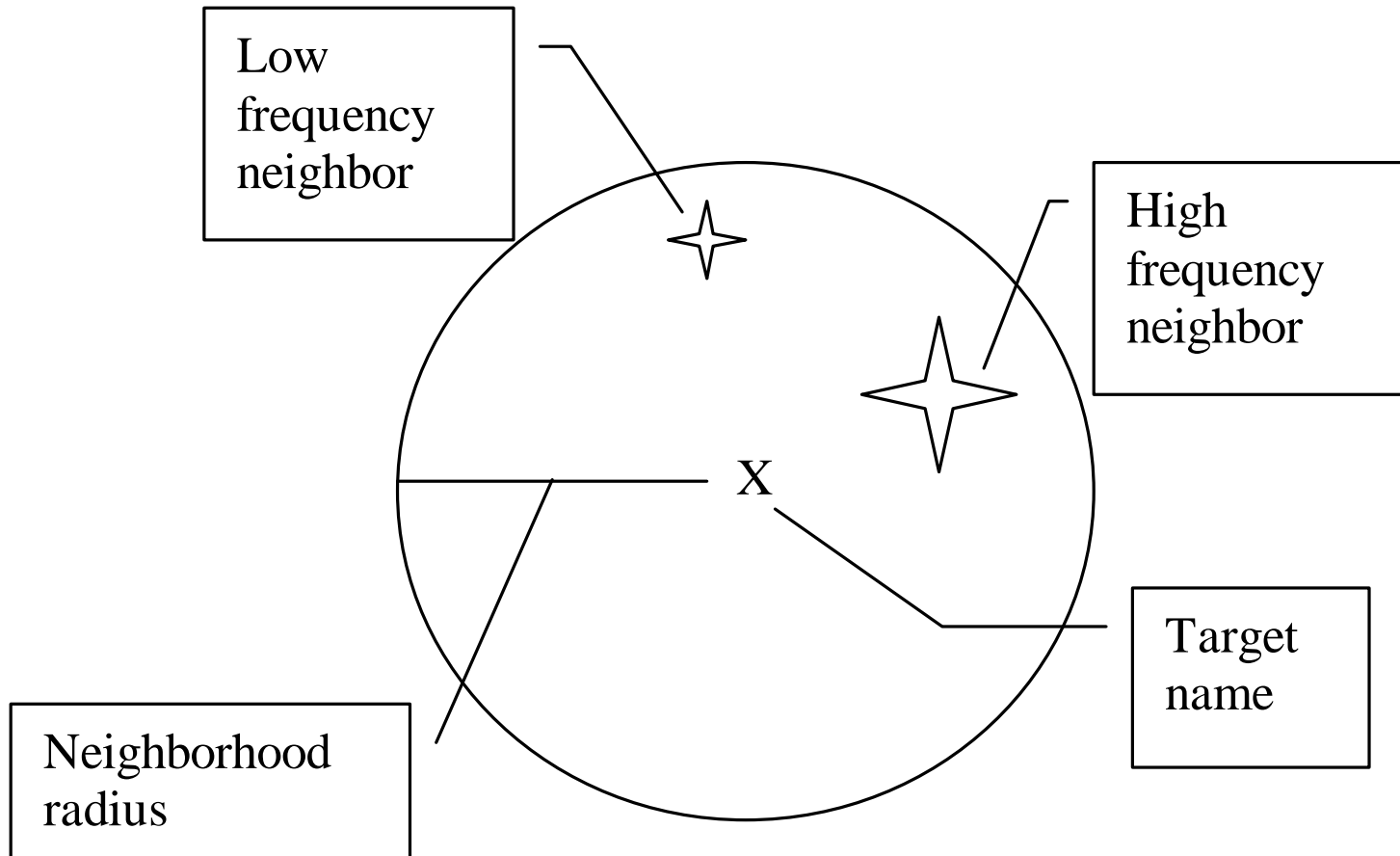


# Definitions

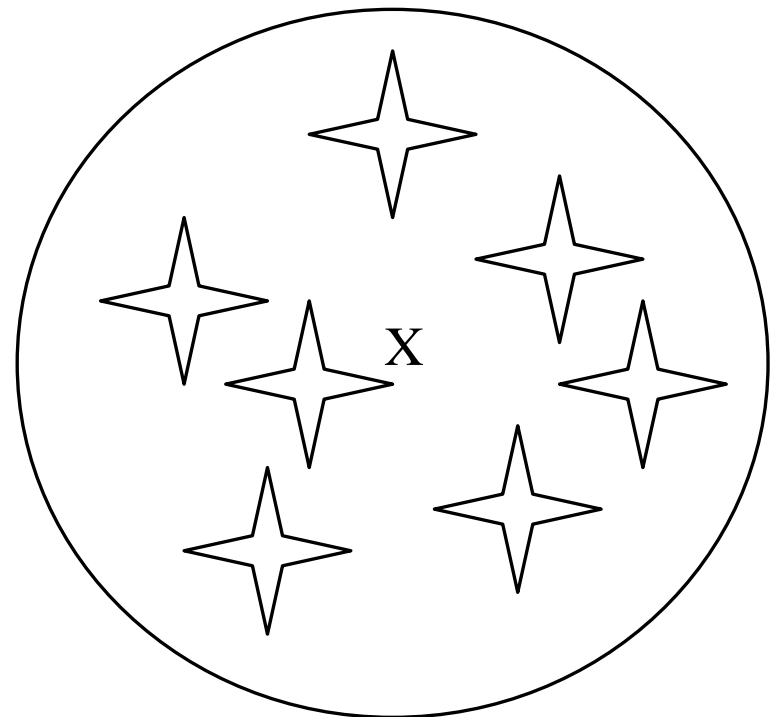
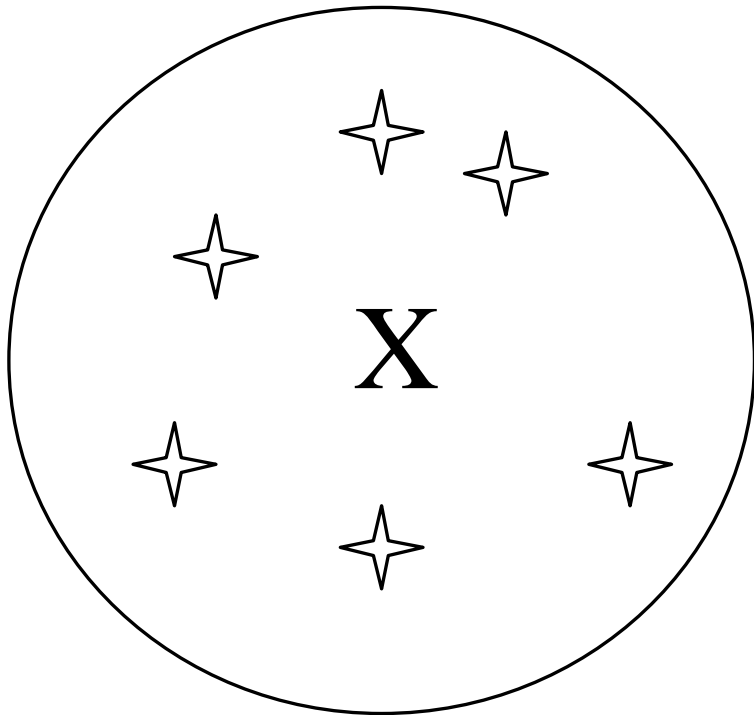
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- **Stimulus Frequency**: the log prescribing frequency of a given drug
- **Neighborhood**: the set of names within a given distance (3 edits) of a stimulus name
- **Neighborhood density**: the number of other names in a stimulus word's neighborhood
- **Neighborhood frequency**: the mean log prescribing frequency of the names in the neighborhood

# Neighborhood Illustration



# Dense Neighborhoods: High and Low Frequency





# Examples

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- High log SF names ( $\log SF > 7$ ): Ventolin<sup>®</sup>, Dyazide<sup>®</sup>, Provera<sup>®</sup>
- Low log SF names ( $\log SF < 3$ ): Vistazine<sup>®</sup>, Antispas<sup>®</sup>, Protaphane<sup>®</sup>
- Name from a sparse neighborhood: Flexeril<sup>®</sup> (no neighbors in NAMCS/NHAMCS)
- Name from a dense neighborhood: Dynabac<sup>®</sup>, Synalar<sup>®</sup>, Rynatan<sup>®</sup>, Dynapen<sup>®</sup>, Dynacirc<sup>®</sup>, Dynacin<sup>®</sup>, Cynobac<sup>®</sup>



# Hypotheses

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- Error rates will increase as stimulus frequency decreases
- Error rates will increase as neighborhood density increases
- Error rates will increase as neighborhood frequency increases



# Methods and Design

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- 2 x 2 x 2 design (stimulus frequency by neighborhood density by neighborhood frequency)
- Stimuli and prescribing frequency data taken from 1992-1996 NAMCS and NHAMCS government databases



# Stimuli: Drug Names

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- Twenty names each were selected at high and low levels of prescribing frequency, neighborhood frequency, and neighborhood density.





# Methods and Design

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- Participants were licensed, practicing pharmacists drawn from attendees at the 2000 National Community Pharmacists Association annual meeting (N=37)
- Task is a noise-masked visual perception task
- Participant must identify a degraded drug name after 3-second exposure

TRUATION

Betadine

Unasyn

ventolin

Solaten



# Procedure

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- Pharmacist seated in front of Macintosh computer
- Drug names appear for 3 seconds
- Names degraded as if sent by a bad fax machine
- Row of XXXXs replaces name after 3 seconds
- Pharmacist types in correct response
- 5 practice trials, 160 test trials



# Analysis Plan

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- Independent Variables
  - Stimulus Frequency
  - Neighborhood Density
  - Neighborhood Frequency
  - 2- and 3-way Interactions
- Dependent Variable
  - Error (1 = error; 0 = correct)
  - All misspellings coded as error
- Mixed-effects logistic regression
- Backward Elimination

# Parameter Estimates

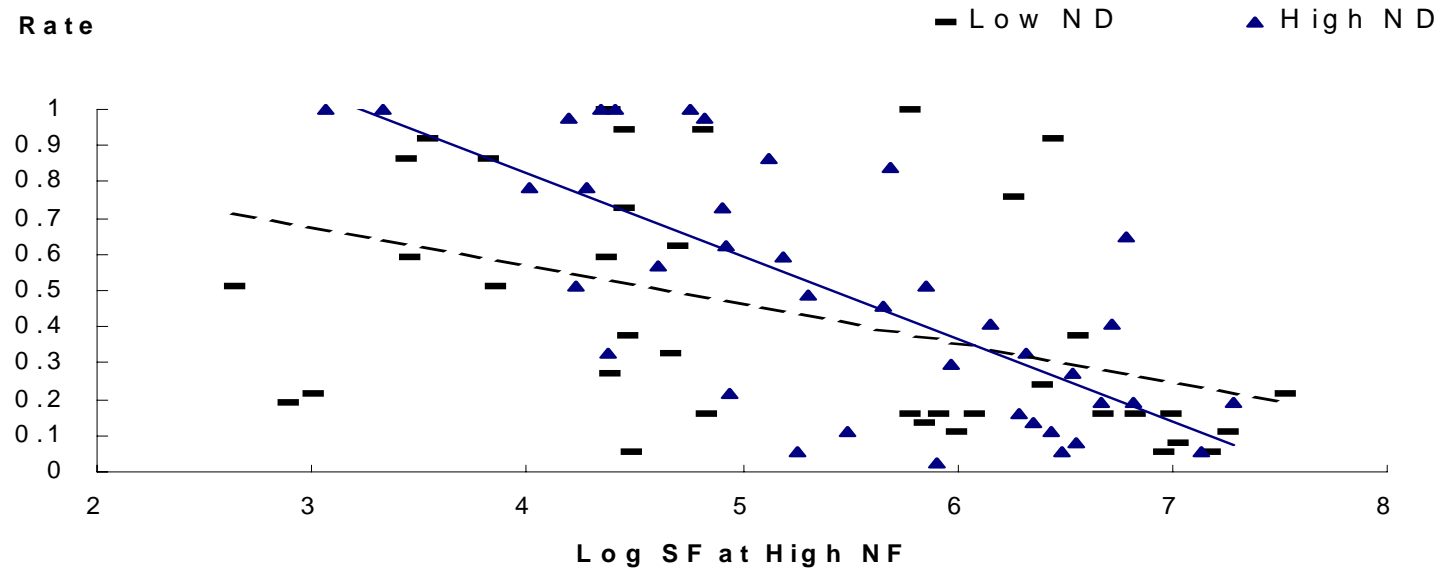
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Variable	Estimate	SE	Z
Intercept	0.129	0.147	0.878
SF	-0.612	0.033	-18.474*
NF	0.096	0.054	1.783
ND	0.186	0.053	3.495*
SF x NF	-0.206	0.042	-4.886*
SF x ND	-0.116	0.034	-3.423*
NF x ND	0.031	0.043	0.726
SF x NF x ND	-0.144	0.024	-6.068*

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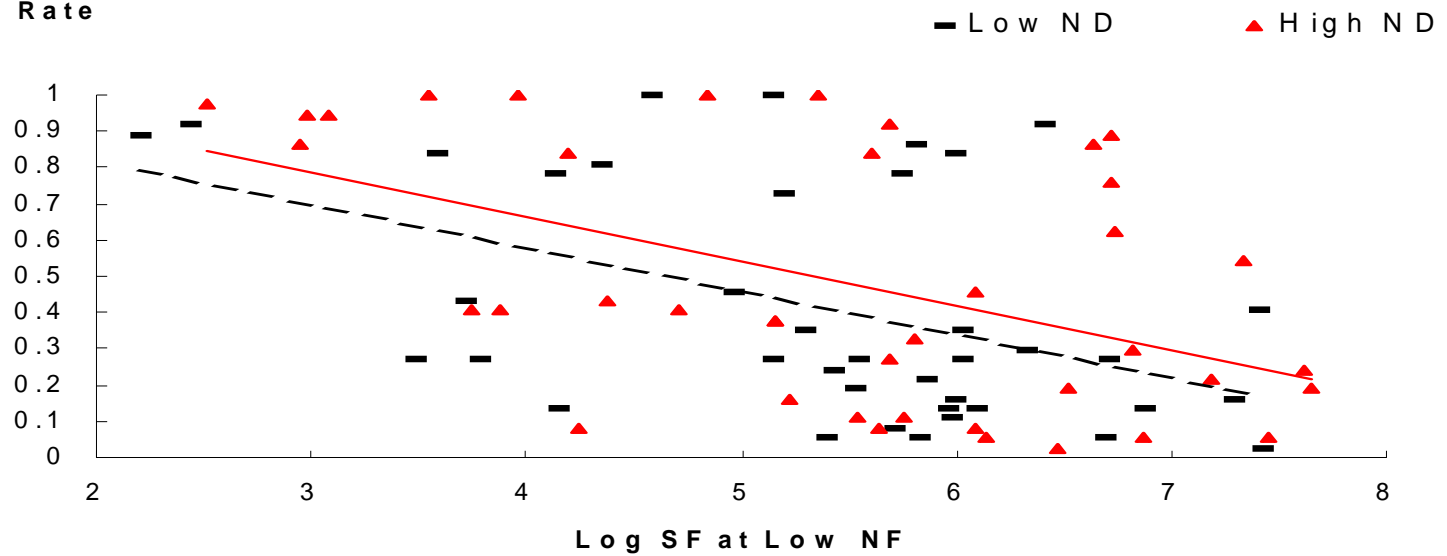
(a)

Error Rate



(b)

Error Rate





# Limitations

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- Somewhat contrived, laboratory task
- Relatively small, non-representative sample of pharmacists (NCPA attendees)
- Noise and exposure durations may be unrealistic



# Patient Safety Lessons

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- Similarity and frequency are still basic mechanisms of error. Look for them everywhere.
- Probability of error not most important endpoint
- Minimize harm
- Harm is a function of number of opportunities for error, probability of error and severity of error





# Barriers and Obstacles

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- Bias still favors “front-line” solutions despite rhetoric about latent errors and systems
- Interdisciplinary research can fall through the cracks as entrenched institutions each say “that’s outside our area”
- Measuring downstream impact of upstream fixes is very difficult/impossible
- Patient safety orgs still lack human factors expertise



# What's Next?

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- Publication and dissemination
- Auditory perception studies
- Software development and dissemination
- Application to formularies within individual health systems
- Integration with other error prevention methods



# Discussion and Implications

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- Rare names much more difficult to perceive than common names.
- Dense neighborhoods inhibit perception
- NF amplifies effect of ND
- SF lessens effect of ND
- Keep neighborhoods sparse
- Use neighborhood measures in pre-approval screening.



# Conclusion

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- The less frequently a drug name is prescribed, the more difficult it is to perceive correctly.
- For low frequency words, the presence of similar neighbors significantly increases the probability of a perceptual error.



# Acknowledgments

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- National Patient Safety Foundation
- Robert Gibbons, Paul Luce