

# **Lecture 7 Text Entry on Mobile Devices -1**

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•**Top Three Activities on Mobile Devices:**

1) Emailing, 2) Social Networking, 3) Messaging

([www.time.com](http://www.time.com))

•**18 to 24 Year Olds Average 110 Text Messages per Day**

([www.time.com](http://www.time.com))

# Challenges of Touchscreen Text Entry

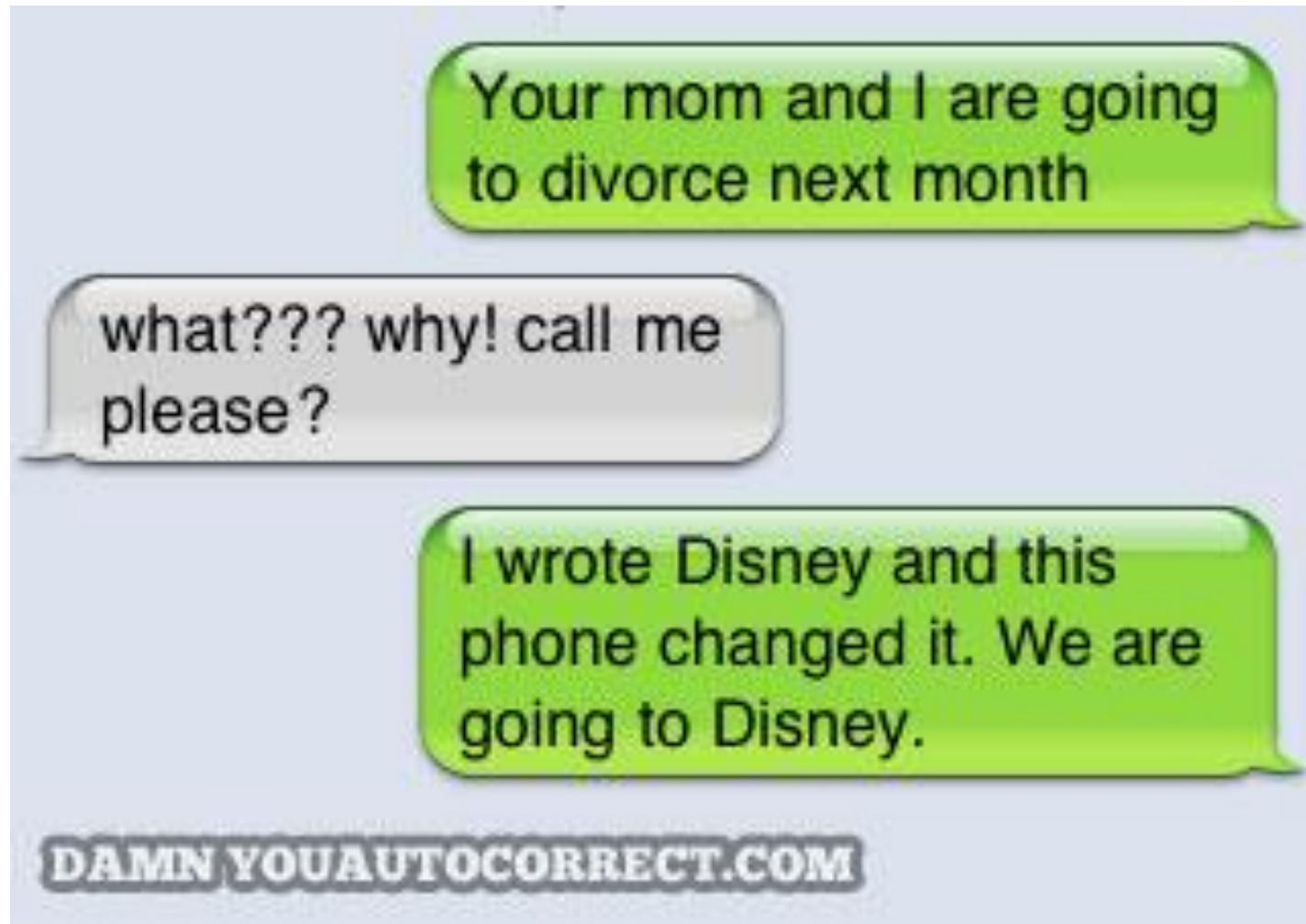


# Challenges of Touchscreen Text Entry



Determined by key boundaries, 50% of words are not correctly typed on phone.

# Unsuccessful Auto-correction



# Unsuccessful Auto-correction



# Outline

- Smart Touch Keyboard
- Gesture Typing
- Optimizing Keyboard Layouts

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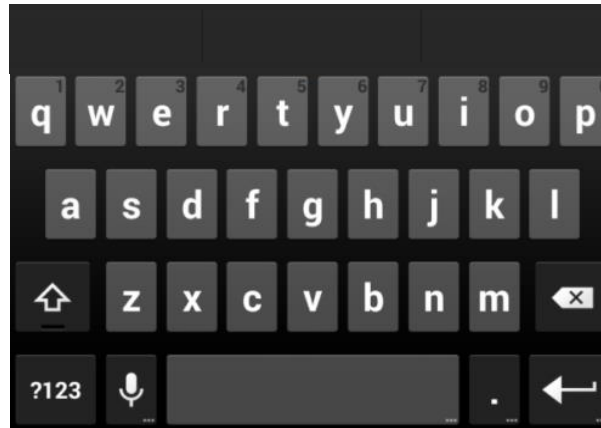


# Smart Touch Keyboard

Typed Word

Keyboard Output

agsim



again

quivj



quick

fav

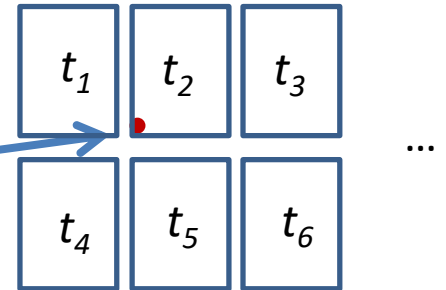


favorite

# Principles of Target Selection

$n$  target candidates:  $T = \{t_1, t_2, \dots, t_n\}$

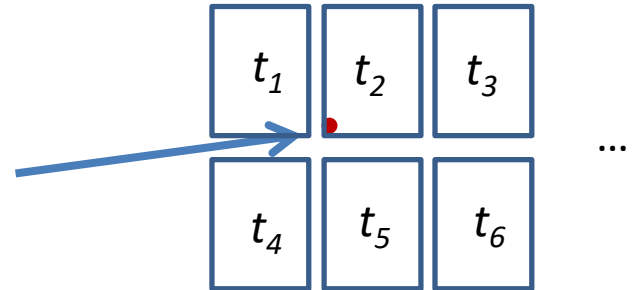
touch point:  $s$



# Principles of Target Selection

$n$  target candidates:  $T = \{t_1, t_2, \dots, t_n\}$

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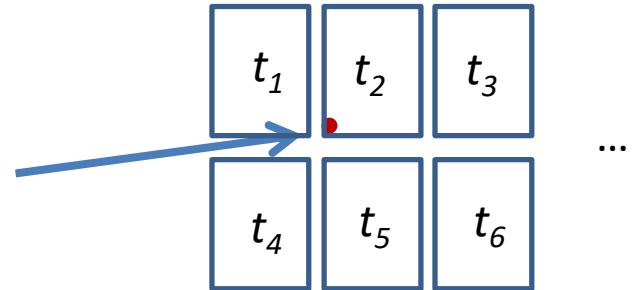
Determining the target:

$$t^* = \underset{t}{\operatorname{argmax}} P(t|s)$$

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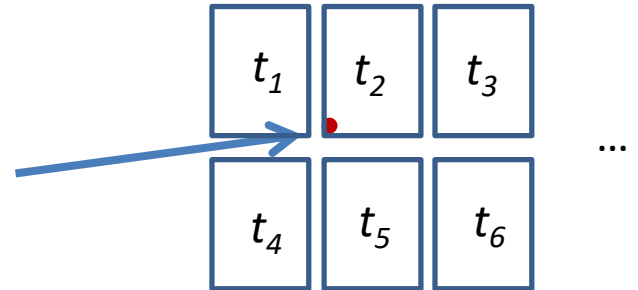
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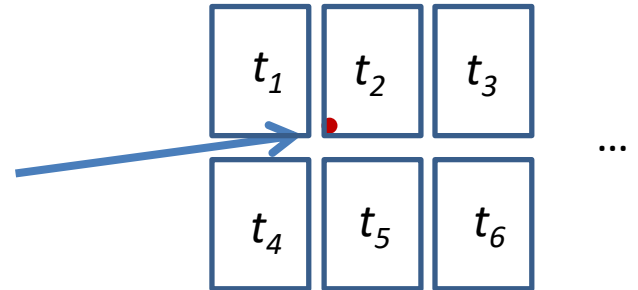
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$$P(s|t) = P(s|\mu, \sigma^2) = \frac{1}{(2\pi\sigma^2)^{1/2}} \exp\left\{-\frac{1}{2\sigma^2} (s - \mu)^2\right\}$$

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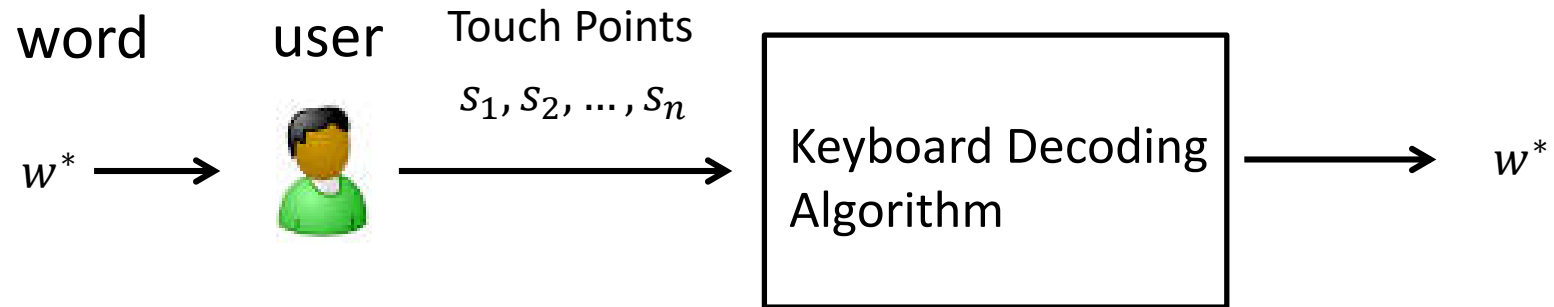
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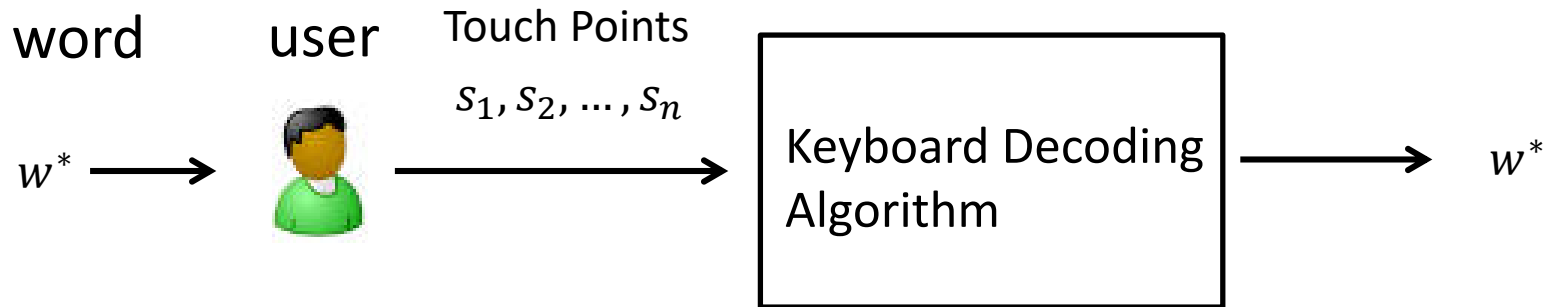
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$P(t)$ : prior probability

# Principles of Smart Touch Keyboard



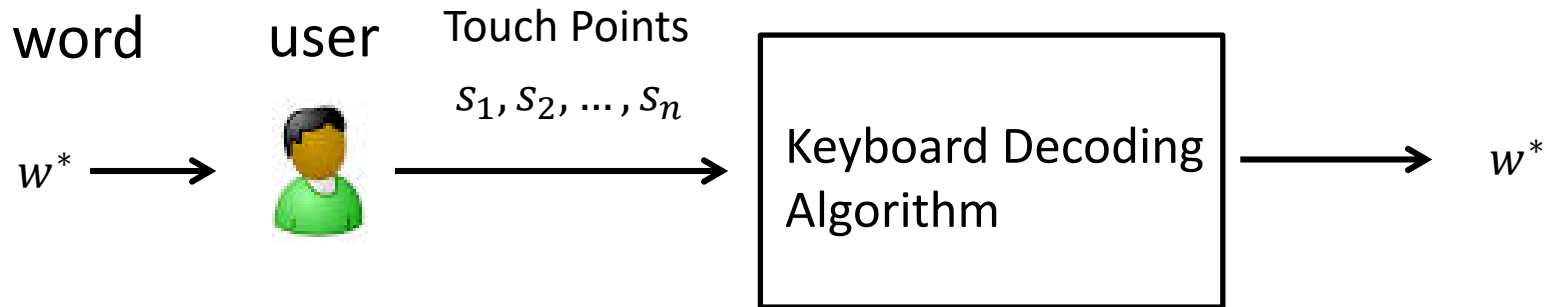
# Principles of Smart Touch Keyboard



$$w^* = \underset{w}{\operatorname{argmax}} P(w | s_1, s_2, \dots, s_n)$$



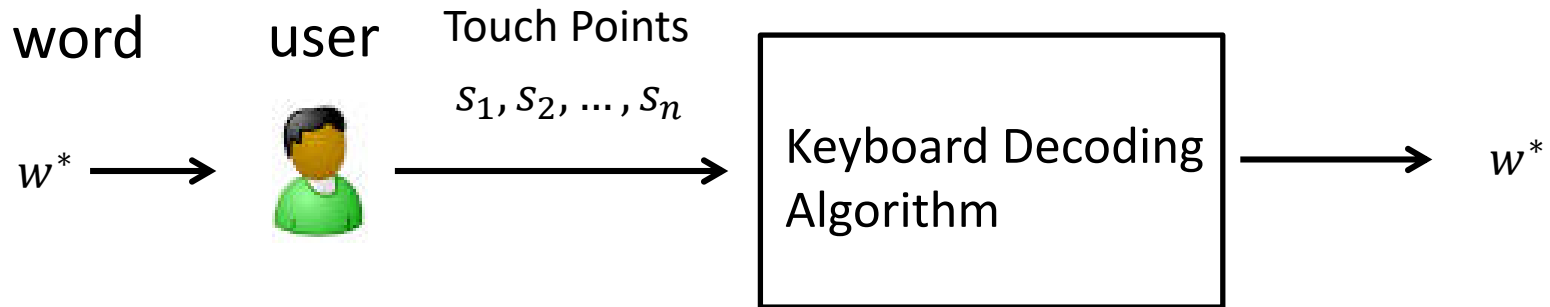
# Principles of Smart Touch Keyboard



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$$P(w | s_1, s_2, \dots, s_n) = \frac{P(s_1, s_2, \dots, s_n | w) P(w)}{P(s_1, s_2, \dots, s_n)}$$

# Principles of Smart Touch Keyboard

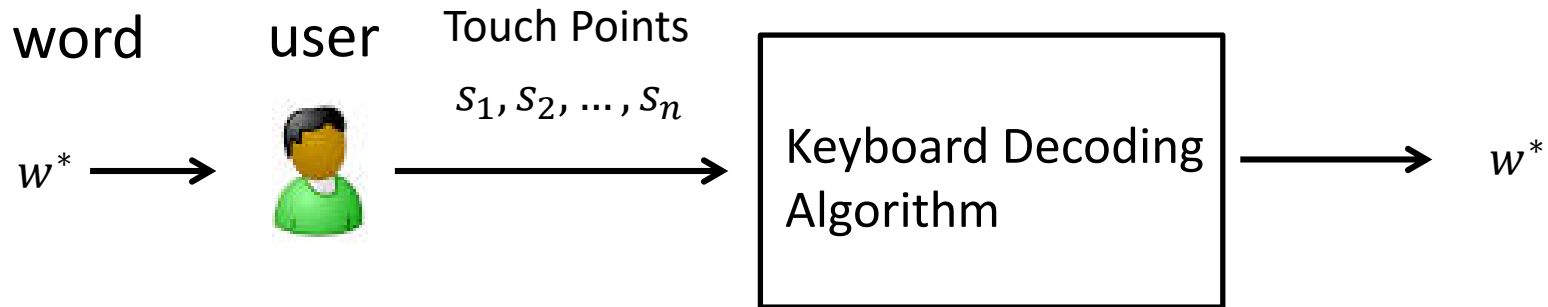


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$P(w)$ : probability from language model

# Principles of Smart Touch Keyboard



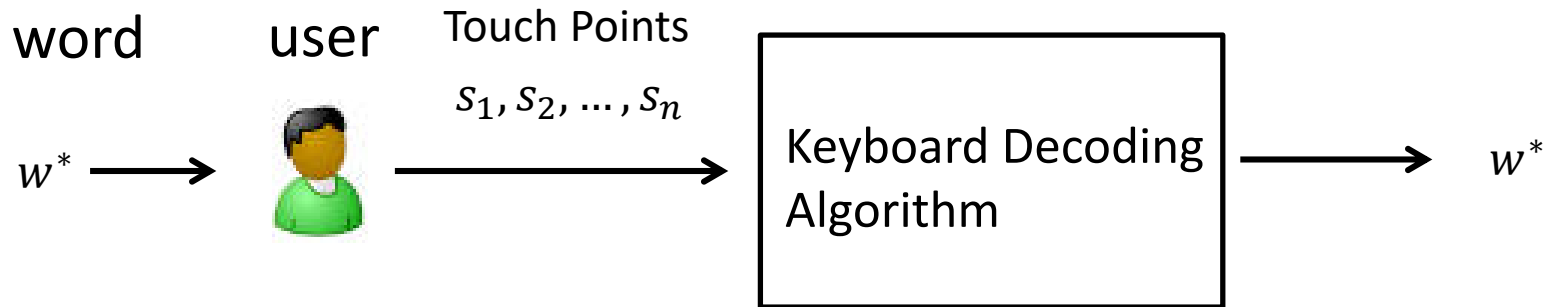
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$P(w)$ : probability from language model

$P(s_1, s_2, \dots, s_n | w)$ ?

# Principles of Smart Touch Keyboard

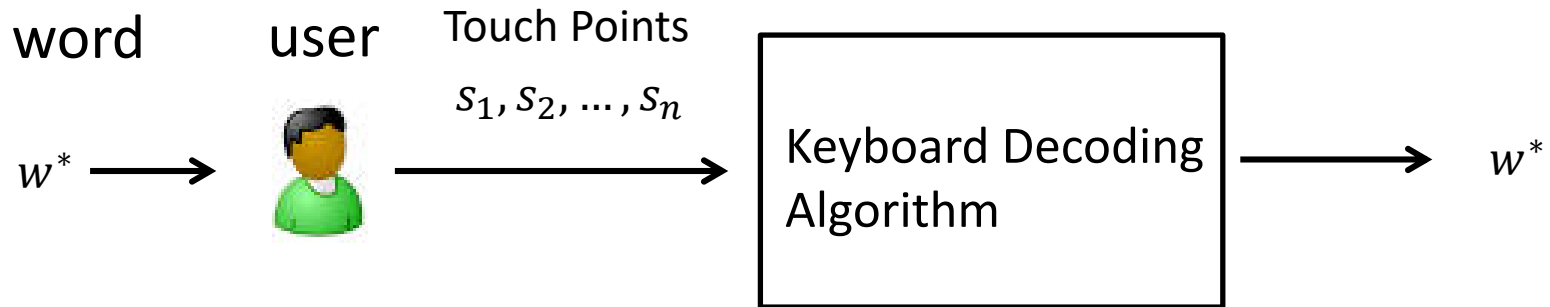


Assume  $w$  consists of  $n$  letters  $c_1, c_2, \dots, c_n$

$$\begin{aligned} P(s_1, s_2, \dots, s_n | w) &= P(s_1, s_2, \dots, s_n | c_1, c_2, \dots, c_n) \\ &= P(s_1 | c_1) P(s_2 | c_2) \dots P(s_n | c_n) \end{aligned}$$

$$P(s_i | c_i) = P(s_i | \mu, \sigma^2) = \frac{1}{(2\pi\sigma^2)^{1/2}} \exp\left\{-\frac{1}{2\sigma^2} (s - \mu)^2\right\}$$

# Principles of Smart Touch Keyboard



$$w^* = \underset{w}{\operatorname{argmax}} P(w | s_1, s_2, \dots, s_n)$$

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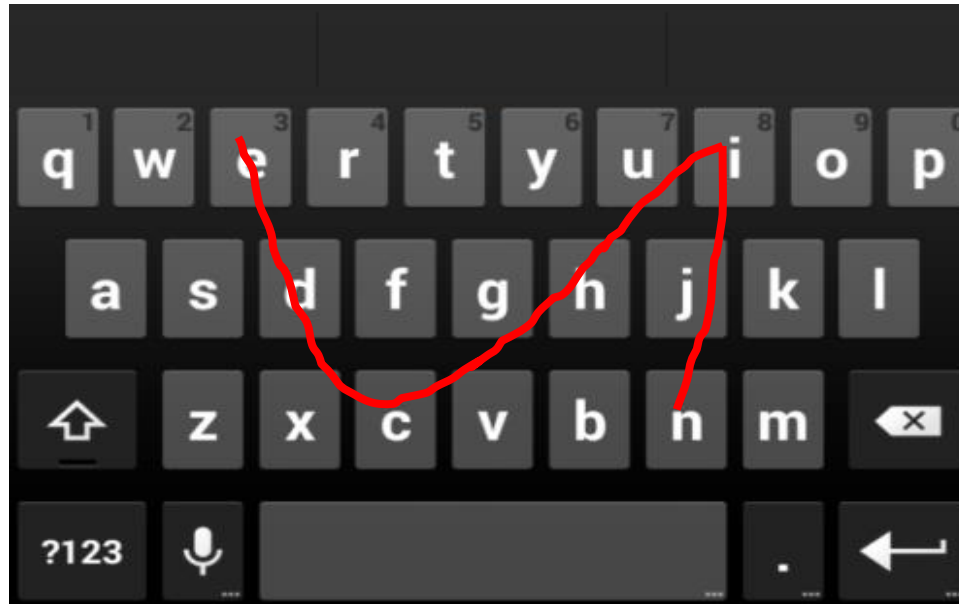
$P(s_1, s_2, \dots, s_n | w)$ ?

# Outline

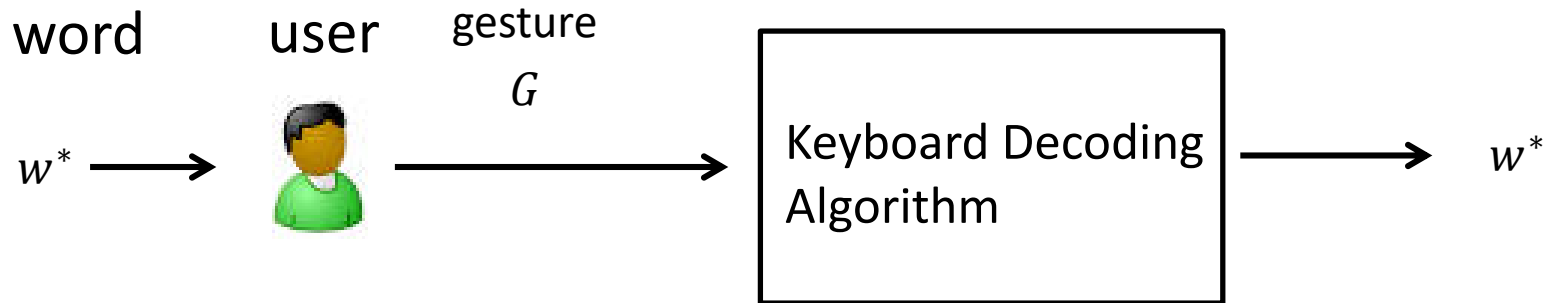
- Smart Touch Keyboard
- **Gesture Typing**
- Optimizing Keyboard Layouts

# Gesture Keyboard

Entering *nice*



# Gesture Decoder



$$W^* = \operatorname{argmax}_w P(W|G) = \operatorname{argmax}_w \frac{P(G|W)P(W)}{P(G)}$$

$$W^* = \operatorname{argmax}_w P(G|W)P(W)$$

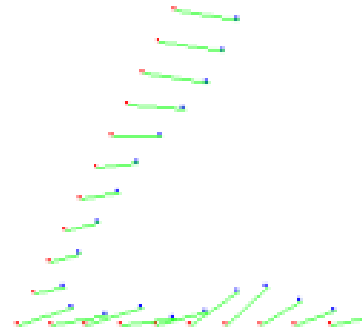
How to calculate  $P(G|W)$ ?



# SHARK<sup>2</sup> Algorithm

- Location Recognition Channel

$$x_s = \frac{1}{N} \sum_{i=1}^N \|u_i - t_i\|_2$$



- Shape Matching Channel

# Gesture Keyboard



ShapeWriter



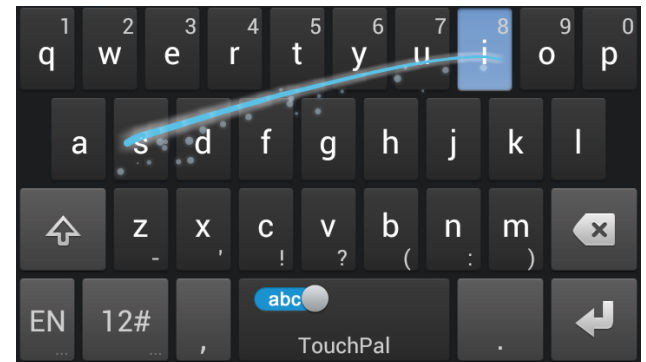
Android

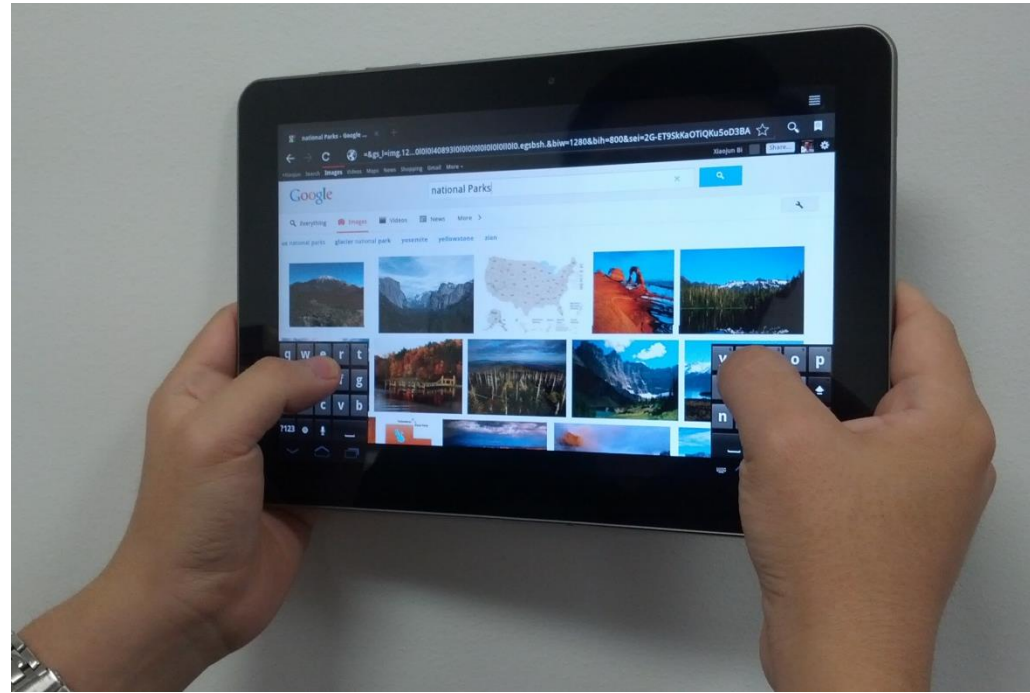
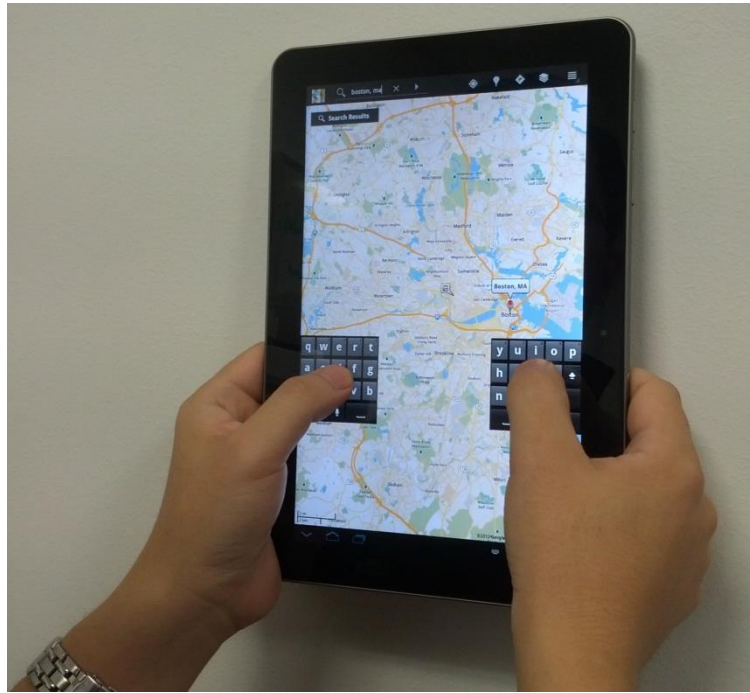


Swype



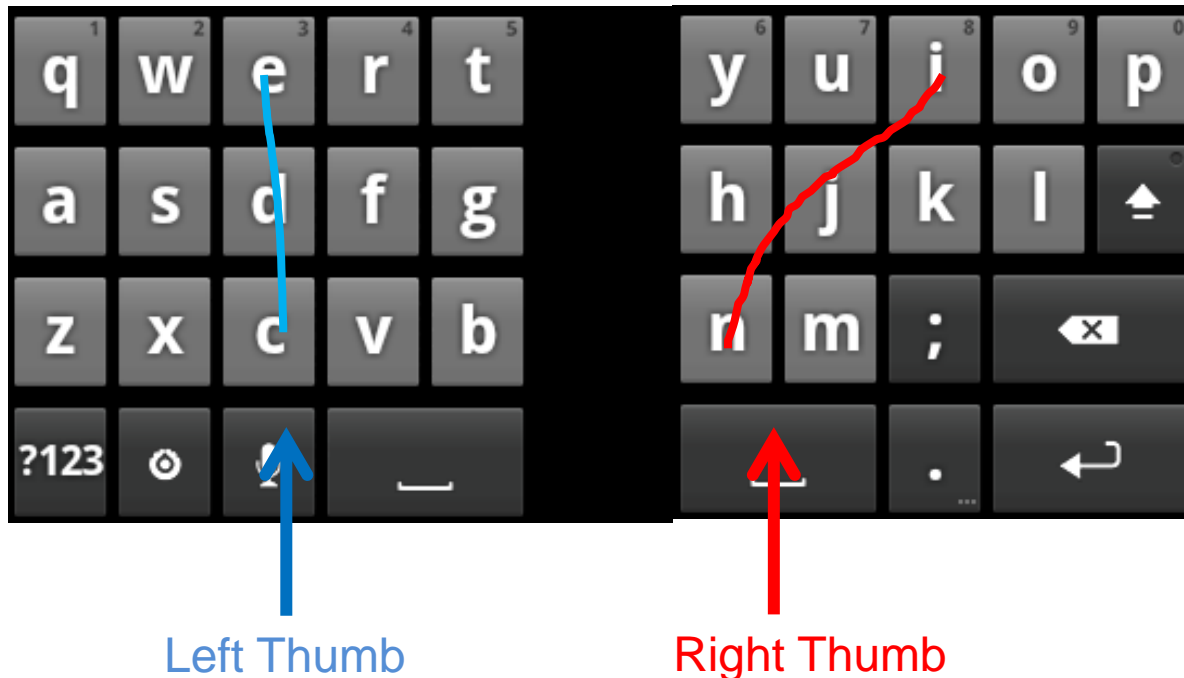
TouchPal





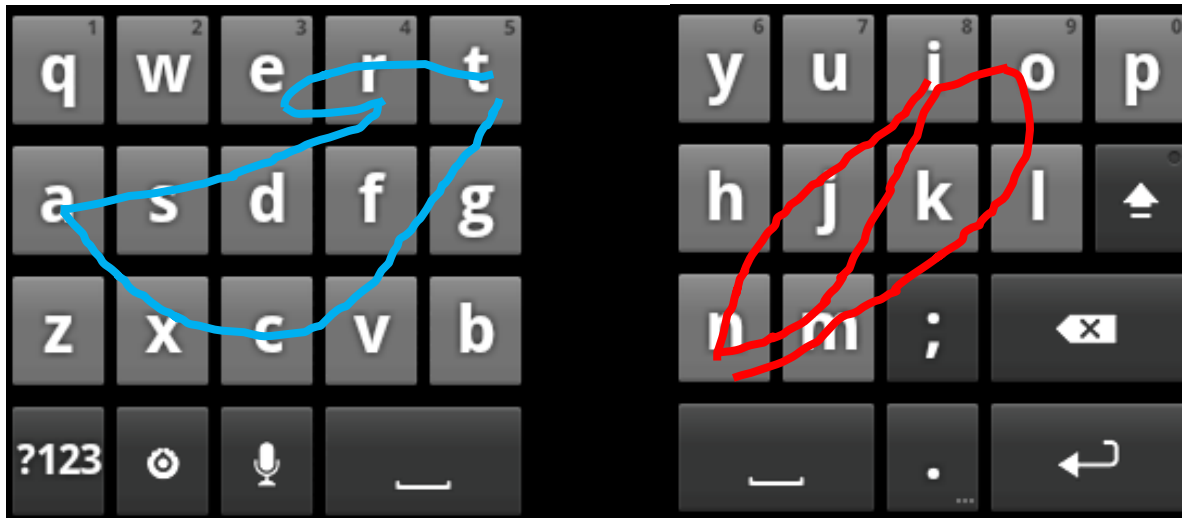
# Bimanual Gesture Typing

Entering *nice*



# Bimanual Gesture Typing

Entering *interaction*



# Bimanual Gesture Typing

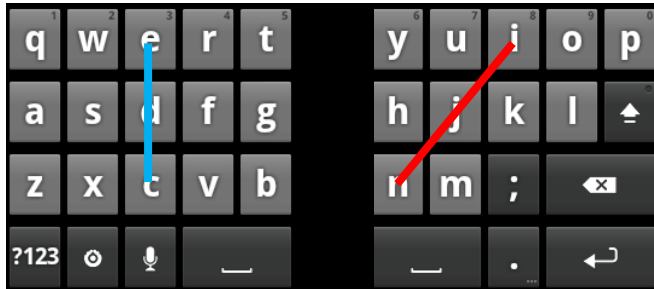


# Perfect Templates

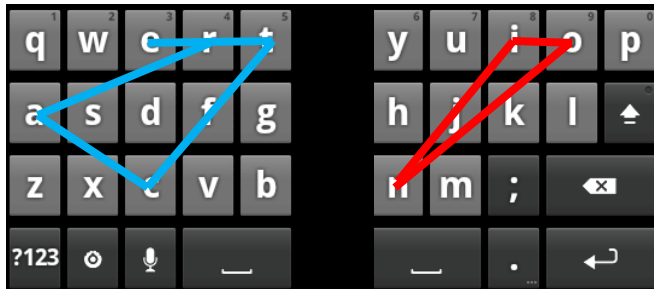


ce      ni  
    ↙    ↘  
  nice

# Perfect Templates



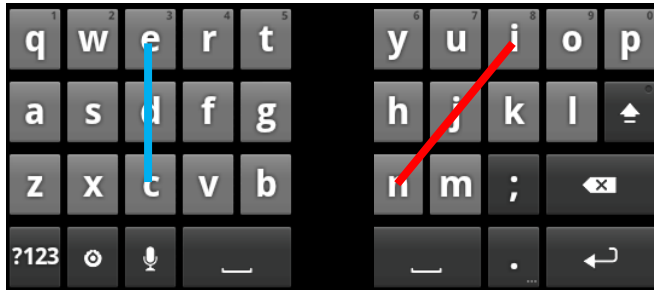
ce ni  
nice



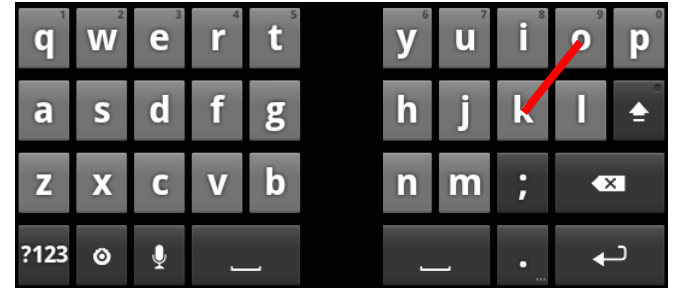
teract inion  
interaction



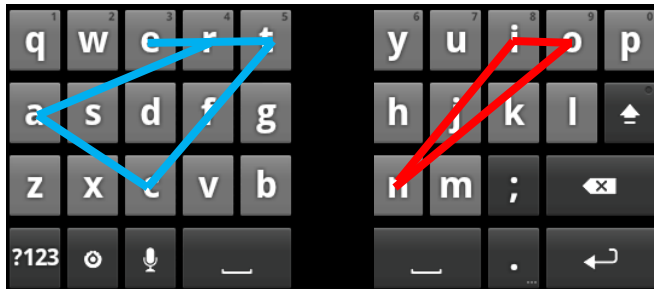
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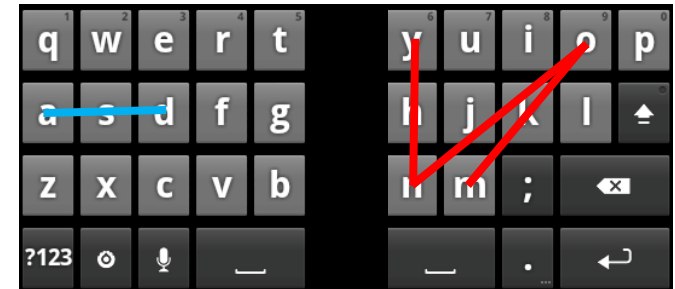
ce ← nice → ni



ok → ok

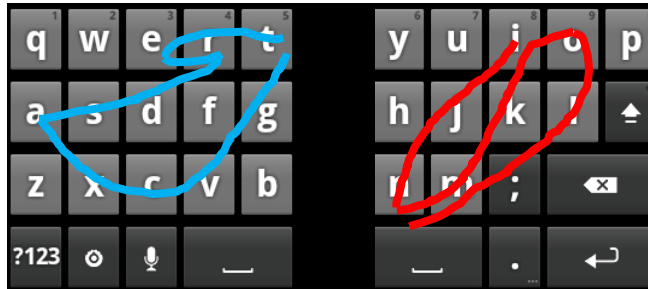


teract ← inion → interaction

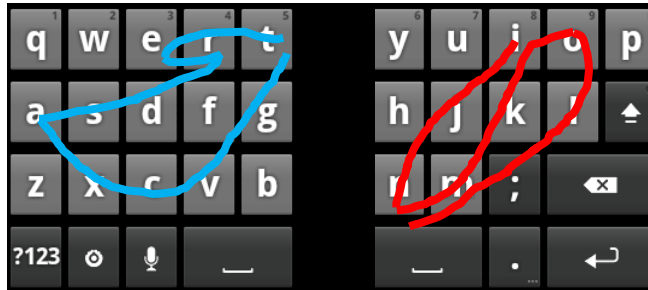


da ← mony → Monday

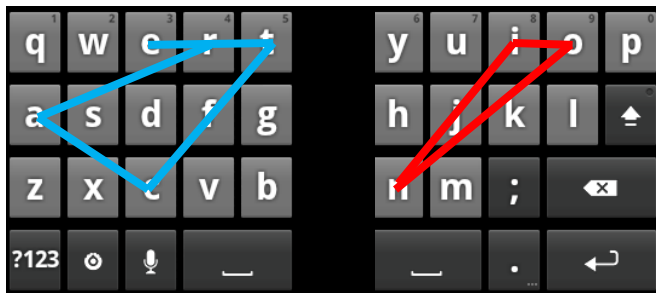
# Bimanual Gesture Recognition



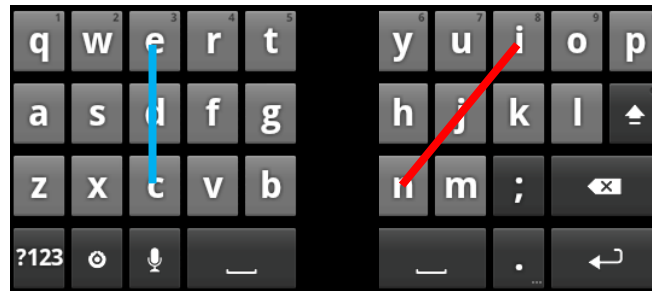
# Bimanual Gesture Recognition



Best Match



interaction

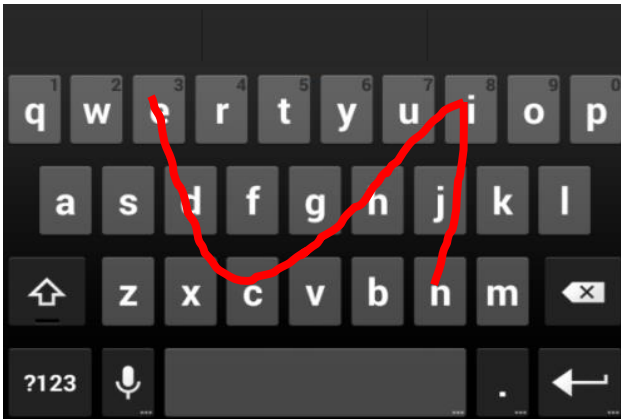


nice

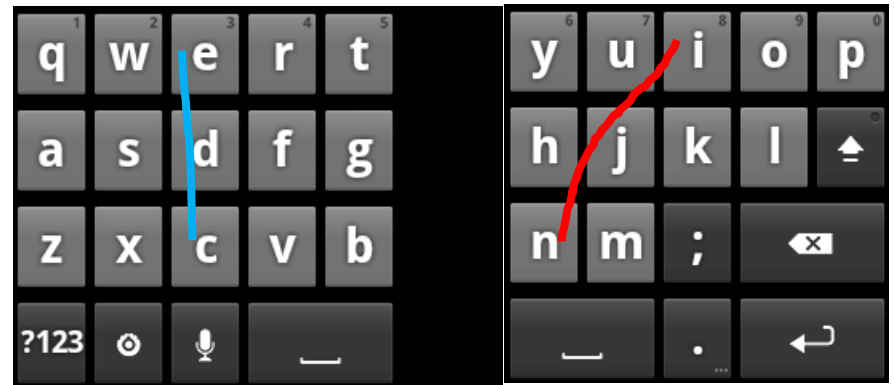
...

# Entering *nice*

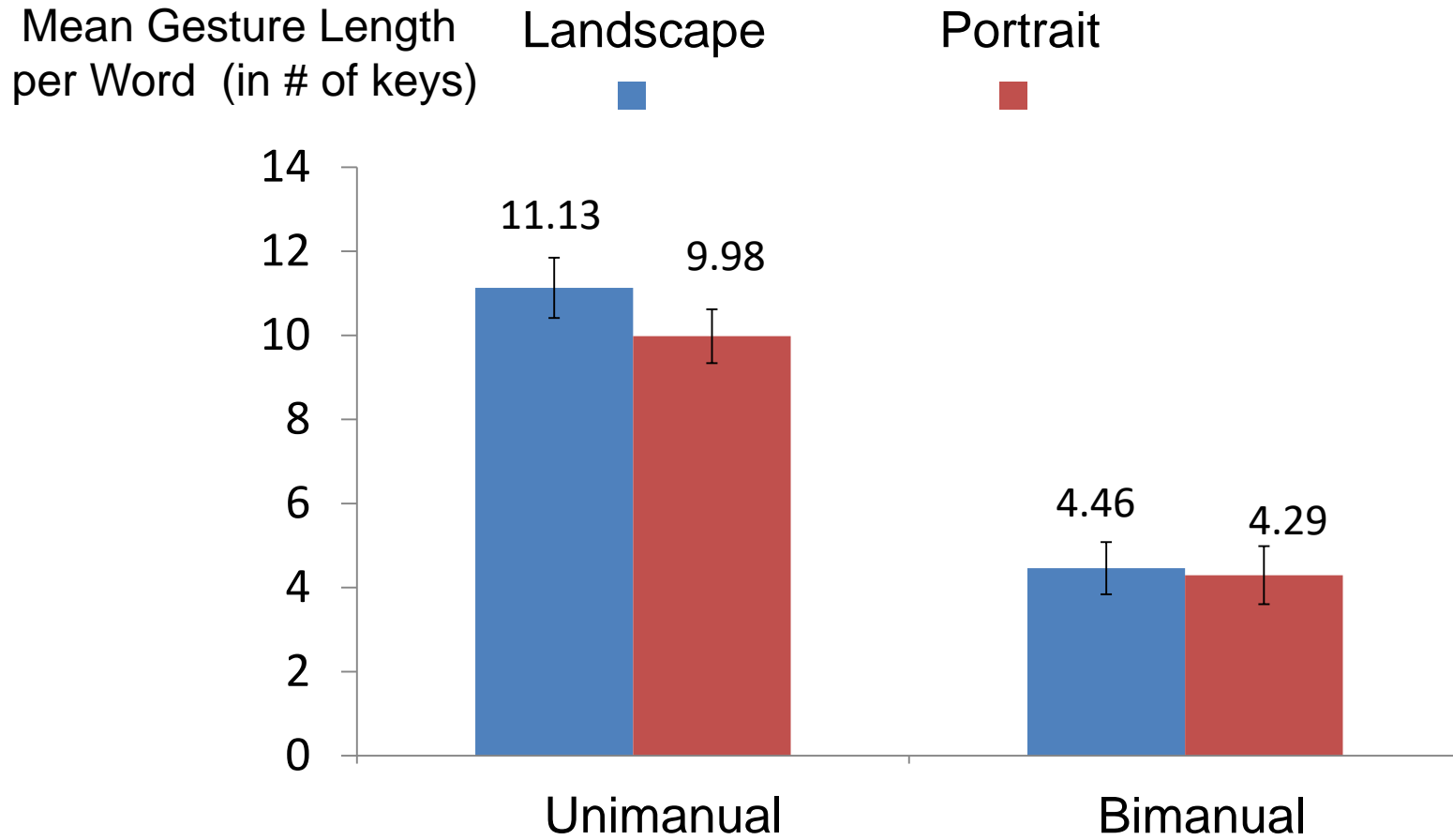
Unimanual Gesture



Bimanual Gesture



# Finger Travel Distance of Unimanual and Bimanual Gesture Typing



# Android Keyboard



From [www.androidpolice.com](http://www.androidpolice.com)