Mixed Effect Regression Analysis in Distinction of English Words with Finalobstruent Using Preceding Vowel Length

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Schedule

- Background Information
- Experiment and data
- Research question and hypothesis
- Models selection
- Results analysis
- Conclusion

Background information

- In English, there is voiced final-obstruent as well as voiceless finalobstruent. e.g. bed/bet ("d" is voiced while "t" is voiceless.)
- Make distinction of final obstruent:
 - Primary cue: voicing.
 - Secondary cue: preceding vowel length. (more significant)
- Secondary cue: preceding vowel length.
- In English, the preceding vowel length of voiced final obstruents is longer than preceding vowel length of voiceless final obstruents. (Kenyon, 1951)

Background information

- In Dutch, however, there is no voiced final-obstruent. e.g. hard/hart ("d" becomes "t". So they are homophones.)
- When Dutch speaks English, they should be able to make distinction of final-obstruent. (using primary cue or/and secondary cue)
- Can Dutch use preceding vowel length of final-obstruent to make distinction in English?

Background information

- Whispered speech causes no vocal fold vibration. (no voiding at all)
- It is logical to infer that speakers (native and non-native speakers) rely more secondary cue (vowel length) more heavily in case of whispered speech than in case of phonated speech.

Research questions

- 1. Is there a difference in preceding vowel length between words with voiced final-obstruents and words with voiceless final-obstruents?
 - (H1: The vowel length is longer in voiced final-obstruents.)
- 2. For native and non-native speakers, is there a difference in vowel length between those two groups?
 - (H2: There is difference.)
- 3. Is there a difference in preceding vowel length between whispered speech and phonated speech?
 - (H3: Whispered speech leads to longer preceding vowel length.)

Experiment

- 1. There were 20 non-native speakers and 8 native speakers.
- 2. Monosyllabic English words were given. They could be divided in group of voiced/voiceless final obstruent, and fricative/stop.
- 3. Both native and non-native speakers pronounce words in both whispered speech and phonated speech.
- 4. Measured the vowels length of each words as time duration in unit of millisecond.

Data

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• Subject: Native speakers (NS) and Non-native speaker (NNS)

tem:		Whisper	Obstruent	Voicing	WhCtV
	1	Whispered	Fricative	Voiced	111
	2	Whispered	Fricative	Voiceless	110
	3	Whispered	Stop	Voiced	101
	4	Whispered	Stop	Voiceless	100
5 6 7	5	Phonated	Fricative	Voiced	011
	6	Phonated	Fricative	Voiceless	010
	7	Phonated	Stop	Voiced	001
	8	Phonated	Stop	Voiceless	000

whisper (Wh)	obstruent (Ct)	voicing (V)
whispered: 1	fricative: 1	voice: 1
phonated: 0	Stop: 0	voiceless: 0

• Vowel Length (DV)

Data

1 Participant Group +Wh+Ct+V +Wh+Ct-V +Wh-Ct+V +Wh-Ct-V -Wh+C	Ct+V -Wh+Ct-V	-Wh-Ct+V	-Wh-Ct-V
	61.69 125.33		
2 F1AH36 NS 257.29 142.5 311 258.47 26	1000	264.03	230.43
3 F1AM27 NS 258.7 165.04 316.68 299.02 23	32.31 144.24	252.99	268.63
4 F1MG27 NS 225.25 163.43 290.57 248.1 24	42.16 138.57	255.94	235.19
5 F1NP23 NS 244.53 187.79 284.46 271.79 22	24.58 149.23	263.78	246.29
6 F1NR28 NS 213.7 148.74 259.34 217.67 1	78.11 94.34	195.56	159.6
7 M1BC38 NS 275.51 198.35 288.24 256.49 25	56.68 139.2	239.45	229.95
8 M1JF41 NS 224.91 156.37 272.72 230.82 2	59.03 146.13	284.34	216.12
9 M1TW30 NS 206.88 126.19 257.27 205.77 19	90.71 89.25	224.76	180.57
10 F2AD19 NNS 179.16 178.36 257.45 247.48 17	77.94 153.58	230.38	220.59
11 F2AN24 NNS 198.75 180.75 237.24 240.39 23	15.81 196.93	240.12	240.46
12 F2BP23 NNS 197.54 193.93 259.18 267.49 22	25.62 232.69	271.16	275.34
13 F2CG25 NNS 186.83 180.26 261.15 245.16 18	84.52 177.6	242.08	246.27
14 F2EC22 NNS 253.47 238.22 320.04 322.83 23	17.46 214.18	288.25	284.03
15 F2MB21 NNS 215.97 212.78 292.03 280.13 22	18.14 197.27	264.1	271.69
16 F2MK26 NNS 255.01 209.97 292.39 282.53 22	21.57 188.67	248.45	230.72
17 F2MT20 NNS 243.26 243.24 326.37 332.46 20	01.48 195.84	278.84	266.45
18 F2MV22 NNS 221.47 195.22 254.8 258.34 19	95.16 157.05	213.29	196.95
19 F2WH23 NNS 207.89 207.43 300.85 308.63 20	02.21 286.89	256.09	260.03
20 M2AM21 NNS 193.8 163.07 225.08 233.3 20	01.58 155.59	207.7	223.78
21 M2JJ25 NNS 209.82 188.75 277.03 271.49 19	98.71 195.87	212.97	196.65
22 M2JK27 NNS 153.42 137.1 238.41 232.68	162.5 135.55	210.75	180.02
23 M2JM24 NNS 263.09 241.04 369.65 368.94 22	28.99 198.57	291.4	248.88
24 M2MA25 NNS 173.59 168.21 237.27 215.59	157.5 138.17	193.02	180.43
25 M2ML24 NNS 207.94 188.29 304.64 284.94 17	70.89 148.68	242.61	233.6
26 M2RJ039 NNS 194.77 153.89 283.82 252.23 16	68.34 129.21	228.96	201
27 M2RM24 NNS 225.99 227.23 305.12 307.36 20	04.51 198.1	259.05	252.27
28 M2RR24 NNS 201.97 178.35 248.21 235.18 17	72.13 149.31	209.61	188.4
29 M2RW29 NNS 199.58 154.06 238.73 215.32 20	06.32 159.27	215.27	197.31

Data

	Α	В	С	D	E	F	G	
1	Parts	Group	WhCtV	Wh	Ct	V	VL	
2	1	NS	111	whispered	fricative	voiced	257.29	
3	1	NS	110	whispered	fricative	voiceless	142.5	
4	1	NS	101	whispered	stop	voiced	311	
5	1	NS	100	whispered	stop	voiceless	258.47	
6	1	NS	011	phonated	fricative	voiced	261.69	
7	1	NS	010	phonated	fricative	voiceless	125.33	
8	1	NS	001	phonated	stop	voiced	264.03	
9	1	NS	000	phonated	stop	voiceless	230.43	
10	2	NS	111	whispered	fricative	voiced	258.7	
11	2	NS	110	whispered	fricative	voiceless	165.04	
12	2	NS	101	whispered	stop	voiced	316.68	
13	2	NS	100	whispered	stop	voiceless	299.02	
14	2	NS	011	phonated	fricative	voiced	232.31	
15	2	NS	010	phonated	fricative	voiceless	144.24	
16	2	NS	001	phonated	stop	voiced	252.99	
17	2	NS	000	phonated	stop	voiceless	268.63	
18	3	NS	111	whispered	fricative	voiced	225.25	
19	3	NS	110	whispered	fricative	voiceless	163.43	
20	3	NS	101	whispered	stop	voiced	290.57	
21	3	NS	100	whispered	stop	voiceless	248.1	
22	3	NS	011	phonated	fricative	voiced	242.16	
23	3	NS	010	phonated	fricative	voiceless	138.57	
24	3	NS	001	phonated	stop	voiced	255.94	

Mixed Effect Regression

- Suitable for categorical and continuous predictors.
- It contains fixed effect and random effect.
- Results can be generalized across subjects and items.
- Easy to add random effect.

 $y_i = \mu_a + \epsilon_{j[i]} + (\mu_b + \delta_{j[i]}) \times x_i + e_i$

Mixed Effect Regression

- Fixed effect: Voicing (V), Group, Whisper(wh).
- Random effect:
 - 1. Participants (intercept)
 - 2. Words (intercept)
 - 3. Random slope for participants group (NS/NNS) per words.
 - 4. Random slope for words features (Voicing? Whispering?) per participants.

Normality of ID (vowel length)



Normal Q-Q Plot

Theoretical Quantiles

> shapiro.test(df\$VL)

Shapiro-Wilk normality test

data: df\$VL W = 0.9962, p-value = 0.8605



Library in R

> library(lme4)

> vl.lmer1<-lmer(VL~Group+(1|Group)+(1+V|WhCtV),data=df)</pre>

Model: H1 (voiced/voiceless)

(No random slope)

VL~V+(1 Parts)+(1 WhCtV)	VL~V+(1 WhCtV)	VL~V+(1 Parts)
Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 628.4 25.07 WhCtV (Intercept) 1483.4 38.51 Residual 503.2 22.43 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 236.26 19.94 11.85 Vvoiceless -26.30 27.40 -0.96 Correlation of Fixed Effects: (Intr) Vvoiceless -0.687	Random effects: Groups Name Variance Std.Dev. WhCtV (Intercept) 1461 38.22 Residual 1132 33.64 Number of obs: 224, groups: WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 236.26 19.37 12.20 Vvoiceless -26.30 27.40 -0.96 Correlation of Fixed Effects: (Intr) Vvoiceless -0.707	Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 468.6 21.65 Residual 1781.2 42.20 Number of obs: 224, groups: Parts, 28 Fixed effects: Estimate Std. Error t value (Intercept) 236.263 5.713 41.35 Vvoiceless -26.297 5.640 -4.66 Correlation of Fixed Effects: (Intr) Vvoiceless -0.494

> AIC(v1.lmerVS1,v1.lmerVS2,v1.lmerVS3) Model: H1 (voiced/voicele v1. 1mer V51 9 2063. 322 vl.lmervs2 6 2219.355

(With random slope)

vl.lmervs3 6 2342.670

VL~V+(1+V Parts)+(1+Group WhCtV)	VL~V+(1+Group WhCtV)	VL~V+(1+V Parts)	
Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 527.30 22.963 Vvoiceless 30.46 5.519 1.00 WhCtV (Intercept) 1453.96 38.131 GroupNS 757.80 27.528 0.12 Residual 318.78 17.854 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 226.444 19.751 11.465 Vvoiceless -6.101 26.991 -0.226 Correlation of Fixed Effects: (Intr) Vvoiceless -0.670	Random effects: Groups Name Variance Std.Dev. Corr WhCtV (Intercept) 1419.5 37.68 GroupNS 620.9 24.92 0.17 Residual 1000.2 31.63 Number of obs: 224, groups: WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 227.828 19.065 11.950 Vvoiceless -5.768 26.962 -0.214 Correlation of Fixed Effects: (Intr) Vvoiceless -0.707	Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 327.39 18.09 Vvoiceless 53.14 7.29 Residual 1764.42 42.01 Number of obs: 224, groups: Parts, 28 Fixed effects: Estimate Std. Error t value (Intercept) 236.263 5.239 45.10 Vvoiceless -26.297 5.780 -4.55 Correlation of Fixed Effects: (Intr) Vvoiceless -0.365	Corr 1.00

Model: H2 (NS/NNS)

(No random slope)

VL~Group+(1 Parts)+(1 WhCtV)	VL~Group+(1 WhCtV)	VL~Group+(1 Parts)
Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 650.9 25.51 WhCtV (Intercept) 1466.5 38.29 Residual 503.2 22.43 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 224.342 14.799 15.160 GroupNS -4.299 11.176 -0.385 Correlation of Fixed Effects: (Intr) GroupNS -0.216	Random effects: Groups Name Variance Std.Dev. WhCtV (Intercept) 1444 38.00 Residual 1133 33.66 Number of obs: 224, groups: WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 224.342 13.696 16.380 GroupNS -4.299 4.978 -0.864 Correlation of Fixed Effects: (Intr) GroupNS -0.104	Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 467.6 21.62 Residual 1969.7 44.38 Number of obs: 224, groups: Parts, 28 Fixed effects: Estimate Std. Error t value (Intercept) 224.342 5.974 37.55 GroupNS -4.299 11.176 -0.38 Correlation of Fixed Effects: (Intr) GroupNS -0.535

Model: H2 (NS/NNS)

(With random slope)

> AIC(vl.lmerGr51,vl.lmerGr52,vl.lmerGr53)

df AIC vl.lmerGrS1 9 2064.443 vl.lmerGrS2 6 2221.049 vl.lmerGrS3 6 2357.928

VL~Group+(1+V Parts)+(1+Group WhCtV)	VL~Group+(1+Group WhCtV)	VL~Group+(1+V Parts)
Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 539.3 23.222 Vvoiceless 30.5 5.523 1.00 Whctv (Intercept) 1281.1 35.792 GroupNS 818.5 28.609 0.21 Residual 318.7 17.853 Number of obs: 224, groups: Parts, 28; Whctv, 8 Fixed effects: Estimate Std. Error t value (Intercept) 223.583 13.987 15.985 GroupNS -1.595 15.025 -0.106 Correlation of Fixed Effects: (Intr) GroupNS -0.037	Random effects: Groups Name Variance Std.Dev. Corr WhCtV (Intercept) 1245.4 35.29 GroupNS 713.4 26.71 0.27 Residual 1000.2 31.63 Number of obs: 224, groups: WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 224.342 12.725 17.630 GroupNS -4.299 10.538 -0.408 Correlation of Fixed Effects: (Intr) GroupNS 0.190	Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 222.8 14.92 Vvoiceless 523.6 22.88 1.00 Residual 1815.1 42.60 Number of obs: 224, groups: Parts, 28 Fixed effects: Estimate Std. Error t value (Intercept) 229.621 5.778 39.74 GroupNS 16.026 10.810 1.48 Correlation of Fixed Effects: (Intr) GroupNS -0.535

Model: H3 (Whispered/f > AIC(v1.1merWh1,v1.1merWh2,v1.1merWh3) (No random slope) > AIC(v1.1merWh1,v1.1merWh2,v1.1merWh3) v1.1merWh1 5 2121.823 v1.1merWh2 4 2230.147

vl.lmerWh3 4 2340.945

VL~Wh+(1 Parts)+(1 WhCtV)	VL~Wh+(1 WhCtV)	VL~Wh+(1 Parts)
Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 628.4 25.07 WhCtV (Intercept) 1496.5 38.68 Residual 503.2 22.43 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 210.34 20.03 10.503 Whwhispered 25.54 27.52 0.928 Correlation of Fixed Effects: (Intr) Whwhispered -0.687	Random effects: Groups Name Variance Std.Dev. WhCtV (Intercept) 1474 38.39 Residual 1132 33.64 Number of obs: 224, groups: WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 210.34 19.46 10.810 Whwhispered 25.54 27.52 0.928 Correlation of Fixed Effects: (Intr) Whwhispered -0.707	Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 467.2 21.61 Residual 1792.5 42.34 Number of obs: 224, groups: Parts, 28 Fixed effects: Estimate Std. Error t value (Intercept) 210.344 5.718 36.79 Whwhispered 25.540 5.658 4.51 Correlation of Fixed Effects: (Intr) Whwhispered -0.495

Model: H3 (Whispered / > AIC(v1. 1merWh51,v1. 1merWh52,v1. 1merWh53) (With random slope) > Vi. 1merWh51 9 2062.418 v1. 1merWh52 6 2218.446

vl.lmerWhS3

6 2339.783

VL~Wh+(1+V Parts)+(1+Group WhCtV)	VL~Wh+(1+Group WhCtV)	VL~Wh+(1+V Parts)
Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 527.36 22.964 Vvoiceless 30.39 5.513 1.00 WhCtV (Intercept) 1275.91 35.720 GroupNS 757.90 27.530 0.20 Residual 318.78 17.854 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 211.01 18.71 11.275 Whwhispered 24.93 25.01 0.997 Correlation of Fixed Effects: (Intr) Whwhispered -0.668	Random effects: Groups Name Variance Std.Dev. Corr WhCtV (Intercept) 1238.0 35.19 GroupNS 620.9 24.92 0.26 Residual 1000.2 31.63 Number of obs: 224, groups: WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 212.82 17.67 12.041 Whwhispered 24.94 25.00 0.998 Correlation of Fixed Effects: (Intr) Whwhispered -0.707	Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 302.9 17.41 Vvoiceless 516.6 22.73 0.26 Residual 1644.1 40.55 Number of obs: 224, groups: Parts, 28 Fixed effects: Estimate Std. Error t value (Intercept) 217.423 5.504 39.50 Whwhispered 25.540 5.418 4.71 Correlation of Fixed Effects: (Intr) Whwhispered -0.492

Result (voiced/voiceless)

• H1: VL~V+(1+V|Parts)+(1+Group|WhCtV)



Normal Q-Q Plot



AIC=2063.322

Result (NS/NNS)

H2: VL~Group+(1+V|Parts)+(1+Group|WhCtV)







QQ plot of residual

Result (Whispered/Phonated)

VL~Wh+(1+V|Parts)+(1+Group|WhCtV)



Multiple fixed effect

vl.lmerM 7 2109.642 vl.lmerM5 11 2050.785

VL~Group+V+Wh+(1 Parts)+(1 WhCtV)	VL~Group+V+Wh+(1+V Parts)+(1+Group WhCtV)
Random effects: Groups Name Variance Std.Dev. Parts (Intercept) 650.9 25.51 WhCtV (Intercept) 1522.8 39.02 Residual 503.2 22.43 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 224.721 24.723 9.090 GroupNS -4.299 11.176 -0.385 Vvoiceless -26.297 27.756 -0.947 Whwhispered 25.540 27.756 0.920 Correlation of Fixed Effects: (Intr) GropNS Vvclss GroupNS -0.129 Vvoiceless -0.561 0.000 Whwhispered -0.561 0.000	Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 539.24 23.22 Vvoiceless 30.58 5.53 1.00 WhCtV (Intercept) 1486.77 38.56 GroupNS 818.23 28.60 0.10 Residual 318.73 17.85 Number of obs: 224, groups: Parts, 28; WhCtV, 8 Fixed effects: Estimate Std. Error t value (Intercept) 214.931 24.238 8.868 GroupNS -1.558 15.033 -0.104 Vvoiceless -7.823 27.362 -0.286 Whwhispered 25.079 27.327 0.918 Correlation of Fixed Effects: (Intr) GropNS Vvclss GroupNS -0.048 Vvoiceless -0.553 -0.023 Whwhispered -0.564 0.000 0.000

Multiple fixed effect

VL~Group*V*Wh+(1 Parts)+(1 WhCtV)	VL~Group*V*Wh+(1+V Parts)+(1+Group WhCtV)
Random effects:Groups NameVariance Std. Dev.Parts (Intercept) 667.8 25.84Whctv (Intercept) 1911.4 43.72Residual367.8 19.18Number of obs: 224, groups:Parts, 28; Whctv, 8Fixed effects:(Intercept)218.387GroupNS20.745Vvoiceless-13.290Whwhispered24.432GroupNS:VvoicelessVvoiceless-51.276GroupNS:Std. Error t value(Intercept)31.596 6.912GroupNS:12.209 1.699Vvoiceless43.930 -0.303Whwhispered43.930 0.556GroupNS:90.0556GroupNS:0.20.403	Random effects: Groups Name Variance Std.Dev. Corr Parts (Intercept) 539.57 23.229 Vvoiceless 29.85 5.464 1.00 WhCtv (Intercept) 1854.84 43.068 GroupNS 331.34 18.203 0.07 Residual 318.73 17.853 Number of obs: 224, groups: Parts, 28; WhCtv, 8 Fixed effects: Estimate Std. Error t value (Intercept) 218.387 31.022 7.040 GroupNS 20.746 16.970 1.222 Vvoiceless -13.290 43.270 -0.307 Whwhispered 24.432 43.252 0.565 GroupNS:Vvoiceless -51.276 19.808 -2.589 GroupNS:Whwhispered 1.536 61.168 0.025 GroupNS:Vvoiceless:Whwhispered 6.123 27.825 0.220
GroupNS:Whwhispered 8.023 -0.234 Vvoiceless:Whwhispered 62.126 0.025 GroupNS:Vvoiceless:Whwhispered 11.346 0.540	

Result

95% confidence interval for the slope estimate:

	H1: Vvoiceless	H1:Vvoiceless (only Parts)	H2: GroupNS	H2: GroupNS (V Parts)	H3: WhWhispered	H3: WhWhispered (only Parts)
Estimate	-6.101	-26.3	-1.595	16.026	24	25.54
Std. Error	26.991	5.64	15.025	10.81	25.01	5.418
CI (UP)	47.881	-15.02	28.455	37.646	74.02	36.376
CI (DOWN)	-60.083	-37.58	-31.645	-5.594	-26.02	14.704

Result

- H1: Words with voiceless final obstruent seem to have smaller vowel length. If we **merely** consider random effect of participants, the result is significant. But when we consider the native/non-native effect per items, the difference is obviously smaller and not significant at all.
- H2: There is no difference in preceding vowel length between native and non-native speakers. But when we consider the voiced/voiceless effect per participants, the difference is relatively obvious.
- H3: Words in whispered speech have longer vowel length. When we merely consider random effect of participants, the result is significant.

Conclusion

- 1. Dutch can use vowel length as secondary cue no matter voiced/voiceless final obstruent.
- 2. Whispered speech can cause longer vowel length, no matter for Dutch or native English speakers.

• Thank you and Question?