

Retrieving Information in Croatian: building a simple and efficient rule-based stemmer

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Introduction

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 - 1 analyze the practice in the IT industry in Croatia concerning the problem of Croatian morphology in information retrieval
 - 2 construct a simple and efficient stemmer which could be easily used in the industry

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- Google started stemming Croatian documents in last few months, method unknown, most probably language independent - general rules + user feedback while using the search engine

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- 80% would upgrade their search engine with an open source of commercial stemmer, 10% would prefer an open source solution, 5% a commercial one, 5% are not interested

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- list of 32 suffix rules built by hand from the 1000 most frequent nouns

List of rules 1

('', 'a', 'u', 'om', 'i', 'ima', 'e')
('a', 'e', 'i', 'u', 'om', 'ama')
('e', 'a', 'u', 'em', 'ima')
('o', 'a', 'u', 'om', 'ima')
('', 'a', 'u', 'om', 'ovi', 'ova', 'ovima', 'ove')
('ak', 'ka', 'ku', 'kom', 'ci', 'aka', 'cima', 'ke')
('k', 'ka', 'ku', 'kom', 'ci', 'cima', 'ke')
('ac', 'ca', 'cu', 'cem', 'ci', 'aca', 'cima', 'ce')
('anj', 'nja', 'nju', 'njem', 'njom', 'nji', 'anja', 'njima', 'nje')
('ka', 'ke', 'ci', 'ki', 'ku', 'kom', 'aka', 'kama')
('ar', 'ra', 'ru', 'rom', 'ri', 'ara', 'rima', 're')
('ao', 'la', 'lom', 'lu', 'lovi', 'lova', 'lovima', 'love')
('', 'a', 'u', 'om', 'em', 'evi', 'eva', 'evima', 'eve')
('an', 'na', 'nu', 'nom', 'ni', 'ana', 'nima', 'ne')
('in', 'ina', 'inu', 'inom', 'i', 'a', 'ima', 'e')
('am', 'ma', 'mu', 'mom', 'movi', 'mova', 'movima', 'move')

List of rules 2

('t', 'ta', 'tu', 'tom', 'ti', 'ata', 'tima', 'te')
('zak', 'ska', 'sku', 'skom', 'sci', 'zaka', 'scima', 'ske')
('tak', 'tka', 'tku', 'tkom', 'tci', 'ci', 'taka', 'tcima', 'cima', 'tke')
('dac', 'ca', 'cu', 'cem', 'ci', 'daca', 'cima', 'ce')
('ga', 'ge', 'zi', 'gi', 'gu', 'gom', 'gama')
('st', 'sti', 'šču', 'stima')
('g', 'ga', 'gu', 'gom', 'zi', 'zima', 'ge')
('sao', 'sli', 'šlju', 'slima')
('t', 'ti', 'ču', 'tima')
('an', 'ni', 'nog', 'noga', 'nome', 'nomu', 'nim', 'ni', 'nih', 'nima', 'ne')
('o', 'og', 'oga', 'om', 'ome', 'omu', 'im', 'a', 'ih', 'ima', 'e')
('ni', 'an', 'nog', 'noga', 'nome', 'nomu', 'nim', 'ni', 'nih', 'nima', 'ne')
('a', 'e', 'oj', 'u', 'om', 'ih', 'ima')
('', 'i', 'og', 'oga', 'om', 'ome', 'omu', 'im', 'ih', 'ima', 'e')
('i', 'og', 'oga', 'om', 'ome', 'omu', 'im', 'ih', 'ima', 'e')

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- ④ there are none of the constraints described above ('a', 'e', 'i', 'u', 'om', 'ama'), *zamka*, *rastom* and *radia* accepted
- ⑤ there is no set of rules, but just a set of suffixes without any entry restrictions ('', 'a', 'u', 'om', 'i', 'ima', 'e', 'ama', 'em', ...), , *zamka*, *rastom* and *radia* accepted

Optimization and evaluation

- using validation set - searching for set of suffixes which maximizes the F_1 measure regarding the gold standard - greedy optimization algorithm (*steepest ascent hill climbing*) - experimenting with different rule forms

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rule form	F_1	precision	recall	# of rules
1	0.9730	0.9775	0.9686	23
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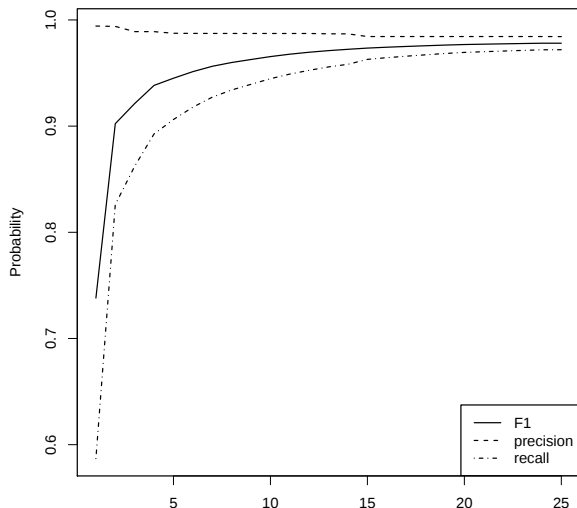
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- on test set, second form of rules achieves F_1 measure of 97,82%, precision 98,40%, recall 97,24%

F_1 , precision and recall during *steepest ascent hill climbing* optimization algorithm with second rule form



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- decline in F_1 of just 0,18 - adjective and noun paradigms very similar

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>>> server.korijen('potraga')
['potragama', 'potragu', 'potrazi', 'potragi', 'potragom', 'potrage',
 'potraga']
>>> server.korijen('pokret')
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- plans to use the web service or the algorithm in Croatian academic directory <http://www.hr>
- an example web application for retrieving information from Vjesnik on-line using the web service

potruga

Upitaj

pronađeni oblici: potrazi 82, potruga 44, potragu 28, potrage 27, potragama 1

[U potrazi za djecom otetom iz Dječjeg doma pomogli i zagrebački taksisti](#)

U **potrazi** za djecom otetom iz Dječjeg doma pomogli i zagrebački taksisti

» Josipovac « , u Nazorovoj 49 , nakon intenzivne **potrage** i niza operativnih mjera vraćeno je u srijedu u poslijepodnevnim M. V. (7) , zagrebačka policija je raspisala **potragu** . Nakon intenzivne potrage i opsežne pretrage terena , u) , zagrebačka policija je raspisala potragu . Nakon intenzivne **potrage** i opsežne pretrage terena , u srijedu oko 16.15 sati) , policija je odmah raspisala tjalericu i započela intenzivnu **potragu** . Dva dana kasnije , u srijedu oko 10 sati <http://www.vjesnik.hr/html/2000/09/01/Clanak.asp?r=cm&c=4>

[» Policija me izbjegava , ako treba ići ću do Strasbourga «](#)

izbjegava , ako treba ići ću do Strasbourga « Ni **potraga** niti očevid nisu obavljeni kako je trebalo , a od neprestance tragali sinjskim krajem ne bi li pronašli djevojku . **Potruga** je završila 5. travnja kada je slučajni prolaznik Josip Bašić osumnjičeni . « izjavio je ogorčeni Ivan Bešlić . U cilju **potrage** , a kasnije i istrage , Bešlić je sam javljao urgirali u Ministarstvu započela je prava istraga , no niti **potraga** , niti očevid , nisu obavljeni kako je trebalo « <http://www.vjesnik.hr/html/2002/07/25/Clanak.asp?r=cm&c=1>

[Suprug sumnja da mu je žena oteta i primorana na prostituciju](#)

uredne dokumente , a za Jadrankom još nije bila raspisana **potraga** , nije bilo razloga za policijsku intervenciju . Upravo tu Jedino što policiji zasad preostaje , je , nakon raspisane **potrage** po Hrvatskoj , raspisati i međunarodnu potragu . , nakon raspisane potrage po Hrvatskoj , raspisati i međunarodnu **potragu** . <http://www.vjesnik.hr/html/2005/01/17/Clanak.asp?r=cm&c=3>

[Opozvana potraga za brodom sa 180 ilegalnih useljenika](#)

Opozvana **potraga** za brodom sa 180 ilegalnih useljenika RIM , 13. veljače 13. veljače - Talijanska obalna straža u ponedjeljak je opozvala **potragu** za brodom , na kojem se smatra da je oko Obalna straža iz talijanske luke Bari priopćila je da je **potraga** za nestalim brodom završila , te da nisu ništa pronašli <http://www.vjesnik.hr/html/2001/02/14/Clanak.asp?r=sss&c=4>

pokret|

Upitaj

pronađeni oblici: pokreta 173, pokret 121, pokretu 47, pokretima 16, pokreti 15, pokreću 15, pokrete 14, pokretom 7

Humanost bez granica

, što je i danas moto kojim se vodi Međunarodni **pokret** Crvenog križa i Crvenog polumjeseca . Stoga se rođendan tog radost življenja « . Mladi je Švicarac bio član filantropskog **pokreta** koji je pomagao starcima , bolesnicima i kažnjenicima . Pokret pokreta koji je pomagao starcima , bolesnicima i kažnjenicima . **Pokret** Buđenje , komu je poslije pristupio , toliko je utjecao ta je povijesna heroína , čija je upornost i iznjednrla **pokret** medicinskih sestara , uspjela ranjenicima priskrbiti osnovnu medicinsku pomoć .

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kako bi tome poučio građane . Načela Crvenog križa Načela **pokreta** ponajprije zahtijevaju sprječavanje i ublažavanje ljudske patnje , zaštitite zdravlja

patnje , zaštite zdravlja i osiguranje poštivanja ljudskog dostojanstva . **Pokret** ne pravi razlike prema vjerskoj , nacionalnoj i klasnoj pripadnosti

službi nacionalnih vlada koja trebaju , u skladu s načelima **pokreta** , čuvati svoju autonomiju . Na diplomatskoj konferenciji koju je <http://www.vjesnik.hr/html/2006/05/11/Clanak.asp?r=pis&c=1>

» Magičnim pokretima « korak bliže Castanedinim pričama

» Magičnim **pokretima** « korak bliže Castanedinim pričama Način na koji se Castaneda širom svijeta održavaju tečajeve Tensegritya , sustava čarobnih i magičnih **pokreta** i konkretnog oblika praktične doktrine koji raspršenu energiju svakog čovjeka

ili slobodnih ratnika) koji jednom tjedno na Pantovčaku vježbaju **pokrete** . Mnogo je i onih , čuli smo , koji

. Mnogo je i onih , čuli smo , koji **pokrete** izvođe individualno , a kroz radionicu je ukupno prošlo 200

. Radi se o praktičnom obliku drevnih znanja , seriji **pokreta** koji stimuliraju skupljanje raspršene energije i djeluju na mišiće i

) , a prakticirali ih radi opće dobrobiti . Izvođenje **pokreta** priprema mišiće i tetive da brzo i učinkovito odgovaraju na

i tetive da brzo i učinkovito odgovaraju na duge serije **pokreta** koji zahtijevaju veću koncentraciju i kinestetičku memoriju . - Ako

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