



# Natural Language Processing

with NuPIC



# NLTK

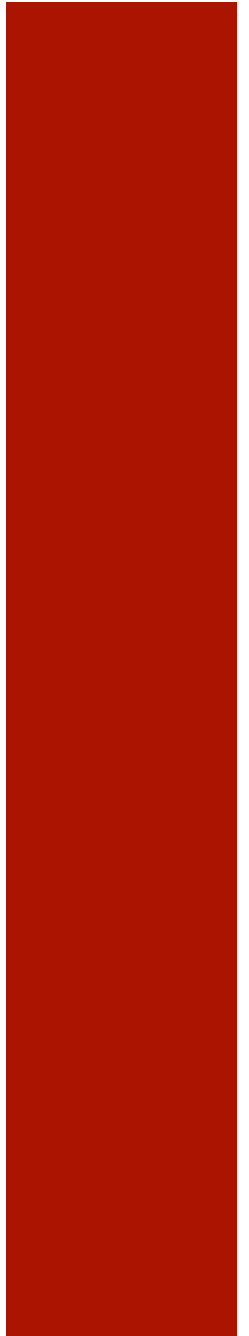
Python Natural Language Tool Kit

# NLTK Part of Speech Tagging

That	DET	determiner
is	V	verb
the	DET	determiner
way	N	noun
Thor	NP	proper noun
got	VD	past tense
his	PRO	pronoun
wonderful	ADJ	adjective
hammer	N	noun
.	.	.

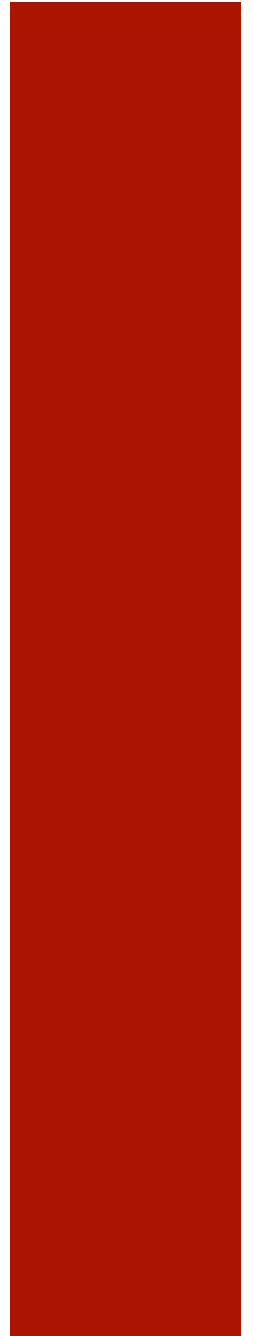
nupic\_nlp

word POS demo

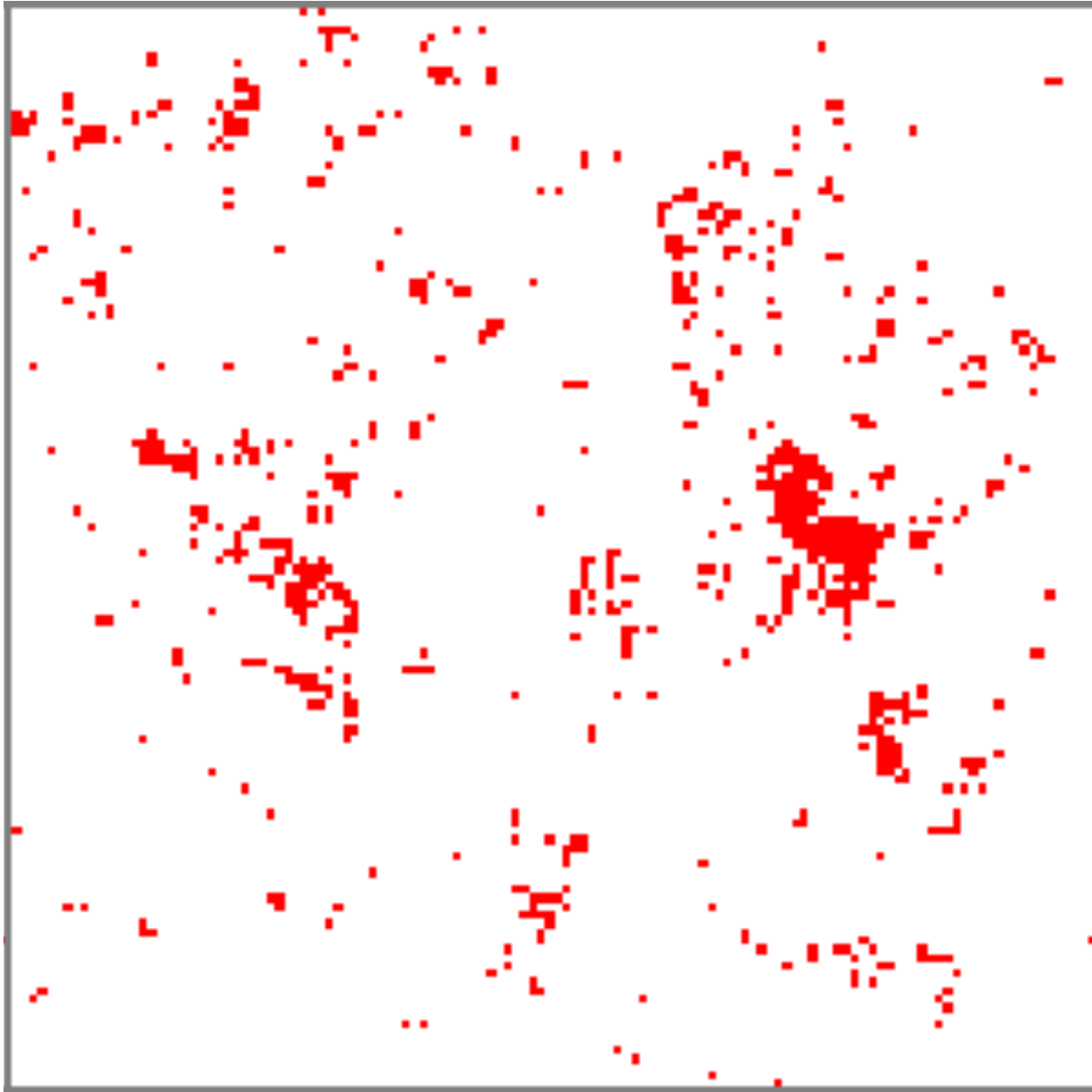


CEPT

Word SDRs



“metal”



# “metal”


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# “metal”

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14978, 15050, 15085, 15214, 15406,  
15408, 15469, 15815, 15945, 16210,  
16346]}
```



metal | 0  
metals | 1  
materials | 2  
metallic | 3  
material | 4  
alloys | 5  
solid | 6  
oxide | 7  
aluminium | 8  
copper | 9  
corrosion | 10  
oxides | 11  
thin | 12  
steel | 13  
alloy | 14  
chemical | 15  
nickel | 16  
platinum | 17  
carbon | 18  
halides | 19  
heavy metal | 20  
oxidation | 21  
plastic | 22  
heating | 23



# pycept

Python CEPT API Client



# pycept: get bitmap from term

```
catBitmap = ceptClient.getBitmap ("cat")
```

```
{u'height': 128, u'width': 128, u'sparsity': 4.0, u'positions': [84, 212, 284, 440, 560, 568, 598, 726, 785, 800, 807, 838, 850, 854, 923, 1152, 1153, 1166, 1170, 1171, 1172, 1197, 1224, 1280, 1281, 1320, 1321, 1464, 1540, 1586, 1716, 1839, 1928, 1931, 1944, 2056, 2095, 2142, 2145, 2146, 2203, 2222, 2223, 2274, 2326, 2328, 2396, 2477, 2512, 2580, 2626, 2706, 2707, 2772, 2783, 2784, 2829, 2834, 2835, 2955, 2993, 3085, 3118, 3145, 3237, 3337, 3341, 3346, 3409, 3595, 3662, 3762, 3799, 3808, 3890, 3891, 3906, 3925, 3967, 4065, 4122, 4222, 4328, 4390, 4425, 4479, 4491, 4492, 4496, 4590, 4617, 4682, 4746, 4752, 4792, 4821, 4889, 4920, 5003, 5027, 5032, 5221, 5223, 5239, 5263, 5272, 5304, 5329, 5367, 5391, 5404, 5443, 5455, 5466, 5467, 5532, 5624, 5702, 5746, 5752, 5856, 5880, 5888, 5891, 6022, 6147, 6148, 6149, 6150, 6193, 6221, 6277, 6334, 6337, 6351, 6473, 6488, 6490, 6533, 6535, 6536, 6572, 6598, 6599, 6601, 6613, 6643, 6659, 6660, 6662, 6746, 6747, 6785, 6786, 6787, 6808, 6875, 6885, 6896, 6912, 6913, 6917, 6934, 6940, 7001, 7023, 7040, 7041, 7043, 7056, 7065, 7066, 7068, 7143, 7161, 7165, 7169, 7170, 7171, 7172, 7174, 7185, 7186, 7187, 7188, 7189, 7190, 7191, 7255, 7279, 7296, 7297, 7302, 7309, 7314, 7315, 7316, 7317, 7318, 7321, 7322, 7329, 7366, 7383, 7384, 7414, 7430, 7443, 7444, 7445, 7450, 7508, 7513, 7522, 7561, 7573, 7574, 7576, 7585, 7602, 7673, 7680, 7681, 7770, 7771, 7779, 7797, 7808, 7809, 7816, 7818, 7832, 7936, 7938, 7949, 7960, 7988, 8022, 8039, 8065, 8066, 8067, 8189, 8192, 8193, 8230, 8273, 8274, 8319, 8320, 8321, 8412, 8448, 8449, 8482, 8506, 8525, 8577, 8578, 8579, 8581, 8657, 8667, 8683, 8708, 8785, 8790, 8832, 8838, 8851, 8915, 8932, 8977, 8978, 9023, 9051, 9053, 9063, 9105, 9106, 9132, 9156, 9232, 9233, 9347, 9361, 9362, 9366, 9368, 9420, 9421, 9440, 9486, 9517, 9526, 9612, 9613, 9614, 9615, 9616, 9617, 9637, 9646, 9742, 9766, 9769, 9854, 9889, 9913, 9929, 10029, 10073, 10089, 10130, 10131, 10258, 10259, 10383, 10384, 10385, 10389, 10391, 10438, 10462, 10469, 10518, 10519, 10520, 10521, 10526, 10604, 10644, 10647, 10648, 10658, 10742, 10773, 10775, 10776, 10909, 10911, 10940, 10978, 11040, 11092, 11126, 11139, 11153, 11164, 11165, 11205, 11214, 11267, 11275, 11281, 11288, 11290, 11292, 11293, 11294, 11295, 11296, 11402, 11417, 11419, 11420, 11422, 11482, 11483, 11531, 11548, 11549, 11579, 11596, 11610, 11611, 11612, 11614, 11617, 11618, 11736, 11864, 11865, 11868, 11881, 11920, 11999, 12001, 12004, 12005, 12006, 12007, 12057, 12093, 12095, 12122, 12132, 12134, 12137, 12138, 12172, 12233, 12250, 12252, 12259, 12294, 12314, 12361, 12379, 12381, 12430, 12441, 12442, 12670, 12673, 12675, 12744, 12769, 12776, 12793, 12801, 12808, 12859, 12871, 12883, 12903, 12904, 12937, 12958, 12986, 13062, 13068, 13071, 13083, 13133, 13138, 13149, 13181, 13188, 13212, 13264, 13281, 13306, 13307, 13316, 13317, 13322, 13384, 13389, 13391, 13392, 13433, 13434, 13444, 13504, 13515, 13612, 13613, 13645, 13740, 13752, 13763, 13765, 13774, 13775, 13880, 13895, 13898, 13899, 13903, 13904, 14026, 14027, 14028, 14031, 14104, 14140, 14149, 14157, 14160, 14198, 14213, 14260, 14266, 14268, 14269, 14287, 14291, 14309, 14311, 14410, 14422, 14512, 14522, 14555, 14563, 14564, 14640, 14648, 14649, 14652, 14678, 14691, 14692, 14693, 14694, 14704, 14775, 14781, 14821, 14822, 14910, 14911, 14931, 15023, 15024, 15068, 15069, 15075, 15086, 15150, 15151, 15179, 15193, 15214, 15307, 15319, 15406, 15415, 15435, 15442, 15505, 15542, 15563, 15571, 15580, 15584, 15641, 15691, 15692, 15696, 15699, 15709, 15710, 15711, 15712, 15714, 15720, 15764, 15766, 15767, 15768, 15769, 15784,
```

# pycept: similar terms from bitmap

```
similar = ceptClient.bitmapToTerms(catBitmap)
```

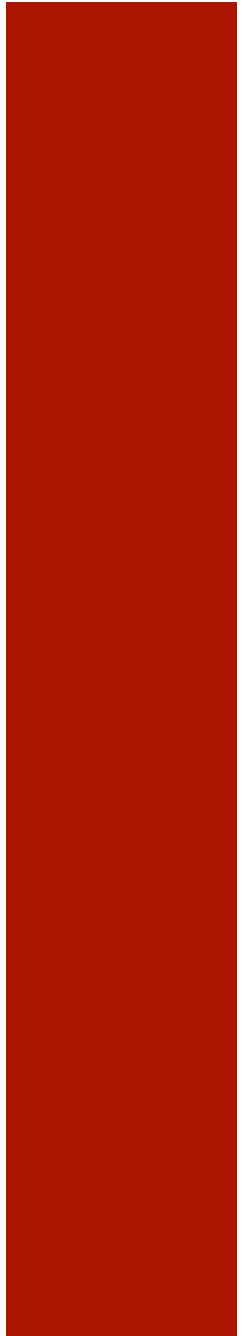
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```

# pycept: similar terms from bitmap

```
similar = ceptClient.bitmapToTerms(catBitmap)
```

cat   0	mice   13
cats   1	mammals   14
dog   2	rodents   15
dogs   3	prey   16
animals   4	canines   17
animal   5	humans   18
rabbits   6	monkey   19
pet   7	adult   20
feline   8	other animals   21
rabbit   9	hares   22
pets   10	mammal   23
mouse   11	predators   24
canine   12	

# Word association experiment



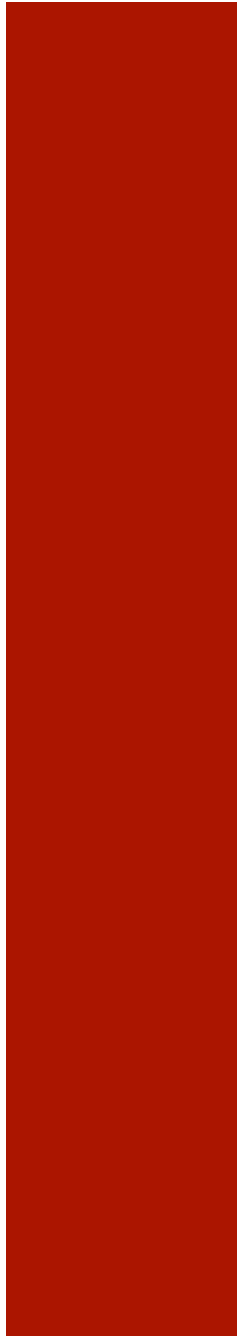






nupic\_nlp

word association demo



# NLP Resources

- Tools
- Experiments
- Challenges

