**Knowledge Discovery and Management  
Problem Set (PS-1B)**

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1. The following NLP operations are performed.

The results of tokenization, lemmatization, POS, parsing, name entity recognition are as follows.

Tokens Lema POS NE

CHICAGO-1, Lemma : CHICAGO, POS : NNP ,NE : LOCATION

-LRB--2, Lemma : -lrb-, POS : -LRB- ,NE : O

AP-3, Lemma : AP, POS : NNP ,NE : ORGANIZATION

-RRB--4, Lemma : -rrb-, POS : -RRB- ,NE : O

---5, Lemma : --, POS : : ,NE : O

Citing-6, Lemma : cite, POS : VBG ,NE : O

high-7, Lemma : high, POS : JJ ,NE : O

fuel-8, Lemma : fuel, POS : NN ,NE : O

prices-9, Lemma : price, POS : NNS ,NE : O

,-10, Lemma : ,, POS : , ,NE : O

United-11, Lemma : United, POS : NNP ,NE : ORGANIZATION

Airlines-12, Lemma : Airlines, POS : NNPS ,NE : ORGANIZATION

said-13, Lemma : say, POS : VBD ,NE : O

Friday-14, Lemma : Friday, POS : NNP ,NE : DATE

it-15, Lemma : it, POS : PRP ,NE : O

has-16, Lemma : have, POS : VBZ ,NE : O

increased-17, Lemma : increase, POS : VBN ,NE : O

fares-18, Lemma : fare, POS : NNS ,NE : O

by-19, Lemma : by, POS : IN ,NE : O

$-20, Lemma : $, POS : $ ,NE : MONEY

6-21, Lemma : 6, POS : CD ,NE : MONEY

per-22, Lemma : per, POS : IN ,NE : O

round-23, Lemma : round, POS : NN ,NE : O

trip-24, Lemma : trip, POS : NN ,NE : O

on-25, Lemma : on, POS : IN ,NE : O

flights-26, Lemma : flight, POS : NNS ,NE : O

to-27, Lemma : to, POS : TO ,NE : O

some-28, Lemma : some, POS : DT ,NE : O

cities-29, Lemma : city, POS : NNS ,NE : O

also-30, Lemma : also, POS : RB ,NE : O

served-31, Lemma : serve, POS : VBD ,NE : O

by-32, Lemma : by, POS : IN ,NE : O

lower-cost-33, Lemma : lower-cost, POS : JJ ,NE : O

carriers-34, Lemma : carrier, POS : NNS ,NE : O

.-35, Lemma : ., POS : . ,NE : O

The Co-reference Resolution of the following text is as follows:

{1=CHAIN1-["AP" in sentence 1, "it" in sentence 1], 2=CHAIN2-["United Airlines" in sentence 1], 3=CHAIN3-["CHICAGO -LRB- AP -RRB- -- Citing high fuel prices , United Airlines said Friday it has increased fares by $ 6 per round trip on flights to some cities also served by lower-cost carriers ." in sentence 1], 4=CHAIN4-["high fuel prices" in sentence 1], 5=CHAIN5-["Friday" in sentence 1], 7=CHAIN7-["fares" in sentence 1], 8=CHAIN8-["round trip" in sentence 1], 9=CHAIN9-["flights" in sentence 1], 10=CHAIN10-["some cities also served by lower-cost carriers" in sentence 1], 11=CHAIN11-["lower-cost carriers" in sentence 1], 12=CHAIN12-["American Airlines" in sentence 2, "a unit AMR" in sentence 2], 13=CHAIN13-["AMR" in sentence 2], 14=CHAIN14-["American Airlines , a unit AMR" in sentence 2], 16=CHAIN16-["the move" in sentence 2], 17=CHAIN17-["spokesman Tim Wagner" in sentence 2], 18=CHAIN18-["United" in sentence 3, "a unit of UAL" in sentence 3], 19=CHAIN19-["UAL" in sentence 3], 20=CHAIN20-["Dallas" in sentence 3], 21=CHAIN21-["Atlanta" in sentence 3], 22=CHAIN22-["San Francisco" in sentence 3], 23=CHAIN23-["Los Angeles" in sentence 3], 24=CHAIN24-["New York" in sentence 3], 25=CHAIN25-["United , a unit of UAL" in sentence 3], 27=CHAIN27-["the increase" in sentence 3, "it" in sentence 3], 28=CHAIN28-["Thursday night" in sentence 3], 29=CHAIN29-["most routes" in sentence 3], 31=CHAIN31-["discount carriers , such as Chicago to Dallas and Atlanta and Denver to San Francisco , Los Angeles and New York" in sentence 3], 32=CHAIN32-["discount carriers" in sentence 3], 33=CHAIN33-["Chicago to Dallas and Atlanta and Denver to San Francisco , Los Angeles and New York" in sentence 3], 34=CHAIN34-["Chicago to Dallas and Atlanta" in sentence 3], 35=CHAIN35-["Dallas and Atlanta" in sentence 3], 36=CHAIN36-["Denver to San Francisco , Los Angeles and New York" in sentence 3], 37=CHAIN37-["San Francisco , Los Angeles and New York" in sentence 3]}

2. Summarize and draw a knowledge graph.

To draw a knowledge graph, we first make the sentence tokenize, lemmatization, name of the entity, POS tagging and co-reference which is the natural language processing. We extract the information by chunking, entity coreference and relational extraction. After the chunking of data, we segment them based on the topics like Arts, people, places etc. For the graph construction, we incorporate ontological constraints and relational patterns and discover statistical relationships within knowledge graph.

