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#Troy Krupinski
#tsk0064
import networkx as nx
import matplotlib.pyplot as plt
import numpy as np
G = nx.DiGraph()

#CSCE 5215 - Machine Learning
#Project 3 - Bayesian Networks

#Network:
'''
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*****
Layer 4:

-----
car_won't_start:

Parents:[No_oil, Battery_flat]

children:[]

Co-parents:[]

Markov-blanket: [No_oil, Battery_flat]

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Dipstick:

Parents: [No_oil]

children: []

Co-parents:[]

Markov-blanket: [No_oil]

-----
Gas_gauge:

Parents: [Battery_flat]

Children: []

Co-parents:[]

Markov-blanket: [Battery_flat]

-----
Lights:

Parents: [Battery_flat]

Children: []

Co-parents:[]

Markov-blanket: [Battery_flat]
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*****
Layer 3:

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Battery_flat:

Parents: [No_charging, Battery_dead]

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Children: [car_won't_start, Gas_gauge, Lights]

Co-parents: [No_oil]

Markov-blanket: [No_charging, Battery_dead, car_won't_start, Gas_gauge, Lights, No_oil]

No_oil:

parents: []

children: [Dipstick, car_won't_start]

Co-parents: [Battery_flat]

Markov-blanket: [Dipstick, car_won't_start, Battery_flat]

Layer 2:

No_charging:

Parents: [Alternator_broken, Fanbelt_broken]

Children: [Battery_flat]

Co-parents: [Battery_dead]

Markov-blanket: [Alternator_broken, Fanbelt_broken, Battery_flat, Battery_dead]

Battery_dead:

Parents: [Battery_age]

Children: [Battery_flat]

Co-parents: [No_charging]

Markov-blanket: [Battery_age, Battery_flat, No_charging]

Layer 1:

Battery_age:

Parents: []

Children: [Battery_dead]

Co-parents: []

Markov-blanket: [Battery_dead]

Alternator_broken:

Parents: []

Children: [No_charging]

Co-parents: [Fanbelt_broken]

Markov-blanket: [No_charging, Fanbelt_broken]

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Fanbelt_broken:

Parents: []

Children: [No_charging]

Co-parents: [Alternator_broken]

Markov-blanket: [No_charging, Alternator_broken]

...

G.add_node("battery_age", ba_y=.2, ba_n = .8)
G.add_node("alternator_broken", ab_y=.1, ab_n = .9)
G.add_node("fanbelt_broken", fb_y = .3, fb_n = .7)
G.add_node("battery_dead", ba_y_bd_y = .7, ba_y_bd_n = .3, ba_n_bd_y = .3, ba_n_bd_n = .7)

G.add_node("no_charging_table",

            ab_y_fb_y_nc_y = .75,
            ab_y_fb_n_nc_y = .4,
            ab_n_fb_y_nc_y = .6,
            ab_n_fb_n_nc_y = .1,
            ab_y_fb_y_nc_n= 0.25,
            ab_y_fb_n_nc_n = .6,
            ab_n_fb_y_nc_n = .4,
            ab_n_fb_n_nc_n = .9)

G.add_node("battery_flat",
            bd_y_nc_y_bf_y=0.95, bd_y_nc_n_bf_y=0.85,
            bd_n_nc_y_bf_y=0.8, bd_n_nc_n_bf_y=0.1,
            bd_y_nc_y_bf_n=0.05, bd_y_nc_n_bf_n=0.15,
            bd_n_nc_y_bf_n=0.2, bd_n_nc_n_bf_n=0.9
)

G.add_node("no_oil", no_y=0.05, no_n=0.95)
G.add_node("lights",
            l_y_bf_y=0.9, l_n_bf_y=0.1,
            l_y_bf_n=0.3, l_n_bf_n=0.7
)
G.add_node("gas_gauge",
            bf_y_gg_y=0.1, bf_n_gg_y=0.95,
            bf_y_gg_n=0.9, bf_n_gg_n=0.05
)
G.add_node("car_wont_start",
            bf_y_no_y_cs_n=0.9, bf_y_no_n_cs_n=0.9,
            bf_n_no_y_cs_n=0.9, bf_n_no_n_cs_n=0.1,
            bf_y_no_y_cs_y=0.1, bf_y_no_n_cs_y=0.1,
            bf_n_no_y_cs_y=0.1, bf_n_no_n_cs_y=0.9
)

G.add_node("dipstick_low",
            no_y_dl_y=0.95, no_n_dl_y=0.3,
            no_y_dl_n=0.05, no_n_dl_n=0.7
)
edges = [
    ("battery_age", "battery_dead"),
    ("alternator_broken", "no_charging_table"),
    ("fanbelt_broken", "no_charging_table"),
    ("no_charging_table", "battery_flat"),
    ("battery_dead", "battery_flat"),
    ("battery_flat", "lights"),
    ("battery_flat", "gas_gauge"),
    ("battery_flat", "car_wont_start"),
    ("no_oil", "dipstick_low"),
    ("no_oil", "car_wont_start")
]

G.add_edges_from(edges)

plt.figure(figsize=(12, 8))

pos = nx.spring_layout(G, k=1, iterations=50)

nx.draw(G, pos, with_labels=True, node_size=3000, node_color="skyblue", font_size=10, font_weight="bold", font_color="black", edge_color="gray")

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plt.title("Bayesian Network - Project 3")
plt.show()

fanbelt_probs = G.nodes["fanbelt_broken"]
battery_age_probs = G.nodes["battery_age"]
alternator_probs = G.nodes["alternator_broken"]

battery_dead_probs = G.nodes["battery_dead"]
no_charging_probs = G.nodes["no_charging_table"]

battery_flat_probs = G.nodes["battery_flat"]
no_oil_probs = G.nodes["no_oil"]

lights_probs = G.nodes["lights"]
gas_gauge_probs = G.nodes["gas_gauge"]
car_wont_start_probs = G.nodes["car_wont_start"]
dipstick_low_probs = G.nodes["dipstick_low"]

...
P(B|+j, +m) =

P(B, e, a, +j, +m)
    P(+j, +m)
    Let us take P(B, e, a, +j, +m).
        Now  $P(B, e, a, +j, +m) = \sum_{e,a} P(B, e, a, +j, +m) = \sum P(B) \times P(e) \times P(a|B, e) \times P(+j|a) \times P(+m|a)$ 
         $= P(B) \times P(+e) \times P(+a|B, +e) \times P(+j|+a) \times P(+m|+a) + P(B) \times P(+e) \times P(-a|B, +e) \times P(+j|-a) \times$ 
         $P(+m|-a) + P(B) \times P(-e) \times P(+a|B, -e) \times P(+j|+a) \times P(+m|+a) + P(B) \times P(-e) \times P(-a|B, -e) \times$ 
         $P(+j|-a) \times P(+m|-a)$ 
    ...

def car_fanbelt(G):
    """
    Calculate P(+cws|+fb) following the sum-product algorithm structure.
    For our case:
    P(+cws|+fb) = P(+cws,+fb) / P(+fb)
    where P(+cws,+fb) =  $\sum (bd,nc) P(+fb) \times P(bd) \times P(nc|+fb) \times P(+cws|bd,nc)$ 
    """
    # Root node probabilities
    fb_y = G.nodes["fanbelt_broken"]["fb_y"] # P(+fb)

    # Get probabilities for battery dead from battery age
    ba_y = G.nodes["battery_age"]["ba_y"]
    ba_n = G.nodes["battery_age"]["ba_n"]
    ba_y_bd_y = G.nodes["battery_dead"]["ba_y_bd_y"]
    ba_n_bd_y = G.nodes["battery_dead"]["ba_n_bd_y"]

    # Get no charging probabilities given fanbelt
    ab_y = G.nodes["alternator_broken"]["ab_y"]
    ab_n = G.nodes["alternator_broken"]["ab_n"]
    ab_y_fb_y_nc_y = G.nodes["no_charging_table"]["ab_y_fb_y_nc_y"]
    ab_n_fb_y_nc_y = G.nodes["no_charging_table"]["ab_n_fb_y_nc_y"]

    # Get no oil probabilities
    no_y = G.nodes["no_oil"]["no_y"]
    no_n = G.nodes["no_oil"]["no_n"]

    # Get battery flat probabilities
    bd_y_nc_y_bf_y = G.nodes["battery_flat"]["bd_y_nc_y_bf_y"]
    bd_y_nc_n_bf_y = G.nodes["battery_flat"]["bd_y_nc_n_bf_y"]
    bd_n_nc_y_bf_y = G.nodes["battery_flat"]["bd_n_nc_y_bf_y"]
    bd_n_nc_n_bf_y = G.nodes["battery_flat"]["bd_n_nc_n_bf_y"]

    # Get car won't start probabilities
    bf_y_no_y_cs_y = G.nodes["car_wont_start"]["bf_y_no_y_cs_y"]
    bf_y_no_n_cs_y = G.nodes["car_wont_start"]["bf_y_no_n_cs_y"]
    bf_n_no_y_cs_y = G.nodes["car_wont_start"]["bf_n_no_y_cs_y"]
    bf_n_no_n_cs_y = G.nodes["car_wont_start"]["bf_n_no_n_cs_y"]

    # Calculate P(+cws,+fb) by summing over all combinations of intermediate variables
    # First, calculate P(bd) for both states
    p_bd_y = ba_y_bd_y * ba_y + ba_n_bd_y * ba_n # P(+bd)
    p_bd_n = 1 - p_bd_y # P(-bd)

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# Calculate P(nc|+fb) for both states
p_nc_y_given_fb = ab_y_fb_y_nc_y * ab_y + ab_n_fb_y_nc_y * ab_n # P(+nc|+fb)
p_nc_n_given_fb = 1 - p_nc_y_given_fb # P(-nc|+fb)

# Now sum over all combinations of bd and nc states:
# P(+cws,+fb) =  $\sum(bd,nc) P(+fb) \times P(bd) \times P(nc|+fb) \times P(bf|bd,nc) \times P(+cws|bf,no)$ 
p_cws_fb = 0

# For battery dead = yes
for bd_state in [(True, p_bd_y), (False, p_bd_n)]:
    bd_val, p_bd = bd_state
    # For no charging = yes/no
    for nc_state in [(True, p_nc_y_given_fb), (False, p_nc_n_given_fb)]:
        nc_val, p_nc = nc_state

        # Calculate P(bf|bd,nc)
        if bd_val and nc_val:
            p_bf_y = bd_y_nc_y_bf_y
        elif bd_val and not nc_val:
            p_bf_y = bd_y_nc_n_bf_y
        elif not bd_val and nc_val:
            p_bf_y = bd_n_nc_y_bf_y
        else:
            p_bf_y = bd_n_nc_n_bf_y

        p_bf_n = 1 - p_bf_y

        # Sum over battery flat states
        for bf_state in [(True, p_bf_y), (False, p_bf_n)]:
            bf_val, p_bf = bf_state
            # Sum over no oil states
            for no_state in [(True, no_y), (False, no_n)]:
                no_val, p_no = no_state

                # Get P(+cws|bf,no)
                if bf_val and no_val:
                    p_cws = bf_y_no_y_cs_y
                elif bf_val and not no_val:
                    p_cws = bf_y_no_n_cs_y
                elif not bf_val and no_val:
                    p_cws = bf_n_no_y_cs_y
                else:
                    p_cws = bf_n_no_n_cs_y

                # Add this combination's contribution
                p_cws_fb += fb_y * p_bd * p_nc * p_bf * p_no * p_cws

# Finally, P(+cws|+fb) = P(+cws,+fb) / P(+fb)
p_cws_given_fb = p_cws_fb / fb_y

return p_cws_given_fb

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```

def car_battery_age(G):
    """
    Calculate P(+cws|+ba) following the sum-product algorithm structure.
    For our case:
    P(+cws|+ba) = P(+cws,+ba) / P(+ba)
    """

    # Root node probabilities
    ba_y = G.nodes["battery_age"]["ba_y"] # P(+ba)

    # Get probabilities for battery dead given battery age
    ba_y_bd_y = G.nodes["battery_dead"]["ba_y_bd_y"] # P(+bd|+ba)

    # Get alternator and fanbelt probabilities (root nodes)
    ab_y = G.nodes["alternator_broken"]["ab_y"]
    ab_n = G.nodes["alternator_broken"]["ab_n"]
    fb_y = G.nodes["fanbelt_broken"]["fb_y"]
    fb_n = G.nodes["fanbelt_broken"]["fb_n"]

    # Get no charging probabilities for all combinations
    ab_y_fb_y_nc_y = G.nodes["no_charging_table"]["ab_y_fb_y_nc_y"]
    ab_y_fb_n_nc_y = G.nodes["no_charging_table"]["ab_y_fb_n_nc_y"]
    ab_n_fb_y_nc_y = G.nodes["no_charging_table"]["ab_n_fb_y_nc_y"]
    ab_n_fb_n_nc_y = G.nodes["no_charging_table"]["ab_n_fb_n_nc_y"]

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ab_fb_nc_y = G.nodes["no_charging_table"]["ab_fb_nc_y"]

# Get no oil probabilities (root node)
no_y = G.nodes["no_oil"]["no_y"]
no_n = G.nodes["no_oil"]["no_n"]

# Get battery flat probabilities
bd_y_nc_y_bf_y = G.nodes["battery_flat"]["bd_y_nc_y_bf_y"]
bd_y_nc_n_bf_y = G.nodes["battery_flat"]["bd_y_nc_n_bf_y"]
bd_n_nc_y_bf_y = G.nodes["battery_flat"]["bd_n_nc_y_bf_y"]
bd_n_nc_n_bf_y = G.nodes["battery_flat"]["bd_n_nc_n_bf_y"]

# Get car won't start probabilities
bf_y_no_y_cs_y = G.nodes["car_wont_start"]["bf_y_no_y_cs_y"]
bf_y_no_n_cs_y = G.nodes["car_wont_start"]["bf_y_no_n_cs_y"]
bf_n_no_y_cs_y = G.nodes["car_wont_start"]["bf_n_no_y_cs_y"]
bf_n_no_n_cs_y = G.nodes["car_wont_start"]["bf_n_no_n_cs_y"]

# Initialize probability sum
p_cws_ba = 0

# Given +ba, we know P(+bd|+ba)
p_bd_y = ba_y_bd_y # P(+bd|+ba)
p_bd_n = 1 - p_bd_y # P(-bd|+ba)

# Sum over all possible combinations of alternator and fanbelt states
for ab_state in [(True, ab_y), (False, ab_n)]:
    ab_val, p_ab = ab_state
    for fb_state in [(True, fb_y), (False, fb_n)]:
        fb_val, p_fb = fb_state

        # Calculate P(nc|ab,fb)
        if ab_val and fb_val:
            p_nc_y = ab_y_fb_y_nc_y
        elif ab_val and not fb_val:
            p_nc_y = ab_y_fb_n_nc_y
        elif not ab_val and fb_val:
            p_nc_y = ab_n_fb_y_nc_y
        else:
            p_nc_y = ab_n_fb_n_nc_y

        p_nc_n = 1 - p_nc_y

# Sum over no charging states
for nc_state in [(True, p_nc_y), (False, p_nc_n)]:
    nc_val, p_nc = nc_state

    # Calculate P(bf|bd,nc) for both battery dead states
    for bd_state in [(True, p_bd_y), (False, p_bd_n)]:
        bd_val, p_bd = bd_state

        # Get P(bf|bd,nc)
        if bd_val and nc_val:
            p_bf_y = bd_y_nc_y_bf_y
        elif bd_val and not nc_val:
            p_bf_y = bd_y_nc_n_bf_y
        elif not bd_val and nc_val:
            p_bf_y = bd_n_nc_y_bf_y
        else:
            p_bf_y = bd_n_nc_n_bf_y

        p_bf_n = 1 - p_bf_y

# Sum over battery flat states
for bf_state in [(True, p_bf_y), (False, p_bf_n)]:
    bf_val, p_bf = bf_state
    # Sum over no oil states
    for no_state in [(True, no_y), (False, no_n)]:
        no_val, p_no = no_state

        # Get P(+cws|bf,no)
        if bf_val and no_val:
            p_cws = bf_y_no_y_cs_y
        elif bf_val and not no_val:
            p_cws = bf_y_no_n_cs_y
        elif not bf_val and no_val:
            p_cws = bf_n_no_y_cs_y

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else:
    p_cws = bf_n_no_n_cs_y

    # Add this combination's contribution
    #  $P(+cws, +ba) = P(+ba) \times P(bd|+ba) \times P(ab) \times P(fb) \times P(nc|ab,fb) \times P(bf|bd,nc) \times P(+cws|bf,no) \times P(no)$ 
    p_cws_ba += ba_y * p_bd * p_ab * p_fb * p_nc * p_bf * p_cws * p_no

# Finally,  $P(+cws|+ba) = P(+cws, +ba) / P(+ba)$ 
p_cws_given_ba = p_cws_ba / ba_y

return p_cws_given_ba

def calc_prob_alternator_given_lights_gasgauge(G):
    """
    Calculate  $P(+ab|-l, -gg)$  using Bayes' rule:
     $P(+ab|-l, -gg) = P(-l, -gg|+ab)P(+ab) / P(-l, -gg)$ 
    """
    # Get root probabilities
    ab_y = G.nodes["alternator_broken"]["ab_y"] #  $P(+ab)$ 
    ab_n = G.nodes["alternator_broken"]["ab_n"] #  $P(-ab)$ 
    fb_y = G.nodes["fanbelt_broken"]["fb_y"] #  $P(+fb)$ 
    fb_n = G.nodes["fanbelt_broken"]["fb_n"] #  $P(-fb)$ 
    ba_y = G.nodes["battery_age"]["ba_y"] #  $P(+ba)$ 
    ba_n = G.nodes["battery_age"]["ba_n"] #  $P(-ba)$ 

    # Get conditional probabilities
    # Battery dead given battery age
    ba_y_bd_y = G.nodes["battery_dead"]["ba_y_bd_y"]
    ba_n_bd_y = G.nodes["battery_dead"]["ba_n_bd_y"]

    # No charging given alternator and fanbelt
    ab_y_fb_y_nc_y = G.nodes["no_charging_table"]["ab_y_fb_y_nc_y"]
    ab_y_fb_n_nc_y = G.nodes["no_charging_table"]["ab_y_fb_n_nc_y"]
    ab_n_fb_y_nc_y = G.nodes["no_charging_table"]["ab_n_fb_y_nc_y"]
    ab_n_fb_n_nc_y = G.nodes["no_charging_table"]["ab_n_fb_n_nc_y"]

    # Battery flat given battery dead and no charging
    bd_y_nc_y_bf_y = G.nodes["battery_flat"]["bd_y_nc_y_bf_y"]
    bd_y_nc_n_bf_y = G.nodes["battery_flat"]["bd_y_nc_n_bf_y"]
    bd_n_nc_y_bf_y = G.nodes["battery_flat"]["bd_n_nc_y_bf_y"]
    bd_n_nc_n_bf_y = G.nodes["battery_flat"]["bd_n_nc_n_bf_y"]

    # Lights and gas gauge given battery flat
    l_n_bf_y = G.nodes["lights"]["l_n_bf_y"] #  $P(-l|+bf)$ 
    l_n_bf_n = G.nodes["lights"]["l_n_bf_n"] #  $P(-l|-bf)$ 
    bf_y_gg_n = G.nodes["gas_gauge"]["bf_y_gg_n"] #  $P(-gg|+bf)$ 
    bf_n_gg_n = G.nodes["gas_gauge"]["bf_n_gg_n"] #  $P(-gg|-bf)$ 

    # Calculate  $P(-l, -gg|+ab)$  and  $P(-l, -gg|-ab)$ 
    p_evidence_given_ab_y = 0
    p_evidence_given_ab_n = 0

    # Sum over all possible paths
    for fb_state in [(True, fb_y), (False, fb_n)]:
        fb_val, p_fb = fb_state

        # Calculate  $P(nc|ab,fb)$ 
        if fb_val:
            p_nc_y_given_ab_y = ab_y_fb_y_nc_y
            p_nc_y_given_ab_n = ab_n_fb_y_nc_y
        else:
            p_nc_y_given_ab_y = ab_y_fb_n_nc_y
            p_nc_y_given_ab_n = ab_n_fb_n_nc_y

        for ba_state in [(True, ba_y), (False, ba_n)]:
            ba_val, p_ba = ba_state

            # Calculate  $P(bd|ba)$ 
            if ba_val:
                p_bd_y = ba_y_bd_y
            else:
                p_bd_y = ba_n_bd_y
            p_bd_n = 1 - p_bd_y

            for bd_state in [(True, p_bd_y), (False, p_bd_n)]:
                bd_val, p_bd = bd_state

                for nc_state in [(True, p_nc_y_given_ab_y), (False, p_nc_y_given_ab_n)]:
                    nc_val, p_nc = nc_state

                    # Here'll multiply by actual  $P(nc)$  later

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for nc_state in [(True, 1), (False, 0)]: # we multiply by actual p(nc) later
    nc_val, _ = nc_state

    # Calculate P(bf|bd,nc)
    if bd_val and nc_val:
        p_bf_y = bd_y_nc_y_bf_y
    elif bd_val and not nc_val:
        p_bf_y = bd_y_nc_n_bf_y
    elif not bd_val and nc_val:
        p_bf_y = bd_n_nc_y_bf_y
    else:
        p_bf_y = bd_n_nc_n_bf_y
    p_bf_n = 1 - p_bf_y

    # Calculate P(-l,-gg|bf)
    for bf_state in [(True, p_bf_y), (False, p_bf_n)]:
        bf_val, p_bf = bf_state

        if bf_val:
            p_evidence = l_n_bf_y * bf_y_gg_n
        else:
            p_evidence = l_n_bf_n * bf_n_gg_n

        # Add contribution to total probability
        path_prob = p_fb * p_ba * p_bd * p_bf * p_evidence

        if nc_val:
            p_evidence_given_ab_y += path_prob * p_nc_y_given_ab_y
            p_evidence_given_ab_n += path_prob * p_nc_y_given_ab_n
        else:
            p_evidence_given_ab_y += path_prob * (1 - p_nc_y_given_ab_y)
            p_evidence_given_ab_n += path_prob * (1 - p_nc_y_given_ab_n)

    # Calculate P(-l,-gg) using total probability theorem
    p_evidence = p_evidence_given_ab_y * ab_y + p_evidence_given_ab_n * ab_n

    # Calculate P(+ab|-l,-gg) using Bayes' rule
    p_ab_given_evidence = (p_evidence_given_ab_y * ab_y) / p_evidence

    return p_ab_given_evidence

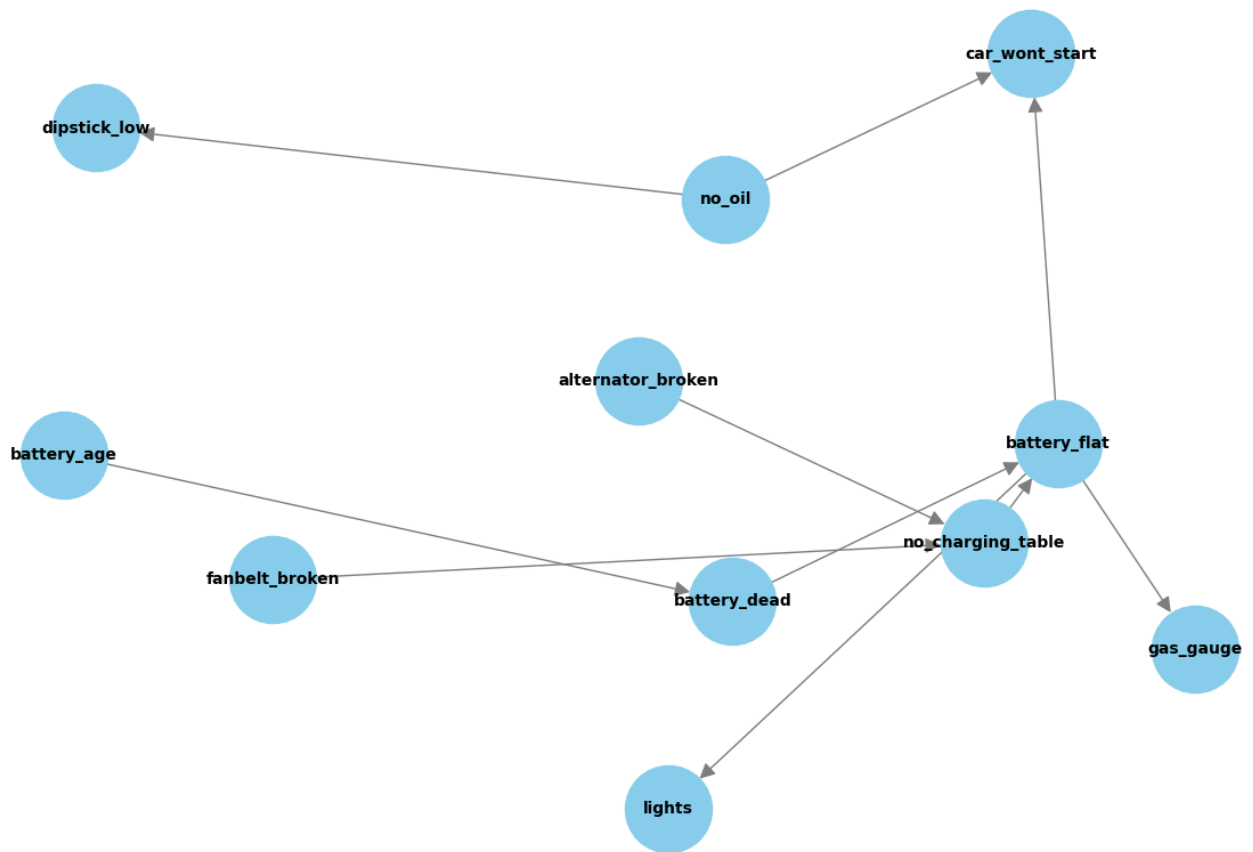
print("p(+cws|+fb)")
R2 = car_fanbelt(G)
print(f"R2: P(+cws | +fb): {R2}")
R3 = car_battery_age(G)
print(f"R3: p(+cws|+ba){R3}")
R4 = calc_prob_alternator_given_lights_gasgauge(G)
print(f"R4: p(+ab|-l,-gg){R4}")

print(G.nodes())

```




Bayesian Network - Project 3



$p(+cws | +fb)$

R2: $P(+cws | +fb)$: 0.34678719999999996

R3: $p(+cws | +ba)$ 0.32637360000000004

R4: $p(+ab | -l, -gg)$ 0.10940802798428095

['battery_age', 'alternator_broken', 'fanbelt_broken', 'battery_dead', 'no_charging_table', 'battery_flat', 'no_oil', 'lights', 'gas_gau