## TME5

April 9, 2019

# 1 PageRank Implementation

### 1.1 Chargement du graphe de sites web:

```
In []: # Structure de données: Liste d'adjacence
        cleaned_graph = open("/Vrac/CPA-PageRank/alr21--dirLinks--enwiki-20071018.txt", "r",en
        max_int = -1
        for e in cleaned_graph:
            if e.startswith("#"):
                continue
            e = e.rstrip("\n")
            indice_point = e.split("\t")
            if int(indice_point[0])>max_int:
                max_int = int(indice_point[0])
            if int(indice_point[1])>max_int:
                max_int = int(indice_point[1])
        cleaned_graph.close()
        cleaned_graph = open("/Vrac/CPA-PageRank/alr21--dirLinks--enwiki-20071018.txt", "r",en
        map_sommet_succ = dict()
        for i in range(max_int+1):
            map_sommet_succ[i] = [[],0,0]
```

```
map_sommet_pred = dict()
        for i in range(max_int+1):
            map_sommet_pred[i] = [[],0]
        for e in cleaned_graph:
            if e.startswith("#") or e.startswith("\n"):
            e = e.rstrip("\n")
            indice_point_1 = e.split("\t")
            map_sommet_succ[int(indice_point_1[0])][0].append(indice_point_1[1])
            map_sommet_succ[int(indice_point_1[0])][1] = map_sommet_succ[int(indice_point_1[0])
            map_sommet_succ[int(indice_point_1[0])][2] = 1/map_sommet_succ[int(indice_point_1[0])]
            map_sommet_pred[int(indice_point_1[1])][0].append(indice_point_1[0])
            map_sommet_pred[int(indice_point_1[1])][1] = map_sommet_succ[int(indice_point_1[1])
        cleaned_graph.close()
In [ ]: map_sommet_succ_copy = dict()
        for k,v in map_sommet_succ.items():
            if v[0] != []:
                map_sommet_succ_copy[k] = v
1.1.1 Produit Matriciel
In []: print(len(list(map_sommet_succ.keys())))
        def norm(p):
            #print(p)
            res = 0
            for i in list(p.keys()):
                res = res + p[i]
            return res
In [ ]: def normalize(p,n,norma):
            res = p
            i = 0
            for i in list(p.keys()):
                normalisated = (1 - norma)/n
                res[i] = res[i] + normalisated
            return res
In [ ]: import copy
        def compare(p,vec,epsilon):
            keys = list(p.keys())
            for i in keys:
                \#print(abs(p[i]-vec[i]), "epsilon = ",epsilon)
                if (abs(p[i]-vec[i])>epsilon):
```

### return False

#### return True

```
In [ ]: def power_iteration_1(liste_succ,alpha,n):
            vec = dict()
            keys = list(liste_succ.keys())
            p = dict()
            for i in keys:
                vec[int(i)] = 1/n
                p[i] = 0
            d = 1 - alpha
            j = 0
            while(True):
                for i in keys:
                    if liste_succ[i][0] == []:
                        continue
                    for v in liste_succ[i][0]:
                        v = int(v)
                        \#print("valeur=",(d*vec[i]/liste\_succ[i][1]), "p[v]=",p[v])
                        p[v] = p[v] + (d*vec[i]/liste_succ[i][1])
                print("boucle for")
                norma = norm(p)
                p = normalize(p,n,norma)
                j = j + 1
                print(j)
                if (j==15):
                    break
                for i in keys:
                    if liste_succ[i][0] == []:
                        continue
                    vec[i] = p[i]
                    p[i] = 0
            return p
In [ ]: p = power_iteration_1(map_sommet_succ, 0.15, len(list(map_sommet_succ.keys())))
In [ ]: p2 = power_iteration_1(map_sommet_succ, 0.9, len(list(map_sommet_succ.keys())))
In [ ]: p1 = copy.deepcopy(p)
```

```
In [ ]: def getKeyByValue(p,value):
            key = 0
            for k,v in p.items():
                if (value == v):
                    key = k
            return key
        def getHighestPageRanks(p):
            l = list()
            for i in range(5):
                pmax = max(list(p.values()))
                indice_max = getKeyByValue(p,pmax)
                l.append(indice_max)
                del(p[indice_max])
            return 1
        def getLowestPageRanks(p):
            l = list()
            for i in range(5):
                pmin = min(list(p.values()))
                indice_min = getKeyByValue(p,pmin)
                l.append(indice_min)
                print(indice_min)
                print(pmin)
                print("----")
                del(p[indice_min])
            return 1
In [ ]: id_highest_page_ranks = getHighestPageRanks(p1)
In [ ]: highest_page_ranks = list()
        for i in id_highest_page_ranks:
            highest_page_ranks.append(map_sommet_page[i])
In [ ]: highest_page_ranks
In [ ]: id_lowest_page_ranks = getLowestPageRanks(p1)
In [ ]: lowest_page_ranks = list()
        for i in id_lowest_page_ranks:
            print(map_sommet_page[i])
            lowest_page_ranks.append(map_sommet_page[i])
In [ ]: lowest_page_ranks
1.2 Exercice 2: Correlations
In []: y = []
        for i in list(p.keys()):
            y.append(map_sommet_pred[i][1])
```