

Chapter 3 :

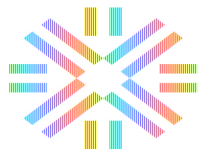
How do we assemble genomes ?

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Introduction

Problème : Assemblage de novo, des reads au génome

Contexte :

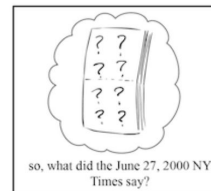
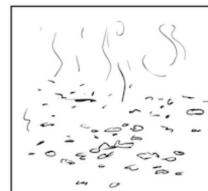
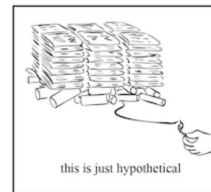
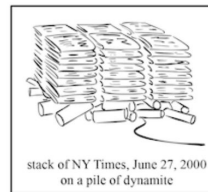
- Séquençage de novo : lecture d'un génome (inconnu)
- Technologies actuelles : lectures courtes (reads) fragmentées
- Défi : reconstituer la séquence originale complète

Le défi de l'assemblage :

- Fragments de taille limitée (150 bp)
- Chevauchements multiples à identifier

But : obtenir une chaîne génome telle que

- Tous les reads doivent faire partie de cette chaîne
- Ce génome doit être le plus “petit possible”

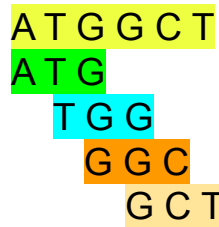


Introduction

Approche par k-mers

Les k-mers, c'est quoi ?

- Découpage des reads en morceaux de taille fixe k
- Exemple : pour k=3
 - Read "ATGGCT" → k-mers : "ATG", "TGG", "GGC", "GCT"



Pourquoi utiliser des k-mers ?

- Tous les fragments font la même taille
- Plus facile d'identifier les connexions
- Très adaptés pour construire un graphe !

Le choix de k est important :

- k petit = trop de connexions possibles
- k grand = connexions manquantes

Script 1

```
1 def Compositionk(Text, k):
2     """Generate the k-mer composition of a string.
3     Text: A string.
4     k: An integer."""
5     kmers = [] # create an empty list to store the k-mers
6     for i in range(len(Text) - k + 1): # iterate over the string
7         # +1 is added to len(Text) - k to include the last k-mer in the string
8         kmers.append(Text[i : i + k]) # add the k-mer to the list
9     # return (kmers)
10    return "\n".join(kmers)
```

```
# Test the function with the sample dataset
Text = "CAATCCAAC"
k = 5
print(Compositionk(Text, k))
```

✓ 0.0s

CAATC
AATCC
ATCCA
TCCAA
CCAAC

Script 2 *

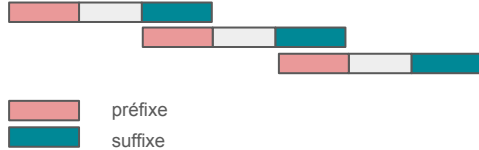
```
5 def genome_path_string(kmers):
6     """Reconstruct a string from its genome path.
7
8     Input: list form : A sequence path of k-mers Pattern1, ... ,
9                     Patternn such that the last k - 1 symbols of Patterni
10                    are equal to the first k-1 symbols of Patterni+1 for 1 ≤ i ≤ n-1.
11
12    Output: A string Text of length k+n-1 such that the i-th k-mer in Text is equal to Patterni (for 1 ≤ i ≤ n).
13    """
14    # Start with the first k-mer
15    genome_string = kmers[0]
16
17    # Append the last character of each subsequent k-mer
18    for kmer in kmers[1:]:
19        genome_string += kmer[-1]
20
21    return genome_string
```

```
# Test
list_kmers = [
    "ACCGA",
    "CCGAA",
    "CGAAG",
    "GAAGC",
    "AAGCT",
] # sequence path of k-mers need to be in order
result = genome_path_string(list_kmers)
pprint.pp(result) # ACCGAAGCT
```

✓ 0.0s

Script 3

```
18
19 def Prefix(Pattern):
20     """Returns the prefix of a k-mer"""
21     return Pattern[:-1]
22
23
24 def Suffix(Pattern):
25     """Returns the suffix of a k-mer"""
26     return Pattern[1:]
27
```



```
def Overlap(Patterns):
    """Construct the overlap graph of a collection of k-mers.

    :param Patterns: A collection Patterns of k-mers.
    :return: The overlap graph Overlap(Patterns), in the form of an adjacency list.
    """
    # Initialize an empty dictionary to store the adjacency list
    adj_list = {}

    # Iterate over each k-mer in Patterns
    for i, Pattern in enumerate(Patterns):
        # i is the index of the current k-mer in Patterns ; Pattern is the current k-mer
        # Iterate over each k-mer in Patterns
        for j, Pattern_prime in enumerate(Patterns):
            # j is the index of the current k-mer in Patterns ; Pattern_prime is the current k-mer
            # Skip the current k-mer
            if i == j:
                # if the index of the current k-mer is equal to the index of the current k-mer
                continue # skip the current k-mer

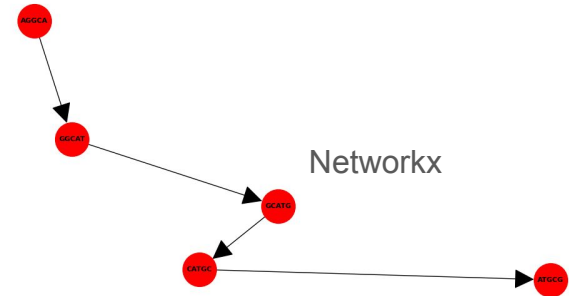
            # Check if Suffix(Pattern) is equal to Prefix(Pattern_prime)
            if Suffix(Pattern) == Prefix(Pattern_prime):
                if Pattern not in adj_list: # if Pattern is not in the adjacency list
                    adj_list[Pattern] = [] # add Pattern to the adjacency list
                adj_list[Pattern].append(Pattern_prime)
                # add Pattern_prime to the adjacency list of Pattern

    return adj_list # return the adjacency list
```

```
testseq = ["ATGCG", "GCATG", "CATGC", "AGGCA", "GGCAT"]
pprint.pp (Overlap (testseq))

✓ 0.0s

{'GCATG': ['CATGC'], 'CATGC': ['ATGCG'], 'AGGCA': ['GGCAT'], 'GGCAT': ['GCATG']}
```



Introduction

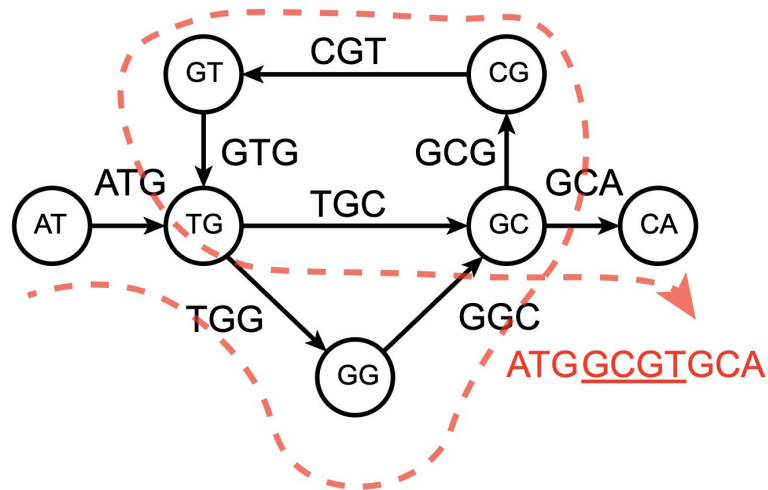
Modélisation du problème : intérêt des graphes

Graphe dirigé :

- Chaque k-mer définit une connexion dirigée
 - Préfixe → Suffixe
 - Exemple : pour "**CGT**" : Préfixe "CG" → Suffixe "GT"
- Nœuds = préfixes/suffixes de taille k-1
- Arêtes = k-mers complets
- Direction = ordre de succession dans la séquence

But :

- Parcourir chaque k-mer une fois
- → Recherche d'un chemin eulérien
- → Reconstruction de la séquence originale !



alexeidrummond.org

Script 5 *

```
def CompositionGraph(Patterns):  
    """  
    Constructs the CompositionGraph of the collection of k-mers Patterns.  
    :param Patterns: A collection of k-mers.  
    :return: The composition graph CompositionGraph(Patterns),  
    in the form of a tuple containing (Prefixes, Suffixes).  
    """  
    # Initialize an empty list to store the edges  
    edges = []  
    for kmer in Patterns:  
        prefix = Prefix(kmer)  
        suffix = Suffix(kmer)  
        edges.append((prefix, suffix))  
    return edges
```

```
# Test the CompositionGraph function  
listKmer = ["GAGG", "CAGG", "GGGG", "GGGA", "CAGG", "AGGG", "GGAG"]  
pprint.pp(CompositionGraph(listKmer))  
  
✓ 0.0s  
  
[('GAG', 'AGG'),  
 ('CAG', 'AGG'),  
 ('GGG', 'GGG'),  
 ('GGG', 'GGA'),  
 ('CAG', 'AGG'),  
 ('AGG', 'GGG'),  
 ('GGA', 'GAG')]
```


Script 5 *

```
# Test the CompositionGraph function
listKmer = ["GAGG", "CAGG", "GGGG", "GGGA", "CAGG", "AGGG", "GGAG"]
pprint.pp(CompositionGraph(listKmer))

✓ 0.0s

[('GAG', 'AGG'),
 ('CAG', 'AGG'),
 ('GGG', 'GGG'),
 ('GGG', 'GGA'),
 ('CAG', 'AGG'),
 ('AGG', 'GGG'),
 ('GGA', 'GAG')]
```

```
44 def DeBruijn(Patterns):
45     """
46     Constructs the de Bruijn graph of a collection of k-mers Patterns.
47     :param Patterns: A collection of k-mers.
48     :return: The de Bruijn graph DeBruijn(Patterns), in the form of an adjacency list.
49     """
50     # Construct the CompositionGraph of Patterns
51     edges = CompositionGraph(Patterns)
52     # Initialize an empty dictionary to store the adjacency list
53     adj_list = {}
54     # Iterate over each edge in the CompositionGraph
55     for edge in edges:
56         # Unpack the edge into the prefix and suffix
57         prefix, suffix = edge
58         # Check if the prefix is already in the adjacency list
59         if prefix in adj_list:
60             # Append the suffix to the list of neighbors
61             adj_list[prefix].append(suffix)
62         else:
63             # Initialize a new list with the suffix as the neighbor
64             adj_list[prefix] = [suffix]
65     # Sort the adjacency list by keys (prefixes) and values (suffixes) in alphabetical order
66     sorted_adj_list = {k: sorted(v) for k, v in sorted(adj_list.items())}
67     return sorted_adj_list
```

```
print("The De Bruijn graph of the given k-mers is:")
pprint.pp(DeBruijn(listKmer))
```

✓ 0.0s

```
The De Bruijn graph of the given k-mers is:
{'AGG': ['GGG'],
 'CAG': ['AGG', 'AGG'],
 'GAG': ['AGG'],
 'GGA': ['GAG'],
 'GGG': ['GGA', 'GGG']}
```

Cycle eulérien

```
1 # Eulerian Cycle Problem
2 """
3 A cycle that traverses each edge of a graph exactly once is called an Eulerian cycle,
4 and we say that a graph containing such a cycle is Eulerian.
5 The following algorithm constructs an Eulerian cycle in an arbitrary directed graph.
6
7 EULERIANCYCLE(Graph)
8     form a cycle Cycle by randomly walking in Graph (don't visit the same edge twice!)
9     while there are unexplored edges in Graph
10         select a node newStart in Cycle with still unexplored edges
11         form Cycle' by traversing Cycle (starting at newStart) and then randomly walking
12         Cycle ← Cycle'
13     return Cycle
14 """
15
16 def EulerianCycle(Graph):
17     """
18     Finds an Eulerian cycle in a graph.
19     param Graph: An Eulerian directed graph, in the form of an adjacency list.
20     return: A list representing an Eulerian cycle in this graph.
21     """
22
23     # Initialize the cycle with any node from the graph. Here, we choose the first node in the keys of the adjacency list
24     cycle = [list(Graph.keys())[0]]
25     # Main loop that continues as long as there are edges in the graph to add to the cycle.
26     while len(Graph) > 0:
27         # When the current cycle is "closed" (the first and last nodes are the same),
28         # check if this cycle contains a node with any unexplored edges.
29         if cycle[0] == cycle[-1]:
30             # As long as the first node of the cycle has no unexplored edges, rotate the cycle.
31             # This means removing the first element of the cycle and appending it at the end.
32             while cycle[0] not in Graph:
33                 cycle.pop(0) # Remove the first node from the cycle.
34                 cycle.append(cycle[0])
35             # Append this node at the end to "rotate" the cycle.
36         # The last node of the current cycle becomes the new "starting point" or source to continue the traversal.
37         source = cycle[-1]
38         # Take one of the neighbors (or targets) of the current node in the graph (chosen randomly) and add it to the cycle.
39         cycle.append(Graph[source].pop())
40         # If the source node has no more neighbors (all its edges have been traversed), remove it from the graph. (clean up empty dict entries of graph)
41         if len(Graph[source]) == 0: # If the node has no more neighbors
42             del Graph[source] # delete the node from the graph
43     return "->".join(cycle) # Return the Eulerian cycle as a string
44
```

Algorithme général

Graphe = dictionnaire d'adjacence Python

Nœuds et arêtes représentant les k-mers

Consommation des arêtes durant le parcours

Construction du cycle par progression itérative depuis un noeud initial.

Gestion des sous-cycles

Cycle eulérien

Définition de la fonction et initialisation

```
1  def EulerianCycle(Graph):
2      """
3      Finds an Eulerian cycle in a graph.
4      Graph: An Eulerian directed graph, in the form of an adjacency list.
5      Return: A list representing an Eulerian cycle in this graph.
6      """
7
8
9
10     # Data structure : dictionnaire d'adjacence
11     Graph = {
12         'AT': ['TG', 'TC'],
13         'TG': ['GC', 'GT'],
14         'TC': ['CG']
15     }
16
17     # Initialize the cycle with any node from the graph. Here, we choose the first node in the keys of the adjacency list
18     cycle = [list(Graph.keys())[0]]
```

Structure de données = graphe représenté par une liste d'adjacence (dictionnaire Python tel que clés = nœuds (préfixes) et valeurs = liste des nœuds accessibles (suffixes))

Exemple: ici à l'initialisation, l'output de cycle = ['AT']

Cycle eulérien

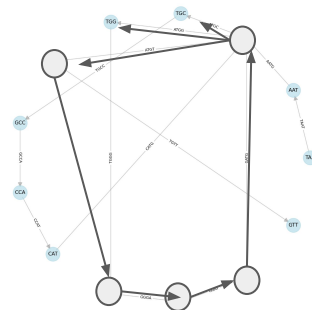
Boucle principale

```
16 # Initialize the cycle with any node from the graph. Here, we choose the first node in the keys of the adjacency list
17 cycle = [list(Graph.keys())[0]]
18
19 # Main loop that continues as long as there are edges in the graph to add to the cycle.
20 while len(Graph) > 0:
21
22     # The last node of the current cycle becomes the new "starting point" or source to continue the traversal.
23     source = cycle[-1]
24
25     # Take one of the neighbors (or targets) of the current node in the graph (chosen randomly) and add it to the cycle.
26     cycle.append(Graph[source].pop())
27
28     # If the source node has no more neighbors (all its edges have been traversed), remove it from the graph. (clean up empty
29     if len(Graph[source]) == 0: # If the node has no more neighbors
30         del Graph[source] # delete the node from the graph
```

Par itération :

- Partir du dernier nœud visité
- Choisir une arête non visitée
- la supprimer simultanément du graphe

→ progression jusqu'à un graphe vide



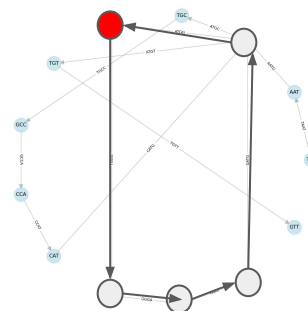
Cycle eulérien

Cycles fermés

```
24 # When the current cycle is "closed" (the first and last nodes are equal),
25 # check if this cycle contains a node with any unexplored edges.
26 if cycle[0] == cycle[-1]:
27
28     # As long as the first node of the cycle has no unexplored edges, rotate the cycle.
29     # This means removing the first element of the cycle and appending it at the end.
30
31     while cycle[0] not in Graph:
32         cycle.pop(0) # Remove the first node from the cycle.
33         cycle.append(cycle[0]) # Append this node at the end to "rotate" the cycle.
```

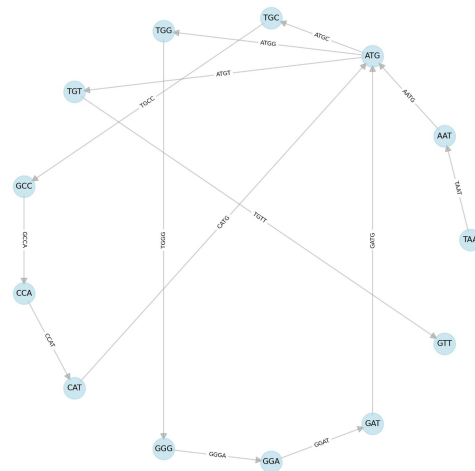
Graphe = { ~~●~~: xy,
○: yz,
○: ab
}

cycle = [●]



eulerien cycle

De Bruijn Graph for TAATGCCATGGGATGTT with k=4



```
# Fonction finale
✓ def StringReconstruction(filename): # filename is the path to the file containing the k-mers
    Patterns = read_kmers_from_file(filename) # read the k-mers from the file
    dB = DeBruijn(Patterns) # construct the de Bruijn graph # script 5
    path = EulerianPath(dB) # find an Eulerian path in the de Bruijn graph #script 7
    Text = PathToGenome(path) # reconstruct the string from the path #script 2
    return Text # sequence output
```

```
25
1 GTATAACGCGGTTACCGTAAAGACA
2 TAATTCAAATTA AAAA ACTCCAACA
3 CAGGTAGAATCCAGCGGAGACCTTT
4 AGACAGTGAACAGAACGGTCAGAG
5 GAAGGGCACTGCGGCCCTCTGAA
6 CCAACTAGGTCACCTTGC CGCGAA
7 CAGCTGGGTAATGGGTGCATAAAT
8 TGGATACGAACCGATCAAGATCTCT
9 TCGCGGGGTGACACCAAGTACTAGC
10 CTCGCCGCATATCAGACCTATGCT
11 TACGTGCGGCCGATGAATTAATCAA
12 AAGATTCTGCTCAACCCATCTCGG
13 AAAGACAGTGAACCAAGCGGTGAG
14 AGGTGTTCTTGCAATCAGTTTTCT
15 CCATATGCGCGGACCGGAACCTGCT
16 TGAAGTCAAAATAGACTATCGGCA
17 GTTATTATGCGCTTGTTGGCTCTTA
18 GGAATCAGGTGTTCTTGCAATCAGT
19 CAATATGCCATAAGGAATCCAACTG
20 GGCCAACTAGGTCACCTTGC CGCG
21 TACAGACATGCAATTCATGAGAGG
22 CCTCCTGAACATATGGCAATGCCA
23 TTCTCTTTTATATAGTACAGAAAT
24 AACAGTCCAGGATGCGGGTTAATCA
25 TTGCGAGCATCTGTCGACGAGAGG
26 AAAGACACAAGCATCAACCCCTG
27 AAACCTTAGGAAGAGTCTCCGGTTA
28 CCTATAAAACAAATCCGGGAGAGC
29 GCCGCAATGTAATTCAGTCCCGA
```

```
['GTATAACGCGGTTACCGTAAAGACA',
 'TAATTCAAATTA AAAA ACTCCAACA',
 'CAGGTAGAATCCAGCGGAGACCTTT',
 'AGACAGTGAACAGAACGGTCAGAG',
 'GAAGGGCACTGCGGCCCTCTGAA',
 'CCAACTAGGTCACCTTGC CGCGAA',
 'CAGCTGGGTAATGGGTGCATAAAT',
 'TGGATACGAACCGATCAAGATCTCT',
 'TCGCGGGGTGACACCAAGTACTAGC',
 'CTCGGCCGCATATCAGACCTATGCT',
 'TACGTGCGGCCGATGAATTAATCAA',
 'AAGATTCTGCTCAACCCATCTCGG',
 'AAAGACAGTGAACCAAGCGGTGAG',
 'AGGTGTTCTTGCAATCAGTTTTCT',
 'CCATATGCGCGGACCGGAACCTGCT',
 'TGAAGTCAAAATAGACTATCGGCA',
 'GTTATTATGCGCTTGTTGGCTCTTA',
 'GGAATCAGGTGTTCTTGCAATCAGT',
 'CAATATGCCATAAGGAATCCAACTG',
 'GGCCAACTAGGTCACCTTGC CGCG',
 'TACAGACATGCAATTCATGAGAGG',
 'CCTCCTGAACATATGGCAATGCCA',
 'TTCTCTTTTATATAGTACAGAAAT',
 'AACAGTCCAGGATGCGGGTTAATCA',
 'TTGCGAGCATCTGTCGACGAGAGG',
 ...]
```

```
[('GTATAACGCGGTTACCGTAAAGACA', 'TATAACGCGGTTACCGTAAAGACA'),
 ('TAATTCAAATTA AAAA ACTCCAACA', 'AATTCAAATTA AAAA ACTCCAACA'),
 ('CAGGTAGAATCCAGCGGAGACCTTT', 'AGGTAGAATCCAGCGGAGACCTTT'),
 ('AGACAGTGAACAGAACGGTCAGAG', 'AGACAGTGAACAGAACGGTCAGAG'),
 ('GAAGGGCACTGCGGCCCTCTGAA', 'AAGGGCACTGCGGCCCTCTGTAAG'),
 ('CCAACTAGGTCACCTTGC CGCGAA', 'CAACTAGGTCACCTTGC CGCGAA'),
 ('CAGCTGGGTAATGGGTGCATAAAT', 'AGCTGGGTAATGGGTGCATAAAT'),
 ('TGGATACGAACCGATCAAGATCTCT', 'GGATACGAACCGATCAAGATCTCT'),
 ('TCGCGGGGTGACACCAAGTACTAGC', 'CGCGGGGTGACACCAAGTACTAGC'),
 ('CTCGGCCGCATATCAGACCTATGCT', 'TCGCGGCCGCATATCAGACCTATGCT'),
 ('TACGTGCGGCCGATGAATTAATCAA', 'ACGTGCGGCCGATGAATTAATCAA'),
 ('AAGATTCTGCTCAACCCATCTCGG', 'AGATTCTGCTCAACCCATCTCGG'),
 ('AAAGACAGTGAACCAAGCGGTGAG', 'AAGACAGTGAACCAAGCGGTGAG'),
 ('AGGTGTTCTTGCAATCAGTTTTCT', 'AGGTGTTCTTGCAATCAGTTTTCT'),
 ('CCATATGCGCGGACCGGAACCTGCT', 'CATATGCGCGGACCGGAACCTGCT'),
 ('TGAAGTCAAAATAGACTATCGGCA', 'GAGTCAAAATAGACTATCGGCA'),
 ('GTTATTATGCGCTTGTTGGCTCTTA', 'TATTATATGCGCTTGTTGGCTCTTA'),
 ('GGAATCAGGTGTTCTTGCAATCAGT', 'GAATCAGGTGTTCTTGCAATCAGT'),
 ('CAATATGCCATAAGGAATCCAACTG', 'AATATGCCATAAGGAATCCAACTG'),
 ('GGCCAACTAGGTCACCTTGC CGCG', 'GCCAACTAGGTCACCTTGC CGCG'),
 ('TACAGACATGCAATTCATGAGAGG', 'ACAGACATGCAATTCATGAGAGG'),
 ('CCTCCTGAACATATGGCAATGCCA', 'CTCTCCTGAACATATGGCAATGCCA'),
 ('TTCTCTTTTATATAGTACAGAAAT', 'TCTCTTTTATATAGTACAGAAAT'),
 ('AACAGTCCAGGATGCGGGTTAATCA', 'ACAGTCCAGGATGCGGGTTAATCA'),
 ('TTGCGAGCATCTGTCGACGAGAGG', 'TGCAGCATCTGTCGACGAGAGG'),
 ...]
```

```
{'AAAAACCGTACTCTTAATGTGA': ['AAAAACCGTACTCTTAATGTGA'],
 'AAAAACCTCAACAGTACTCAAGAC': ['AAAAACCTCAACAGTACTCAAGAC'],
 'AAAAACCTTGCCTGTAAGAGAA': ['AAAAACCTTGCCTGTAAGAGAA'],
 'AAAAACCGATACTCTTAATGTGA': ['AAAAACCGATACTCTTAATGTGA'],
 'AAAAACCTCAACAGTACTCAAGAC': ['AAAAACCTCAACAGTACTCAAGAC'],
 'AAAAAGACACAAGCATCAACCCCT': ['AAAAAGACACAAGCATCAACCCCT'],
 'AAAAACAAATCCGGGAGAGCGGGG': ['AAAAACAAATCCGGGAGAGCGGGG'],
 'AAAAACACCTCGGCTGAAAAACG': ['AAAAACACCTCGGCTGAAAAACG'],
 'AAAAACAGAGTGTGTTTCTACGA': ['AAAAACAGAGTGTGTTTCTACGA'],
 'AAAAACGCGGCCAAGTACTGCTCA': ['AAAAACGCGGCCAAGTACTGCTCA'],
 'AAAAACCGATACTCTTAATGTGA': ['AAAAACCGATACTCTTAATGTGA'],
 'AAAAAGTCTCTTTATATAGTAC': ['AAAAAGTCTCTTTATATAGTAC'],
 'AAAAAGTCTTCTAGTAATGAGGG': ['AAAAAGTCTTCTAGTAATGAGGG'],
 'AAAACTCAACAGTACTCAAGAC': ['AAAACTCAACAGTACTCAAGAC'],
 'AAAACTAGGAAGAGTCTCCGGT': ['AAAACTAGGAAGAGTCTCCGGT'],
 'AAAAAGACACAAGCATCAACCCCT': ['AAAAAGACACAAGCATCAACCCCT'],
 'AAAAATCCGGGAGAGCGGGCTAAC': ['AAAAATCCGGGAGAGCGGGCTAAC'],
 'AAAAATAGACTATCGGCAAGCAAT': ['AAAAATAGACTATCGGCAAGCAAT'],
 'AAAAACAAATCCGGGAGAGCGGGG': ['AAAAACAAATCCGGGAGAGCGGGG'],
 'AAAAAGGCTGTGATCTCCCAT': ['AAAAAGGCTGTGATCTCCCAT'],
 'AAAAACCTTGCCTGTAAGAGAA': ['AAAAACCTTGCCTGTAAGAGAA'],
 'AAAAAGACAGTCAAGGGCGGCT': ['AAAAAGACAGTCAAGGGCGGCT'],
 'AAAAAGAGTGTGTTTCTACGAG': ['AAAAAGAGTGTGTTTCTACGAG'],
 'AAAAAGGCGCAATGAGTCCAC': ['AAAAAGGCGCAATGAGTCCAC'],
 'AAAAACATCATCTGACCGGTGTA': ['AAAAACATCATCTGACCGGTGTA'],
 ...}]
```

```
['GGCATAGGCTCGTCTCTCATCAC',
 'GCATAGGCTCGTCTCTCATCAC',
 'CATAGGCTCGTCTCTCATCACTG',
 'ATAGGCTCGTCTCTCATCACTGG',
 'TAGGCTCGTCTCTCATCACTGGT',
 'AGGCTCGTCTCTCATCACTGGTT',
 'GGCTCGTCTCTCATCACTGGTTT',
 'GCTGCTCTCTCATCACTGGTTTC',
 'CTGCTCTCTCATCACTGGTTTCT',
 'TCGTCTCTCATCACTGGTTTCTG',
 'CGTCTCTCATCACTGGTTTCTGG',
 'GTCTCTCATCACTGGTTTCTGGA',
 'TCCTCTCATCACTGGTTTCTGAT',
 'CCTCTCATCACTGGTTTCTGGATG',
 'CTCTCATCACTGGTTTCTGGATGT',
 'TCTCATCACTGGTTTCTGGATGTG',
 'CTCATCACTGGTTTCTGGATGTTG',
 'TCATCACTGGTTTCTGGATGTTGC',
 'CATCACTGGTTTCTGGATGTTGCT',
 'ATCACTGGTTTCTGGATGTTGCTA',
 'TCATCTGGTTTCTGGATGTTGCTAT',
 'CACTGGTTTCTGGATGTTGCTATC',
 'ACTGGTTTCTGGATGTTGCTATCT',
 'CTGGTTTCTGGATGTTGCTATCTA',
 'TGTTTCTGGATGTTGCTATCTAC',
 ...]
```

'GGCATAGGCTCGTCTCTCATCACTGGTTTCTGGATGTTGCTATCTACTCATTTTGTGTGGCTCAGCCTACTTTGCCGCAATGTAATTCAGTTCGCCAGTCCAGTGGGTAATGGGTGCCATAAATTCACCAACCACTTGGGCACGGCGGCAGTCTCGGAGAAAGCCTACGAAACATCCATCTGCACCGGTTAAGGGCAAGCCTGAGTGCAAAATAGACTATCGGCAAGCAATAATTAAGACTTTGCAAGGATCAGGAGAGTCTATTGGATTCCTGTATCGTATTCTAGGACGATTACGGAATTCATCGACATTTCCACTGACTGAAGCTCAGTACAGGTGCGGTCCTACAATCTAACCAATGTTAGGGCAGATATAAATTTGCTGCATAAAACCTTCTCTTTATATAGTACCAGATTATGATTAAGGCTCCGCTACCCGCCCTCTGTTATTTATGCGCTTTGTGGCTCTTAGGAACAGTCCAGGATGGGTTAATCAAGCTGTGACTCGGCCGAGTGAATAGCGGCACCTATTCATGCTGCTGACTCTGGTGTGGTACTCAATACAGCTTTATGCCAATTCGATCTCCGACAGCCTGTAGTAGAAGATTAAGAGTGGACCTGGACCTGBCACCTCTCGCGGCATATCAGACCTATGCTGCGGTTCCCTATATAAAACAAATCCGGGAGAGCGGGGCTAACCGGCATCAAAAAGACACAAGCCTCAACCCCTGATTTACGAGCGCGATGCTCCCTCGCCCATCCAAGCGCACCAGAGGATACGGGACTCCATCTTAAGGCCAGAAGGGGACTGCACCGGCCCCAGTACCGGTGAAAAACAGCGGCCAAGTACAGTCCACCTTGC CGCGGAATCCGGCGGACAGGTGAATACGTGCGGCCGCGGATAATTCAAATTA AAAA ACTCCAACAGTACTCAAGACCGGCTCATCTTTAAGAAACGAAGCCGACCTTTTGCCCTAGTCGCTCAGTGAGGACATAGGGTATTGCTTATGGTTCCACCAAGCCTTGAATGTATCTCTCCGTTGCGCTGTGTTGCAGTACGCAAGAAGCAGGTAGAATCCAGCGGAGACCTTTACACGTAGAAGCAAAAACCGATCTTCTAATGTGAAGTACACAAGAGCGGATGTTACGGATAAGTACCTGTTATTCATCATCTACGCAAGCCGCTGCGCGCTGCACACTGAGTTACTTATGACGTTCTCGGGGTGAAACCTTAGGAAGAGTCTCCGGTATGCCATCTGCCCCATCAGGTTAATGTGAAGCTTTGGCGCTCGGAATCAGGTGTTCTGCAATCAGTTTTTCTCGGGTGCAGTTAAAGTCCAGAGGCTTTGGGAATGTGACCAAGAGTGCGTTACTGCTATTTCCGGTGTGCAATGTTAGATACCTTGCCAGCATTGCTGACCGAGCAGGCTGTGTTGACGAGGCTGGTTTACGAGGATCAATCAGATACCATATGCCCGCAGCGAAACGTTATTCTAGTAATGAGGGTTAGAGCCGGAAGGGACTATGCCCGCTCTCTGAACATATGGGCAATGCCATCAAAATGCTACTGCCAGTCCCGATCTTGGAAGTGAGTCCAGGATAAGTACGATTCATGAGAGAGCTGCGGATGAGTATTCATCATCATCTACGCAAGCCGCTGCGCGCTGCACACTGAGTTACTTATGACGTTCTCGGGGTGAAACCTTAGGAAGAGTCTCCGGTATGCCATCTGCCCCATCAGGTTAATGTGAAGCTTTGAGGTTCCACAGATTCGATTCATGAGAGGCTGGGCGAGGTTGGATGAACACCGATCAAGATCTGCTCAACCCATCTCGGGGTACCGGTGATGAACATGTCTAATTTGTCTCTTAAGGTTACTGAGGAGCTTTGCGGTATAACCGGGTACCGTAAGACAGTGAACAGAACGGTCAGAGGCGGCTCAACGAGTACCTTTGGGCTGCGGGGCATATCCCTGATTATTCTCATGATGTCTATCTTCTGTTGCTATAACTGTGCGAGTATCATGTCAACGCAAGTATCAGCTCTAAAAACACCCTCGGCTGAAACAGAGCTGATGTTTCTACGAGAGATGGTACATCTTAGAGGGCCGCGACAACATACATCTCACGGTAGATGTGCTTTCGCGGGGTGACACCAAGTACTAGCCAAATGTTTGAACGTGCGACAGGCTCTGCTAGGCACCTCGCGTGTATAGCTAGTCAAGGCAAGCCTCGAGTG'

https://alexeidrummond.org/bayesian_phylo_lectures/lectureGenomeAssembly/?print-pdf#/

[git@github.com](https://github.com/hakimGMO/Team-PLS-Genome-Assembly):hakimGMO/Team-PLS-Genome-Assembly.git

<https://www.bioinformaticsalgorithms.org/bioinformatics-chapter-3>

Script 4

```
def PathGraphk(Text, k):  
    """  
    Generate the nodes and edges of the path graph from a genome Text.  
  
    PathGraphk(Text) is the path consisting of  $|Text| - k + 1$  edges,  
    where the  $i$ -th edge of this path is labeled by the  $i$ -th  $k$ -mer in Text and the  $i$ -th node of  
    the path is labeled by the  $i$ -th  $(k - 1)$ -mer in Text.  
  
    :param Text: A string representing the genome.  
    :param k: An integer representing the length of  $k$ -mers.  
  
    :return: A tuple containing two lists:  
        - nodes: A list of  $(k-1)$ -mers representing the nodes of the path graph.  
        - edges: A list of  $k$ -mers representing the edges of the path graph.  
    """  
    # Initialize an empty list to store the nodes  
    nodes = []  
    # Initialize an empty list to store the edges  
    edges = []  
  
    # Iterate over the range from 0 to the length of Text - k+1  
    for i in range(len(Text) - k + 1):  
        # Append the  $i$ -th  $(k - 1)$ -mer in Text to the nodes list  
        nodes.append(Text[i : i + k - 1])  
        # Append the  $i$ -th  $k$ -mer in Text to the edges list  
        edges.append(Text[i : i + k])  
  
    return nodes, edges
```

```
# Test the PathGraphk function  
k1 = 4 # length of k-mers  
text1 = "AAGATTCTCTAC" # genome Text  
  
pprint.pp(PathGraphk(text1, k1)) #  
✓ 0.0s  
  
(['AAG', 'AGA', 'GAT', 'ATT', 'TTC', 'TCT', 'CTC', 'TCT', 'CTA'],  
 ['AAGA', 'AGAT', 'GATT', 'ATTC', 'TTCT', 'TCTC', 'CTCT', 'TCTA', 'CTAC'])
```

Script 4

```
58 def DeBruijn(Text, k):
59     """
60     Generate the adjacency list of the de Bruijn graph from a genome Text.
61
62     The de Bruijn graph DeBruijn(Text) is formed by gluing identically labeled nodes in PathGraphk(Text).
63
64     :param Text: A string representing the genome.
65     :param k: An integer representing the length of k-mers.
66
67     :return: A dictionary representing the adjacency list of the de Bruijn graph.
68     """
69     # Generate the nodes and edges of the path graph nodes,
70     edges = PathGraphk(Text, k)
71
72     # Initialize an empty dictionary to store the adjacency list
73     adj_list = {}
74
75     # Iterate over each edge in the edges list
76     for i in range(len(edges[1])): # edges[1] is the list of k-mers
77         edge = edges[1][i] # get the i-th k-mer
78         # Get the prefix of the edge
79         prefix = edge[: k - 1]
80         # Get the suffix of the edge
81         suffix = edge[1:]
82
83         # If the prefix is not in the adjacency list, add it
84         if prefix not in adj_list:
85             adj_list[prefix] = []
86
87         # Add the suffix to the adjacency list for the prefix
88         adj_list[prefix].append(suffix)
89
90     return adj_list
```

```
# Test the DeBruijn function
result = DeBruijn(text1, k1)
pprint.pp(result)
```

✓ 0.0s

```
{'AAG': ['AGA'],
 'AGA': ['GAT'],
 'GAT': ['ATT'],
 'ATT': ['TTC'],
 'TTC': ['TCT'],
 'TCT': ['CTC', 'CTA'],
 'CTC': ['TCT'],
 'CTA': ['TAC']}
```