■ Spark RDD(Resilient Distributed Dataset)

1) RDD의 성질

- 불변성 : 읽기 전용

- 복원성 : 장애 내성

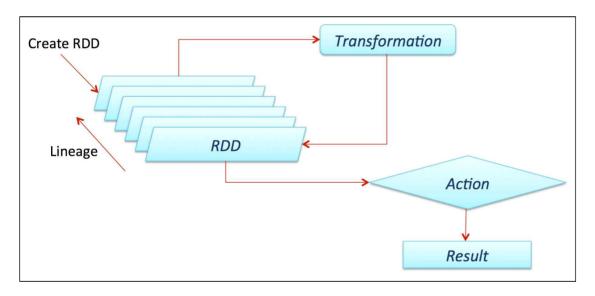
- 분산 : 노드 한 개 이상에 저장된 데이터 셋

2) RDD의 유형

- 변환(Transformation) : 데이터를 조작해 새로운 RDD를 생성

- 행동(Action) : 계산결과를 반환하거나 특정 작업을 수행하려고 실제 계산을 시작하는 역할을 함

3) Lazy Evaluation



- 여러번 transformation을 해도 실제로 작동되지는 않고, 액션 메서드를 호출할 때 transformation을 수행하는 개념으로, 계획에 따라 빠르고 효율적으로 transformation을 가능하게 함

4) 자바의 람다식(java 8에서 추가됨)

- 식별자 없이 실행 가능한 함수 표현식

```
( parameters ) -> expression body
( parameters ) -> { expression body }
() -> { expression body }
() -> expression body
```

- 예제

```
package org.jbm.spark_0626;
import java.util.ArrayList;
import java.util.List;
import java.util.function.Function;
public class LambdaTest {
       public static void main(String[] args) {
               List<Integer> list = new ArrayList<>();
               list.add(1);
               list.add(2);
               list.add(3);
               list.add(4);
               list.add(5);
               //기존의 for each문
               for(int value : list) {
                       System.out.println(value);
               }//for end
               //람다식의 for each 문
               list.forEach(value->System.out.println(value));
       }
```

- 변환(Transformation) 연산자
- 1) map 연산자 : 원본 RDD의 모든 요소에 임의의 함수를 적용할 수 있는 변환 연산자

```
package org.jbm.spark 0626;
import java.util.Arrays;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
public class RDDAPI3_map {
       private static JavaSparkContext sc;
       static {
               SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
               sc = new JavaSparkContext(conf);
       }
       public static void main(String[] args) {
               executeMap1();
               executeMap2();
               executeMap3();
       }
       //1,2,3,4,5인 RDD를 +1해서 2,3,4,5,6으로 만드는 예제
       private static void executeMap1() {
               //1,2,3,4,5인 JavaRDD를 생성
               JavaRDD<Integer> rdd1 = sc.parallelize(Arrays.asList(1, 2, 3, 4, 5));
               // -> 함수는 아래와 같은 코드임 즉, 인자() {} return 등을 생략가능함
               JavaRDD<Integer> rdd2 = rdd1.map(i \rightarrow i + 1);
               //JavaRDD<Integer> rdd2 = rdd1.map((Integer i) -> {
                       return i + 1;
               //
               //});
               System.out.println(rdd2.collect());
       }
       //전화번호를 쪼개서 '-'을 넣어주는 예제
       private static void executeMap2() {
```

```
//1,2,3,4,5인 JavaRDD를 생성
               JavaRDD<String> rdd =
               sc.parallelize(Arrays.asList("0102223333","01123456788","0174451234"))
                 .map(phone -> {
                      String p1 = phone.substring(0, 3);
                      String p2 = phone.substring(3,phone.length()-4);
                      String p3 = phone.substring(phone.length()-4,phone.length());
                      return p1+"-"+p2+"-"+p3;
               });
               System.out.println(rdd.collect());
       }
       //23살...이런 String형을 23...이런 Integer형으로 변환하는 예제
       private static void executeMap3() {
               JavaRDD<String> rdd = sc.parallelize(Arrays.asList("15살","23살","34살","47살"));
               //맵은 RDD타입이 같을 수도 있고, 다를 수도 있음
               JavaRDD<Integer>
                                           rdd2
                                                                          rdd.map(age
Integer.parseInt(age.substring(0,age.length()-1)));
               System.out.println(rdd2.collect());
       }
}
```

[2, 3, 4, 5, 6]

[010-222-3333, 011-2345-6788, 017-445-1234]

[15, 23, 34, 47]

2) flatMap 연산자: map과 유사하지만 iterator를 리턴

```
package org.jbm.spark_0626;
import java.util.ArrayList;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
public class RDDAPI4_flatMap {
       private static JavaSparkContext sc;
       static {
               SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
       }
       public static void main(String[] args) {
               List<String> data = new ArrayList<String>();
               data.add("진,슈가");
               data.add("제이홉,RM,지민");
                data.add("뷔,정국");
               JavaRDD<String> rdd1 = sc.parallelize(data);
               System.out.println("rdd1은");
                for (String s : rdd1.collect()) {
                        System.out.println(s);
               } // for end
               JavaRDD<String> rdd2 = rdd1.flatMap(s -> Arrays.asList(s.split(",")).iterator());
               System.out.println("");
               System.out.println("rdd2는");
               for (String s : rdd2.collect()) {
                        System.out.println(s);
               } // for end
       }
```

진,슈가 제이홉,RM,지민 뷔,정국



3) distinct 연산자 : 중복 제거

```
| package org.jbm.spark_0626;

| import java.util.Arrays;
| import org.apache.commons.lang3.ArrayUtils;
| import org.apache.spark.SparkConf;
| import org.apache.spark.api.java.JavaSparkContext;

| public class RDDAPI5_distinct {
| private static JavaSparkContext sc;
| static {
| SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
| sc = new JavaSparkContext(conf);
| }
| public static void main(String[] args) {
| JavaRDD<String> rdd =
| sc.parallelize(Arrays.asList("게니","지수","제니","지수","리사","로제","
```

```
리사"));

System.out.println("변경전:"+rdd.collect());

rdd =rdd.distinct();

System.out.println("변경후:"+rdd.collect());

}
```

변경전:[제니, 지수, 제니, 지수, 리사, 로제, 리사]

변경후:[지수, 로제, 제니, 리사]

4) filter 연산자 : 리턴값이 true인 경우만 필터링

```
package org.jbm.spark_0626;
import java.util.Arrays;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
public class RDDAPI7_filter {
        private static JavaSparkContext sc;
        static {
                SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
        }
        public static void main(String[] args) {
                JavaRDD<Integer> rdd = sc.parallelize(Arrays.asList(1, 2, 3, 4, 5));
                //2보다 큰 값만
                JavaRDD<Integer> result = rdd.filter((v) -> v > 2);
                System.out.println(result.collect());
        }
```

[3, 4, 5]

5) mapPartitions 연산자 : flatMap과 비슷하나 파티션별로 나눠서 작동됨

```
package org.jbm.spark 0626;
import java.util.ArrayList;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
public class RDDAPI6_mapPartitions {
        private static JavaSparkContext sc;
        static {
                SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
        }
        public static void main(String[] args) {
                //파티션이 4개
                JavaRDD<Integer> rdd1 = sc.parallelize(Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10), 4);
                JavaRDD<String> rdd2 = rdd1.mapPartitions(numbers -> {
                        List<String> result = new ArrayList<>();
                        while (numbers.hasNext()) {
                                result.add(numbers.next() +"살");
                        }
                        return result.iterator();
                });
                System.out.println(rdd2.collect());
        }
```

TaskSchedulerImpl: Adding task set 0.0 with 4 tasks

[1살, 2살, 3살, 4살, 5살, 6살, 7살, 8살, 9살, 10살]

6) mapValues 연산자 : value값을 변형시킬 수 있는 연산자

```
package org.jbm.spark_0626;
import java.util.Arrays;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaPairRDD;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
import scala.Tuple2;
public class RDDAPI8 mapValues {
       private static JavaSparkContext sc;
       static {
               SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
               sc = new JavaSparkContext(conf);
       }
       public static void main(String[] args) {
               JavaRDD<String> rdd1 = sc.parallelize(Arrays.asList("a", "b", "c"));
               //mapToPair는 하나의 RDD를 PairRDD로 변환시켜주는 연산자
               JavaPairRDD<String, Integer> rdd2 =
                               rdd1.mapToPair((String t) -> new Tuple2<String, Integer>(t, 1));
               System.out.println(rdd2.collect());
               //mapValues는 값을 변환시켜주는 연산자
               rdd2 = rdd2.mapValues((Integer v1) -> v1 + 1);
               System.out.println(rdd2.collect());
       }
```

```
[(a,1), (b,1), (c,1)]
[(a,2), (b,2), (c,2)]
```

7) flatMapValues 연산자 : flatMap과 흡사함(value값에 대해서)

```
package org.jbm.spark 0626;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaPairRDD;
import org.apache.spark.api.java.JavaSparkContext;
import scala.Tuple2;
public class RDDAPI9_flatMapValues {
        private static JavaSparkContext sc;
        static {
                SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
        }
        public static void main(String[] args) {
                List<Tuple2<Integer, String>> data =
                                Arrays.asList(
                                                 new Tuple2<Integer, String>(1, "a,b"),
                                                 new Tuple2<Integer, String>(2, "a,c"),
                                                 new Tuple2<Integer, String>(1, "d,e")
                                                 );
                JavaPairRDD<Integer, String> rdd1 = sc.parallelizePairs(data);
                System.out.println(rdd1.collect());
                JavaPairRDD<Integer, String> rdd2 =
                                rdd1.flatMapValues((String v1) -> Arrays.asList(v1.split(",")));
                System.out.println(rdd2.collect());
        }
```

```
[(1,a,b), (2,a,c), (1,d,e)]
```

```
[(1,a), (1,b), (2,a), (2,c), (1,d), (1,e)]
```

8) zip 연산자 : 두개의 RDD를 PairRDD로 합침

```
package org.jbm.spark 0626;
import java.util.Arrays;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaPairRDD;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
public class RDDAPI10 zip {
        private static JavaSparkContext sc;
        static {
                SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
        }
        public static void main(String[] args) {
                JavaRDD<String> rdd1 = sc.parallelize(Arrays.asList("a", "b", "c"));
                JavaRDD<Integer> rdd2 = sc.parallelize(Arrays.asList(1, 2, 3));
                JavaPairRDD<String, Integer> result = rdd1.zip(rdd2);
                System.out.println(result.collect());
        }
```

- 결과

```
[(a,1), (b,2), (c,3)]
```

9) 그 외의 연산자들 : 예제에서 하나씩 실행해서 공부함

```
package org.jbm.spark 0626;
import java.util.ArrayList;
import java.util.Arrays;
import java.util.List;
import java.util.Map;
import java.util.Random;
import java.util.stream.Collectors;
import org.apache.spark.HashPartitioner;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaDoubleRDD;
import org.apache.spark.api.java.JavaPairRDD;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.api.java.Optional;
import org.apache.spark.storage.StorageLevel;
import org.apache.spark.streaming.util.BatchedWriteAheadLog.Record;
import scala.Tuple2;
public class RDDAPI12 ETC {
        private static JavaSparkContext sc;
        static {
                SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
        }
        public static void main(String[] args) {
                                 doMapValues(sc);
                                 doFlatMapValues(sc);
                                 doGroupBy(sc);
                                 doGroupByKey(sc);
                                 doCogroup(sc);
                                 doDistinct(sc);
                                 doCartesian(sc);
                                 doSubtract(sc);
                                 doUnion(sc);
                                 doIntersection(sc);
                                 doJoin(sc);
                                 doLeftOuterJoin(sc);
                                 doSubtractByKey(sc);
                                 doFoldByKey(sc);
                                 doPipe(sc);
                                 doCoalesceAndRepartition(sc);
```

```
doRepartitionAndSortWithinPartitions(sc);
                                 doPartitionBy(sc);
                                 doSortByKey(sc);
                                 doKeysAndValues(sc);
                                 doSample(sc);
                                 doFirst(sc);
                                 doTake(sc);
                                 doTakeSample(sc);
                                 doCountByValue(sc);
                                 doFold(sc);
                                 doSum(sc);
                                 doForeach(sc);
                                 doForeachPartition(sc);
                                 doDebugString(sc);
                                 doCache(sc);
                                 doGetPartitions(sc);
       }
       public static void doMapValues(JavaSparkContext sc) {
                JavaRDD<String> rdd1 = sc.parallelize(Arrays.asList("a", "b", "c"));
                JavaPairRDD<String, Integer> rdd4 =
                                rdd1.mapToPair((String t)
                                                                     new
                                                                           Tuple2<String,
                                                                                             Integer>(t,
                                                              ->
1)).mapValues((Integer v1) -> v1 + 1);
               System.out.println(rdd4.collect());
       }
       public static void doFlatMapValues(JavaSparkContext sc) {
                List<Tuple2<Integer, String>> data =
                                Arrays.asList(
                                                new Tuple2<Integer, String>(1, "a,b"),
                                                new Tuple2<Integer, String>(2, "a,c"),
                                                new Tuple2<Integer, String>(1, "d,e"));
                JavaPairRDD<Integer, String> rdd1 = sc.parallelizePairs(data);
                JavaPairRDD<Integer,
                                       String>
                                                   rdd3
                                                                 rdd1.flatMapValues((String
                                                                                               v1)
                                                                                                      ->
Arrays.asList(v1.split(",")));
               System.out.println(rdd3.collect());
       }
       public static void doGroupBy(JavaSparkContext sc) {
                JavaRDD<Integer> rdd1 = sc.parallelize(Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10));
```

```
JavaPairRDD<String, Iterable<Integer>> rdd3 = rdd1.groupBy((Integer v1) -> (v1 % 2 == 0)
? "even" : "odd");
                System.out.println(rdd3.collect());
       }
       public static void doGroupByKey(JavaSparkContext sc) {
                List<Tuple2<String, Integer>> data = Arrays.asList(
                                new Tuple2<String, Integer>("a", 1),
                                new Tuple2<String, Integer>("b", 2),
                                new Tuple2<String, Integer>("c", 3),
                                new Tuple2<String, Integer>("b", 4),
                                new Tuple2<String, Integer>("c", 5));
                JavaPairRDD<String, Integer> rdd1 = sc.parallelizePairs(data);
                JavaPairRDD<String, Iterable<Integer>> rdd2 = rdd1.groupByKey();
               System.out.println(rdd2.collect());
       }
       public static void doCogroup(JavaSparkContext sc) {
                List<Tuple2<String, String>> data1 = Arrays.asList(
                                new Tuple2<String, String>("k1", "v1"),
                                new Tuple2<String, String>("k2", "v2"),
                                new Tuple2<String, String>("k1", "v3")
                                );
               List<Tuple2<String, String>> data2 = Arrays.asList(new Tuple2<String, String>("k1",
"v4"));
                JavaPairRDD<String, String> rdd1 = sc.parallelizePairs(data1);
                JavaPairRDD<String, String> rdd2 = sc.parallelizePairs(data2);
                JavaPairRDD<String,
                                        Tuple2<Iterable<String>,
                                                                     Iterable<String>>>
                                                                                             result
rdd1.<String>cogroup(rdd2);
                System.out.println(result.collect());
       }
       public static void doDistinct(JavaSparkContext sc) {
                JavaRDD<Integer> rdd = sc.parallelize(Arrays.asList(1, 2, 3, 1, 2, 3, 1, 2, 3));
                JavaRDD<Integer> result = rdd.distinct();
                System.out.println(result.collect());
       }
       public static void doCartesian(JavaSparkContext sc) {
```

```
JavaRDD<Integer> rdd1 = sc.parallelize(Arrays.asList(1, 2, 3));
                JavaRDD<String> rdd2 = sc.parallelize(Arrays.asList("a", "b", "c"));
                JavaPairRDD<Integer, String> result = rdd1.cartesian(rdd2);
                System.out.println(result.collect());
        }
        public static void doSubtract(JavaSparkContext sc) {
                JavaRDD<String> rdd1 = sc.parallelize(Arrays.asList("a", "b", "c", "d", "e"));
                JavaRDD<String> rdd2 = sc.parallelize(Arrays.asList("d", "e"));
                JavaRDD<String> result = rdd1.subtract(rdd2);
                System.out.println(result.collect());
        }
        public static void doUnion(JavaSparkContext sc) {
                JavaRDD<String> rdd1 = sc.parallelize(Arrays.asList("a", "b", "c"));
                JavaRDD<String> rdd2 = sc.parallelize(Arrays.asList("d", "e", "f"));
                JavaRDD<String> result = rdd1.union(rdd2);
                System.out.println(result.collect());
        }
        public static void doIntersection(JavaSparkContext sc) {
                JavaRDD<String> rdd1 = sc.parallelize(Arrays.asList("a", "a", "b", "c"));
                JavaRDD<String> rdd2 = sc.parallelize(Arrays.asList("a", "a", "c", "c"));
                JavaRDD<String> result = rdd1.intersection(rdd2);
                System.out.println(result.collect());
        }
        public static void doJoin(JavaSparkContext sc) {
                List<Tuple2<String, Integer>> data1 = Arrays.asList(new Tuple2("a", 1), new Tuple2("b",
1), new Tuple2("c", 1),
                                new Tuple2("d", 1), new Tuple2("e", 1));
                List<Tuple2<String, Integer>> data2 = Arrays.asList(new Tuple2("b", 2), new Tuple2("c",
2));
                JavaPairRDD<String, Integer> rdd1 = sc.parallelizePairs(data1);
                JavaPairRDD<String, Integer> rdd2 = sc.parallelizePairs(data2);
                JavaPairRDD<String, Tuple2<Integer, Integer>> result = rdd1.<Integer>join(rdd2);
                System.out.println(result.collect());
        }
        public static void doLeftOuterJoin(JavaSparkContext sc) {
                List<Tuple2<String, Integer>> data1 = Arrays.asList(new Tuple2("a", 1), new Tuple2("b",
"1"),
                                new Tuple2("c", "1"));
                List<Tuple2<String, Integer>> data2 = Arrays.asList(new Tuple2("b", 2), new Tuple2("c",
"2"));
                JavaPairRDD<String, Integer> rdd1 = sc.parallelizePairs(data1);
```

```
JavaPairRDD<String, Integer> rdd2 = sc.parallelizePairs(data2);
                JavaPairRDD<String,
                                          Tuple2<Integer,
                                                                Optional<Integer>>>
                                                                                          result1
rdd1.<Integer>leftOuterJoin(rdd2);
                JavaPairRDD<String,</pre>
                                          Tuple2<Optional<Integer>,
                                                                          Integer>>
                                                                                          result2
rdd1.<Integer>rightOuterJoin(rdd2);
                System.out.println("Left: " + result1.collect());
                System.out.println("Right: " + result2.collect());
        }
        public static void doSubtractByKey(JavaSparkContext sc) {
                List<Tuple2<String, Integer>> data1 = Arrays.asList(new Tuple2("a", 1), new Tuple2("b",
1));
                List<Tuple2<String, Integer>> data2 = Arrays.asList(new Tuple2("b", 2));
                JavaPairRDD<String, Integer> rdd1 = sc.parallelizePairs(data1);
                JavaPairRDD<String, Integer> rdd2 = sc.parallelizePairs(data2);
                JavaPairRDD<String, Integer> result = rdd1.subtractByKey(rdd2);
                System.out.println(result.collect());
        }
        public static void doFoldByKey(JavaSparkContext sc) {
                List<Tuple2<String, Integer>> data = Arrays.asList(new Tuple2("a", 1), new Tuple2("b",
1), new Tuple2("b", 1));
                JavaPairRDD<String, Integer> rdd = sc.parallelizePairs(data);
                JavaPairRDD<String, Integer> result2 = rdd.foldByKey(0, (Integer v1, Integer v2) -> v1 +
v2);
                System.out.println(result2.collect());
        }
        public static void doPipe(JavaSparkContext sc) {
                JavaRDD<String> rdd = sc.parallelize(Arrays.asList("1,2,3", "4,5,6", "7,8,9"));
                JavaRDD<String> result = rdd.pipe("cut -f 1,3 -d ,");
                System.out.println(result.collect());
        }
        public static void doCoalesceAndRepartition(JavaSparkContext sc) {
                JavaRDD < Integer > rdd1 = sc.parallelize(Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 0), 10);
                JavaRDD<Integer> rdd2 = rdd1.coalesce(5);
                JavaRDD<Integer> rdd3 = rdd2.coalesce(10);
                System.out.println("partition size:" + rdd1.getNumPartitions());
                System.out.println("partition size:" + rdd2.getNumPartitions());
                System.out.println("partition size:" + rdd3.getNumPartitions());
        }
```

```
public static List<Integer> fillToNRandom(int n) {
               ArrayList<Integer> rst = new ArrayList<>();
               Random random = new Random();
               return random.ints(n, 0, 100).boxed().collect(Collectors.toList());
       }
       public static void doRepartitionAndSortWithinPartitions(JavaSparkContext sc) {
               List<Integer> data = fillToNRandom(10);
               JavaPairRDD<Integer, String> rdd1 = sc.parallelize(data).mapToPair((Integer v) -> new
Tuple2(v, "-"));
               JavaPairRDD<Integer, String> rdd2 = rdd1.repartitionAndSortWithinPartitions(new
HashPartitioner(3));
               rdd2.count();
               rdd2.foreachPartition( it ->{
                               System.out.println("======");
                               while (it.hasNext()) {
                                       System.out.println(it.next());
                               }
               });
       }
       public static void doPartitionBy(JavaSparkContext sc) {
               List<Tuple2<String, Integer>> data = Arrays.asList(new Tuple2("apple", 1),
Tuple2("mouse", 1),new Tuple2("monitor", 1));
               JavaPairRDD<String, Integer> rdd1 = sc.parallelizePairs(data, 5);
               JavaPairRDD<String, Integer> rdd2 = rdd1.partitionBy(new HashPartitioner(3));
               System.out.println("rdd1:"
                                           + rdd1.getNumPartitions()
                                                                                    ", rdd2:"
rdd2.getNumPartitions());
       }
       public static void doSortByKey(JavaSparkContext sc) {
               List<Tuple2<String, Integer>> data = Arrays.asList(new Tuple2("q", 1), new Tuple2("z",
1), new Tuple2("a", 1));
               JavaPairRDD<String, Integer> rdd = sc.parallelizePairs(data);
               JavaPairRDD<String, Integer> result = rdd.sortByKey();
               System.out.println(result.collect());
       }
       public static void doKeysAndValues(JavaSparkContext sc) {
               List<Tuple2<String, String>> data = Arrays.asList(new Tuple2("k1", "v1"),
Tuple2("k2", "v2"), new Tuple2("k3", "v3"));
               JavaPairRDD<String, String> rdd = sc.parallelizePairs(data);
               System.out.println(rdd.keys().collect());
               System.out.println(rdd.values().collect());
       }
       public static ArrayList<Integer> fillToN(int n) {
```

```
ArrayList<Integer> rst = new ArrayList<>();
        for (int i = 0; i < n; i++)
                rst.add(i);
        return rst:
}
public static void doSample(JavaSparkContext sc) {
        List<Integer> data = fillToN(100);
        JavaRDD<Integer> rdd = sc.parallelize(data);
        JavaRDD<Integer> result1 = rdd.sample(false, 0.5);
        JavaRDD<Integer> result2 = rdd.sample(true, 1.5);
        System.out.println(result1.take(5));
        System.out.println(result2.take(5));
}
public static void doFirst(JavaSparkContext sc) {
        List<Integer> data = Arrays.asList(5, 4, 1);
        JavaRDD<Integer> rdd = sc.parallelize(data);
        int result = rdd.first();
        System.out.println(result);
}
public static void doTake(JavaSparkContext sc) {
        List<Integer> data = fillToN(100);
        JavaRDD<Integer> rdd = sc.parallelize(data);
        List<Integer> result = rdd.take(5);
        System.out.println(result);
}
public static void doTakeSample(JavaSparkContext sc) {
        List<Integer> data = fillToN(100);
        JavaRDD<Integer> rdd = sc.parallelize(data);
        List<Integer> result = rdd.takeSample(false, 4);
        result.forEach(x->System.out.println(x));
}
public static void doCountByValue(JavaSparkContext sc) {
        JavaRDD<Integer> rdd = sc.parallelize(Arrays.asList(1, 1, 2, 3, 3));
        Map<Integer, Long> result = rdd.countByValue();
        System.out.println(result);
}
public static void doFold(JavaSparkContext sc) {
        List<Integer> data = Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10);
        JavaRDD<Integer> rdd = sc.parallelize(data, 3);
        int result2 = rdd.fold(0, (Integer v1, Integer v2) -> v1 + v2);
        System.out.println(result2);
```

```
}
public static void doSum(JavaSparkContext sc) {
        List<Double> data = Arrays.asList(1d, 2d, 3d, 4d, 5d, 6d, 7d, 8d, 9d, 10d);
        JavaDoubleRDD rdd = sc.parallelizeDoubles(data);
        double result = rdd.sum();
        System.out.println(result);
}
public static void doForeach(JavaSparkContext sc) {
        List<Integer> data = Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10);
        JavaRDD<Integer> rdd = sc.parallelize(data);
        rdd.foreach((Integer t) -> System.out.println("Value Side Effect: " + t));
}
public static void doForeachPartition(JavaSparkContext sc) {
        List<Integer> data = Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10);
        JavaRDD<Integer> rdd = sc.parallelize(data, 3);
        rdd.foreachPartition(it -> {
                System.out.println("Partition Side Effect!!");
                it.forEachRemaining(v -> System.out.println("Value Side Effect:" + v));
        });
}
public static void doDebugString(JavaSparkContext sc) {
        JavaRDD<Integer> rdd1 = sc.parallelize(fillToN(100), 10);
        JavaRDD<Integer> rdd2 = rdd1.map((Integer v1) -> v1 * 2);
        JavaRDD<Integer> rdd3 = rdd2.map((Integer v1) -> v1 * 2);
        JavaRDD<Integer> rdd4 = rdd3.coalesce(2);
        System.out.println(rdd4.toDebugString());
}
public static void doCache(JavaSparkContext sc) {
        JavaRDD<Integer> rdd = sc.parallelize(fillToN(100), 10);
        rdd.cache();
        rdd.persist(StorageLevel.MEMORY_ONLY());
}
public static void doGetPartitions(JavaSparkContext sc) {
        JavaRDD<Integer> rdd = sc.parallelize(fillToN(1000), 10);
        System.out.println(rdd.partitions().size());
        System.out.println(rdd.getNumPartitions());
}
```

■ 행동(Action) 메서드

1) count() : 갯수를 세는 메서드

```
package org.jbm.spark 0626;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
public class RDDAPI2 count {
        private static JavaSparkContext sc;
        static {
                SparkConf conf = new SparkConf().setAppName("RDDAPIEx").setMaster("local");
                sc = new JavaSparkContext(conf);
        }
        public static void main(String[] args) {
                JavaRDD<Integer> rdd = sc.parallelize(Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10));
                System.out.println("행의 갯수: "+rdd.count());
        }
}
```

행의 갯수 : 10

2) collect() : 자바의 리스트로 변환해주는 메서드

```
package org.jbm.spark_0626;

import java.util.Arrays;
import java.util.List;

import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
```

[1, 2, 3, 4, 5, 6, 7, 8, 9, 10]

3) reduce 연산자 : 결과를 줄이는(맵리듀스의 리듀스와 같음) 연산

```
public static void main(String[] args) {
        executeReduce();
        executeReduceByKey();
}
private static void executeReduce() {
        List<Integer> data = Arrays.asList(1, 2, 3, 4, 5, 6, 7, 8, 9, 10);
        JavaRDD<Integer> rdd = sc.parallelize(data, 3);
        int result = rdd.reduce((Integer v1, Integer v2) -> v1 + v2);
        System.out.println(result);
}
private static void executeReduceByKey() {
        List<Tuple2<String, Integer>> data = Arrays.asList(
                        new Tuple2<String, Integer>("a", 0),
                        new Tuple2<String, Integer>("a", 1),
                        new Tuple2<String, Integer>("b", 1),
                        new Tuple2<String, Integer>("b", 2),
                        new Tuple2<String, Integer>("b", 3),
                        new Tuple2<String, Integer>("b", 4)
                        );
        JavaPairRDD<String, Integer> rdd = sc.parallelizePairs(data);
        JavaPairRDD<String, Integer> result2 = rdd.reduceByKey((Integer v1, Integer v2) ->
        {
                System.out.println("v1:"+v1);
                System.out.println("v2:"+v2);
                return v1 + v2;
        }
        );
        System.out.println(result2.collect());
}
```

■ WordCount 비교

1) MyWordCount 직접 구현

```
package org.jbm.spark_0626;
import java.io.FileInputStream;
import java.io.PrintWriter;
import java.util.ArrayList;
import java.util.HashMap;
import java.util.List;
import java.util.Map;
import java.util.Set;
public class MyWordCount {
       public static void main(String[] args) throws Exception {
                long start = System.currentTimeMillis();
                FileInputStream fis = new FileInputStream("src/assets/test.txt");
               List<String> sList = new ArrayList<>();
               List<Integer> tmp = new ArrayList<>();
               Map<String, Object> result = new HashMap<>();
               int data = 0;
               int oldData = 0;
               while ((data = (byte)fis.read()) != -1) {
                        if (data != 32 && data != 13 && data !=10) {
                                tmp.add(data);
                       }else {
                                if((oldData!=32 && oldData!=13 && oldData!=10) && (data==32 ||
data==13)) {
                                        Integer[] b = tmp.toArray(new Integer[tmp.size()]);
                                        byte[] bb = new byte[b.length];
                                        for (int i = 0; i < b.length; i++) {
                                                bb[i]=(byte)(int)b[i];
```

```
String s = new String(bb, "UTF-8");
                        sList.add(s);
                        Integer size = (Integer)result.get(s);
                        if(size!=null) {
                                result.put(s,size+1);
                        }else {
                                result.put(s, 1);
                        }
                        tmp.clear();
                }
        }//else
        oldData = data;
} // while end
fis.close();
Integer[] b = tmp.toArray(new Integer[tmp.size()]);
byte[] bb = new byte[b.length];
for (int i = 0; i < b.length; i++) {
        bb[i]=(byte)(int)b[i];
}
String s = new String(bb, "UTF-8");
sList.add(s);
Integer size = (Integer)result.get(s);
if(size!=null) {
        result.put(s,size+1);
}else {
        result.put(s, 1);
}
PrintWriter out = new PrintWriter("src/assets/result.txt");
Set<String> keys = result.keySet();
```

time:27922

2) RDD로 구현

```
package org.jbm.spark_0626;
import org.apache.spark.SparkConf;
import org.apache.spark.api.java.JavaPairRDD;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;

import scala.Tuple2;
import java.util.Arrays;

public class WordCountRDD {

    public static void main(String[] args) throws Exception {

        SparkConf conf = new SparkConf().setAppName("WordCount").setMaster("local");

        // 1) SparkContext 생성
        JavaSparkContext sc = new JavaSparkContext(conf);

        Thread.sleep(2000);

        try {
```

```
long start = System.currentTimeMillis();
                       // 2) 입력 소스로부터 RDD 생성
                       JavaRDD<String> inputRDD = sc.textFile("src/assets/test.txt");
                       // 3) 한칸 띄우는 문자들로 나눠서 RDD 생성
                       JavaRDD<String> words = inputRDD.flatMap((String s) -> Arrays.asList(s.split("
")).iterator());
                       // 4) RDD를 PairRDD로
                       JavaPairRDD<String,</pre>
                                                                        words.mapToPair(w
                                              Integer>
                                                         wcPair
                                                                                                   new
Tuple2<String,Integer>(w, 1));
                       JavaPairRDD<String, Integer> result = wcPair.reduceByKey((Integer c1, Integer
c2) \rightarrow c1 + c2);
                       result.saveAsTextFile("src/result");
                       long end = System.currentTimeMillis();
                       System.out.println("time:"+(end-start));
               } catch (Exception e) {
                       e.printStackTrace();
               } finally {
                       // Step5: Spark와의 연결 종료
                       sc.stop();
               }
       }
```

time:3027

- DataSet(DataFrame도 포함)
- RDD는 분산환경에서 메로리 기반으로 빠르고 안정적으로 동작
- RDD는 풍부한 데이터 처리 연산을 제공
- 하지만 데이터에 대한 메타데이터, '스키마'는 표현 못함
- 스파크 SQL은 RDD의 한계를 극복
- 스파크 SQL에는 1.SQL, 2. 데이터셋(DataSet) API가 있음
- 스파크 2.0부터 데이터 프레임 클래스가 데이터셋 클래스로 통합되면서 자바에서는 데이터셋 클래스만 사용

vo 생성: Person.java

```
package vo;
import java.io.Serializable;
public class Person implements Serializable {
  private int no;
  private String name;
  private int age;
  private String job;
  public Person() {
  }
  public Person( int no, String name, int age, String job) {
        this.no= no;
    this.name = name;
    this.age = age;
    this.job = job;
  public int getNo() {
          return no;
  public void setNo(int no) {
          this.no = no;
  }
  public String getName() {
    return name;
  }
  public void setName(String name) {
```

```
this.name = name;
}

public int getAge() {
   return age;
}

public void setAge(int age) {
   this.age = age;
}

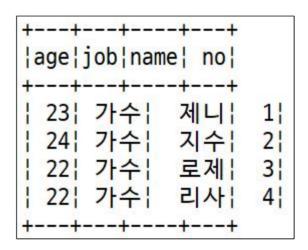
public String getJob() {
   return job;
}

public void setJob(String job) {
   this.job = job;
}
```

1) DataFrame 생성

```
package org.jbm.spark_0626;
import java.util.*;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.Dataset;
import org.apache.spark.sql.Row;
import org.apache.spark.sql.SparkSession;
import vo.Person;
public class DatasetAPI_dataframe {
        private static SparkSession spark;
        private static JavaSparkContext sc;
        public static void main(String[] args) {
                spark = SparkSession
                                .builder()
                                .appName("DataFrameSample")
                                .master("local[*]")
                                .getOrCreate();
```

```
sc = new JavaSparkContext(spark.sparkContext());
       createDataframe();
        spark.stop();
}
public static void createDataframe() {
        Person row1 = new Person(1, "제니", 23, "가수");
        Person row2 = new Person(2, "지수", 24, "가수");
        Person row3 = new Person(3, "로제", 22, "가수");
        Person row4 = new Person(4, "리사", 22, "가수");
        //1. 로컬 컬렉션으로부터 데이터프레임 생성
        List<Person> data = Arrays.asList(row1, row2, row3, row4);
        Dataset<Row> df1 = spark.createDataFrame(data, Person.class);
        //2. RDD를 이용해 데이터프레임 생성
        JavaRDD<Person> rdd = sc.parallelize(data);
        Dataset<Row> df2 = spark.createDataFrame(rdd, Person.class);
        df1.show();
        df2.show();
}
```



2) DataSet 생성

- 자바 객체를 이용해 생성

```
package org.jbm.spark_0626;
```

```
import java.util.Arrays;
import java.util.List;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.*;
import vo.Person;
public class DatasetAPI1_createDataSet{
       private static SparkSession spark;
       private static JavaSparkContext sc;
       public static void main(String[] args) {
               // TODO Auto-generated method stub
               spark = SparkSession
                               .builder()
                               .appName("DatasetSample")
                               .master("local[*]")
                               .getOrCreate();
               sc = new JavaSparkContext(spark.sparkContext());
                createDataSet();
                spark.stop();
        public static void createDataSet() {
                Person row1 = new Person(1, "제니", 23, "가수");
                Person row2 = new Person(2, "지수", 24, "가수");
                Person row3 = new Person(3, "로제", 22, "가수");
                Person row4 = new Person(4, "리사", 22, "가수");
                //자바 객체를 이용해 생성
                List<Person> data = Arrays.asList(row1, row2, row3, row4);
                Dataset<Person> ds= spark.createDataset(data, Encoders.bean(Person.class));
                //결과 확인
                ds.show();
        }
}
```

```
+---+--+---+

| age|job|name| no|

+---+---+

| 23| 가수| 제니| 1|

| 24| 가수| 지수| 2|

| 22| 가수| 로제| 3|

| 22| 가수| 리사| 4|

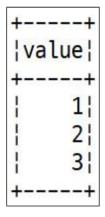
+---+---+
```

- RDD를 이용해 생성

```
package org.jbm.spark_0626;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.*;
import vo.Person;
public class DatasetAPI2_createDataSet {
        private static SparkSession spark;
        private static JavaSparkContext sc;
        public static void main(String[] args) {
                // TODO Auto-generated method stub
                spark = SparkSession
                                .builder()
                                .appName("DatasetSample")
                                .master("local[*]")
                                .getOrCreate();
                sc = new JavaSparkContext(spark.sparkContext());
                 createDataSet();
                 spark.stop();
        }
         public static void createDataSet() {
                 //RDD를 이용해 생성
                 JavaRDD<Integer> javaRDD = sc.parallelize(Arrays.asList(1,2,3));
```

```
Dataset<Integer> ds = spark.createDataset(javaRDD.rdd(), Encoders.INT());

ds.show();
}
```



- 데이터 프레임을 이용해 생성

```
package org.jbm.spark_0626;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.*;
import vo.Person;
public class DatasetAPI2_createDataSet {
        private static SparkSession spark;
        private static JavaSparkContext sc;
        public static void main(String[] args) {
                spark = SparkSession
                                .builder()
                                .appName("DatasetSample")
                                .master("local[*]")
                                .getOrCreate();
                sc = new JavaSparkContext(spark.sparkContext());
```

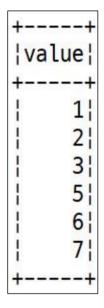
```
createDataSet();

spark.stop();
}

public static void createDataSet() {

//RDD를 이용해 생성
    JavaRDD<Integer> javaRDD = sc.parallelize(Arrays.asList(1,2,3,4,5,6,7));
    Dataset<Integer> ds = spark.createDataset(javaRDD.rdd(), Encoders.INT());

ds.show();
}
}
```

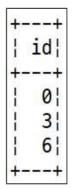


3) Range : 범위에 포함되는 모든 숫자 리스트 생성

```
package org.jbm.spark_0626;

import java.util.Arrays;
import java.util.List;
import org.apache.spark.api.java.JavaRDD;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.*;
import org.apache.spark.sql.types.DataTypes;
import org.apache.spark.sql.types.StructField;
import org.apache.spark.sql.types.StructType;
public class DatasetAPI4_createDataSet {
    private static SparkSession spark;
    private static JavaSparkContext sc;
```

```
public static void main(String[] args) {
       // TODO Auto-generated method stub
       spark = SparkSession
                        .builder()
                        .appName("DatasetSample")
                        .master("local[*]")
                        .getOrCreate();
       sc = new JavaSparkContext(spark.sparkContext());
         createDataSet();
         spark.stop();
public static void createDataSet() {
       // range()로 생성
         Dataset<Long> ds = spark.range(0, 7, 3);
         //결과 확인
         ds.show();
}
```



4) Select

```
package org.jbm.spark_0626;

import java.util.Arrays;
import java.util.List;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.Dataset;
import org.apache.spark.sql.Encoders;
import org.apache.spark.sql.Encoders;
import org.apache.spark.sql.SparkSession;
```

```
import org.apache.spark.sql.TypedColumn;
import vo.Person;
public class DatasetAPI_select {
       private static SparkSession spark;
       private static JavaSparkContext sc;
       private static Dataset<Person> ds;
       public static void main(String[] args) {
               spark = SparkSession
                               .builder()
                               .appName("DatasetSample")
                               .master("local[*]")
                               .config("spark.driver.host","192.168.0.112")
                               .getOrCreate();
               sc = new JavaSparkContext(spark.sparkContext());
                Person row1 = new Person(1, "제니", 23, "모델");
                Person row2 = new Person(2, "뷔", 24, "댄서");
                Person row3 = new Person(3, "지수", 24, "학생");
                Person row4 = new Person(4, "정국", 22, "가수");
                List<Person> data = Arrays.asList(row1, row2, row3, row4);
                ds = spark.createDataset(data, Encoders.bean(Person.class));
                runSelectEx();
                spark.stop();
       }
        public static void runSelectEx() {
               //출력하고 싶은 컬럼만 지정해서 출력
                TypedColumn<Object, String> c1 = ds.col("name").as(Encoders.STRING());
                TypedColumn<Object, Integer> c2 = ds.col("age").as(Encoders.INT());
                ds.select(c1, c2).show();
        }
}
```

```
+---+

| name | age |

+---+

| 제니 | 23 |

| 뷔 24 |

| 지수 | 24 |

| 정국 | 22 |

+----+
```

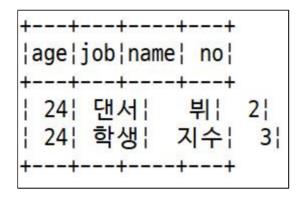
5) Where

```
package org.jbm.spark_0626;
import java.util.Arrays;
import java.util.List;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.Dataset;
import org.apache.spark.sql.Encoders;
import org.apache.spark.sql.SparkSession;
import org.apache.spark.sql.TypedColumn;
import vo.Person;
public class DatasetAPI_select {
       private static SparkSession spark;
       private static JavaSparkContext sc;
       private static Dataset<Person> ds;
       public static void main(String[] args) {
                spark = SparkSession
                                .builder()
                                .appName("DatasetSample")
                                .master("local[*]")
                                .config("spark.driver.host","192.168.0.112")
                                .getOrCreate();
                sc = new JavaSparkContext(spark.sparkContext());
                Person row1 = new Person(1,"제니", 23, "모델");
                Person row2 = new Person(2,"뷔", 24, "댄서");
                 Person row3 = new Person(3,"지수", 24, "학생");
                 Person row4 = new Person(4,"정국", 22, "가수");
                 List<Person> data = Arrays.asList(row1, row2, row3, row4);
                 ds = spark.createDataset(data, Encoders.bean(Person.class));
                 runSelectEx();
```

```
spark.stop();

}

public static void runSelectEx() {
     ds.select("*").where(ds.col("age").equalTo(24)).show();
}
```



5) 외부에서 csv파일을 불러온 뒤 join

```
package org.jbm.spark_0626;
import org.apache.spark.api.java.JavaSparkContext;
import org.apache.spark.sql.Dataset;
import org.apache.spark.sql.Row;
import org.apache.spark.sql.SparkSession;
import org.apache.spark.sql.functions;
public class DatasetAPI_join {
        private static SparkSession spark;
        private static JavaSparkContext sc;
        private static Dataset<Row> films;
        private static Dataset<Row> filmRatings;
        public static void main(String[] args) {
                spark = SparkSession
                                .builder()
                                .appName("DatasetSample")
                                .master("local[*]")
                                .config("spark.driver.host","192.168.0.112")
                                .getOrCreate();
                sc = new JavaSparkContext(spark.sparkContext());
                 createDataSet();
                 runAsEx();
```

```
public static void createDataSet() {
    String dir = "file:/C:/jbm/data/movie/";
    //파일로 데이터셋 생성
    films = spark.read().csv(dir+"films.csv").as("films");
    filmRatings = spark.read().csv(dir+"film_ratings.csv").as("filmRatings");
    //데이터셋 확인
    films.show();
    filmRatings.show();

}

public static void runAsEx() {
    //join
    films.join(filmRatings,functions.expr("films._c0 = filmRatings._c1")).show();
}
```

결과

		LL
+++ _c0 _c1	_c0 _c1 _c2	_c0 _c1 _c0 _c1 _c2
++	++	 +
1 명량	1 1 1.5	1 명량 1 1 1.5
1 88 2 국제시장	1 2 1.5	2 국제시장 1 2 1.5
	1 3 3	3 배테랑 1 3 3
	1 4 4.5	4 아바타 1 4 4.5
4 아바타	1 5 3	5 도둑들 1 5 3
5 도둑들	1 6 2.5	6
6 7번방의 선물		
7 암살	1 7 2.5	7 암살 1 7 2.5
8 광해	1 8 2.5	8 광해 1 8 2.5
╎ 9╎ 택시운전사╎	1 9 2	9 택시운전사 1 9 2
╎ 10╎ │ 신과함께-죄와벌╎	1 10 1	10 신과함께-죄와벌 1 10 1
11 부산행 	1 11 2.5	11 부산행 1 11 2.5
12 변호인	1 12 2.5	12 변호인 1 12 2.5
13 해운대	1 13 1.5	13 - 해운대 1 13 1.5
	1 14 3	14 괴물 1 14 3
15 왕의남자	1 15 4	15 왕의남자 1 15 4
; 16¦어벤져스:에이지오브울트론¦	1 16 2	16 어벤져스:에이지오브울트론 1 16 2
17 인터스텔라	1 1 17 3	17 인터스텔라 1 17 3
17 - 년 - 교 - 교 - 교 - 교 - 교 - 교 - 교 - 교 - 교	1 18 3	18 겨울왕국 1 18 3
10 기골 8 19 검사외전	1 20 3.5	20 설국열차 1 20 3.5
13	1 21 2.5	21 관상 1 21 2.5
40 글쉬글시	1 1 21 2.5	1 21
++	[-	

▲ films

▲ filmRatings ▲ Join 결과

- WordCount를 DataSet으로 구현

```
package org.jbm.spark_0626;
import java.util.Arrays;
import org.apache.spark.sql.*;
import scala.Tuple2;
public class WordCountDataSet {
       public static void main(String[] args) throws Exception{
               SparkSession
SparkSession.builder().master("local").appName("WordCount").getOrCreate();
               Thread.sleep(2000);
                long start = System.currentTimeMillis();
               Dataset<String> ds = spark.read().text("src/assets/test.txt").as(Encoders.STRING());
            Dataset<String> wordDF2 = ds.flatMap((String v) -> Arrays.asList(v.split(" ")).iterator(),
```

time:3982