

PFLOCK Report

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January 10, 2020

Task analysis...

- ▶ Apache Spark divides the work into a number of Stages, each one is also divide into a number of Tasks.
- ▶ Each Task evaluates the data from a particular Partition and it is sent to an Executor for evaluation.
- ▶ Tracking the Tasks will give us a notion of the Partitions and Executors performance...

Task analysis...

- ▶ SparkListener class allows us to monitor Task metrics. We can capture info about:
 - ▶ executor: The id of the executor where the Task was evaluated.
 - ▶ duration: Execution time of the task.
 - ▶ recordsRead/Written: Total number of records read or written.
 - ▶ bytesRead/Written: Total number of bytes read or written.
 - ▶ shuffleRead/Written: Total number of records read or written from the shuffle by this task.

Task analysis...

- ▶ Running experiments with Epsilon=30, Mu=3 and Delta=3.
- ▶ Collecting Task metrics. Focus on Time-by-time implementation...

timestamp	executor	duration	recordsRead	bytesRead	recordsWritten	bytesWritten	shuffleRead	shuffleWritten	taskId	index	stageId	jobId	phase	phaseTime	timeInstant	appId
2020-01-08 12:27:04.377	10.10.1.7:0	378.99	0	0	0	0	14037	0	97742	10	173588	736	3.Flocks reported	392.73	19	0146
2020-01-08 12:19:36.086	10.10.1.9:9	237.699	0	0	0	0	12127	0	97689	9	66336	699	3.Flocks reported	248.25	18	0146
2020-01-08 13:42:55.240	10.10.1.10:5	235.786	0	0	0	0	10223	0	244083	9	448326	1809	3.Flocks reported	251.44	48	0146
2020-01-08 13:52:17.960	10.10.1.2:8	177.572	0	0	0	0	13210	0	254205	10	485888	1083	3.Flocks reported	195.21	50	0146
2020-01-08 13:47:35.776	10.10.1.1:2	171.391	0	0	0	0	8626	0	249124	4	466918	1846	3.Flocks reported	191.37	49	0146
2020-01-08 12:18:29.040	10.10.1.5:7	170.653	0	0	0	0	12360	0	97692	12	66336	699	3.Flocks reported	248.25	18	0146
2020-01-08 12:23:35.931	10.10.1.6:4	170.463	0	0	0	0	12582	0	97740	0	73588	736	3.Flocks reported	392.73	19	0146
2020-01-08 12:23:33.030	10.10.1.4:3	167.643	0	0	0	0	11782	0	97743	11	73588	736	3.Flocks reported	392.73	19	0146
2020-01-08 12:18:15.858	10.10.1.10:5	157.472	0	0	0	0	10643	0	97691	11	66336	699	3.Flocks reported	248.25	18	0146
2020-01-08 12:14:47.144	10.10.1.5:7	154.757	0	0	0	0	10398	0	87630	10	59462	662	3.Flocks reported	166.08	17	0146
2020-01-08 12:30:29.388	10.10.1.3:1	141.001	0	0	0	0	11811	0	102773	9	81218	773	3.Flocks reported	154.8	20	0146
2020-01-08 12:59:24.048	10.10.1.2:8	140.66	0	0	0	0	8457	0	158051	11	190896	1180	3.Flocks reported	152.02	31	0146
2020-01-08 13:51:33.706	10.10.1.7:0	133.318	0	0	0	0	12423	0	254203	8	485888	1083	3.Flocks reported	195.21	50	0146
2020-01-08 12:48:35.329	10.10.1.6:4	132.945	0	0	0	0	9607	0	138683	9	145212	1032	3.Flocks reported	149.56	27	0146
2020-01-08 12:30:29.628	10.10.1.2:8	131.642	0	0	0	0	10302	0	102775	11	81218	773	3.Flocks reported	154.8	20	0146
2020-01-08 12:30:16.284	10.10.1.5:7	127.817	0	0	0	0	9768	0	102774	10	81218	773	3.Flocks reported	154.8	20	0146
2020-01-08 12:30:07.998	10.10.1.7:0	126.585	0	0	0	0	9495	0	102771	7	81218	773	3.Flocks reported	154.8	20	0146
2020-01-08 13:46:49.124	10.10.1.5:7	124.738	0	0	0	0	10508	0	249129	9	466918	1846	3.Flocks reported	191.37	49	0146
2020-01-08 12:33:36.213	10.10.1.6:4	119.825	0	0	0	0	8159	0	107825	11	89226	810	3.Flocks reported	135.32	21	0146
2020-01-08 12:14:11.183	10.10.1.8:6	118.796	0	0	0	0	8959	0	87631	11	59462	662	3.Flocks reported	166.08	17	0146
2020-01-08 13:46:39.349	10.10.1.6:4	118.423	0	0	0	0	8351	0	249123	3	466918	1846	3.Flocks reported	191.37	49	0146
2020-01-08 13:46:51.948	10.10.1.6:4	112.496	0	0	0	0	9716	0	244082	9	448326	1809	3.Flocks reported	251.44	48	0146
2020-01-08 13:40:51.083	10.10.1.3:1	112.428	0	0	0	0	9081	0	244085	11	448326	1809	3.Flocks reported	251.44	48	0146
2020-01-08 13:46:33.482	10.10.1.10:5	109.014	0	0	0	0	12698	0	249130	10	466918	1846	3.Flocks reported	191.37	49	0146
2020-01-08 12:13:59.913	10.10.1.10:5	107.525	0	0	0	0	10710	0	87633	13	59462	662	3.Flocks reported	166.08	17	0146
2020-01-08 12:09:04.546	10.10.1.3:1	107.16	0	0	0	0	8475	0	77485	8	46848	588	3.Flocks reported	117.55	15	0146
2020-01-08 12:29:54.401	10.10.1.8:6	106.013	0	0	0	0	11466	0	102776	12	81218	773	3.Flocks reported	154.8	20	0146
2020-01-08 12:22:29.870	10.10.1.9:9	104.483	0	0	0	0	15153	0	97739	7	73588	736	3.Flocks reported	392.73	19	0146
2020-01-08 13:51:01.278	10.10.1.10:5	100.891	0	0	0	0	10685	0	254204	9	485888	1083	3.Flocks reported	195.21	50	0146
2020-01-08 12:22:25.645	10.10.1.3:1	100.258	0	0	0	0	10934	0	97741	9	73588	736	3.Flocks reported	392.73	19	0146

Figure: Top 30 longest tasks

Task analysis...

- ▶ Running experiments with Epsilon=30, Mu=3 and Delta=3.
- ▶ Collecting Task metrics. Focus on Time by time implementation...

timestamp	executor	duration	recordsRead	bytesRead	recordsWritten	bytesWritten	shuffleRead	shuffleWritten	taskId	index	stageId	jobId	phase	phaseTime	timeInstant	appId			
2020-01-08 12:27:04.377	10.10.1.7	0	0	0	0	0	0	0	14037	0	97742	10	173588	736	3	Flocks reported	192.73	19	0146
2020-01-08 12:19:36.086	10.10.1.9	9	0	0	0	0	0	0	12127	0	92689	9	66336	699	3	Flocks reported	248.25	18	0146
2020-01-08 13:42:55.240	10.10.1.10	5	0	0	0	0	0	0	10223	0	244083	9	448326	1809	3	Flocks reported	251.44	48	0146
2020-01-08 13:52:17.960	10.10.1.2	8	0	0	0	0	0	0	13210	0	254205	10	485888	1083	3	Flocks reported	195.21	50	0146
2020-01-08 13:47:35.776	10.10.1.1	2	0	0	0	0	0	0	8826	0	249124	4	466918	1846	3	Flocks reported	191.37	49	0146
2020-01-08 12:18:29.040	10.10.1.5	7	0	0	0	0	0	0	12360	0	92692	12	66336	699	3	Flocks reported	248.25	18	0146
2020-01-08 12:23:35.851	10.10.1.6	4	0	0	0	0	0	0	12582	0	97740	9	173588	736	3	Flocks reported	192.73	19	0146
2020-01-08 12:23:33.030	10.10.1.4	3	0	0	0	0	0	0	11792	0	97743	11	173588	736	3	Flocks reported	192.73	19	0146
2020-01-08 12:18:15.856	10.10.1.10	5	0	0	0	0	0	0	10643	0	92691	11	66336	699	3	Flocks reported	248.25	18	0146
2020-01-08 12:14:47.144	10.10.1.5	7	0	0	0	0	0	0	10398	0	87630	10	59462	662	3	Flocks reported	166.08	17	0146
2020-01-08 12:30:29.388	10.10.1.3	1	0	0	0	0	0	0	11811	0	102773	9	81218	773	3	Flocks reported	154.8	20	0146
2020-01-08 12:59:24.048	10.10.1.2	8	0	0	0	0	0	0	8457	0	150891	11	790096	1180	3	Flocks reported	152.02	31	0146
2020-01-08 13:51:33.706	10.10.1.7	0	0	0	0	0	0	0	12423	0	254203	8	485888	1083	3	Flocks reported	195.21	50	0146
2020-01-08 12:48:35.329	10.10.1.6	4	0	0	0	0	0	0	9087	0	138093	9	145212	1032	3	Flocks reported	149.56	27	0146
2020-01-08 12:30:29.028	10.10.1.2	8	0	0	0	0	0	0	10382	0	127775	11	81218	773	3	Flocks reported	154.8	20	0146
2020-01-08 12:30:16.284	10.10.1.5	7	0	0	0	0	0	0	9260	0	102774	10	81218	773	3	Flocks reported	154.8	20	0146
2020-01-08 12:30:07.998	10.10.1.7	0	0	0	0	0	0	0	9495	0	102771	7	81218	773	3	Flocks reported	154.8	20	0146
2020-01-08 13:46:49.124	10.10.1.5	7	0	0	0	0	0	0	10508	0	249129	9	466918	1846	3	Flocks reported	191.37	49	0146
2020-01-08 12:33:36.213	10.10.1.6	4	0	0	0	0	0	0	8159	0	107825	11	89226	810	3	Flocks reported	135.32	21	0146
2020-01-08 12:14:11.183	10.10.1.8	6	0	0	0	0	0	0	8959	0	87631	11	59462	662	3	Flocks reported	166.08	17	0146
2020-01-08 13:46:39.349	10.10.1.6	4	0	0	0	0	0	0	8351	0	249123	3	466918	1846	3	Flocks reported	191.37	49	0146
2020-01-08 13:46:51.948	10.10.1.6	4	0	0	0	0	0	0	8718	0	944082	9	448326	1809	3	Flocks reported	251.44	48	0146
2020-01-08 13:46:51.083	10.10.1.3	1	0	0	0	0	0	0	9981	0	244085	11	448326	1809	3	Flocks reported	251.44	48	0146
2020-01-08 13:46:33.402	10.10.1.10	5	0	0	0	0	0	0	12698	0	249130	10	466918	1846	3	Flocks reported	191.37	49	0146
2020-01-08 12:13:59.913	10.10.1.10	5	0	0	0	0	0	0	10710	0	87633	13	59462	662	3	Flocks reported	166.08	17	0146
2020-01-08 12:09:04.546	10.10.1.3	1	0	0	0	0	0	0	8475	0	77485	8	46848	588	3	Flocks reported	117.55	15	0146
2020-01-08 12:29:54.481	10.10.1.8	6	0	0	0	0	0	0	11466	0	102776	12	81218	773	3	Flocks reported	154.8	20	0146
2020-01-08 12:22:29.870	10.10.1.9	9	0	0	0	0	0	0	15153	0	97739	7	173588	736	3	Flocks reported	192.73	19	0146
2020-01-08 13:51:01.228	10.10.1.10	5	0	0	0	0	0	0	10865	0	1254204	9	485888	1083	3	Flocks reported	195.21	50	0146
2020-01-08 12:22:35.645	10.10.1.3	1	0	0	0	0	0	0	10954	0	97741	9	173588	736	3	Flocks reported	192.73	19	0146

Figure: Top 30 longest tasks

Stage analysis...

- ▶ SparkListener also provide info about each Stage. Some interesting metrics are:
 - ▶ numTasks: The number of tasks in which the Stage is divided.
 - ▶ name: The Spark function which invoke the Stage and its line of code.
 - ▶ details: The stack trace when the Stage was called.

phase	timeInstant	stageId	name	ntasks	duration	details
3. Flocks reported	173586	count	at FF.scala:19:15	262386		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	159462	count	at FF.scala:19:14	254895		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	166336	count	at FF.scala:19:16	247619		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	181218	count	at FF.scala:19:15	200018		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	189226	count	at FF.scala:19:15	124389		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	187162	count	at FF.scala:19:16	92191		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	152966	count	at FF.scala:19:14	89954		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	197612	count	at FF.scala:19:14	89192		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	186376	count	at FF.scala:19:14	88634		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	157746	count	at FF.scala:19:15	82889		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	115518	count	at FF.scala:19:14	78201		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	146848	count	at FF.scala:19:16	74317		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	125038	count	at FF.scala:19:15	72252		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	141168	count	at FF.scala:19:17	71473		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	115152	count	at FF.scala:19:13	55794		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	261156	count	at FF.scala:19:15	55926		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	219228	count	at FF.scala:19:17	59316		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	118878	count	at FF.scala:19:14	46877		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	114666	count	at FF.scala:19:15	43682		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)
3. Flocks reported	18796	count	at FF.scala:19:14	27812		FF\$anonfun\$run\$1.apply\$mcV\$sp(FF.scala:19:1) FF\$anonfun\$run\$1.apply(FF.scala:73) FF\$.run(FF.scala:73) FF\$.main(FF.scala:483) FF\$.main(FF.scala:483)

Figure: Top 20 longest stages

Stage analysis...

- ▶ FF.scala:191 makes a call to the redundant flocks pruning routine.
- ▶ Recently I modify this routine to be call during the join between time instants. I will double-check the code.
- ▶ Currently I have extracted some data for testing (time instant 19) and making some improvements.

What is next...

- ▶ Fixing the shuffling overhead during the pruning routine.
- ▶ Performing similar analysis for the Time-window implementation.