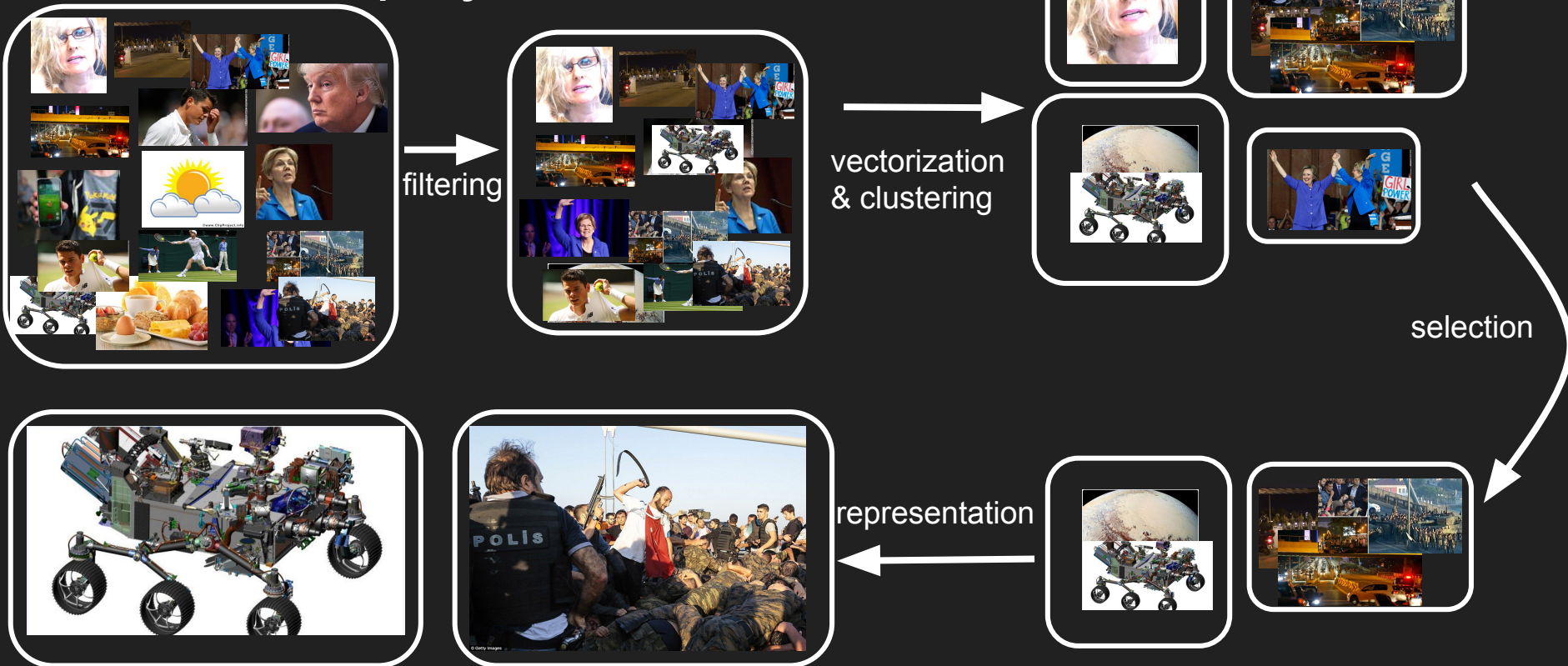


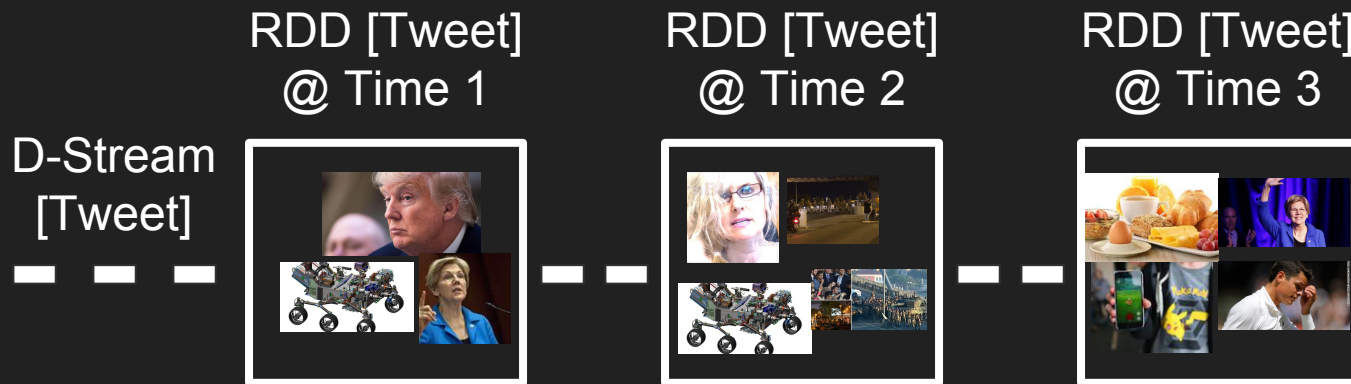
# Twitter News Feed

Final presentation

# Goal of the project



# Apache Spark Streaming



# Clustering: Streaming k-Means

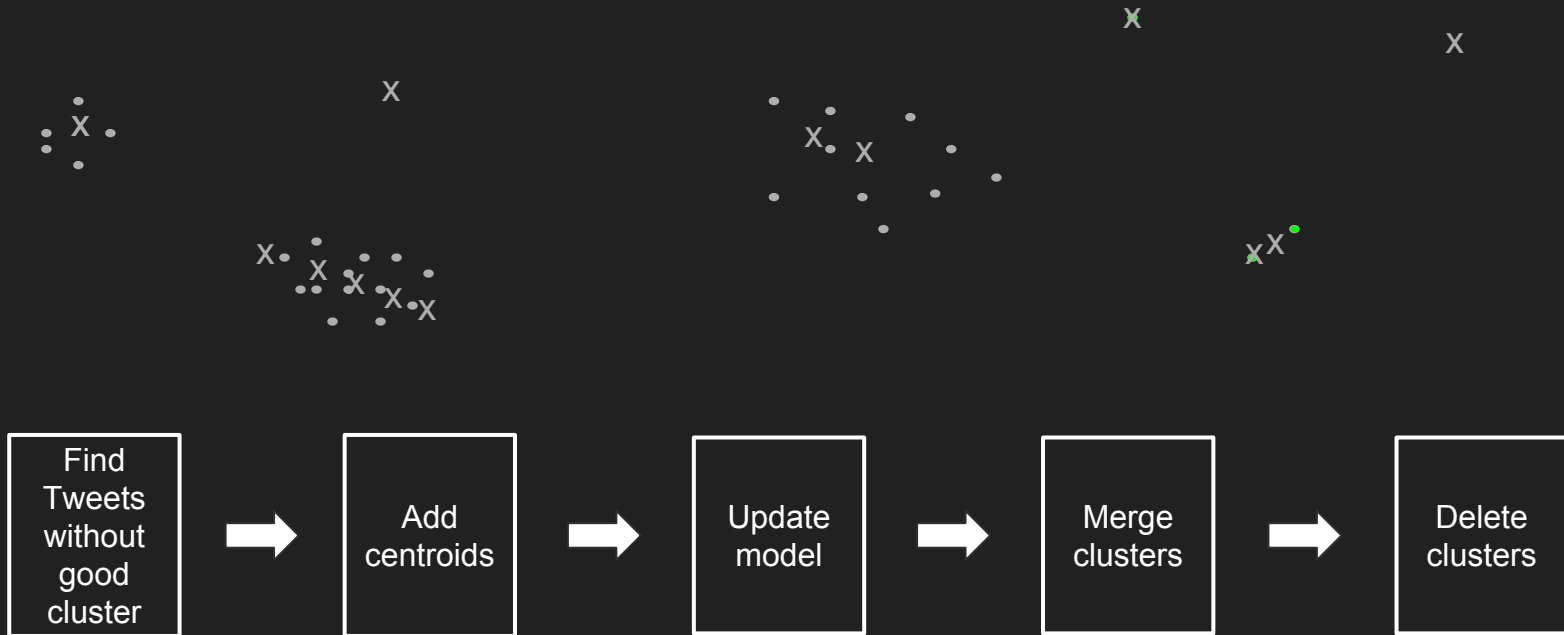
- Continuous clustering with batches
- For every batch, new centroids are calculated
- Centroids and cluster size are saved
- Cluster quality problems due to:
  - Randomly generated initial centroids
  - Static k not based on cluster results

# Dynamic k-Means (1/3)



- Remove cluster if weight is too low
- Add a cluster if tweet is too far away from closest centroid
- Merge clusters which are close to each other


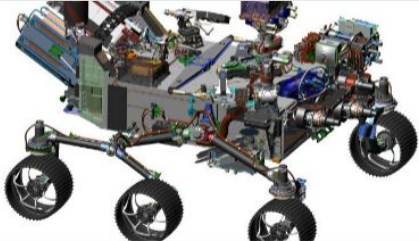



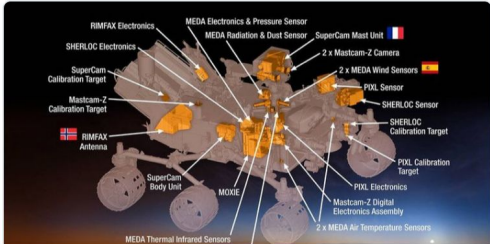
# Dynamic k-Means (2/3)



# Dynamic k-Means (3/3)

- Advantages:
  - No need to find a  $k$  that works “okay” for arbitrary input
  - No need to choose initial centroids
  - Easy to parallelize
- Disadvantages:
  - More computationally expensive
  - New thresholds to define

# Twitter News Stream

	Cluster ID	Attribute	Batch 0	Batch 1	Batch 2
	Count		162	104	52
1663		Tweet	<div data-bbox="320 203 846 834">  <p><b>Glinda Dahlka</b> @dahlka_glinda</p> <p><a href="#">Follow</a></p> <p>#Tech NASA shows off the design for its Mars 2020 rover <a href="http://dld.bz/eGMHu">dld.bz/eGMHu</a> 9:35 PM - 15 Jul 2016</p>  <p>NASA shows off the design for its Mars 2020 rove... The rover NASA plans to send to Mars in 2020 is taking shape, and today its near-final design was revealed, <a href="http://techcrunch.com">techcrunch.com</a></p> <p>↩ ↻ ❤</p> </div>	<div data-bbox="857 323 1383 711">  <p><b>Noelle Salinaines</b> @NoelleSalinain1</p> <p><a href="#">Follow</a></p> <p>NASA's next Mars rover will 'seek the signs of life' on red planet - <a href="http://wp.me/p7gLtg-qjs">wp.me/p7gLtg-qjs</a> 9:41 PM - 15 Jul 2016</p> <div data-bbox="886 514 1022 650">  </div> <p>NASA's next Mars rover will 'seek t... NASA gave a glimpse into its plans for its next Martian rover on Friday, a craft <a href="http://meekvoices.com">meekvoices.com</a></p> <p>↩ ↻ ❤</p> </div>	<div data-bbox="1394 203 1920 847">  <p><b>Space Plazas</b> @SpacePlazas</p> <p><a href="#">Follow</a></p> <p>NASA Is Ready to Start Building Its Life-Hunting 2020 Mars Rover - <a href="http://Space.com">Space.com</a> <a href="http://dlvr.it/LpYNv4">dlvr.it/LpYNv4</a> 9:37 PM - 15 Jul 2016</p>  <p>NASA Is Ready to Start Building Its Life-Hunting 2... NASA's life-hunting 2020 Mars rover has cleared an extensive review process and is now ready to begin the <a href="http://space.com">space.com</a></p> <p>↩ ↻ ❤</p> </div>
	News URL		<a href="#">url</a>	<a href="#">url</a>	<a href="#">url</a>
	Silhouette		0.65	0.58	0.57



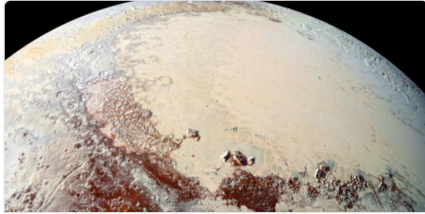


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At 1pm ET: Get to know our next Mars rover! Join our  
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437 1,250

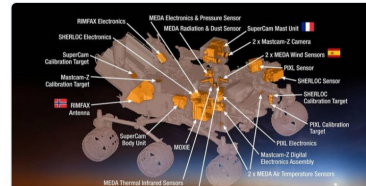


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NASA's life-hunting 2020 Mars rover has cleared an  
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[ow.ly/QRtT502rWTN](https://www.cnet.com/news/nasa-readying-next-mars-rover/)

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NASA readying next Mars rover

The space agency says it's set to move  
forward on the final stages of design  
cnet.com



**Robert C Pasker, III**  
@RCPasker

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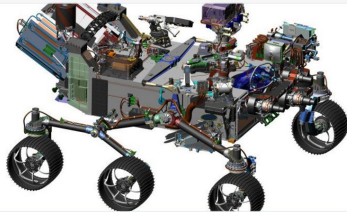
#Entrepreneur Not Good at Sales? Here Are 5 Easy  
Ways to Get More More Clients. [goo.gl/fb/nz3Mfh](https://goo.gl/fb/nz3Mfh)

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Leonardo DiCaprio's character in 'Wolf of Wall Street.'  
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**Tajuk Tekno**  
@TajukTekno

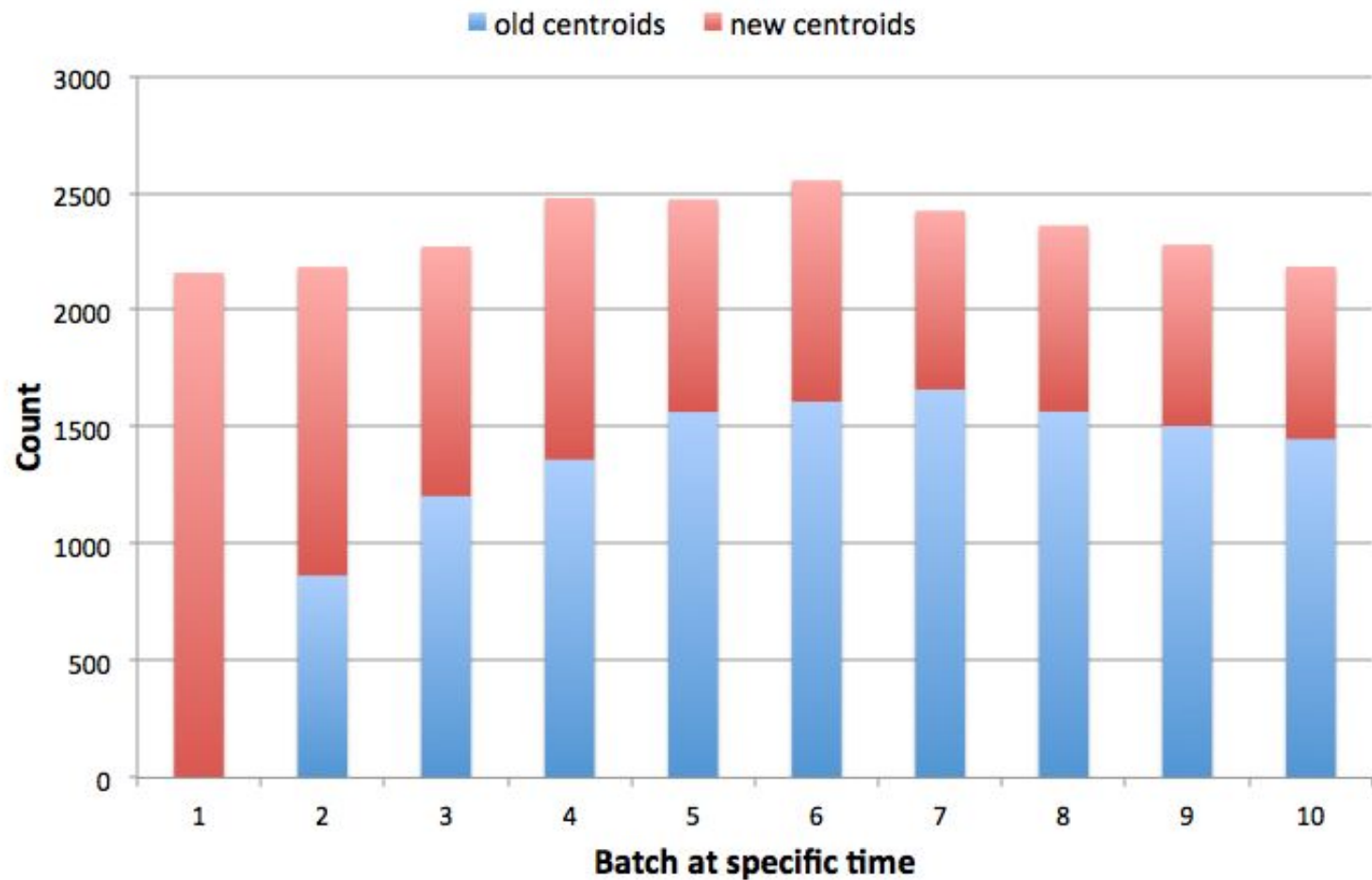
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NASA shows off the design for its Mars 2020 rover  
[dlvr.it/LpYPQy](https://dlvr.it/LpYPQy)

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## Cluster Count Over Time For Batch Size 10,000



# Performance Evaluation

Hardware: HPI-Cluster

- 10 Server à 2 Cores x 2.67 GHz CPU, 4 GB RAM

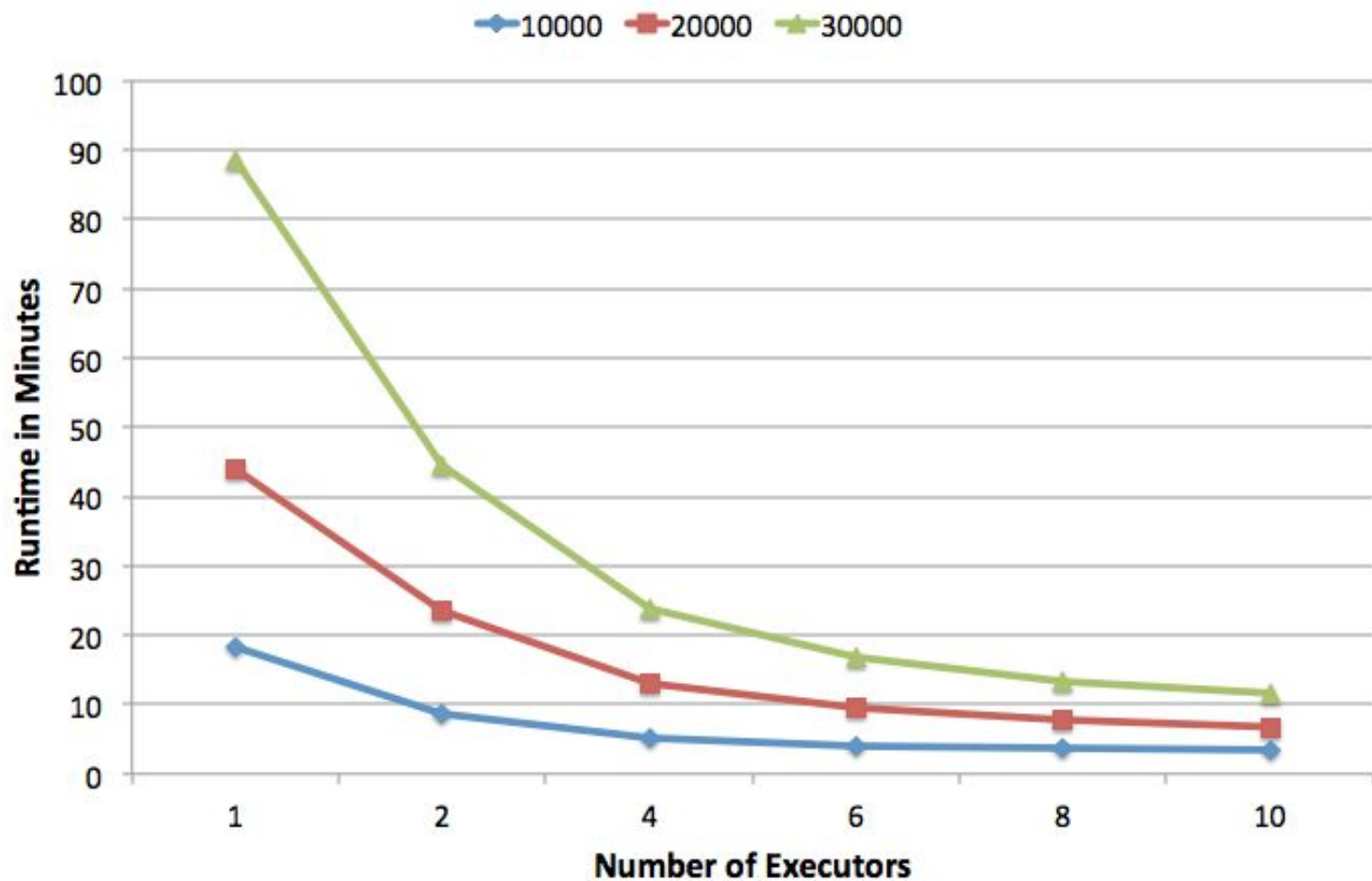
Input

- 300.000 Tweets 15.07.16 19:30 - 23:30 Uhr

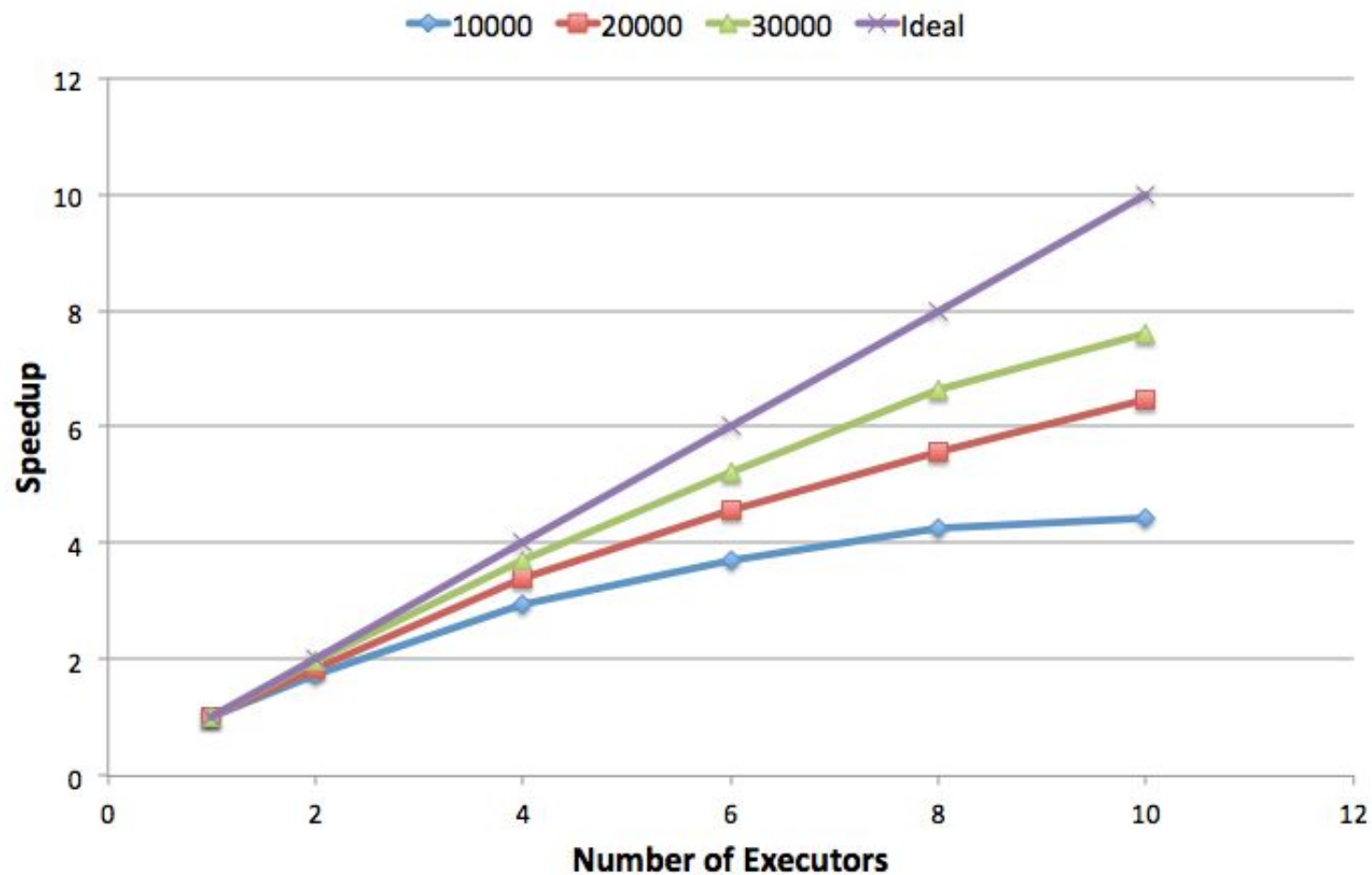
Execution

- 3 times per setting
- 1 Core per Executor

## Clustering Runtime Per Executors for 10 Batches

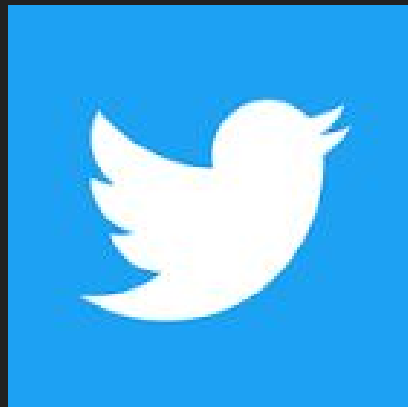


## Relative Speedup ( $S = T1/Tn$ )



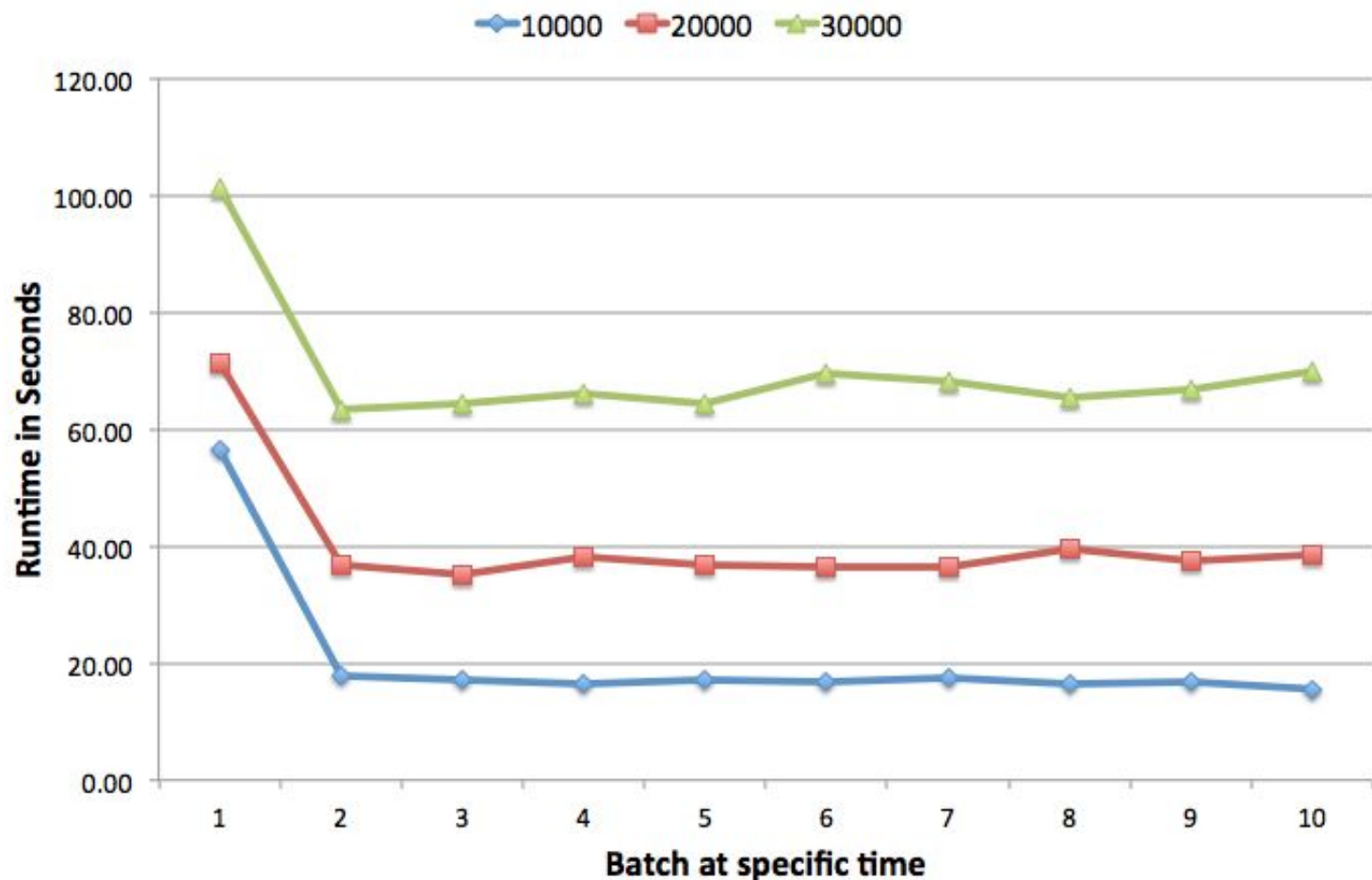
# Conclusion

- We can process and cluster tweets live
- Getting high quality results for clustering is very tough



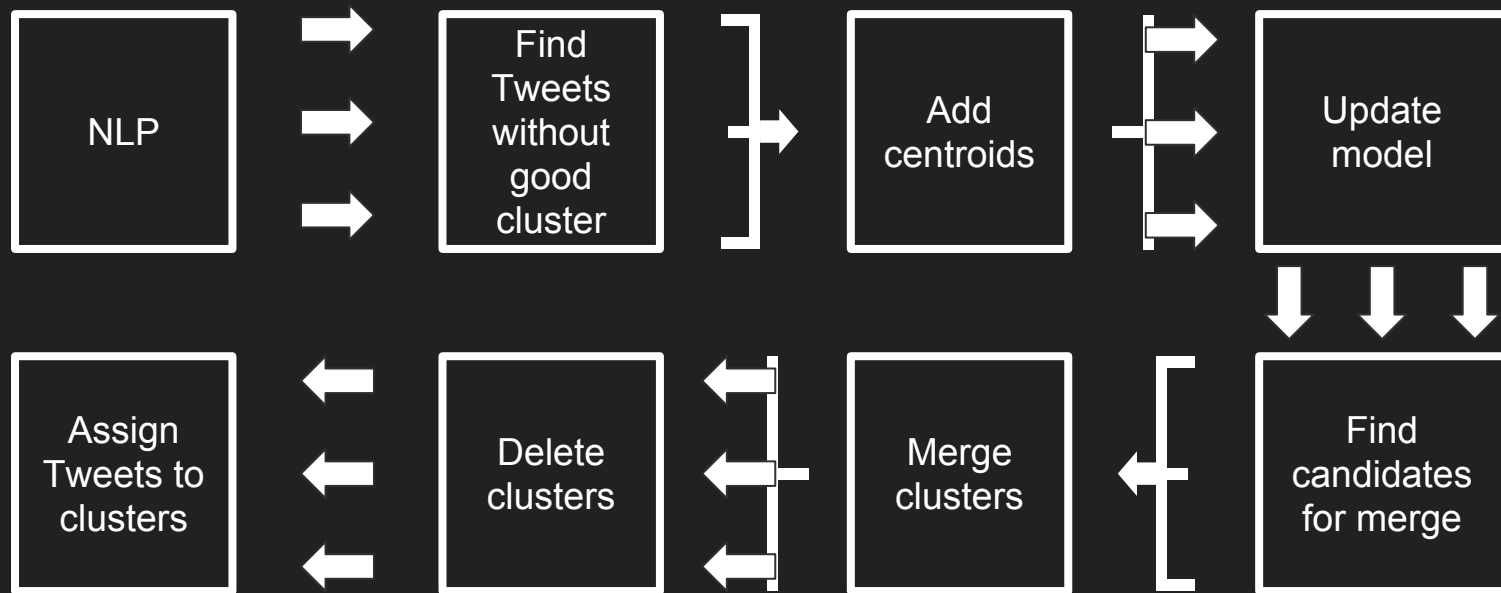
# Backup

## Clustering Runtime Per Batch Using 10 Executors/Cores





# Dynamic k-Means: Parallelization



# Cluster size distribution

