

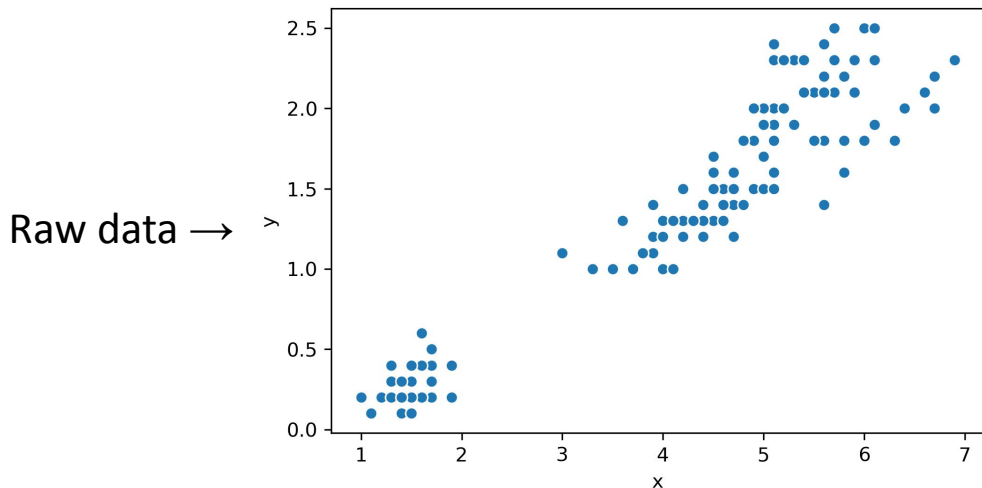
# K-Means Clustering Algorithm

# K-Means Clustering

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Most popular clustering approach: K-Means

- Pick an arbitrary  $k$ , and randomly place  $k$  “centers”, each a different color
- Repeat until convergence:
  - Color points according to the closest center
  - Move center for each color to center of points with that color

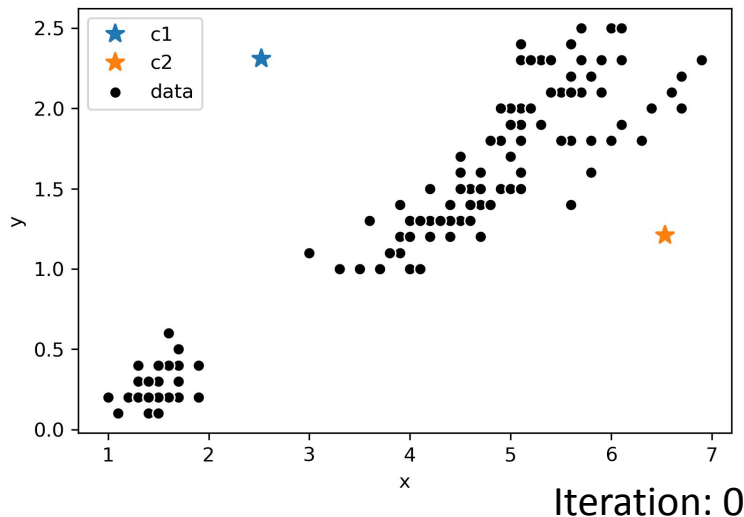


# K-Means Clustering

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Initial random  
placement of two  
centers

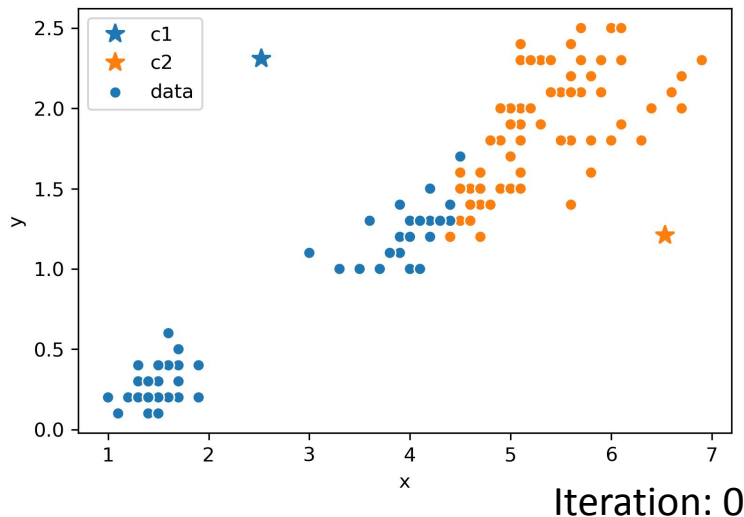


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Data colored by  
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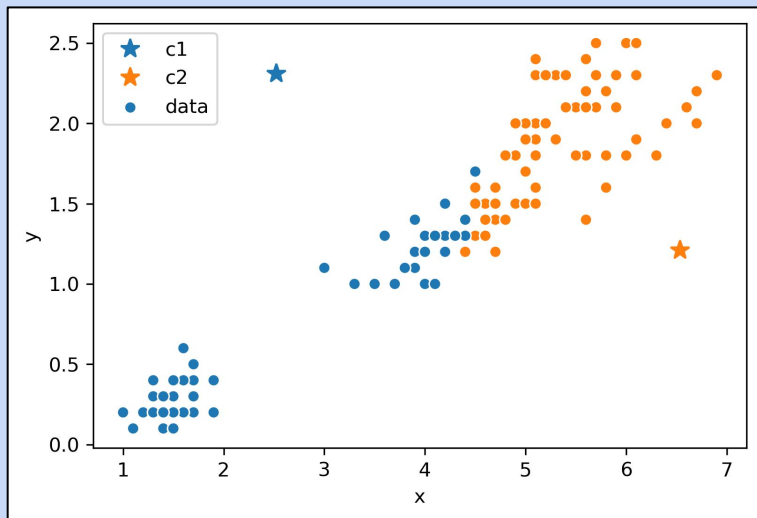


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Where should the centers go next?

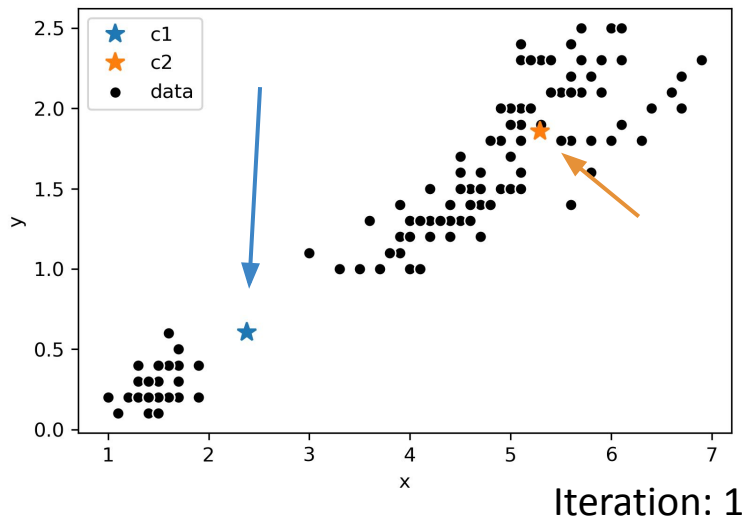


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Centers moved to  
their new homes

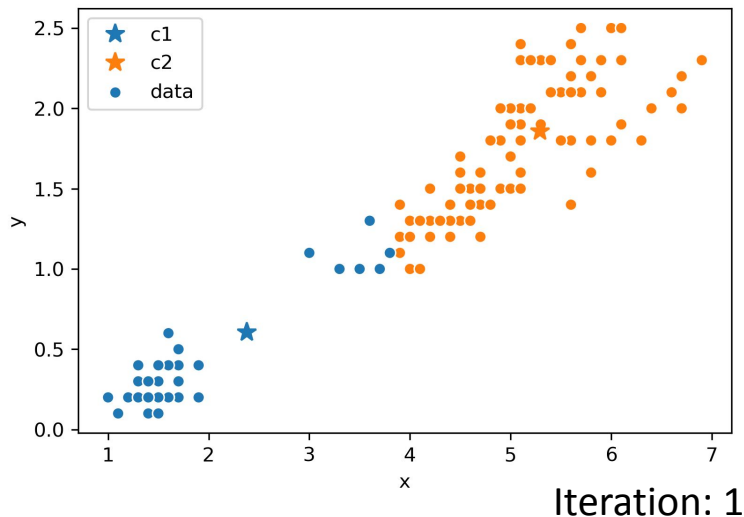


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Data colored by  
closest center (in  
new position)



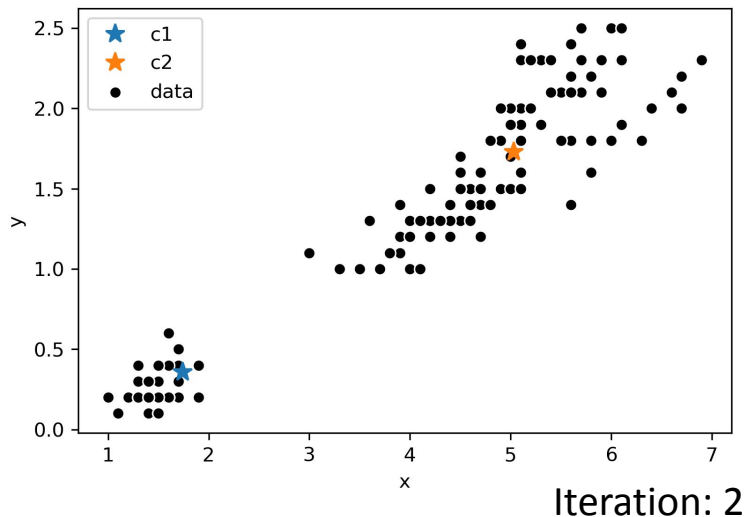
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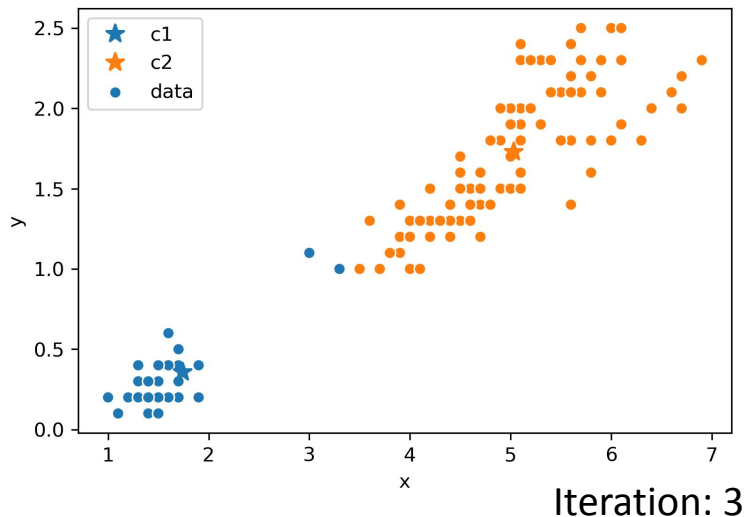


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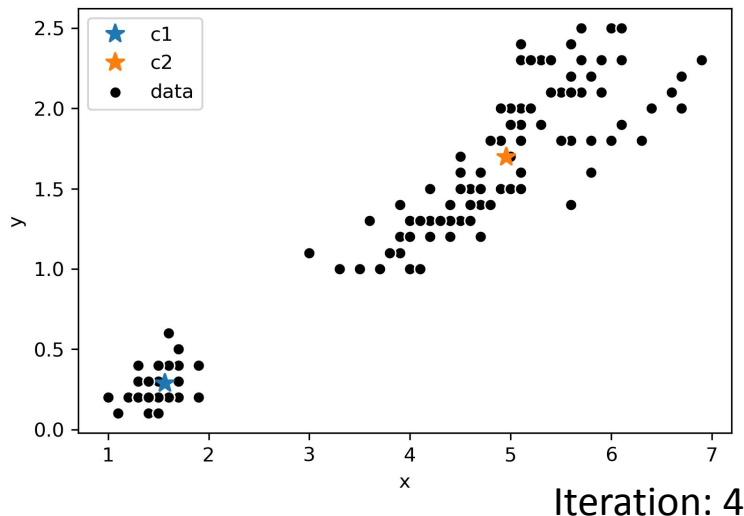


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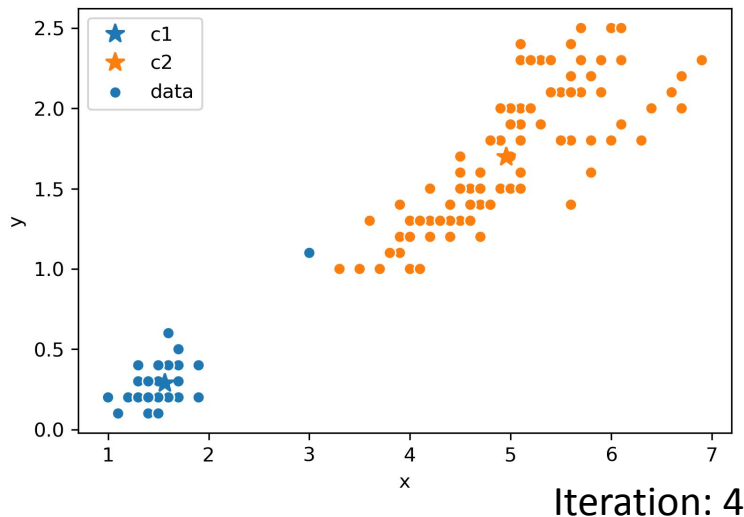
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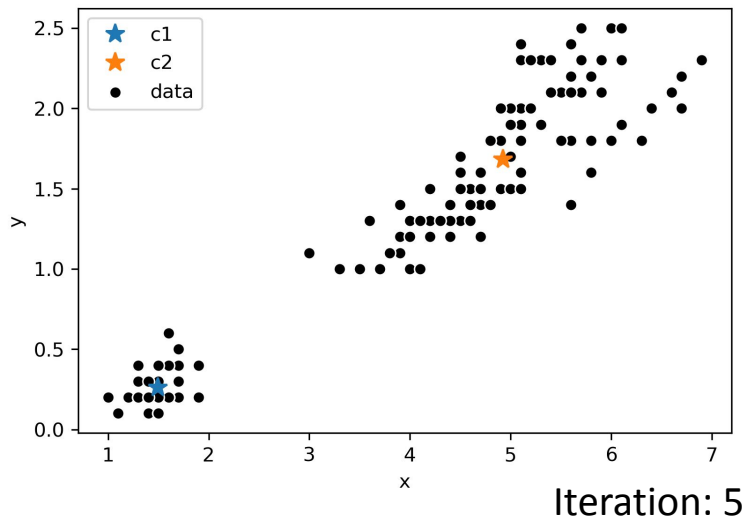


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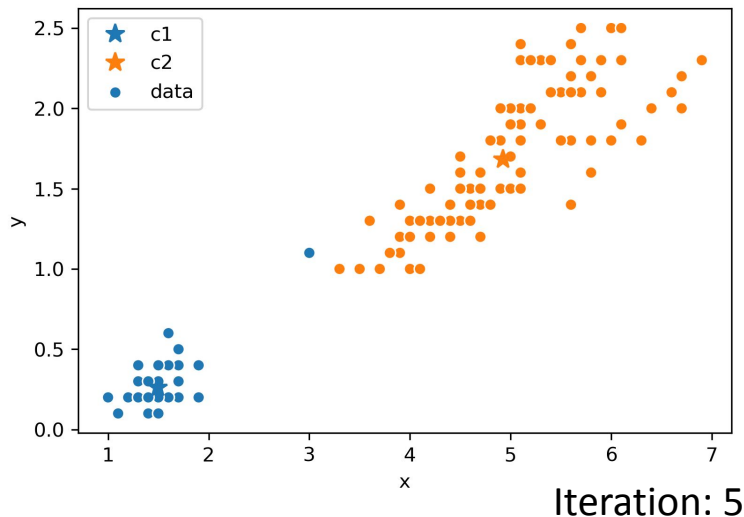


# K-Means Clustering

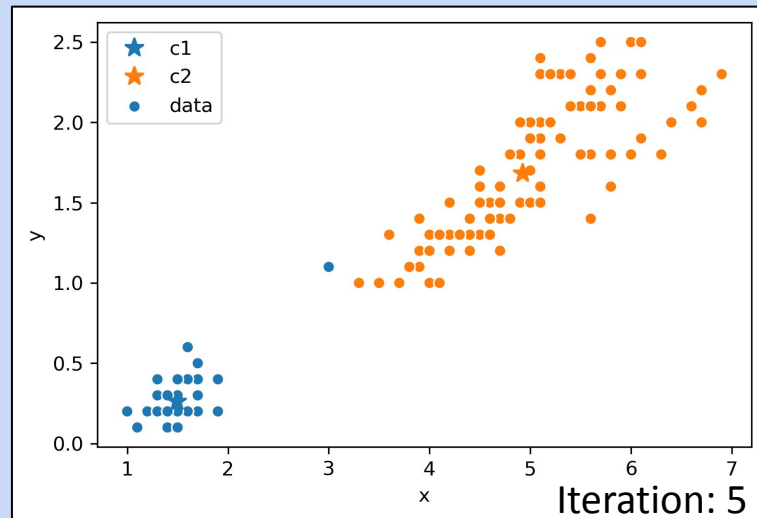
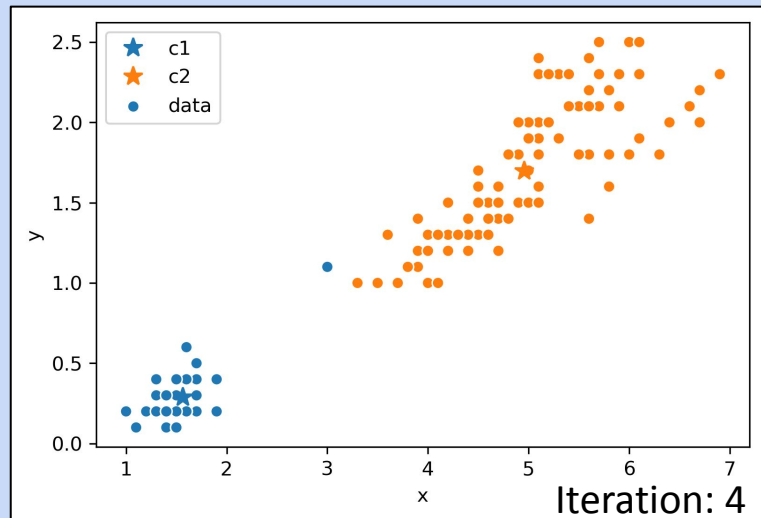
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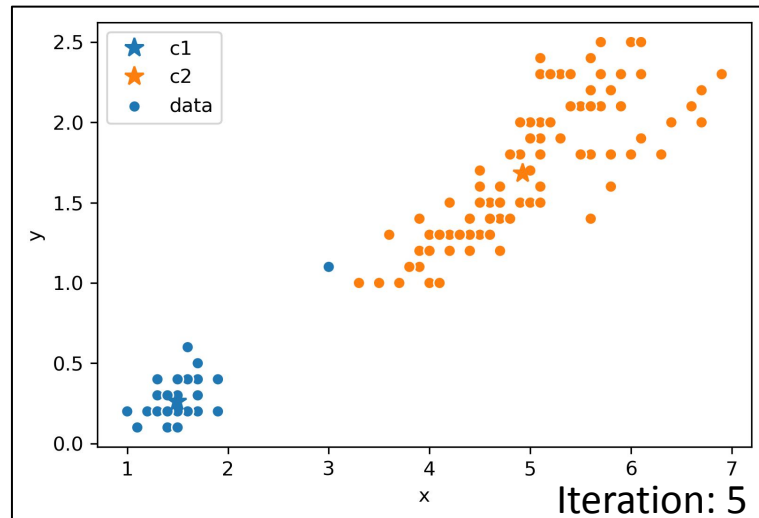
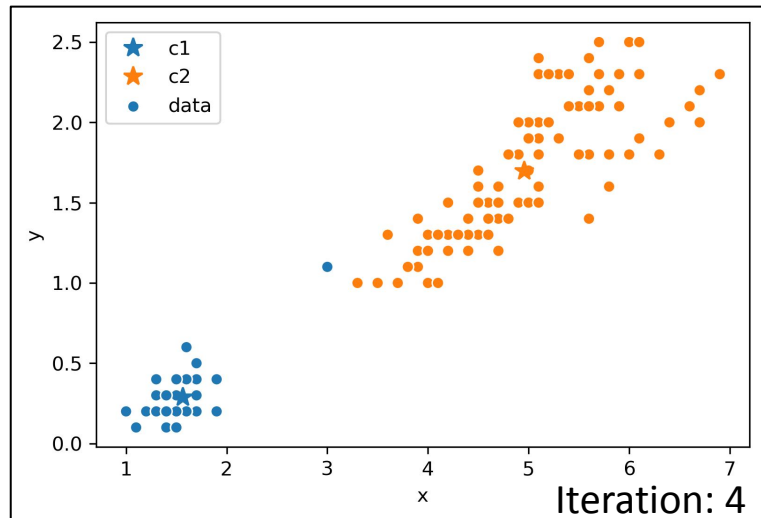
# K-Means Clustering



Above we see the results after iteration 4 and 5

- Centers moved slightly between iteration 4 and 5
- But no points changed color
- Are we done?

# K-Means Clustering



Above we see the results after iteration 4 and 5

- Centers moved slightly between iteration 4 and 5
- But no points changed color
- Are we done?
  - Yes! If we tried iteration 6, we'd see that centers don't move at all