



AI Bridge

Lecture 4

Unsupervised Learning



Species
#1?



Species
#2?



Unsupervised Learning

Clustering

Dimension reduction

ChatGPT

Clustering: Google news

Giant panda gives birth to rare twin cubs at Japan's oldest zoo

USA TODAY · 6 hours ago

- Giant panda gives birth to twin cubs at Japan's oldest zoo

CBS News · 7 hours ago

- Giant panda gives birth to twin cubs at Tokyo's Ueno Zoo

WHBL News · 16 hours ago

- A Joyful Surprise at Japan's Oldest Zoo: The Birth of Twin Pandas

The New York Times · 1 hour ago

- Twin Panda Cubs Born at Tokyo's Ueno Zoo

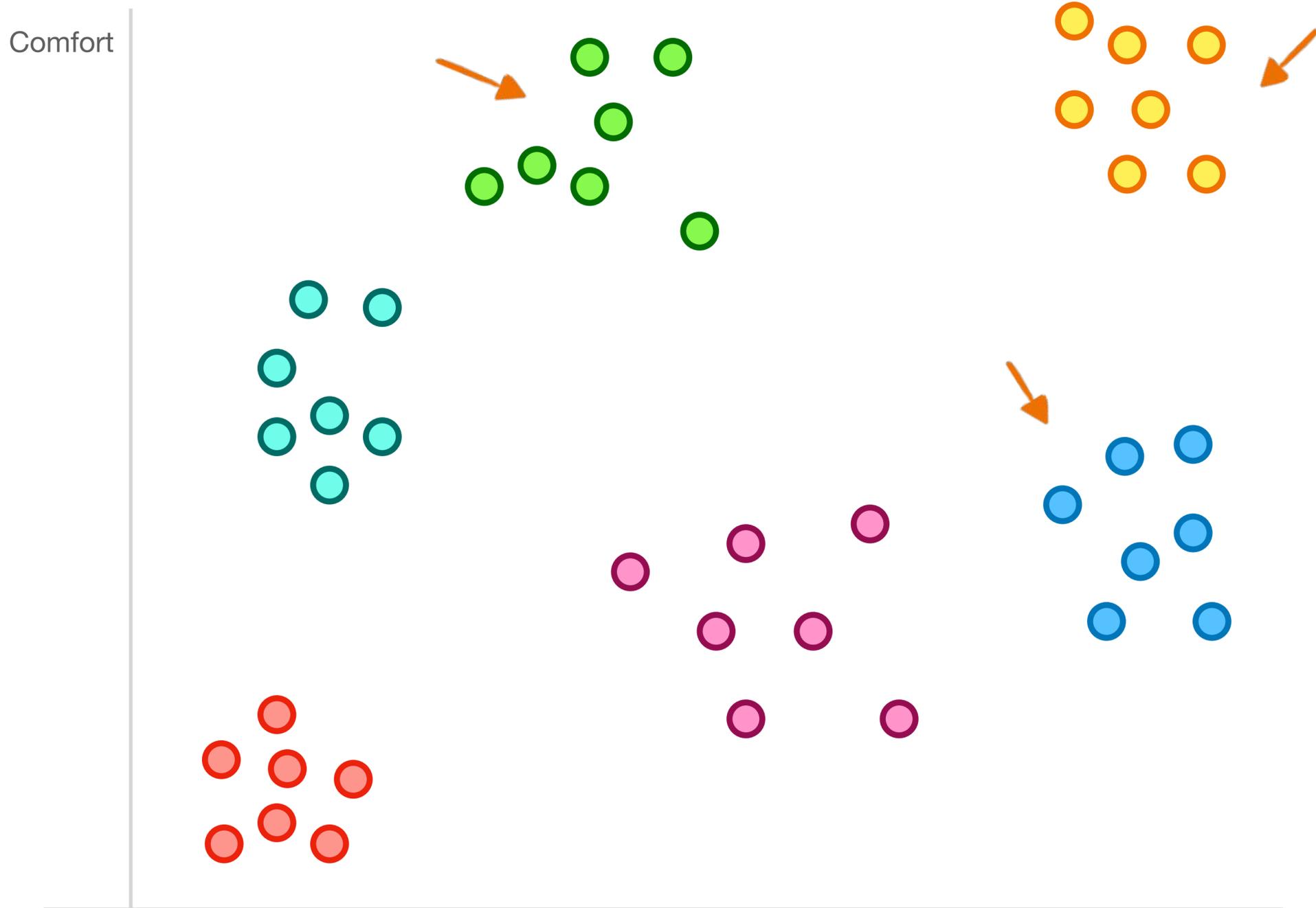
PEOPLE · 6 hours ago

 [View Full Coverage](#)



k-means clustering

how do we find these clusters?



clusters can tell us about the relationship of data

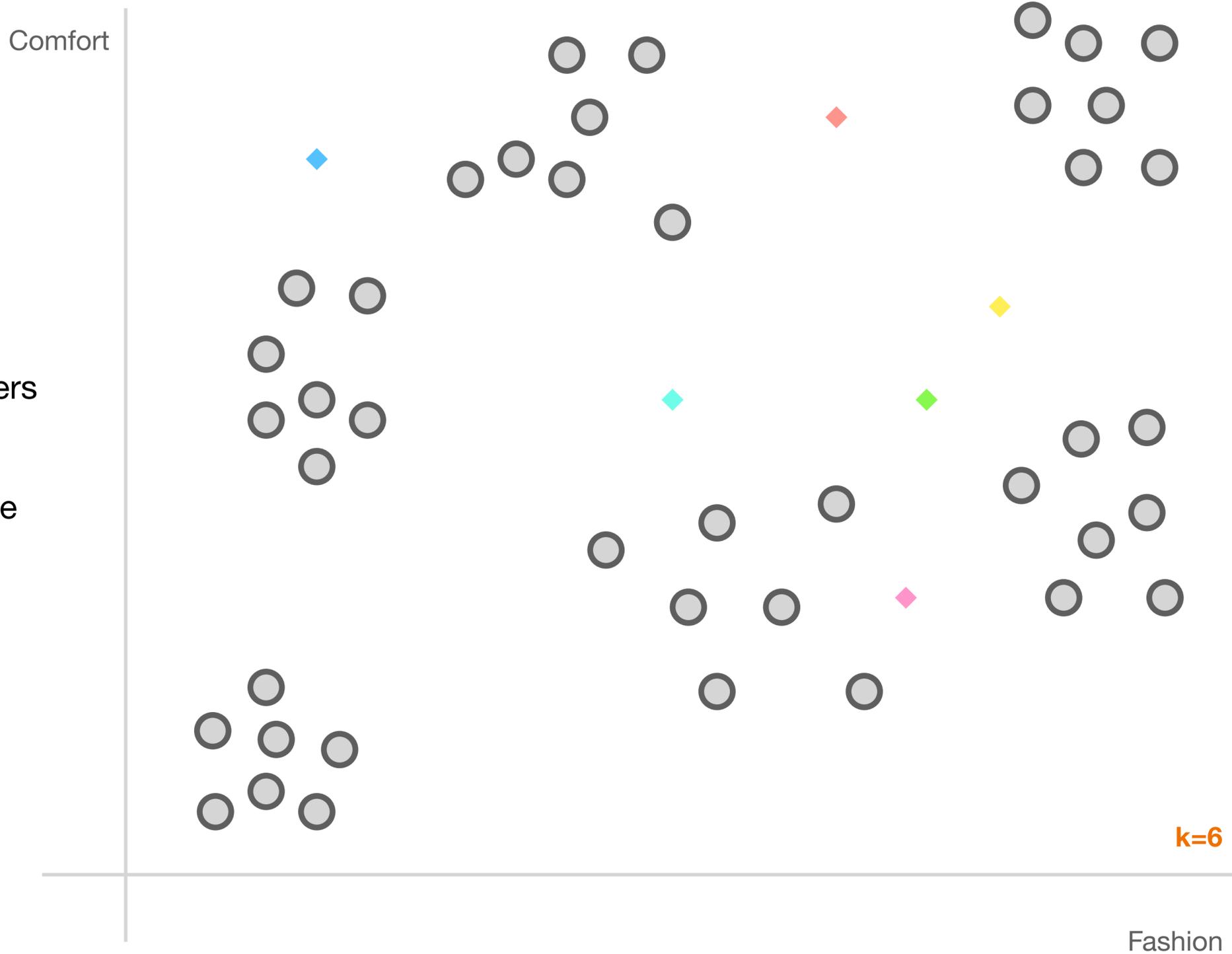
Fashion

...even if they are unlabeled!

→ **unsupervised learning!**

k-means clustering

- 1. pick a K-number of clusters
- 2. randomly pick a series of “centroids”
- 3. assign each particle to the centroid closest to it

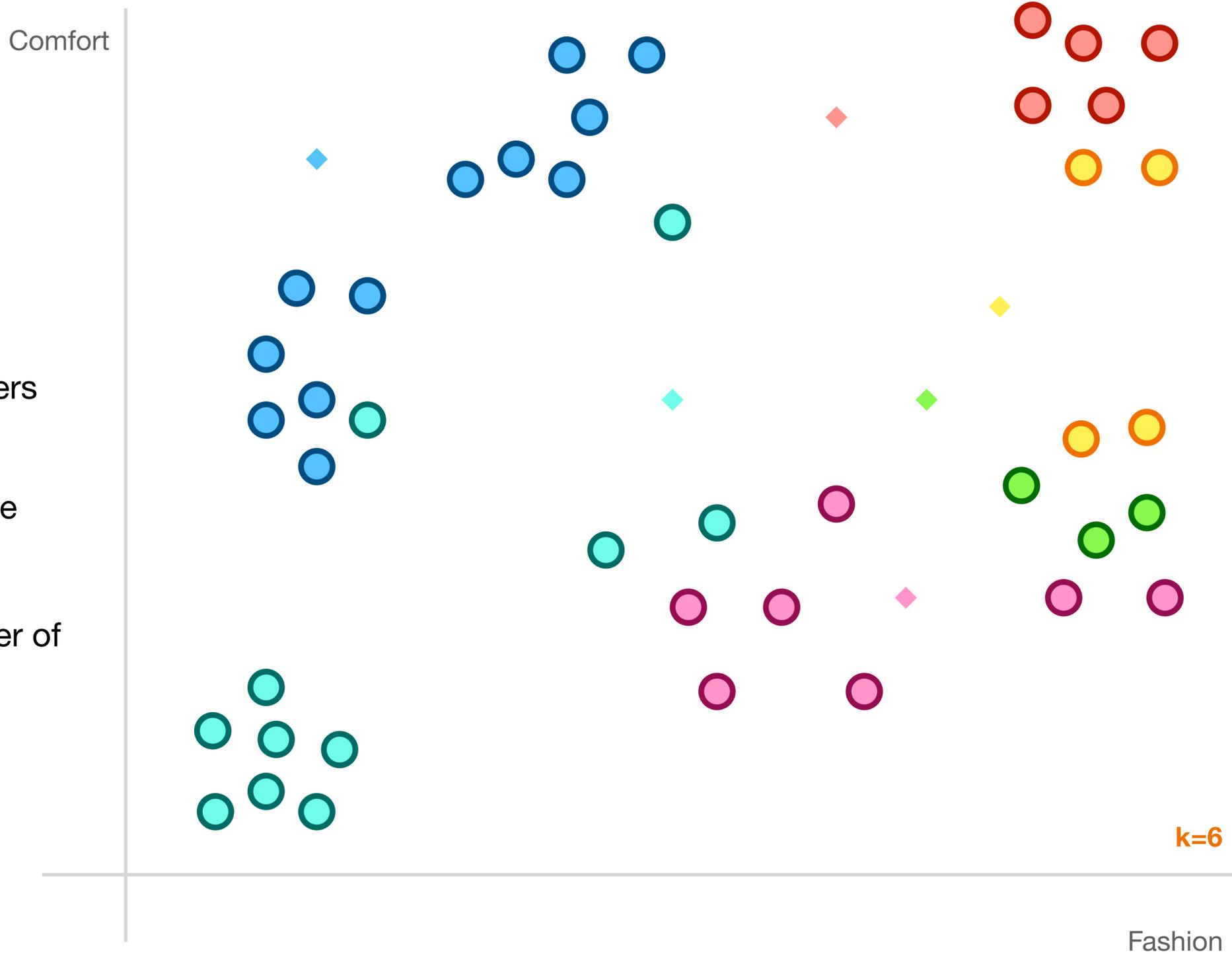


k=6

Fashion

k-means clustering

- 1. pick a K-number of clusters
- 2. randomly pick a series of “centroids”
- 3. assign each particle to the centroid closest to it
- 4. move the centroid to the weighted geometric center of samples assigned to it

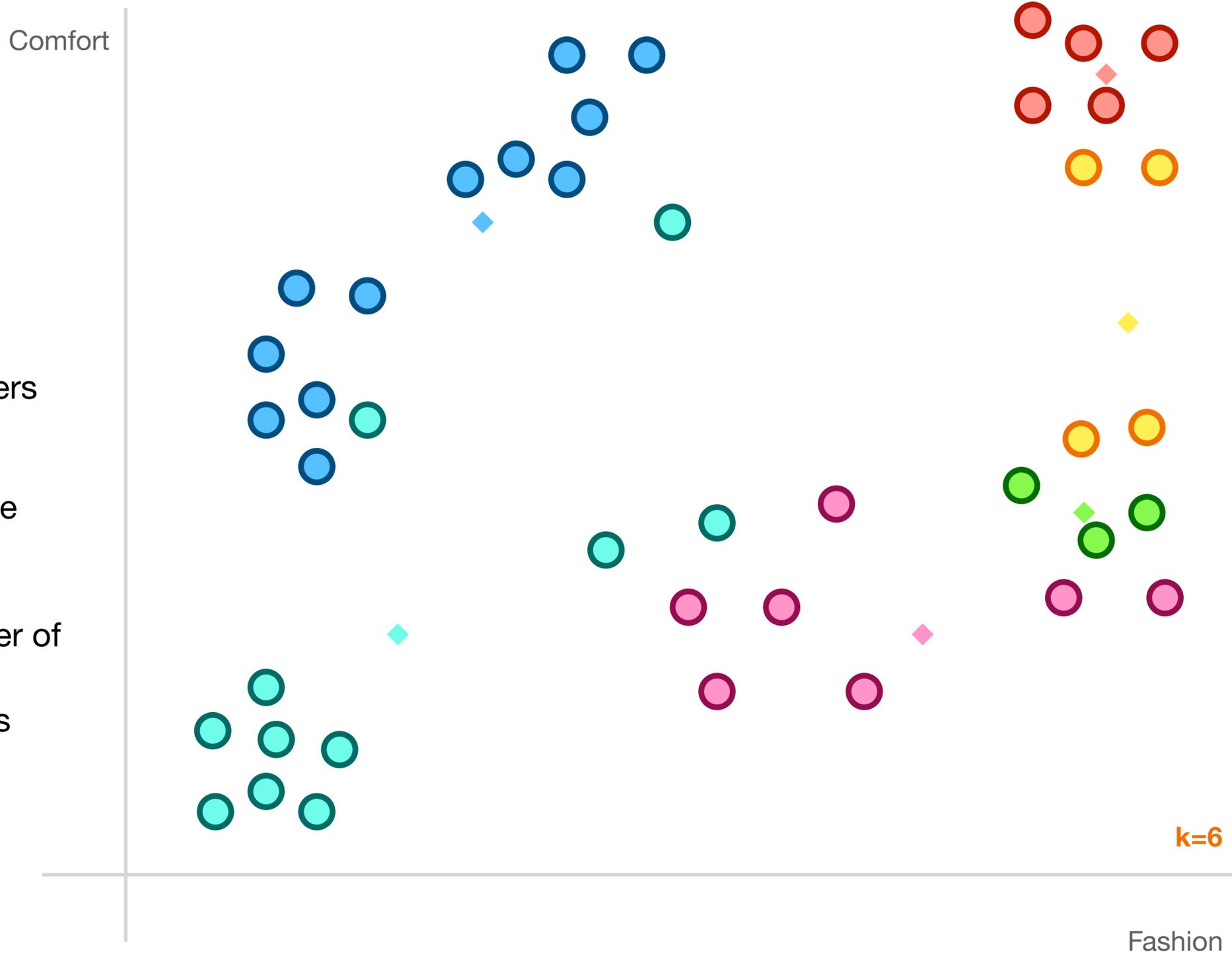


k=6

Fashion

k-means clustering

- 1. pick a K-number of clusters
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- 4. move the centroid to the weighted geometric center of samples assigned to it
- 5. Repeat 3-4 until centroids stop moving!

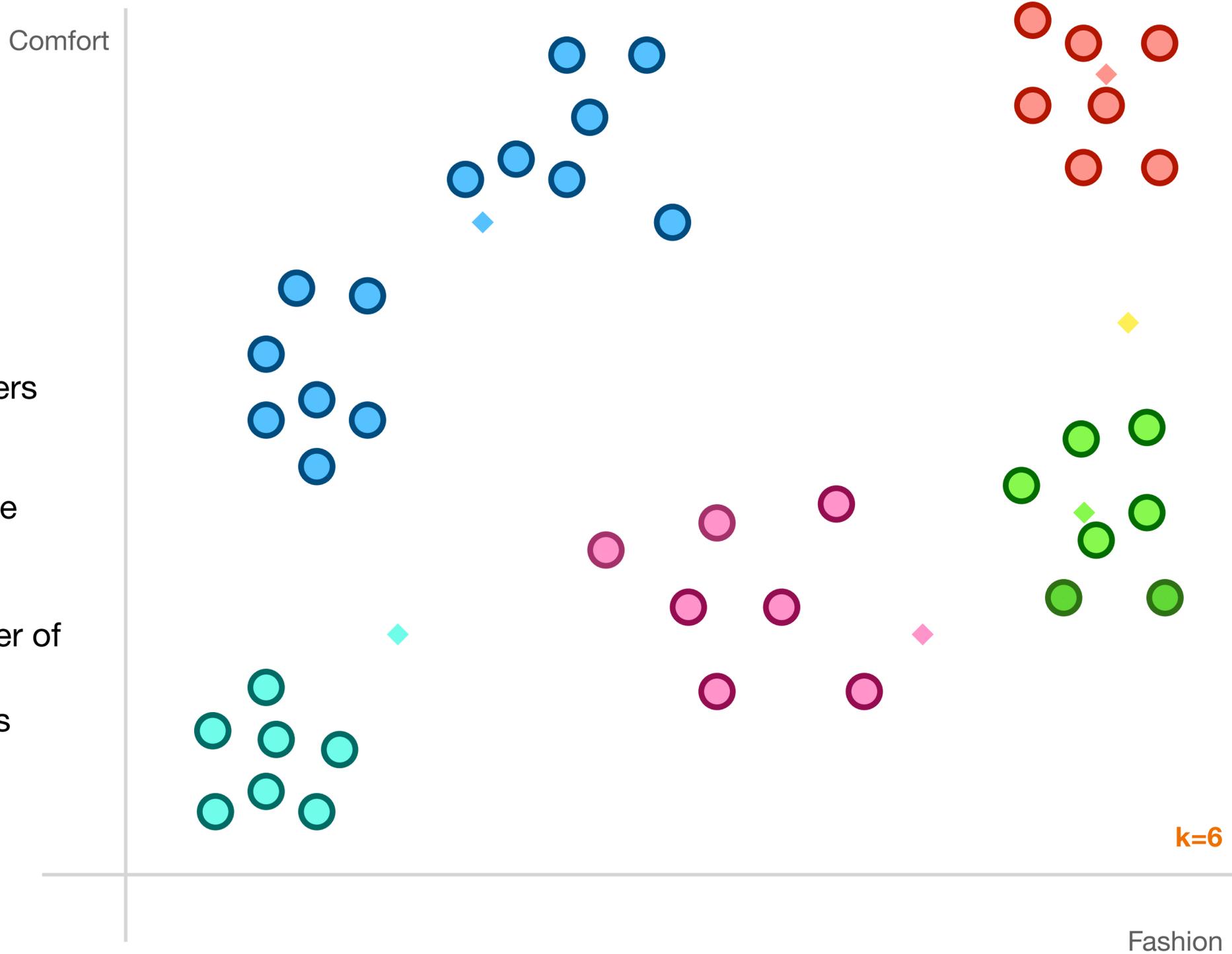


k=6

Fashion

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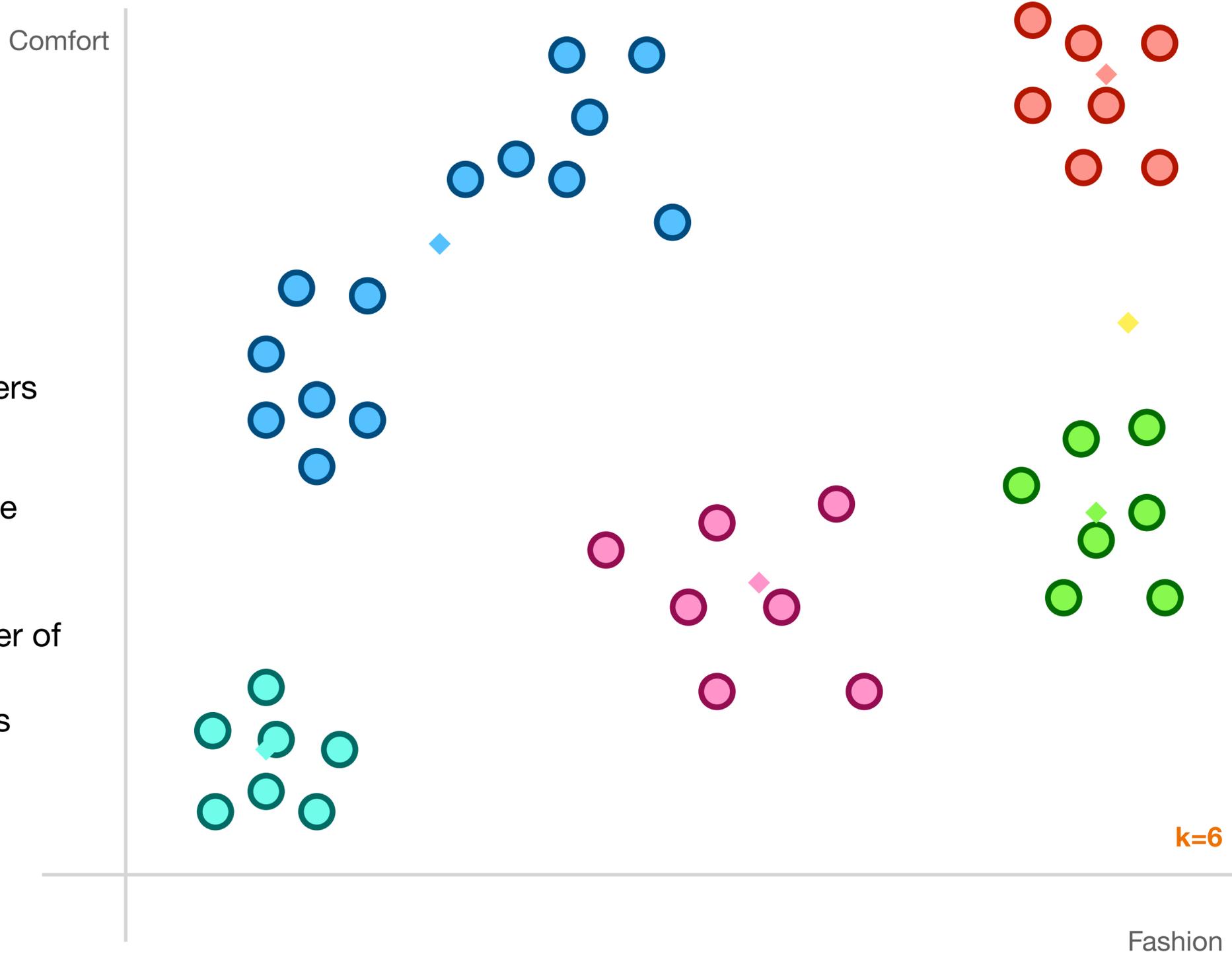


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Fashion

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Do we always get back the same clusters?

Nope. And that's OK.



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Nope. And that's OK.

- **K-means** is an *indeterministic* algorithm—it has built-in randomness

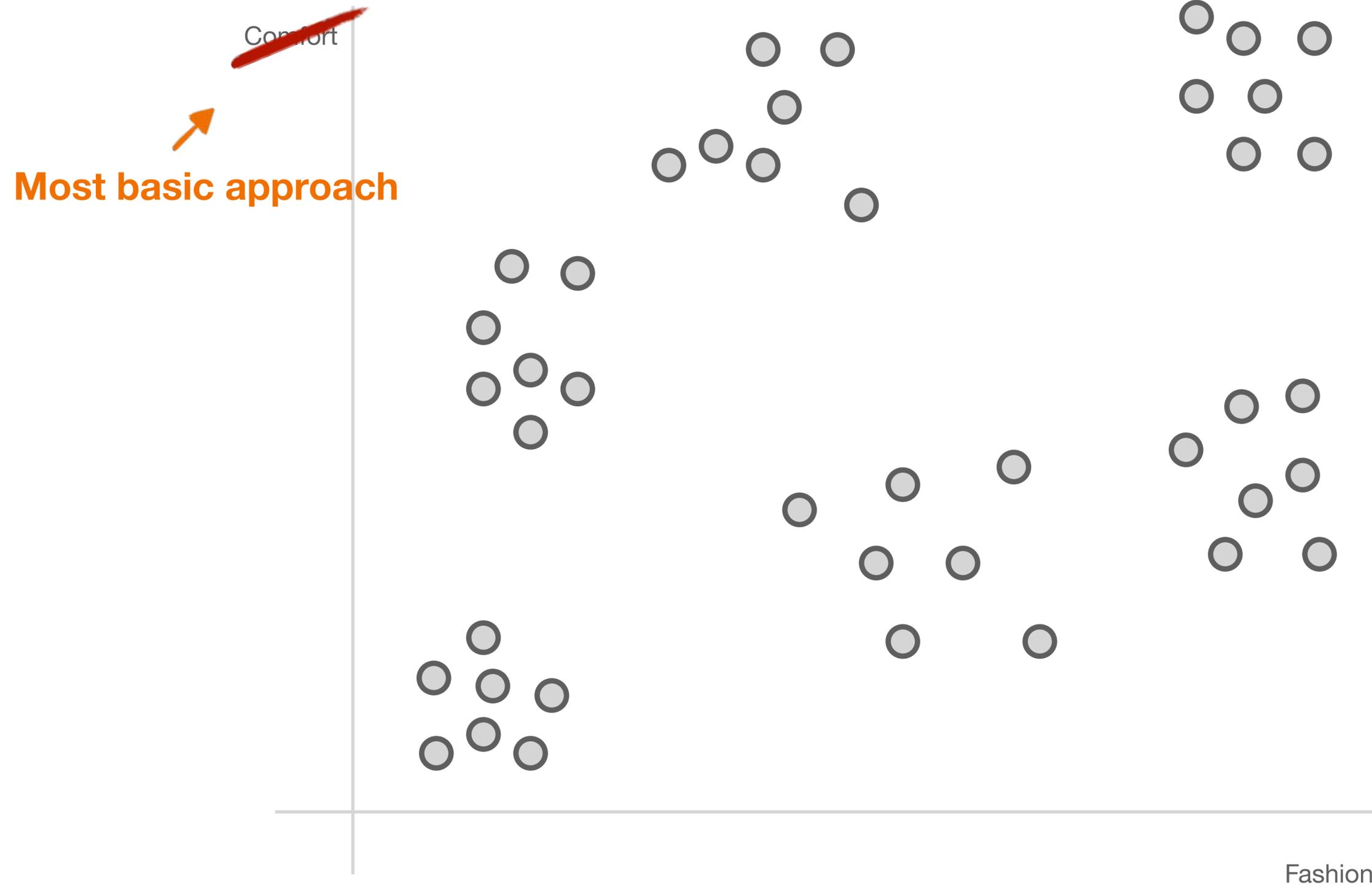
Unsupervised Learning

Clustering

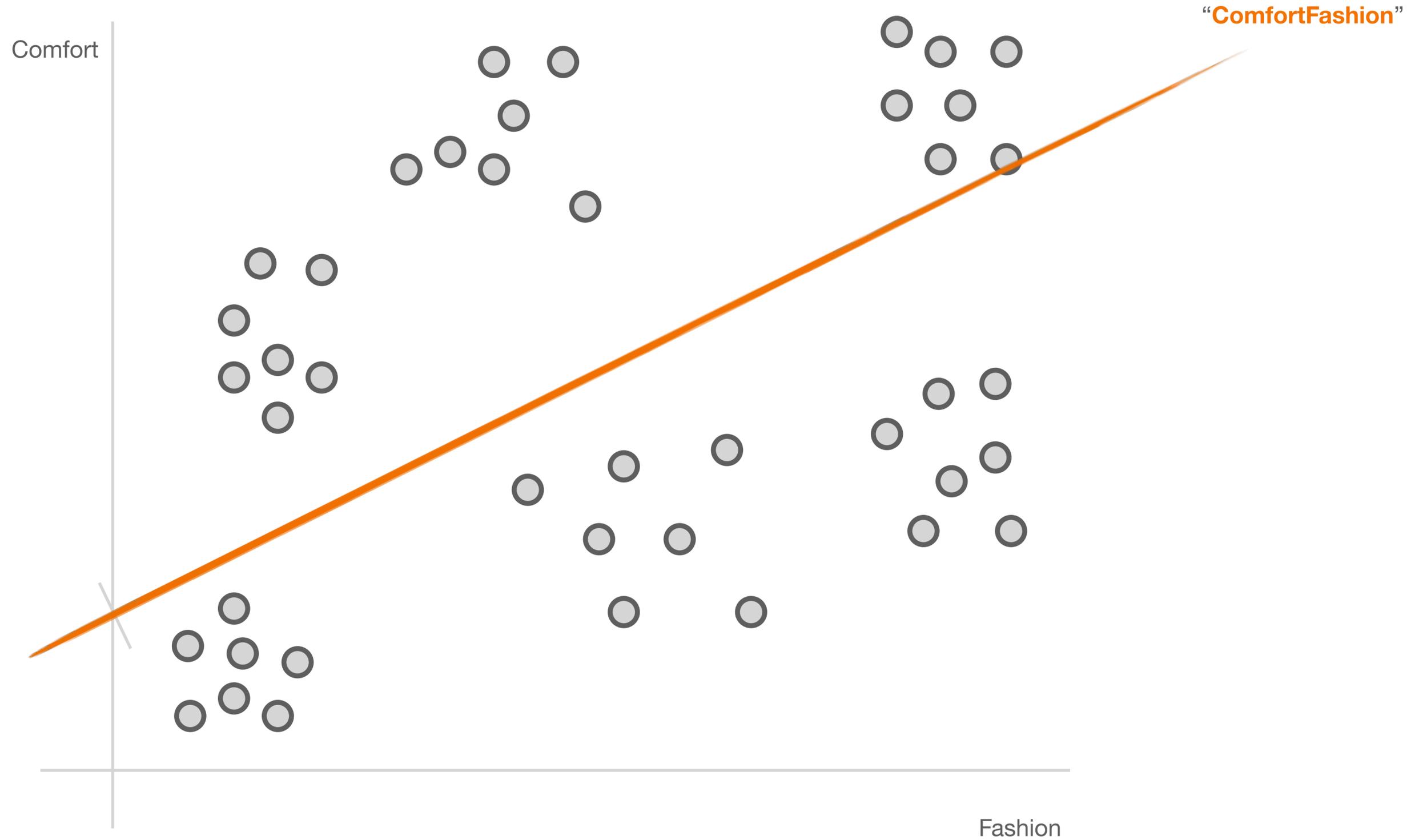
Dimension reduction

ChatGPT

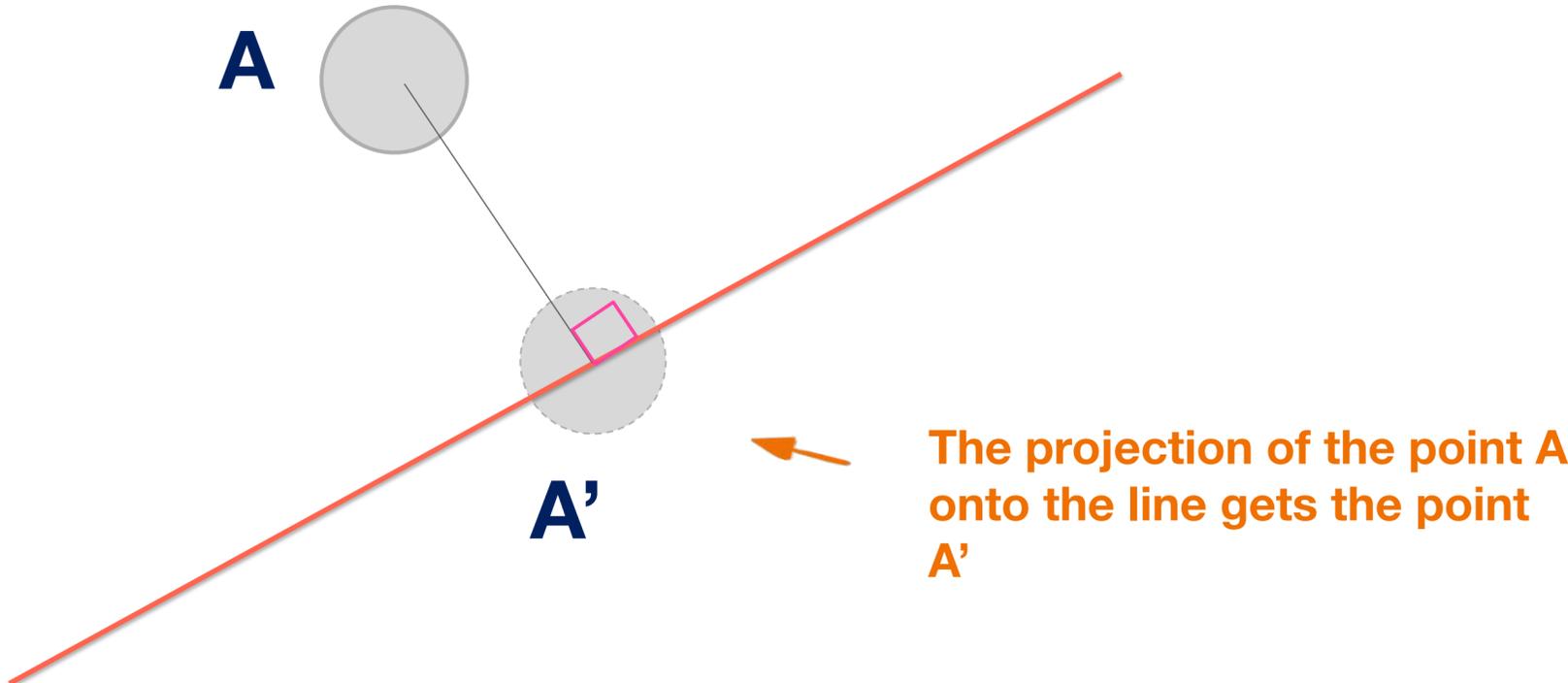
Principle Component Analysis



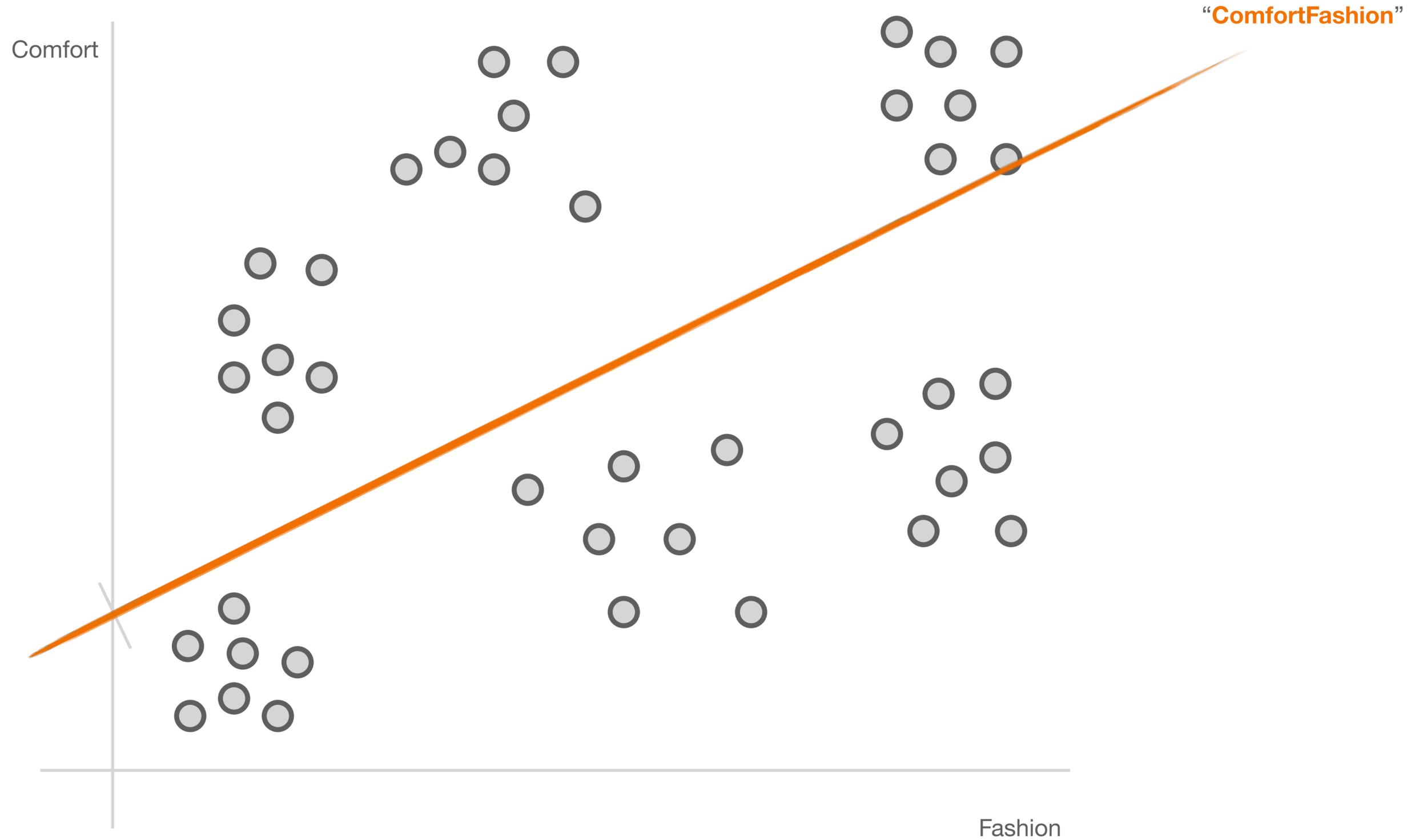
Principle Component Analysis



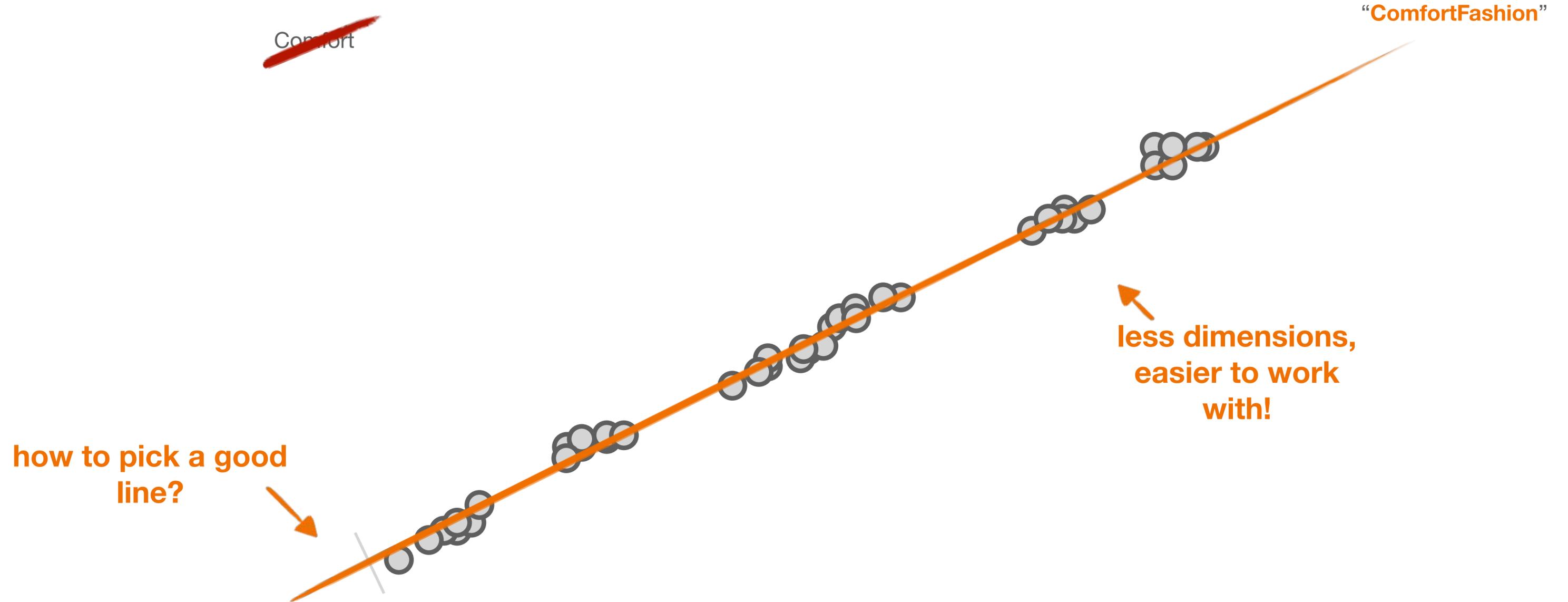
Principle Component Analysis



Principle Component Analysis



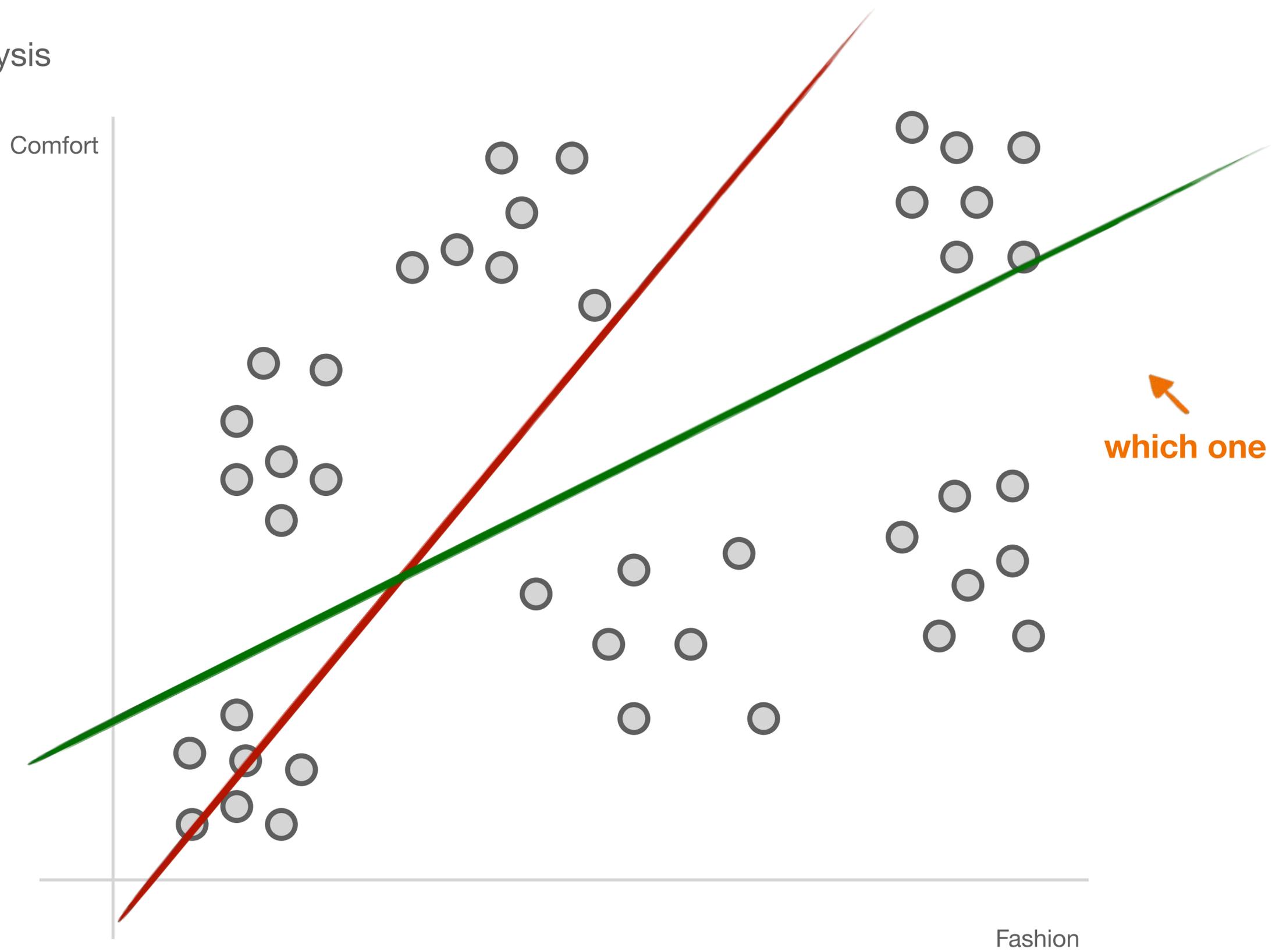
Principle Component Analysis



- by **projecting** the samples down to a smaller dimension, they are easier to work with.

Principle Component Analysis

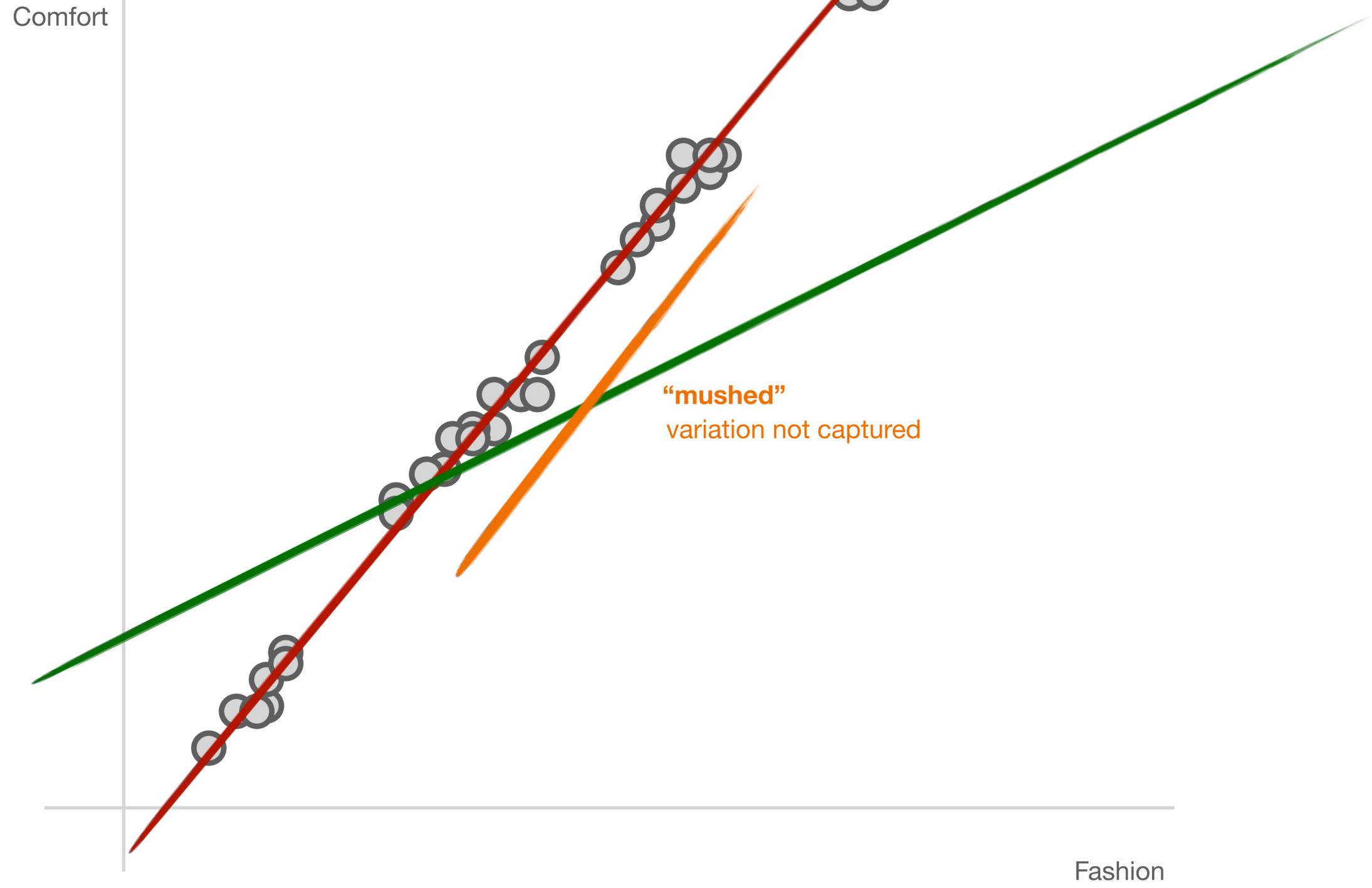
how to pick a good line?



which one is better?

Principle Component Analysis

how to pick a good line?



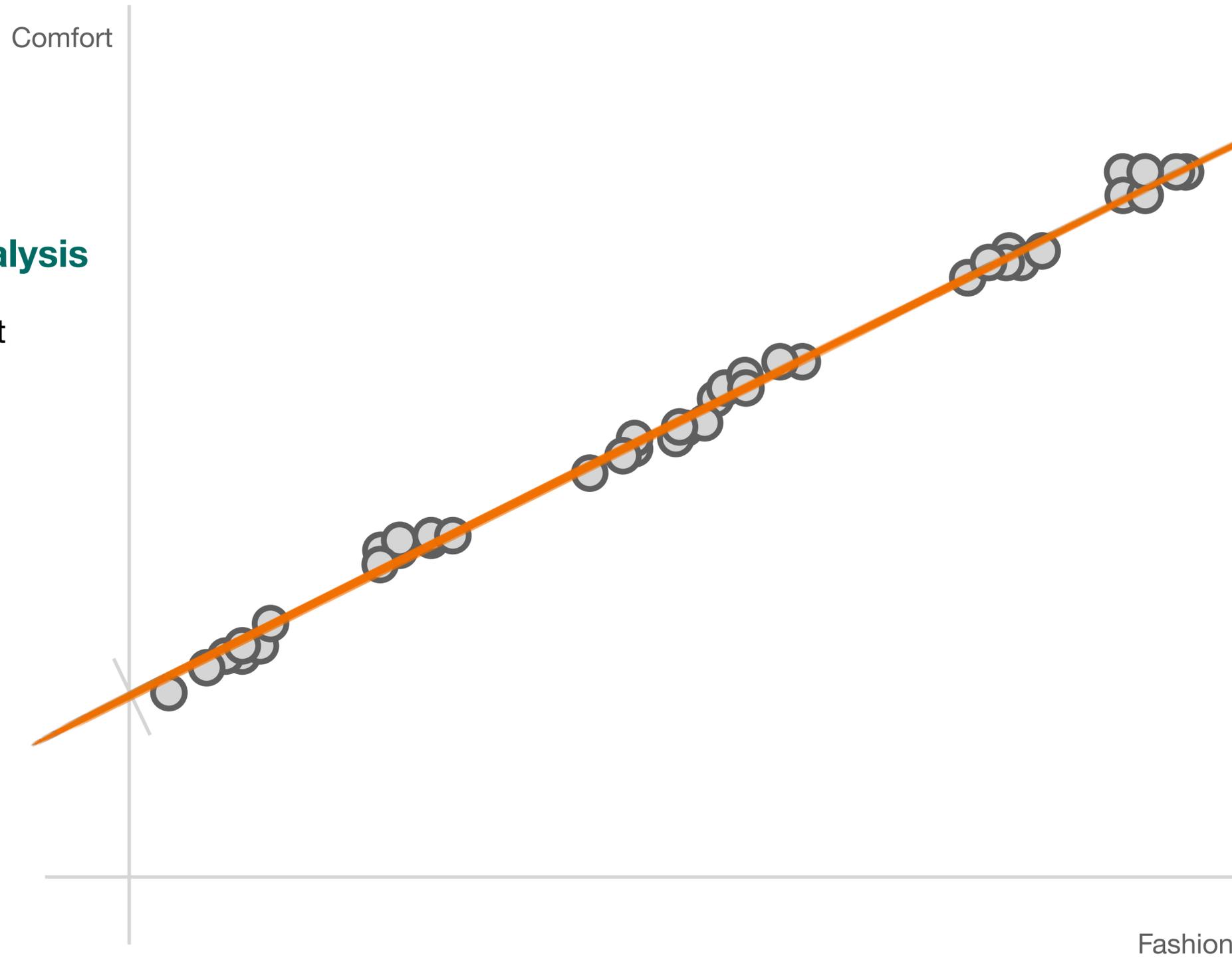
■ a good **“projection”** captures the **variation** in the data

Principle Component Analysis

how to pick a good line?

principle component analysis

- Find a good line (**basis**) that **maximizes variation**
- **Project** samples down



But, can we formalize it?



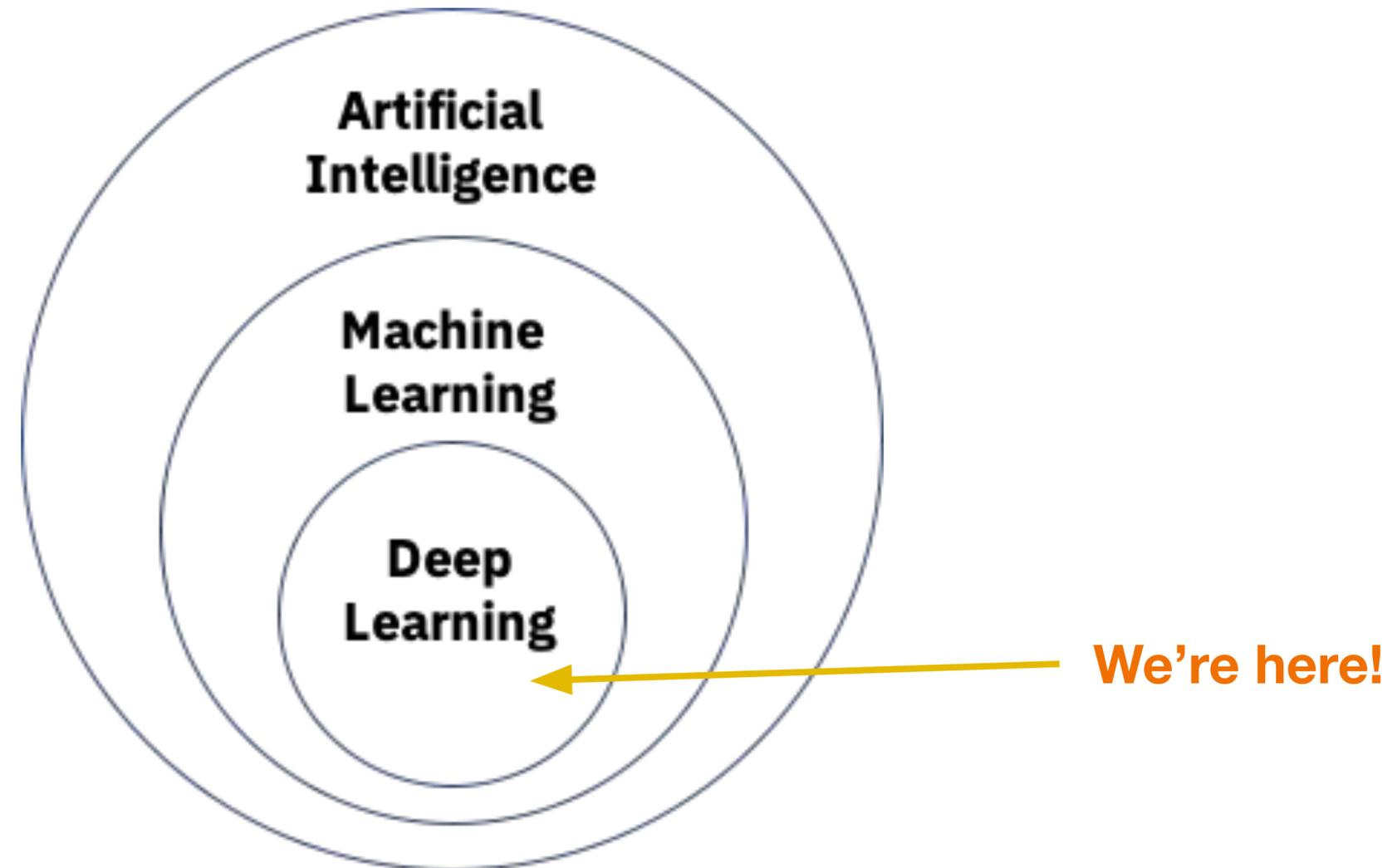
So you've undoubtedly heard about
ChatGPT...

How ChatGPT Works

How ChatGPT Works

Training ChatGPT Using ChatGPT

Training ChatGPT



- ChatGPT's goal: **Generating** new, human-like text for conversations

Training ChatGPT: The Beginning

- ChatGPT's goal: **Generating** new, human-like text for conversations



- **“Generative Pretrained Transformers”**
- Large Language Model (LLM)
- *Next-Token Prediction*

Large language models



Large



Large training dataset



Large number of parameters



General purpose



Commonality of human languages



Resource restriction



Pre-trained and fine-tuned

Training ChatGPT: The Beginning



Training ChatGPT: The Beginning

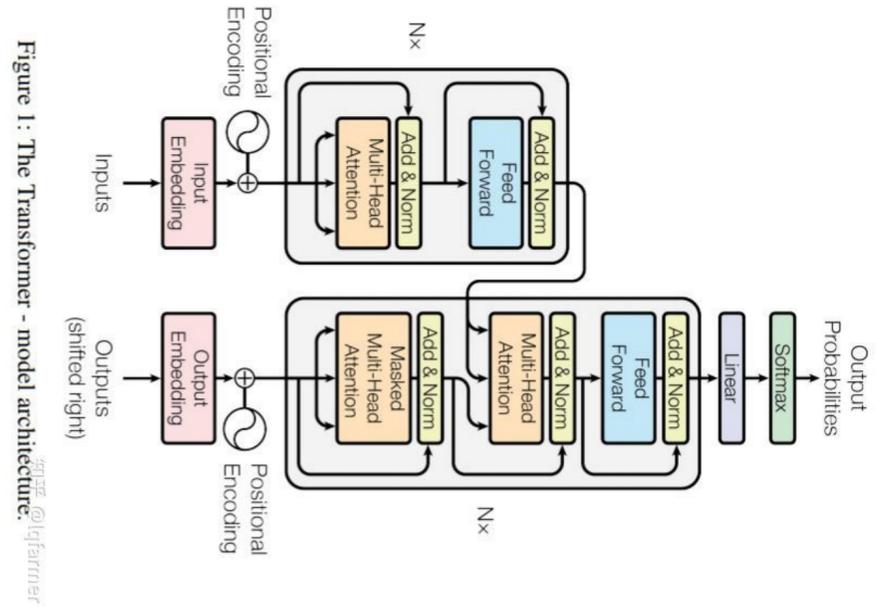
[Text input]



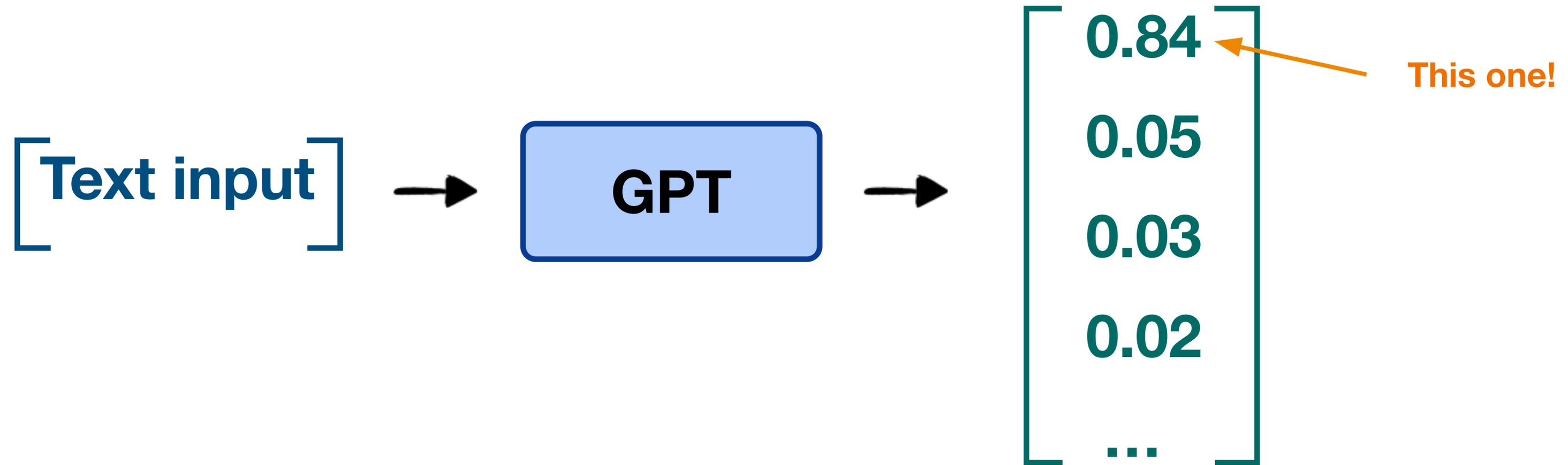
GPT



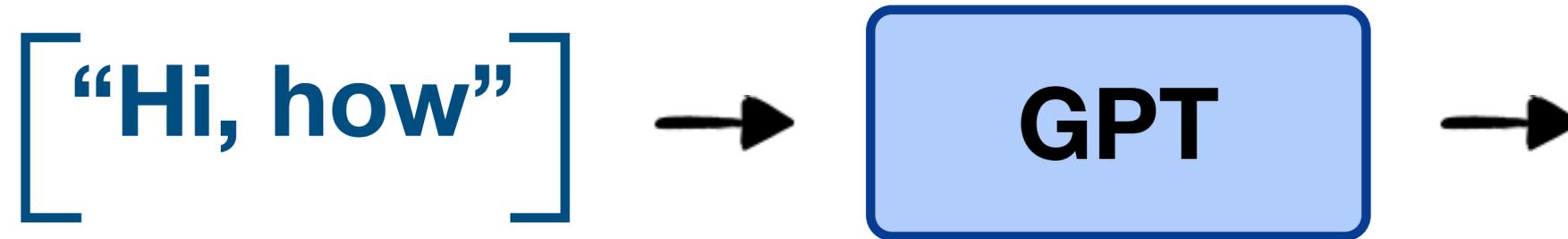
[Next word]



Training ChatGPT: The Beginning



Predicting Next Word



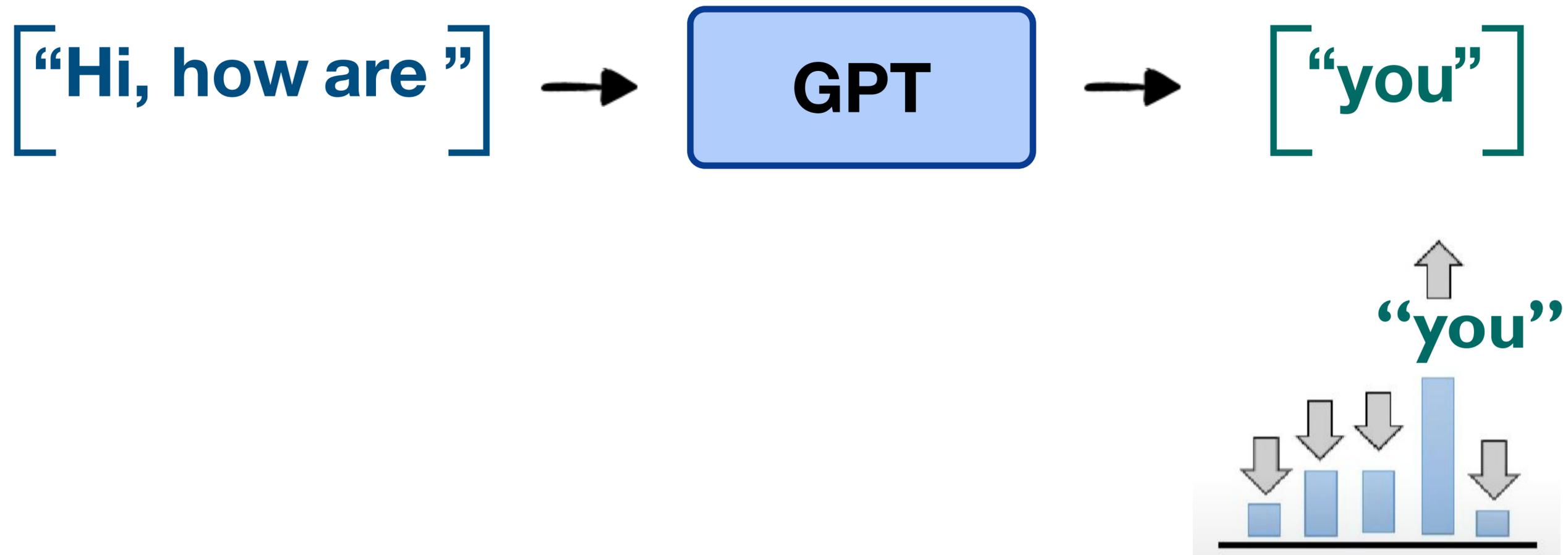
Predicting Next Word

- Now we **repeat** and **generate more text!**



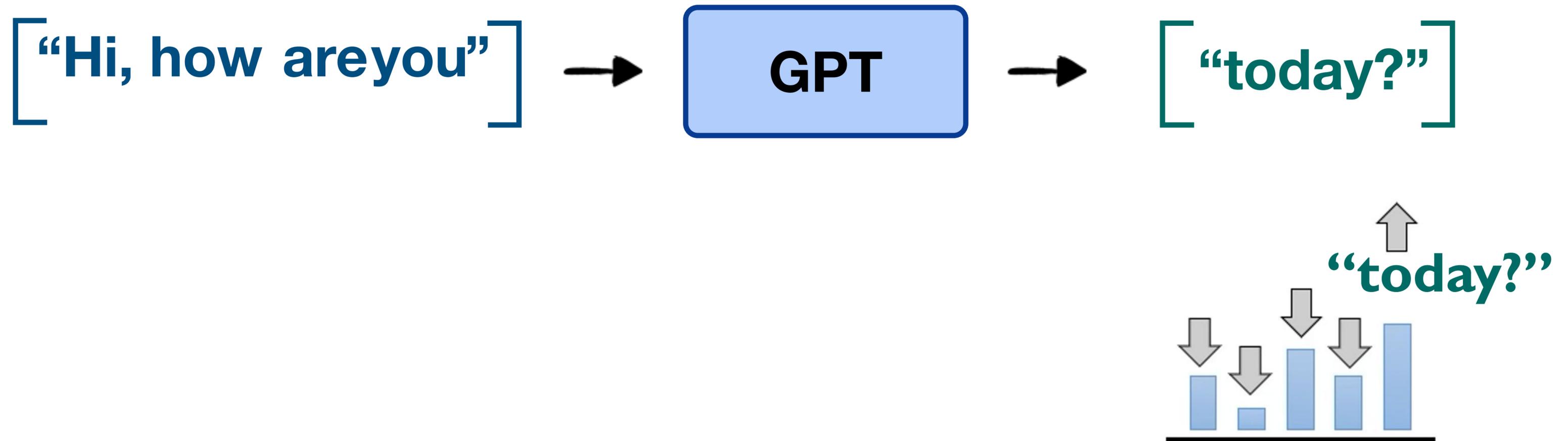
Predicting Next Word

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Predicting Next Word

- Now we **repeat** and **generate more text!**



Predicting Next Word

- Now we **repeat** and **generate more text!**



Already a powerful tool. But...

“What is the highest mountain range?”

GPT



“The highest mountain range is the Himalayas.”



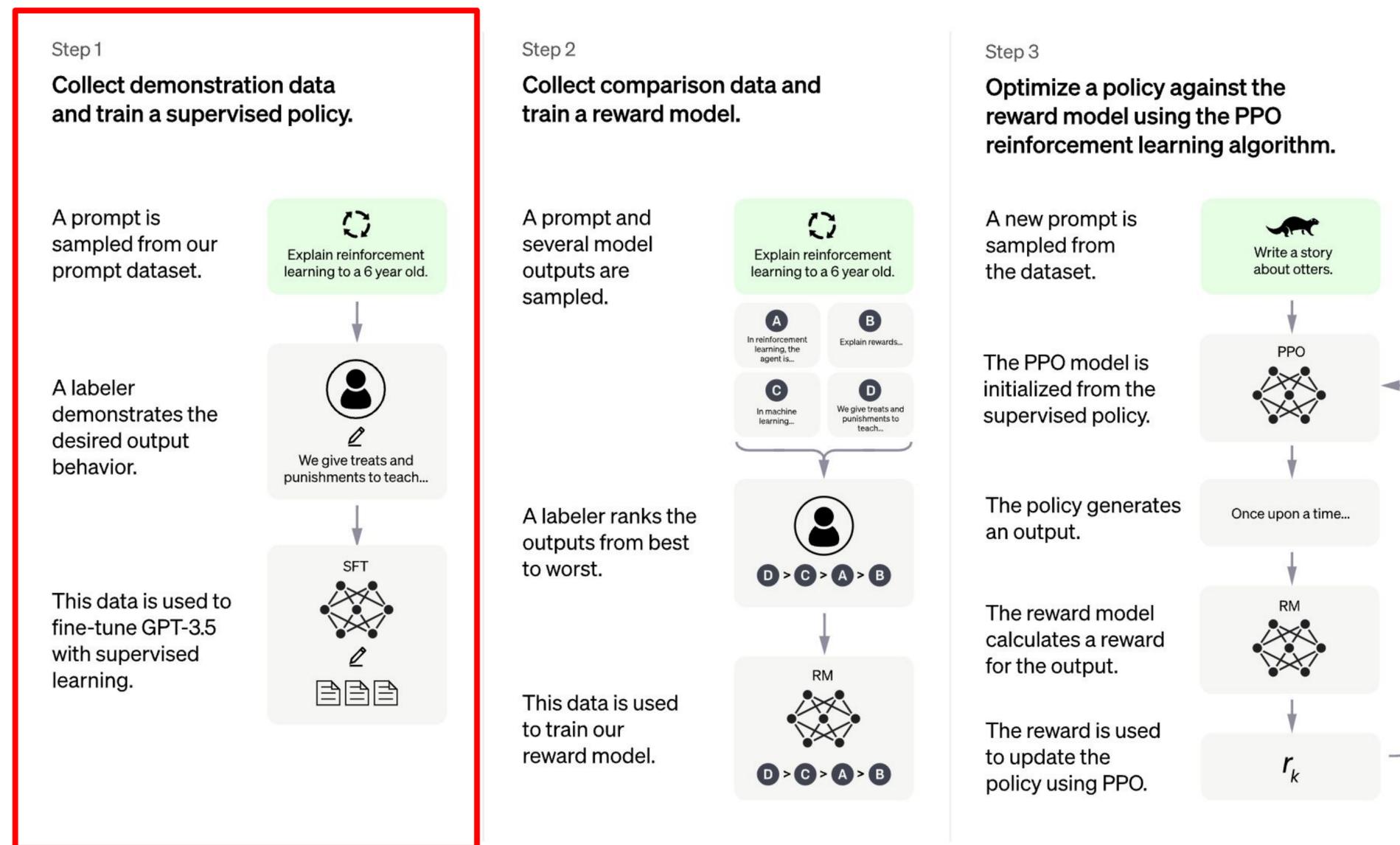
“A. Himalayas; B. K2; C. ...”



“Do you know?”

Training ChatGPT from GPT: Fine-tuning

- Reinforcement learning from human feedback (RLHF)



CREDIT: <https://openai.com/blog/chatgpt>

“What is the highest mountain range?”

human

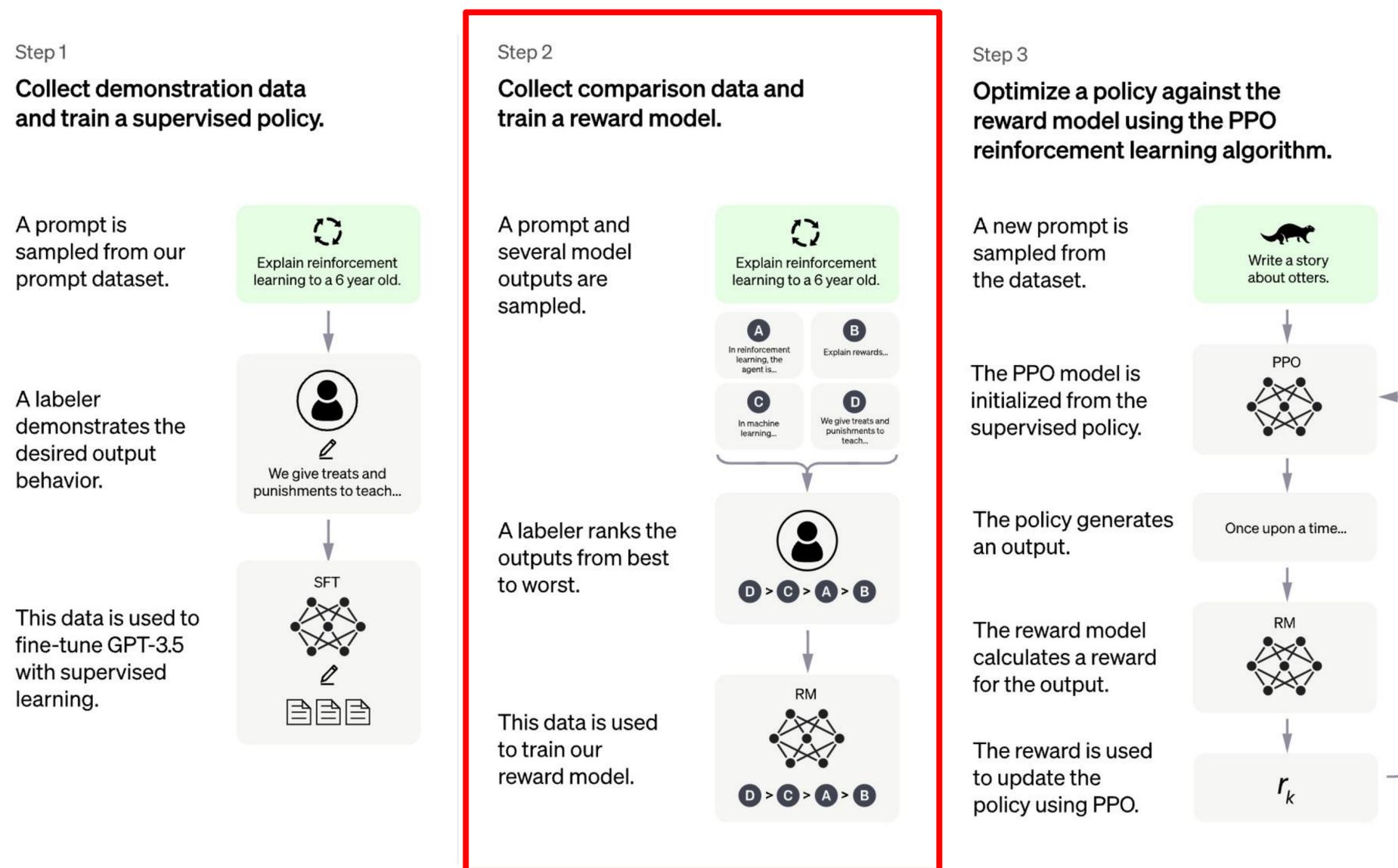
“The highest mountain range is the Himalayas.”

Fine-tuning

ChatGPT

Training ChatGPT: Specialisation

- Reinforcement learning from human feedback (RLHF)



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“What is the highest mountain range?”

GPT



“The highest mountain range is the Himalayas.”



Human labeling



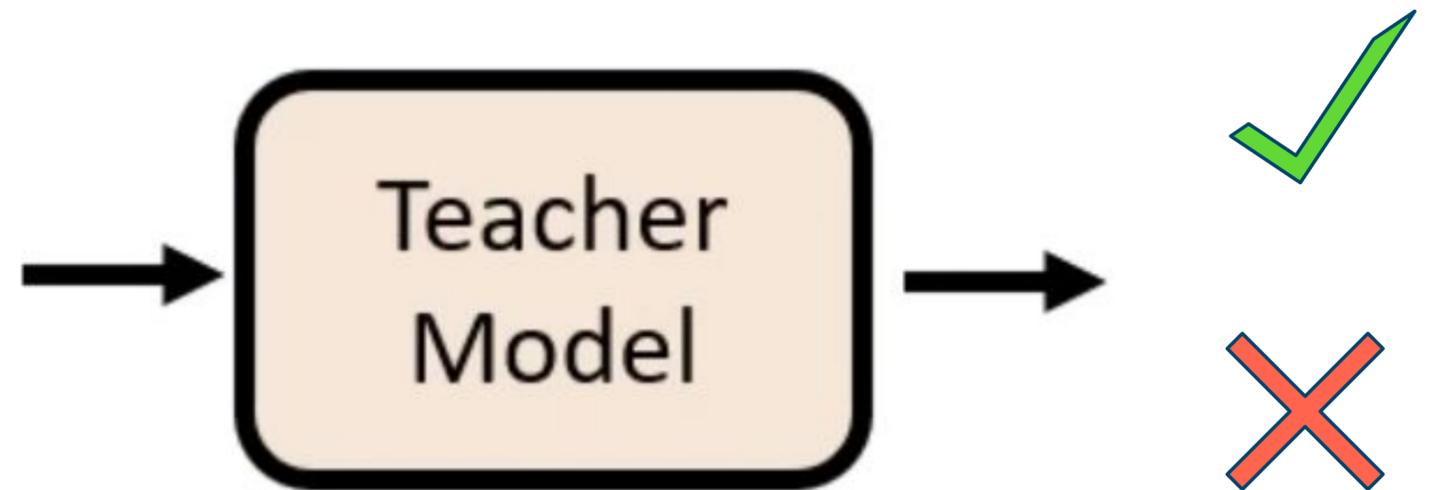
“A. Himalayas; B. K2; C. .”



“What is the highest mountain range?”

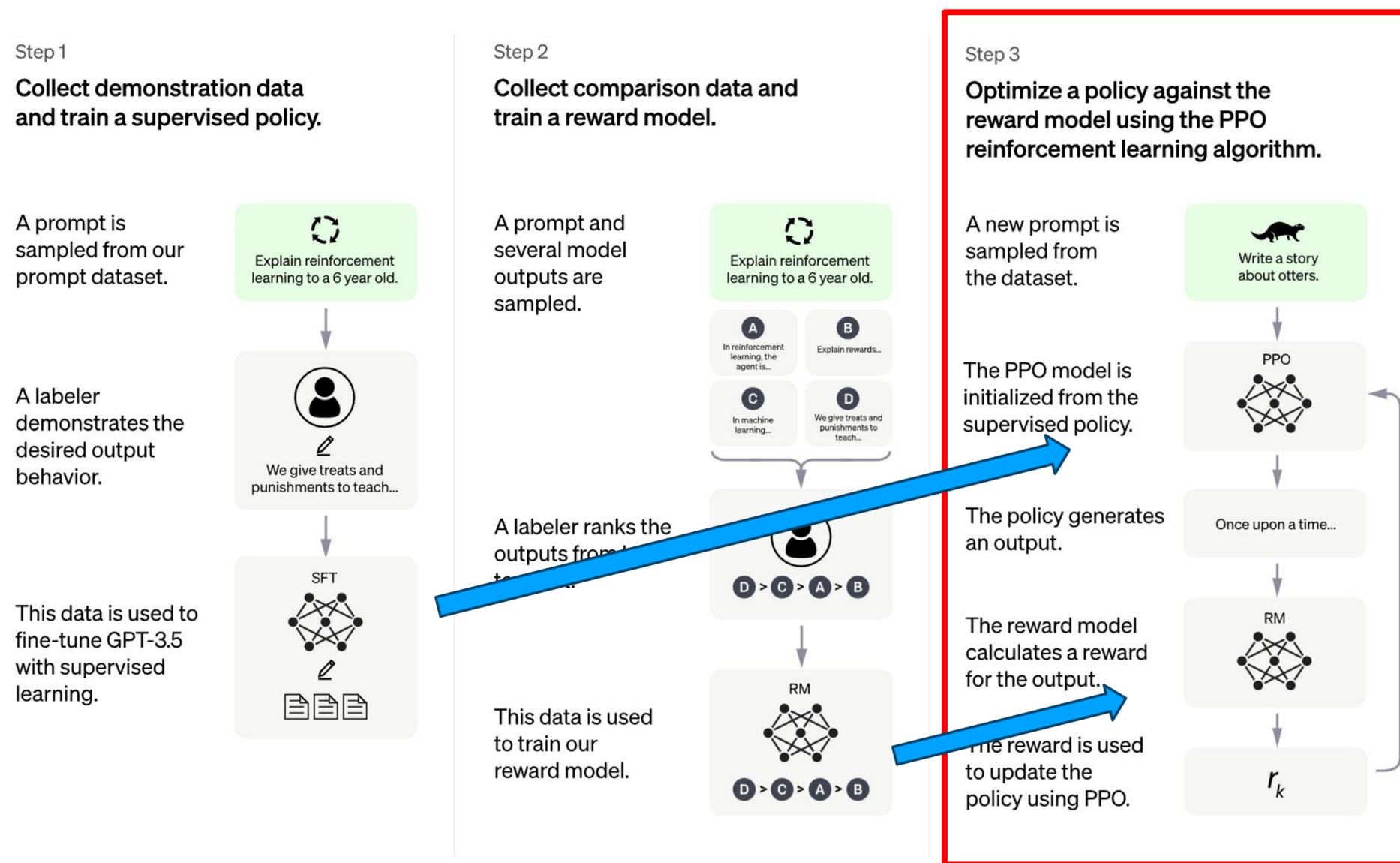
“The highest mountain range is the Himalayas.”

“A. Himalayas; B. K2; C. .”



Training ChatGPT: Specialisation

- Reinforcement learning from human feedback (RLHF)



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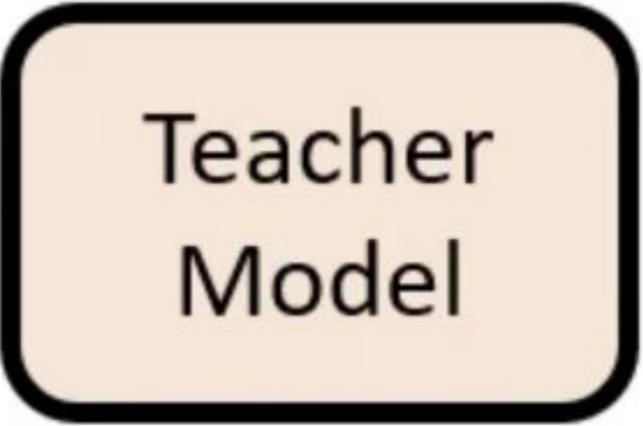
“What is the highest mountain range?”



Reward Signal



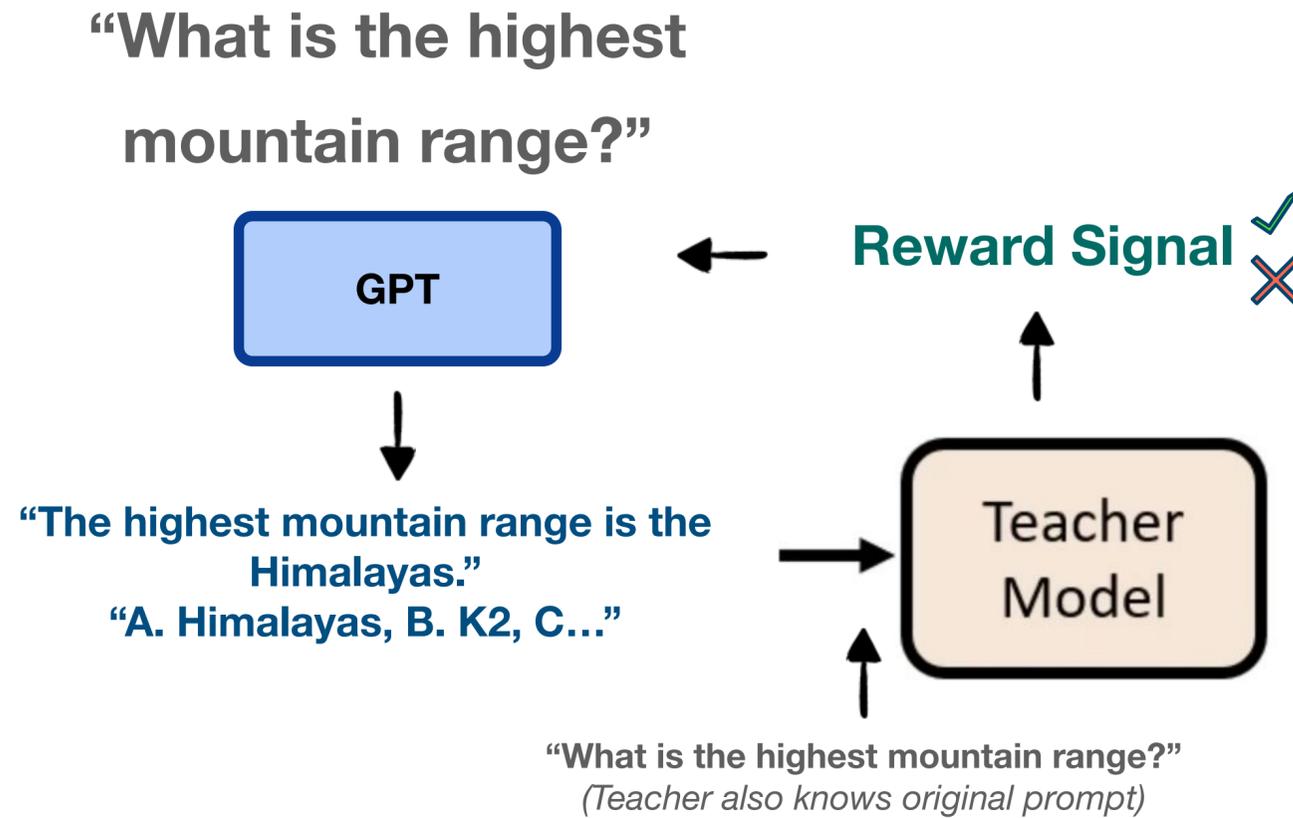
“The highest mountain range is the Himalayas.”
“A. Himalayas, B. K2, C...”



“What is the highest mountain range?”
(Teacher also knows original prompt)

Training ChatGPT

- Pretrained large language models + fine-tuning = **ChatGPT**.



How ChatGPT Works

Training ChatGPT Using ChatGPT

ChatGPT

- Importantly, ChatGPT's **primary goal** is to **generate as human-like text as possible**.
- The model is **probabilistic**.
- It is **by no means** guaranteed to be correct.
- It provides good starting points, but **verify!**

Some Warnings

1. **Don't take what it says for granted!** Always fact check its information.



Steven A. Schwartz told a judge considering sanctions that the episode had been “deeply embarrassing.” Jefferson Siegel for The New York Times

Some Warnings

1. **Don't take what it says for granted!** Always fact check its information.
2. **Your conversations are part of its learning process.** Data privacy rules apply; be careful!

<https://openai.com/policies/privacy-policy>

1. Personal information we collect

We collect personal information relating to you (“Personal Information”) as follows:

Personal Information You Provide: We collect Personal Information if you create an account to use our Services or communicate with us as follows:

- *Account Information:* When you create an account with us, we will collect information associated with your account, including your name, contact information, account credentials, payment card information, and transaction history, (collectively, “Account Information”).
- *User Content:* When you use our Services, we collect Personal Information that is included in the input, file uploads, or feedback that you provide to our Services (“Content”).

Some Warnings

1. **Don't take what it says for granted!** Always fact check its information.
2. **Your conversations are part of its learning process.** Data privacy rules apply; be careful!
3. **ChatGPT is a neutral tool.** It falls on you to ensure your uses are ethical and sanctioned.

Some Warnings

1. **Don't take what it says for granted!** Always fact check its information.
 2. **Your conversations are part of its learning process.** Data privacy rules apply; be careful!
 3. **ChatGPT is a neutral tool.** It falls on you to ensure your uses are ethical and sanctioned.
- **Give specific instructions to the bot**
 - Make sure you leave little to no room for error!
 - **Treat the responses like suggestions, not facts**
 - It's good at a lot of things, but not great at one particular thing



AI Bridge

Xin Liu, Professor, Computer Science. UC Davis

With acknowledgments to

AI Institute for Food Systems

Cupertino Library