

# Visualization Design and Redesign

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**CS 448B: Visualization  
Fall 2020**

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**Last Time:  
Data and Image Models**

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# The big picture

## task

questions, goals,  
assumptions

## data

physical type  
int, float, etc.  
abstract type  
nominal, ordinal, etc.

## domain

metadata  
semantics  
conceptual model  
conventions

## processing algorithms

mapping  
visual encoding

## image

graphical marks  
visual channel

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# Nominal, ordinal and quantitative



On the theory of scales of measurements  
S. S. Stevens, 1946

## N - Nominal (labels)

Fruits: Apples, oranges, ...

Operations: =, ≠

## O - Ordered

Quality of meat: Grade A, AA, AAA

Operations: =, ≠, <, >

## Q - Interval (location of zero arbitrary)

Dates: Jan, 19, 2016; Loc.: (LAT 33.98, LON -118.45)

Like a geometric point. Cannot compare directly

Only differences (i.e. intervals) may be compared

Operations: =, ≠, <, >, -

## Q - Ratio (location of zero fixed)

Physical measurement: Length, Mass, Temp, ...

Counts and amounts

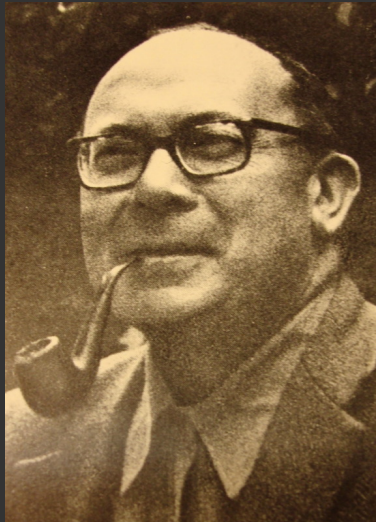
Like a geometric vector, origin is meaningful

Operations: =, ≠, <, >, -, ÷

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# Marks and Visual Variables



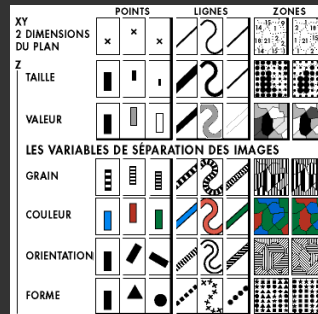
Semiology of Graphics  
J. Bertin, 1967

**Marks:** geometric primitives



**Visual Variables:** control mark appearance

- Position (2x)
- Size
- Value
- Texture
- Color
- Orientation
- Shape



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# Bertins' "Levels of Organization"

Position

N	O	Q
---	---	---

Size

N	O	Q
---	---	---

Value

N	O	q
---	---	---

Texture

N	o	
---	---	--

Color

N		
---	--	--

Orientation

N		
---	--	--

Shape

N		
---	--	--

**N** Nominal

**O** Ordered

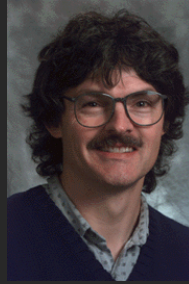
**Q** Quantitative

Note: Q < O < N

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# Automated design

Jock Mackinlay's APT 86



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## Combinatorics of encodings

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### Challenge:

Assume 8 visual encodings and  $n$  data fields

Pick the best encoding from the exponential number of possibilities  $(n+1)^8$

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# Principles

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## Challenge:

Assume 8 visual encodings and  $n$  data fields

Pick the best encoding from the exponential number of possibilities  $(n+1)^8$

## Principle of Consistency:

The properties of the image (visual variables) should match the properties of the data

## Principle of Importance Ordering:

Encode the most important information in the most effective way

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# Mackinlay's expressiveness criteria

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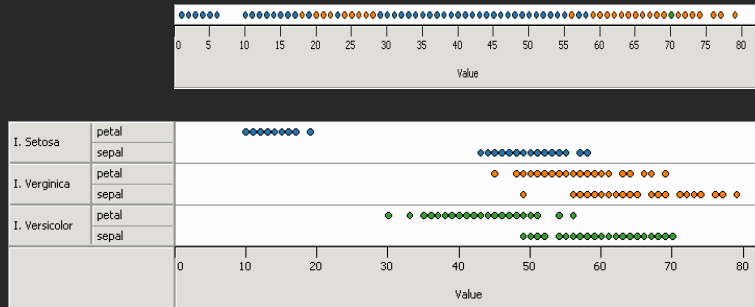
## Expressiveness

A set of facts is expressible in a visual language if the sentences (i.e. the visualizations) in the language express **all** the facts in the set of data, and **only** the facts in the data.

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# Cannot express the facts

A one-to-many (1 → N) relation cannot be expressed in a single horizontal dot plot because multiple tuples are mapped to the same position



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# Expresses facts not in the data

A length is interpreted as a quantitative value;  
 ∴ Length of bar says something untrue about N data

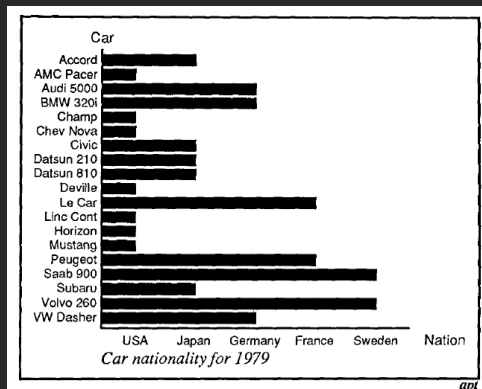


Fig. 11. Incorrect use of a bar chart for the *Nation* relation. The lengths of the bars suggest an ordering on the vertical axis, as if the USA cars were longer or better than the other cars, which is not true for the *Nation* relation.

[Mackinlay, APT, 1986]

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# Mackinlay's effectiveness criteria

## Effectiveness

A visualization is more effective than another visualization if the information conveyed by one visualization is more readily **perceived** than the information in the other visualization.

## Subject of perception lecture

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# Mackinlay's ranking

Quantitative		Ordinal		Nominal
Position	—	Position	—	Position
Length	↘ ↗	Density	↘ ↗	Hue
Angle	↘ ↗	Saturation	↘ ↗	Texture
Slope	↘ ↗	Hue	↘ ↗	Connection
Area	↘ ↗	Texture	↘ ↗	Containment
Volume	↘ ↗	Connection	↘ ↗	Density
Density	↘ ↗	Containment	↘ ↗	Saturation
Saturation	↘ ↗	Length	↘ ↗	Shape
Hue	↘ ↗	Angle	↘ ↗	Length
Texture	↘ ↗	Slope	↘ ↗	Angle
Connection	↘ ↗	Area	↘ ↗	Slope
Containment	↘ ↗	Volume	↘ ↗	Area
Shape	—	Shape	↘ ↗	Volume

Conjectured effectiveness of the encoding

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# Mackinlay's Design Algorithm

User formally specifies data model and type

Input: list of data variables ordered by importance

## APT searches over design space

Tests expressiveness of each visual encoding (rule-based)

Generates encodings that pass test

Rank by perceptual effectiveness criteria

Outputs *most effective* visualization

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# Automatic chart construction



Automating the design of graphical presentation of relational information  
J. Mackinlay, 1986

Encode most important data using highest ranking visual variable for the data type

Price	Mileage	Weight
13,500	22	3000
7,200	31	1500
11,300	12	4200
...	...	...

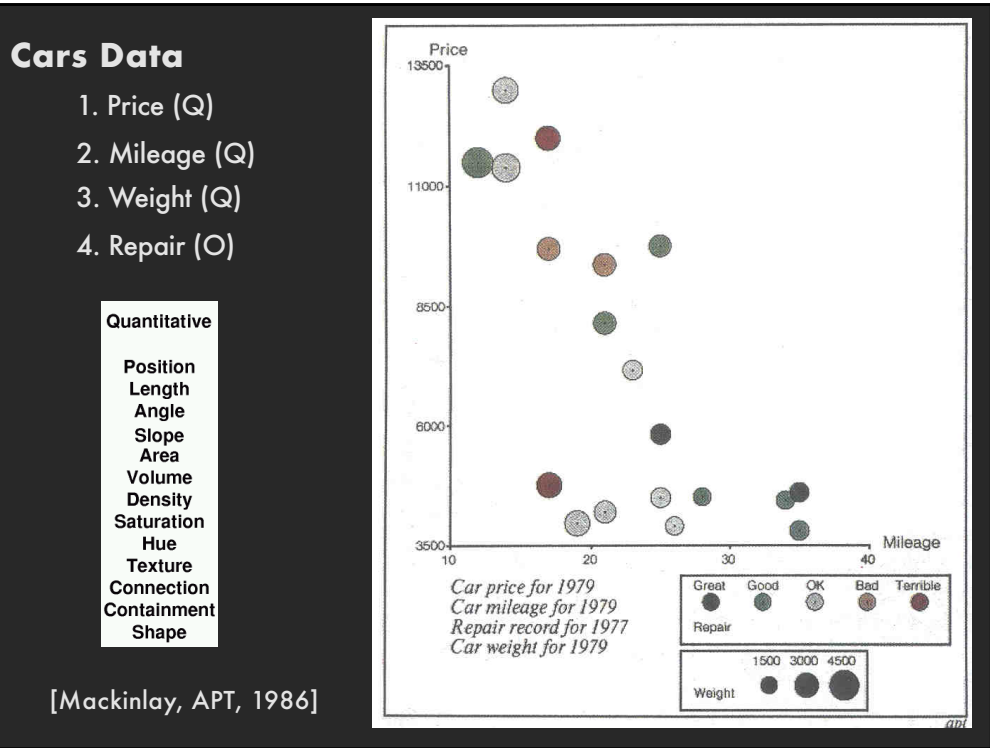
- 
1. Price (Q)
  2. Mileage (Q)
  3. Weight (Q)

Quantitative	Ordinal	Nominal
Position	Position	Position
Length	Density	Hue
Angle	Saturation	Texture
Slope	Hue	Connection
Area	Texture	Containment
Volume	Connection	Density
Density	Containment	Saturation
Saturation	Length	Shape
Hue	Angle	Length
Texture	Slope	Angle
Connection	Area	Slope
Containment	Volume	Area
Shape	Shape	Volume

mark: lines

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- Price → y-pos (Q)
  - Mileage → x-pos (Q)
  - Weight → size (Q)

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## Limitations

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- Does not cover many visualization techniques**
  - Networks, maps, diagrams
  - Also, 3D, animation, illustration, ...
- Does not consider interaction**
- Does not consider semantics or conventions**
- Assumes single visualization as output**

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## Summary

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### Formal specification

- **Data model:** relational data, N,O,Q types
- **Image model:** marks, attributes, encodings
- **Encodings mapping data to image**

### Choose expressive and effective encodings

- **Rule-based test of expressiveness**
- **Perceptual effectiveness rankings**

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## Announcements

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# Announcements

## Class participation requirements

Complete readings and notebooks before class

In-class discussion

Post at least 1 discussion substantive comment/question per week.

1 pass for the quarter

## Class website

<https://magrawala.github.io/cs448b-fa20>

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# A2: Exploratory Data Analysis

Use **Tableau** to formulate & answer questions

## First steps

Step 1: Pick domain & data

Step 2: Pose questions

Step 3: Profile data

Iterate as needed

## Create visualizations

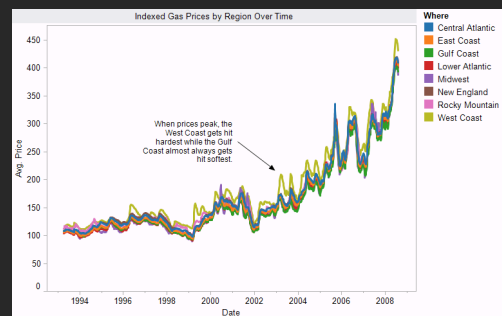
Interact with data

Refine questions

## Author a report

Screenshots of most insightful views (10+)

Include titles and captions for each view



**Due before class on Oct 6, 2020**

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# A1 Review

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## Design Considerations

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**Guides: Title, labels, legend, captions, source!**

### **Expressiveness and Effectiveness**

Express the facts and only the facts

Avoid unexpressive marks (lines? gradients?)

Use perceptually effective encodings that match data type

Don't distract: faint gridlines, pastel highlights/fills

The "elimination diet" approach – start minimal

### **Support comparison and pattern perception**

Between elements, to a reference line, or to counts

Use reader-friendly units and labels

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## Design Considerations

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**Group / sort data** by meaningful dimensions

**Transform data** (e.g., filter, log, normalize)

Are model choices (regression lines) appropriate?

**Reduce cognitive overhead**

Minimize visual search, minimize ambiguity

Appropriate size, aspect ratio, legible text

Avoid legend lookups if direct labeling works

Avoid color mappings with indiscernible colors

**Be consistent!** Visual inferences should consistently support data inferences

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## Participating in the discussion

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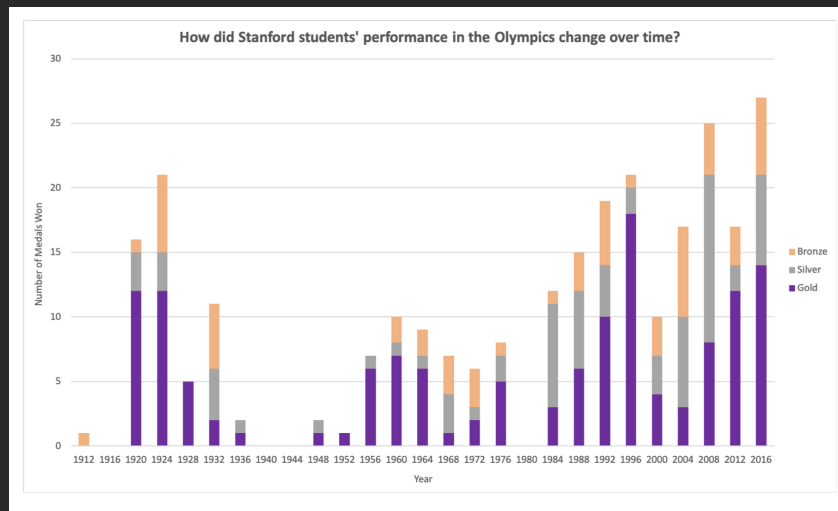
**Let's try this**

- Everyone unmute
- Speak raise hand in zoom and I'll call on you
- Turn on video if you are comfortable

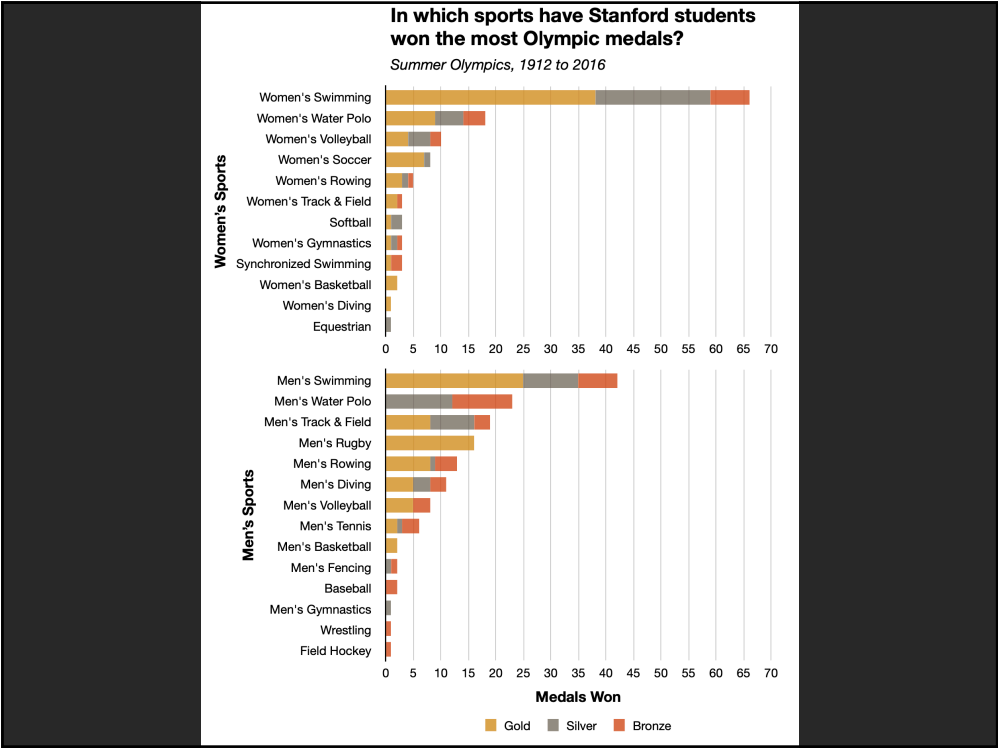
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# Stacked Bar Charts (most common)

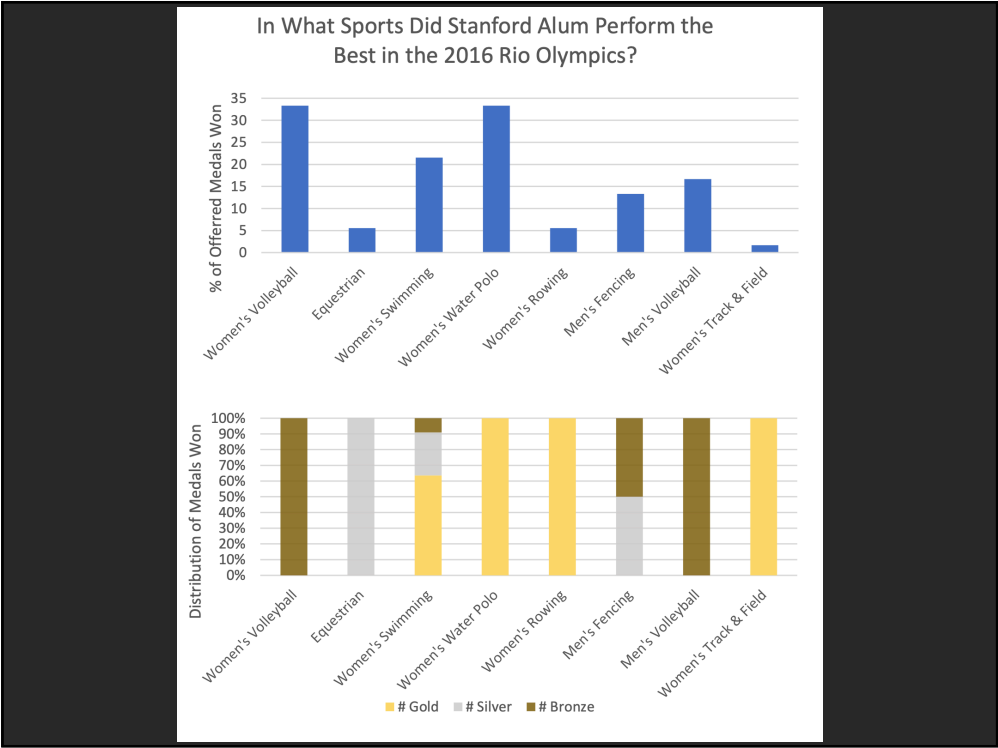
34



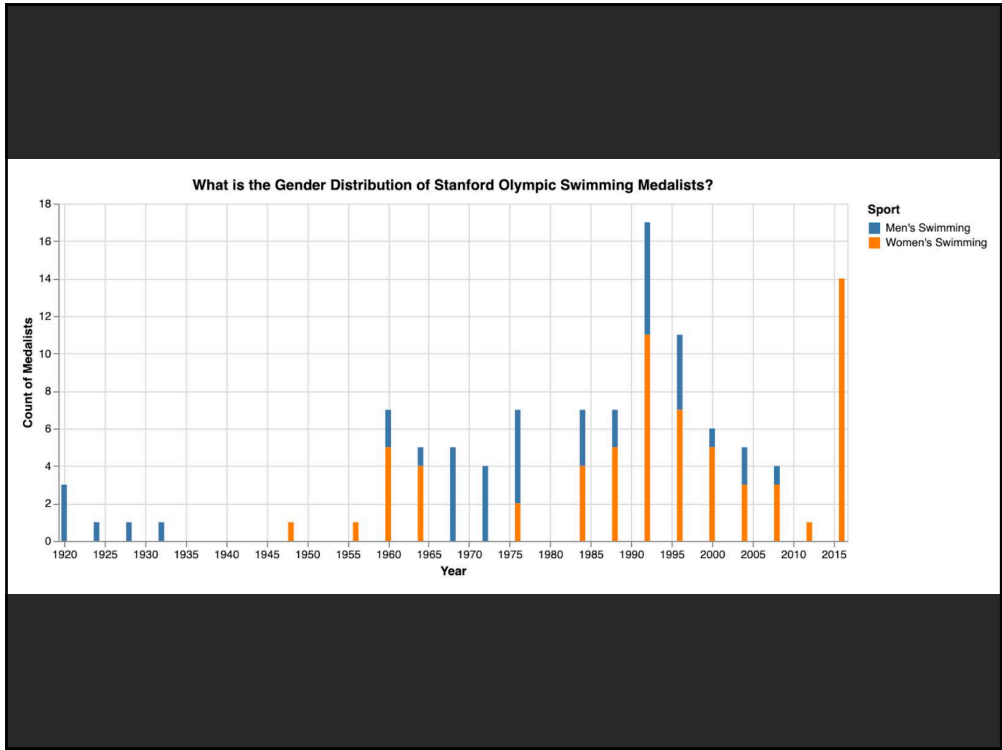
36



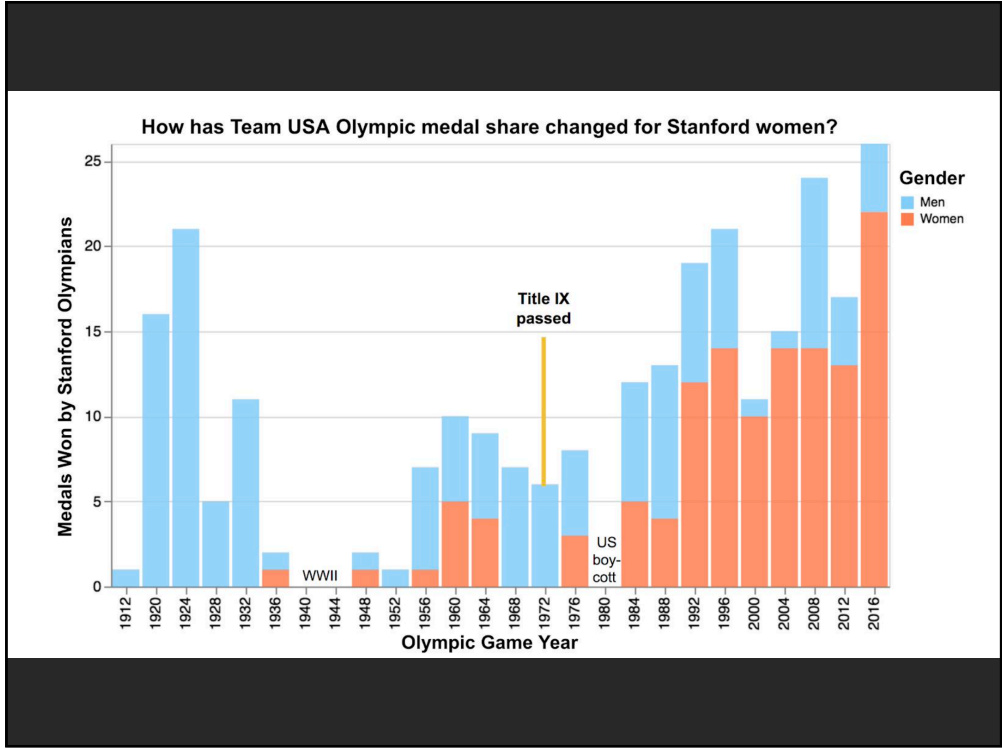
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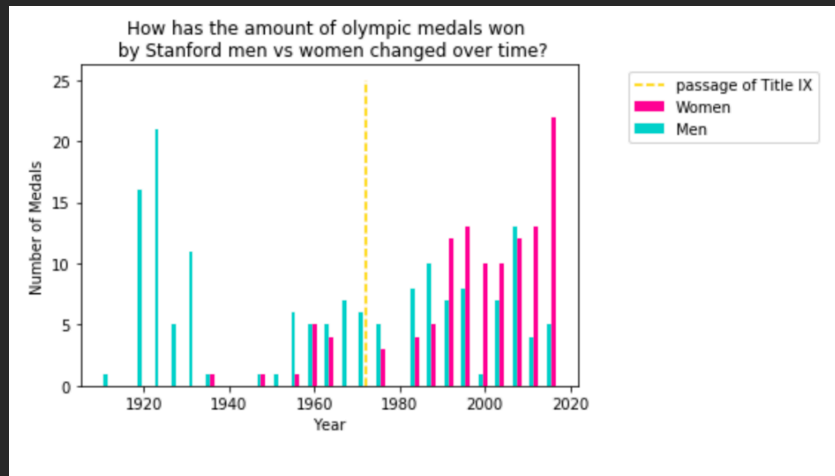
39



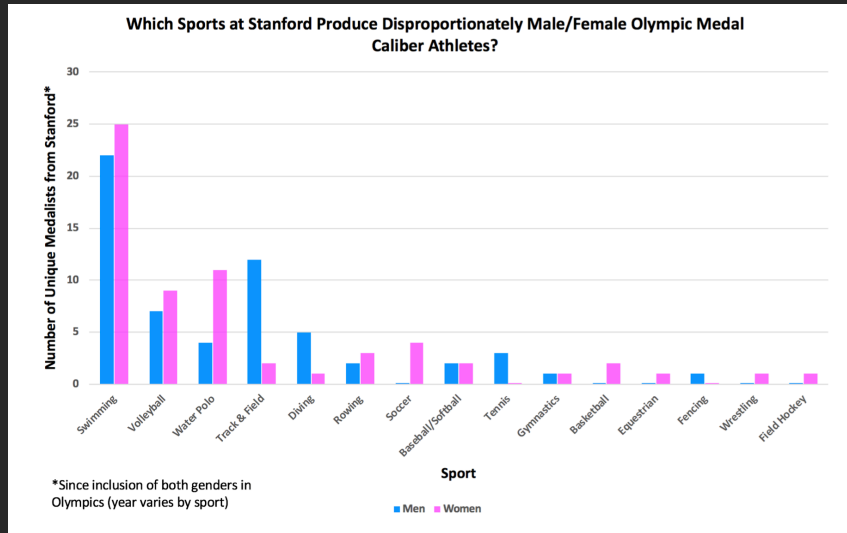
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# Grouped Bar Charts

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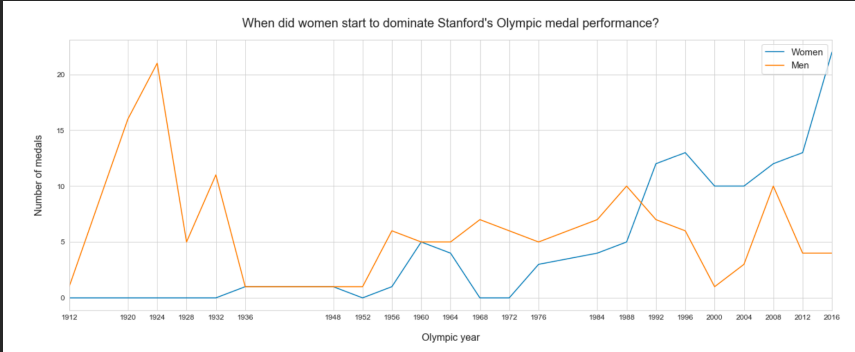


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# Line Charts

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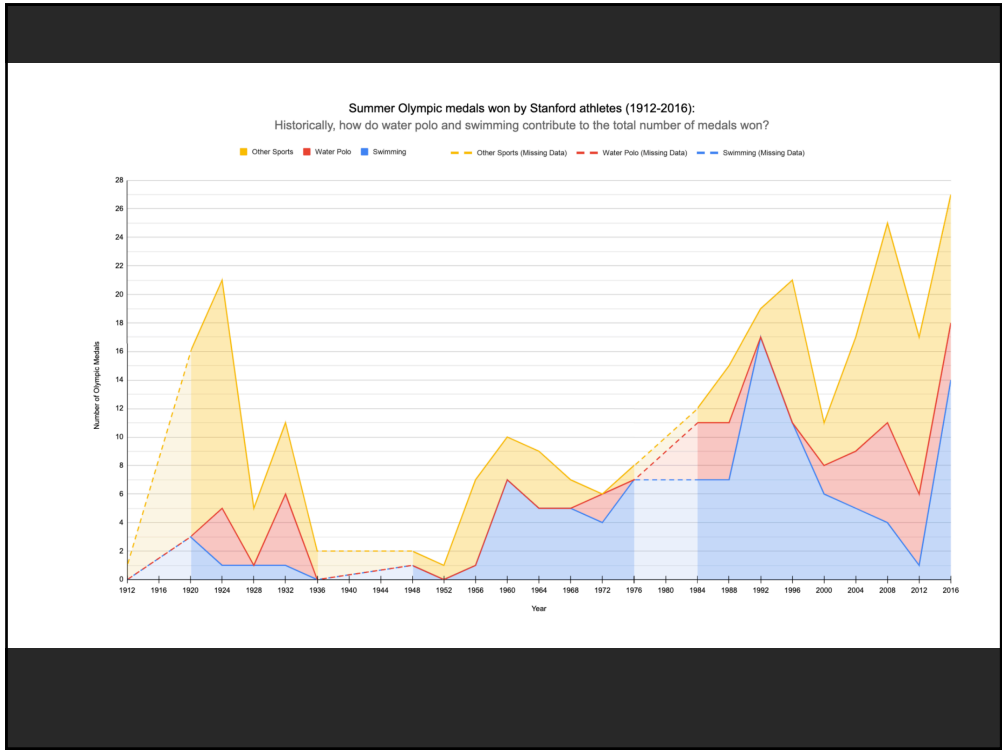




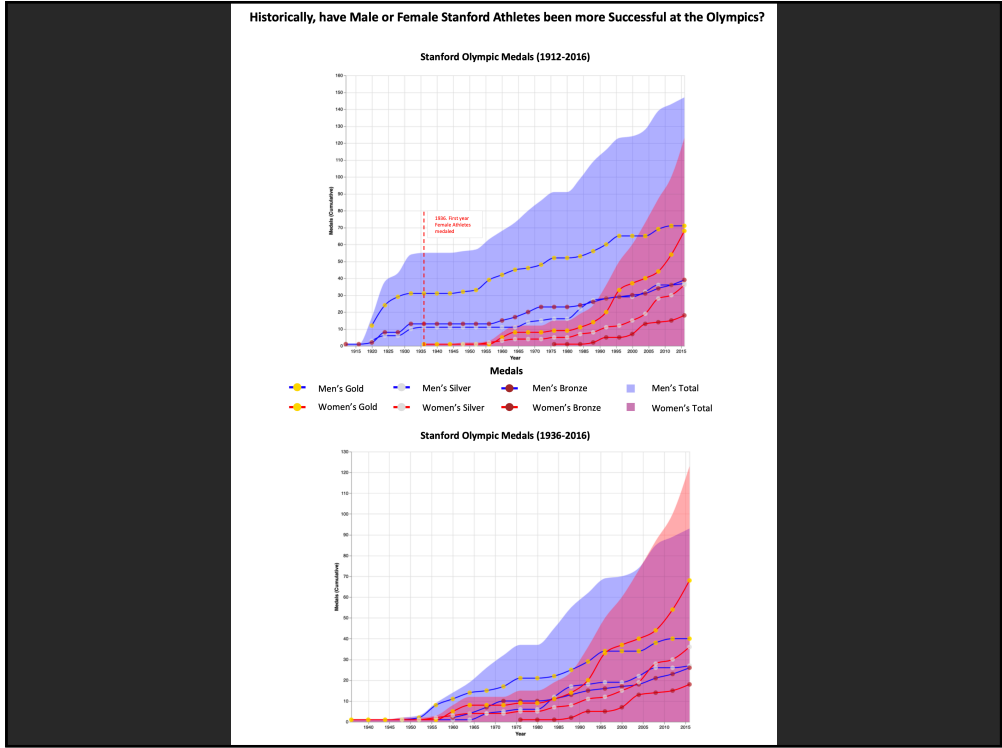
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# Area Charts

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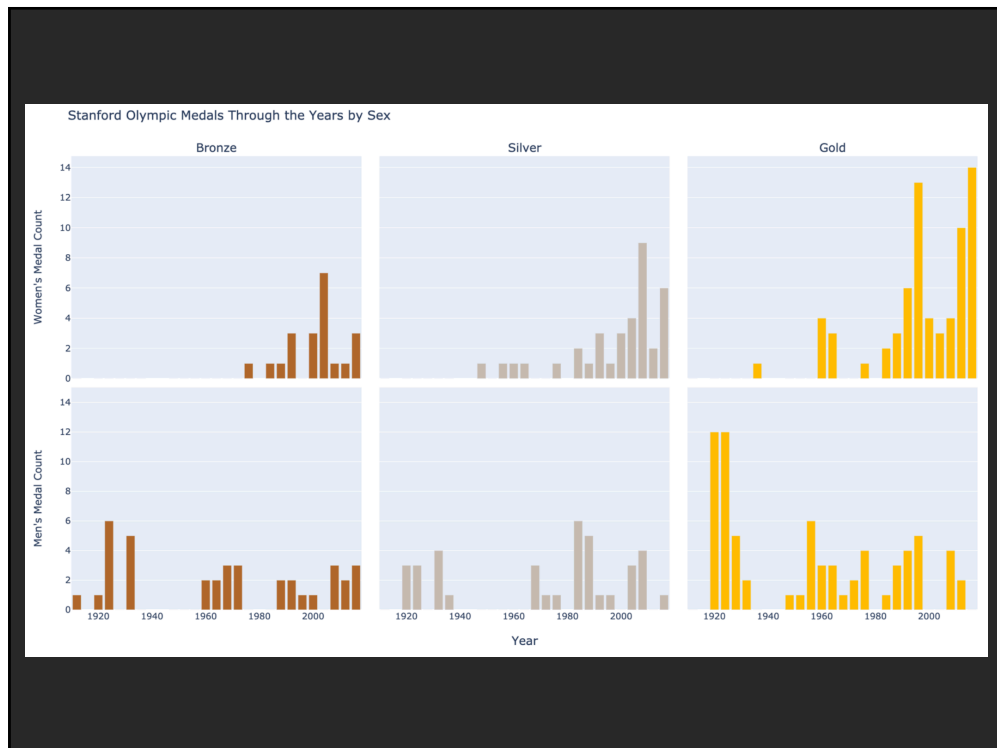
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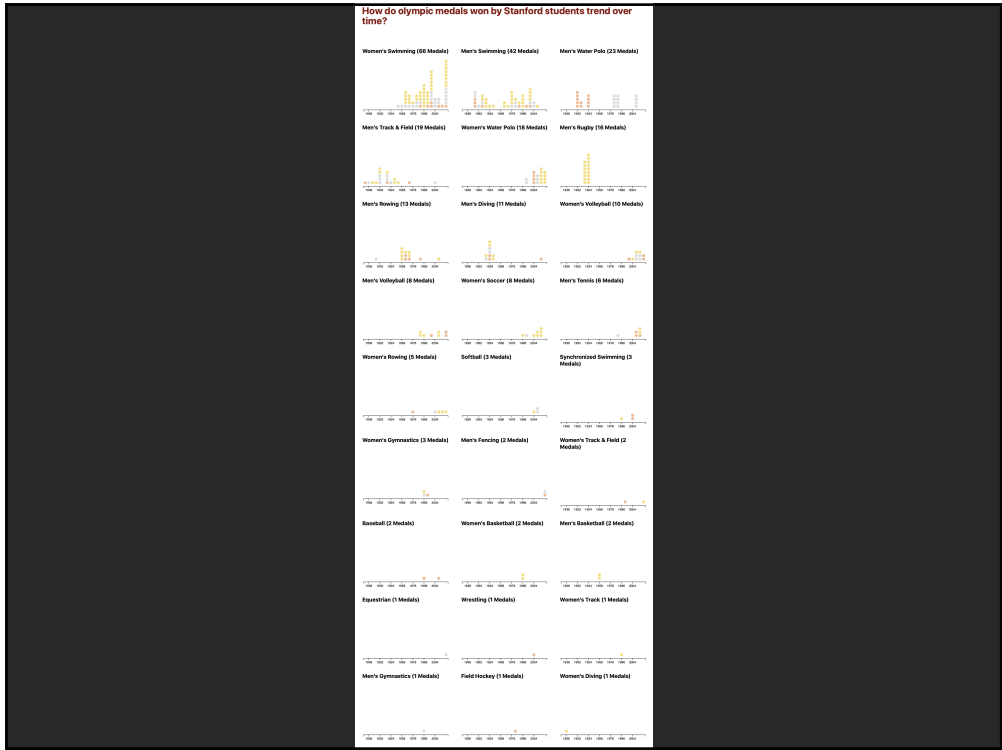
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# Small Multiples

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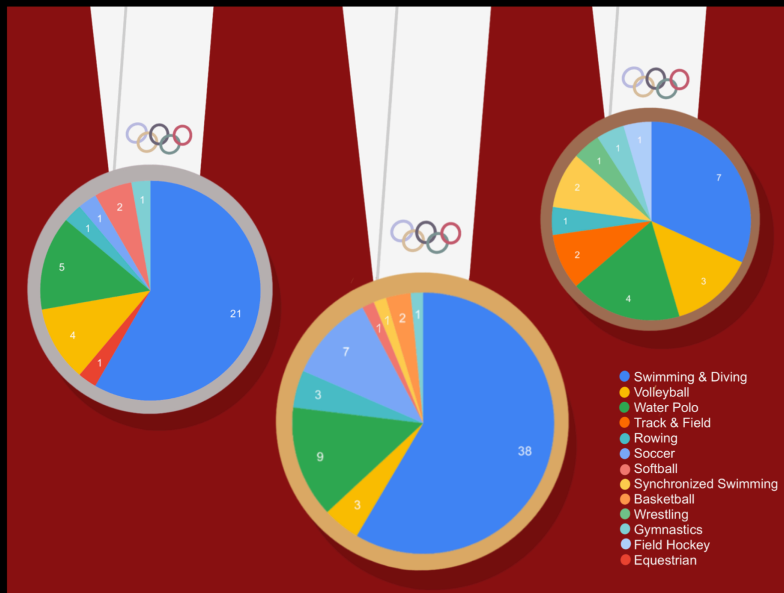


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# Pie Charts

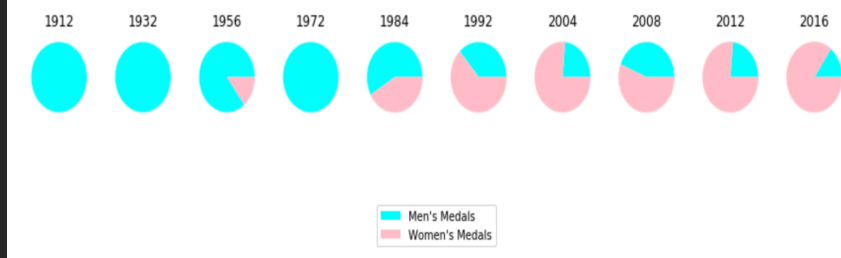
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Of All Stanford female Olympians, What Sport Has Won The Most Medals?



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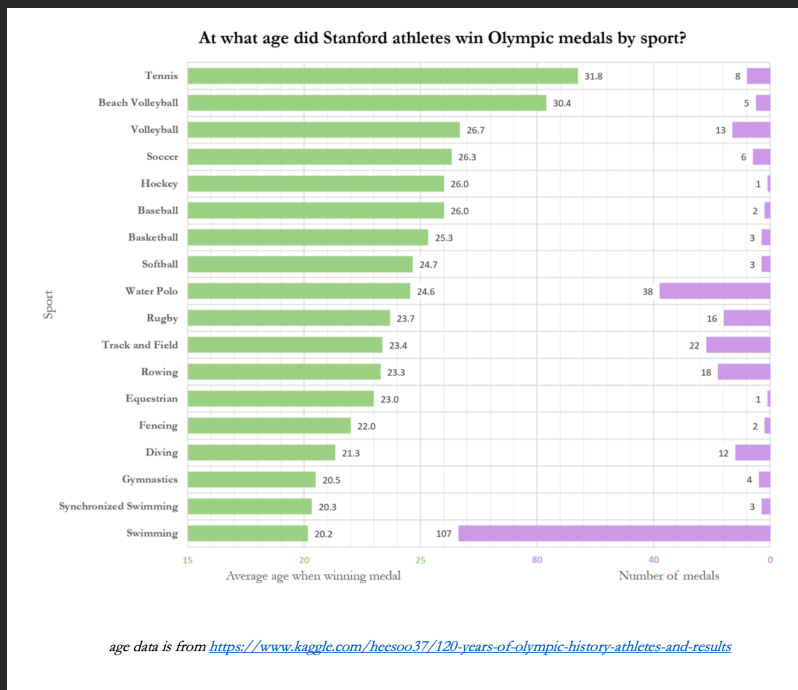
Did Stanford's Olympic medal distribution between genders change over time?



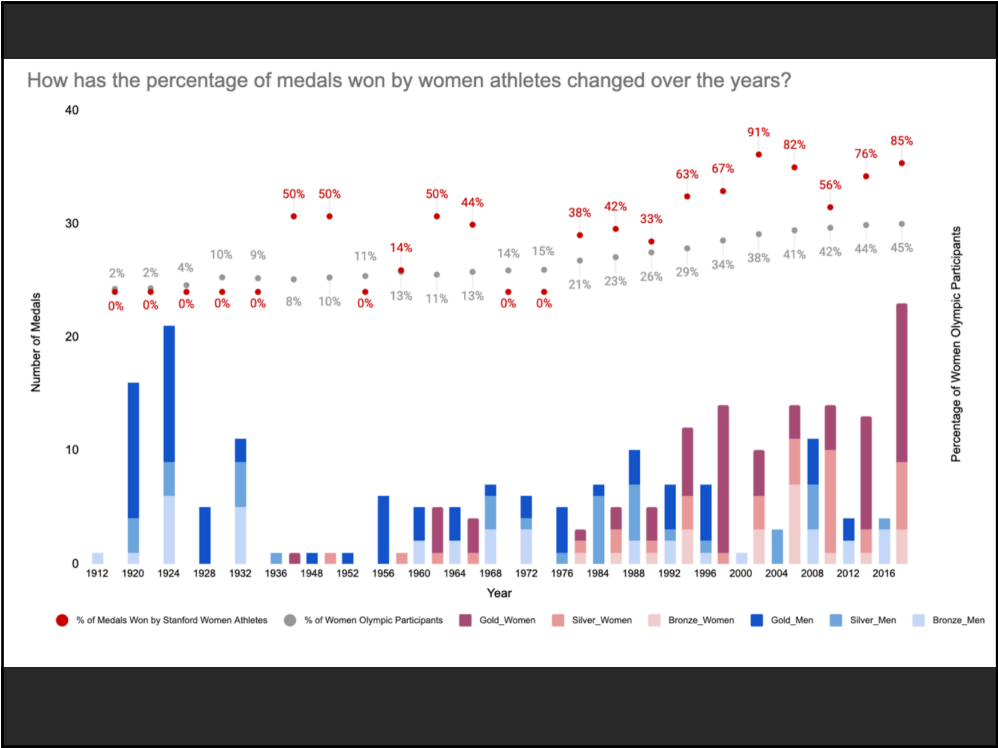
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# Multiple Encodings

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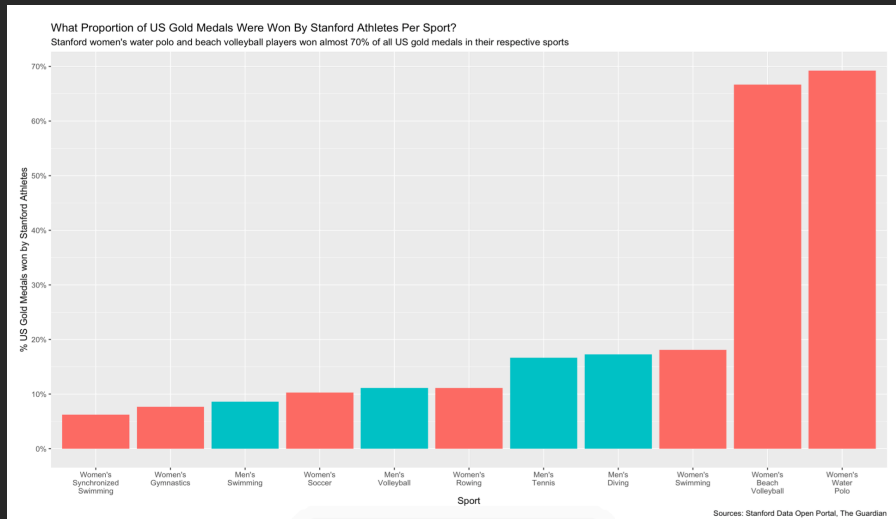
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# Additional Data

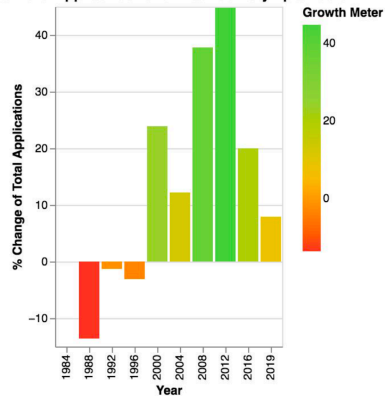
70



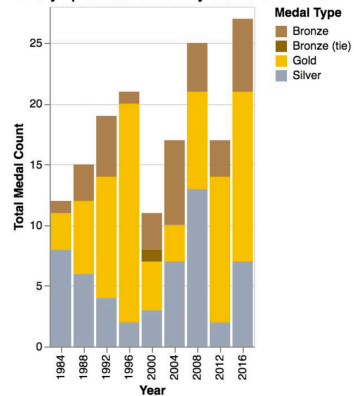
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### Do Stanford Athlete Performances at the Summer Olympics Impact Admissions Numbers in Subsequent Years?

Stanford Applicant Growth Between Olympic Years



Summer Olympic Medals Won By Stanford Athletes



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