



# How to elicit beliefs when the distribution matters

Paolo Crosetto (INRAE) & Thomas De Haan (UiB)

SEET Meeting, Valencia, February, 3rd 2023

# This talk

A sales pitch



A (nascent) research program



**It's tough to make  
predictions**

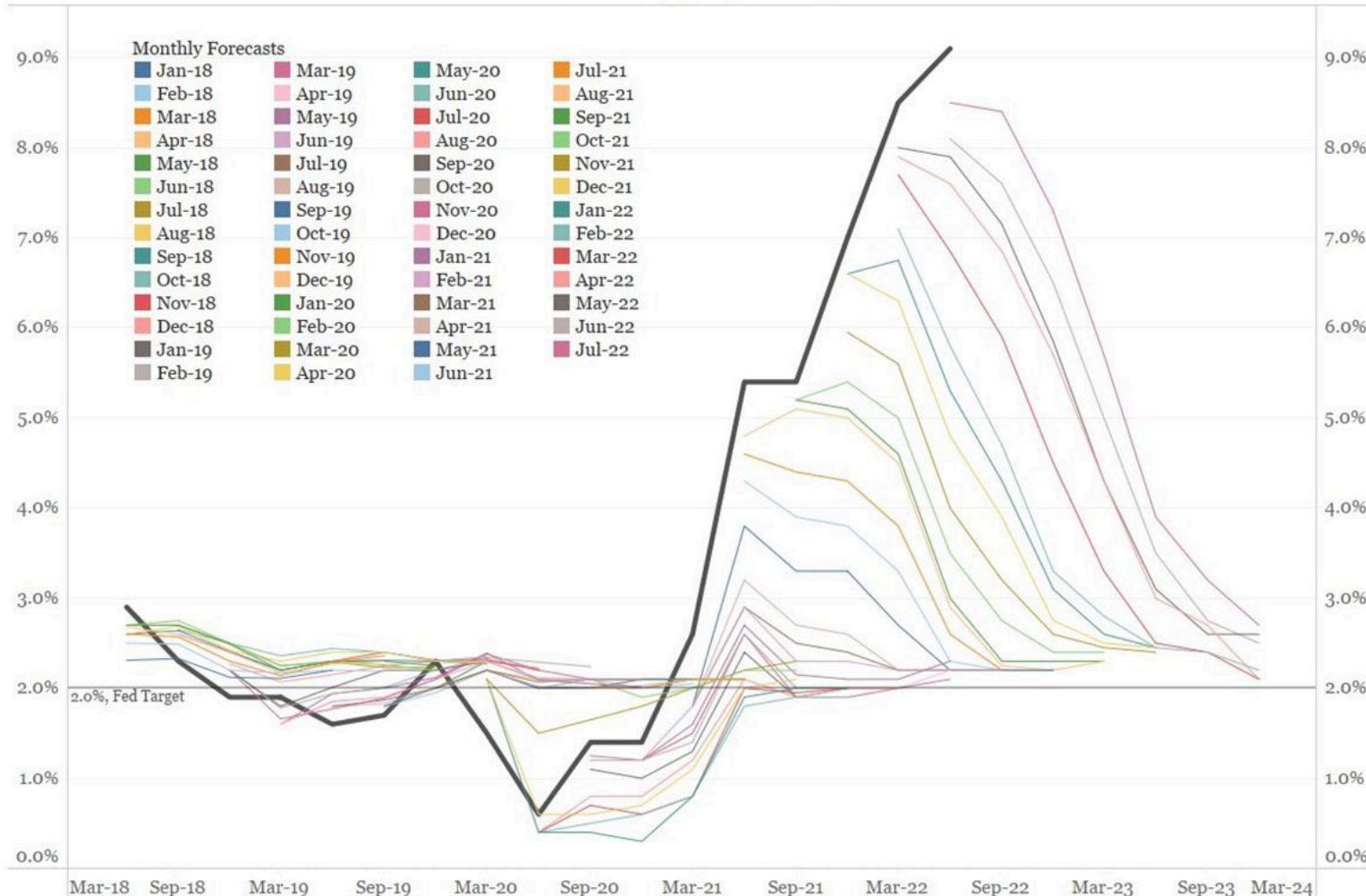
# It's tough to make predictions

(especially about the future)

# Inflation

## The Forecasts Always End at 2%

January 2018 to July 2022

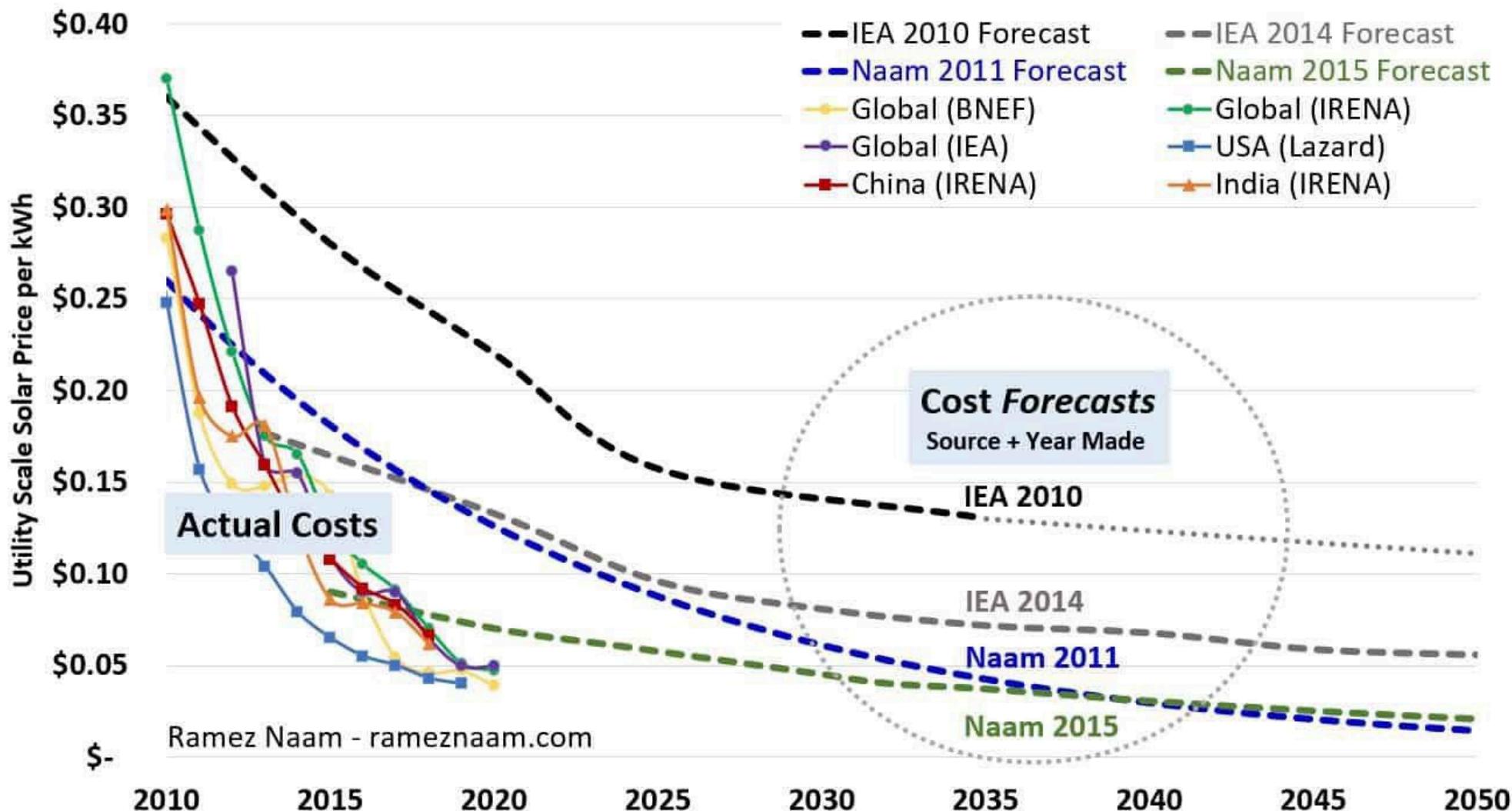


Data Source: Bloomberg, Bureau of Labor Statistics

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<https://www.biancoresearch.com/>

# Solar

## Solar Costs Are Decades Ahead of Forecasts



# Are they just *bad*

or do they just don't face the right incentives?

**Research program: how  
best to incentivize  
forecasters?**

# The problem

- usually: forecasters do **not** face incentive compatible contracts
  - i.e. *they don't pay for their mistakes*
  - market signals are distorted
  - opaque, small market
- solutions:
  - reputation mechanism (of some sort)
  - prediction markets
  - **write incentive-compatible contracts**

# The tools & the roadmap

we have the right tool: scoring rules

**BUT:**

- we *don't know* how good they are
- we *don't know* if they'd work in this context
- we **do** know that subjects do not understand them
- to the point that it might be better **not to use them** (Danz et al. AER 2022)

# The (nascent) research program

## 1. How to evaluate scoring rules?

*Develop a paradigm to evaluate scoring rules in the context of forecasts*

## 2. What is **the best** scoring rule?

*Horse race of scoring rules within the new paradigm*

## 3. Would it **work** in the field?

*Field experiments in prediction website / markets*

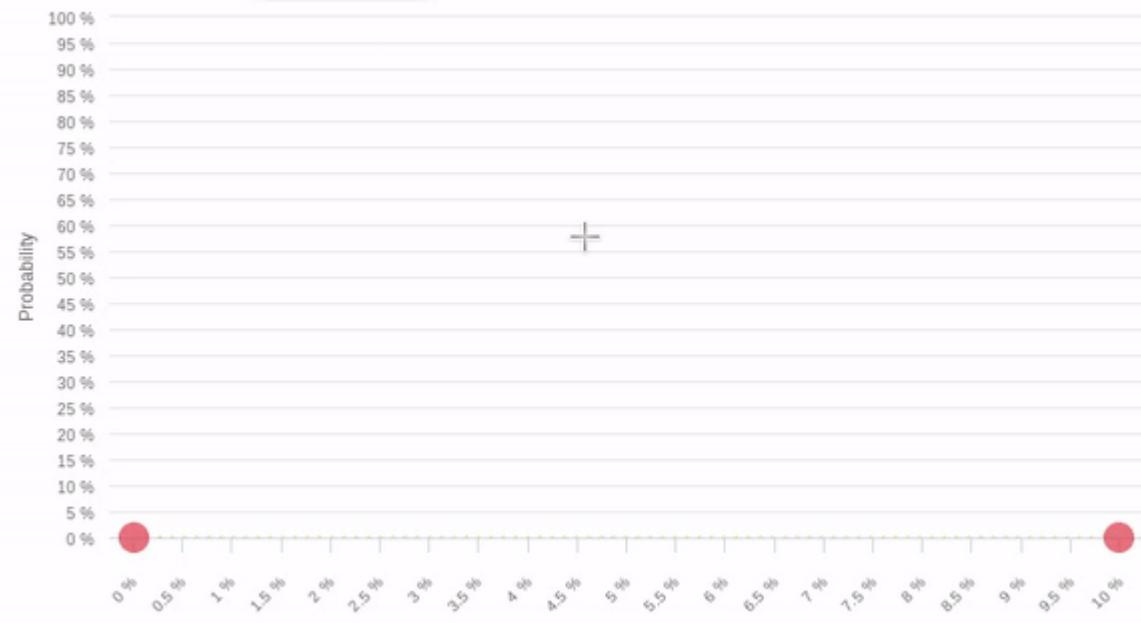
# The (nascent) research program

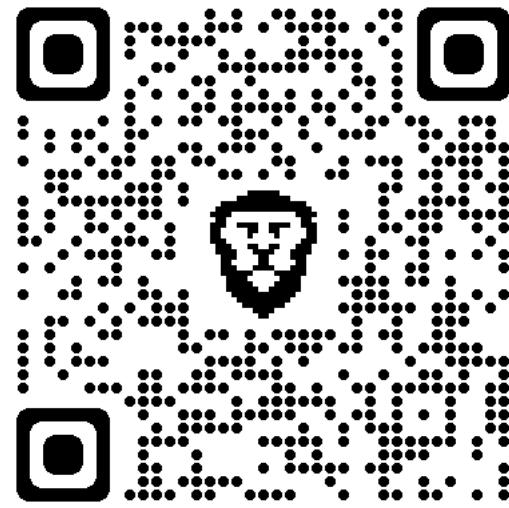
0. How best to **input** beliefs and forecasts? Does it matter?

*Horse race of belief/forecast elicitation interfaces*

**Sales pitch: the best tool to  
elicit beliefs**

# One-slide version of the talk





# The sale pitch

- we make a case for **precise belief elicitation** as a **key lab tool**
- we **introduce and test** against others the **Click-and-Drag** interface

Text-based

Bid in range 1 to 12

Bid in range 13 to 24

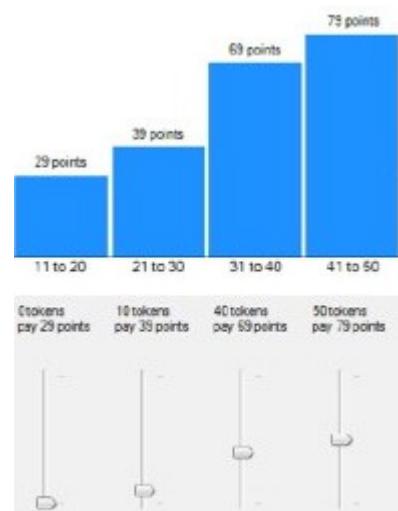
Bid in range 25 to 36

Bid in range 37 to 48

Bid in range 49 to 60

The sum of the numbers is ----- 

Slider-based



Metaculus



# Why eliciting belief distributions?

# Beliefs matter

## In the lab

- *perception* of stimuli is increasingly important
- experiments yield *fuzzy measures* – e.g. cognitive uncertainty

## In the real world

- increasing importance of *forecasting* and *prediction markets*
- perception of *risks, costs & benefits* of **policies** crucial

# How you elicit beliefs matters

Belief elicitation is usually **unintuitive** to subjects

- the tool used is **not neutral**:
  - forcing point estimates? **bias!**
  - asking for distributions? **hard!**
  - confidence intervals? **what?**

# The state of the art

# What do we aim for

A good interface *does not get in the way* of subjects. It should:

- make it easy to input **distributions** but also allow for point estimates
- allow for a **fast** sketch of your belief
- allow to be **accurate**
- **scale** to a lower/higher number of bins
- allow for non-standard, skewed, bimodal, **whatever** distributions

# Text-input interfaces

## Question 1

Please report your belief about your opponent's bid.

We will provide five intervals. You are asked to report how likely you think your opponent's bid is to be in each of these intervals. The number in each input field you are asked to fill in is your percentage estimate of the likelihood of your opponent's bid being in that particular interval.

The five percentages need to add up to 100.

There will be an automatic checker to tell you what the current sum is as you enter the numbers.

Bid in range 1 to 12

Bid in range 13 to 24

Bid in range 25 to 36

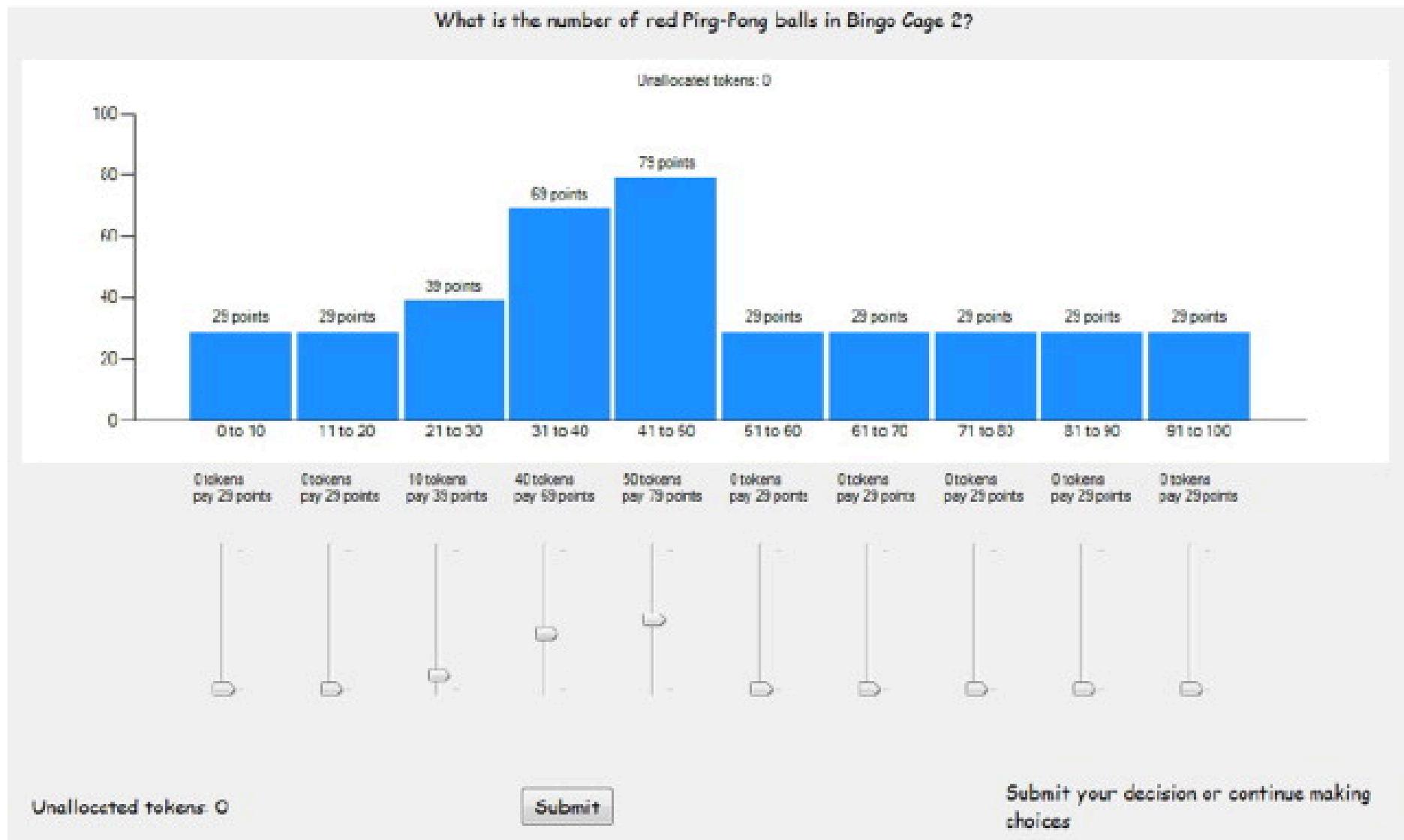
Bid in range 37 to 48

Bid in range 49 to 60

The sum of the numbers is ----- 

Crosetto et al. (JEPsy, 2020): *slow, scales badly, sum to 100; but precise*

# Slider interfaces



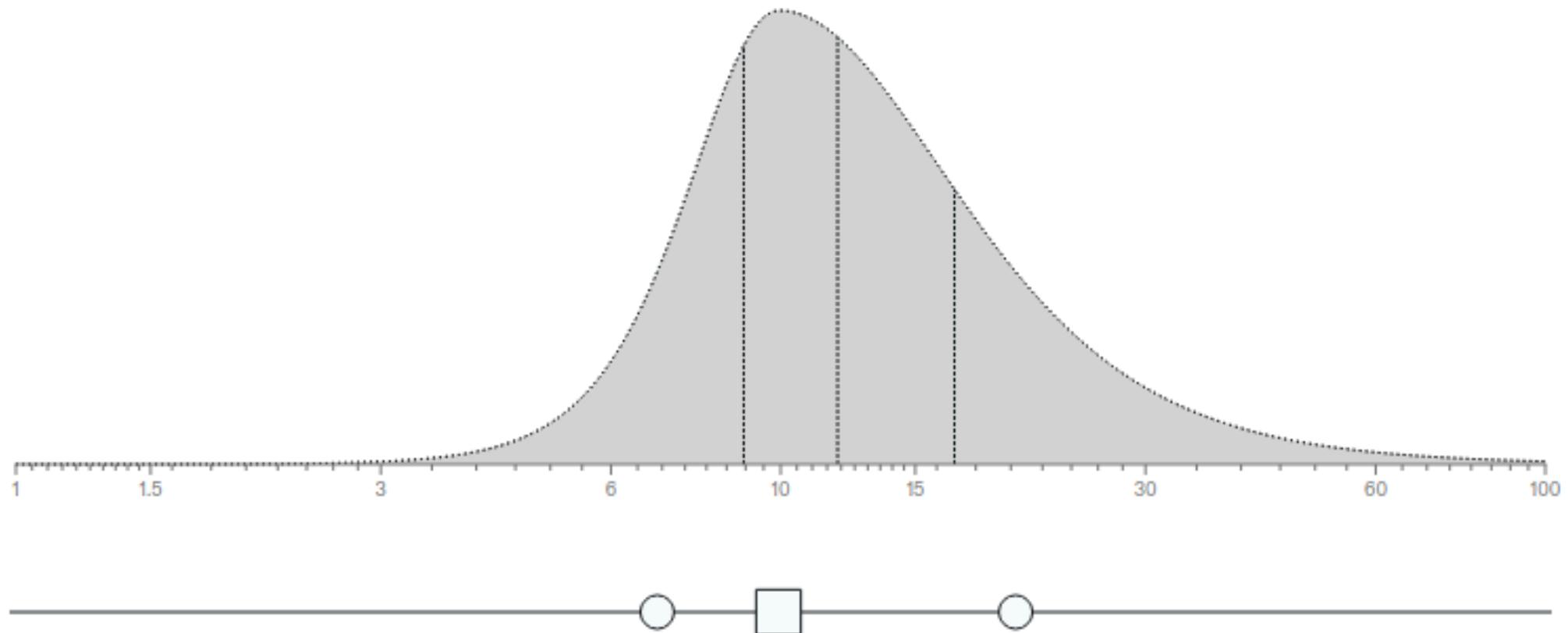
Harrison et al (EL 2015): better, scales OKish, sum to 100; but intuitive

# Distribution interfaces

▼ Prediction

probability density ▾

Community



Metaculus: *fast, continuous, no sum to 100; but: limited in shapes, requires stat*

# Click-and-Drag

# Say hello to Click-and-drag

- adjust the graph by **adding**, **moving** or **removing** anchor-points
- **add** anchor-points by **clicking** anywhere on the graph.
- **move** anchor-points around by **dragging** them.
- **remove** anchor-points by **clicking on** them.



# Experimental design

# Task

- subjects need to **match a given distribution**
- within a certain **time constraint**
- the **closer** the match, the **higher** the payoff

# Task - live!

## Playground: familiarize yourself with the task (no bonus)

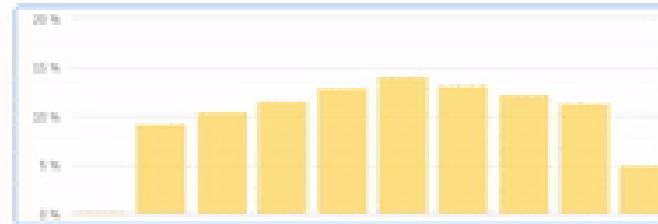
You can adjust the bar-graph by adding, moving or removing anchor points:

- You can add anchor-points by clicking anywhere on the graph canvas.
- You can move anchor-points around by dragging them.
- You can remove anchor-points by clicking on them.

Your score: 0 cent

Upload Reset

Validate



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# Dimensions

- **Interfaces:** Click-and-Drag, Text, Slider, Distribution
- **Time** constraint: **15** and **45** seconds
- **Shape:** normal, skewed, skewed bimodal, complex
- **Scale:** 7, 15 or 30 bins

# Treatments

- **between-subjects:** interface
- **within-subjects:** time, difficulty, scale

# Interfaces/2: Slider

Playground: familiarize yourself with the task (no bonus)

You can adjust the bar-graph by dragging each bar up or down. Click on the top of the bar to drag it.

Your score: 0 cent

Validate



10%

12%

14%

16%

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20%

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12%

14%

16%

18%

20%

10%

12%

14%

# Interfaces/3: Text

## Playground: familiarize yourself with the task (no bonus)

You can adjust the bar-graph by entering a numerical bar height for each bar in the respective text field below the horizontal axis.

Your score: 0 cent

Validate



100

90

80

70

60

# Interfaces/4: Distribution

Playground: familiarize yourself with the task (no bonus)

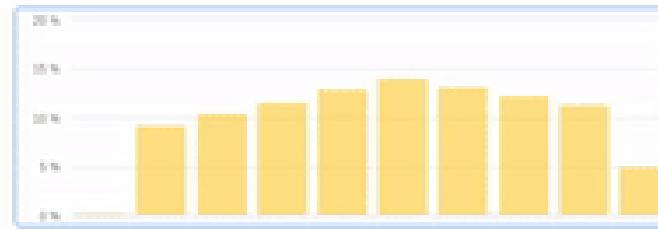
You can adjust the bar-graph by adjusting the position of the horizontal slider buttons below the graph.

You can add additional sliders to fine-tune the bar-graph.

Your score: 14 cents



Value



20

18

16

14

12

10

8

6

4

2

0

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18

16

14

12

10

8

6

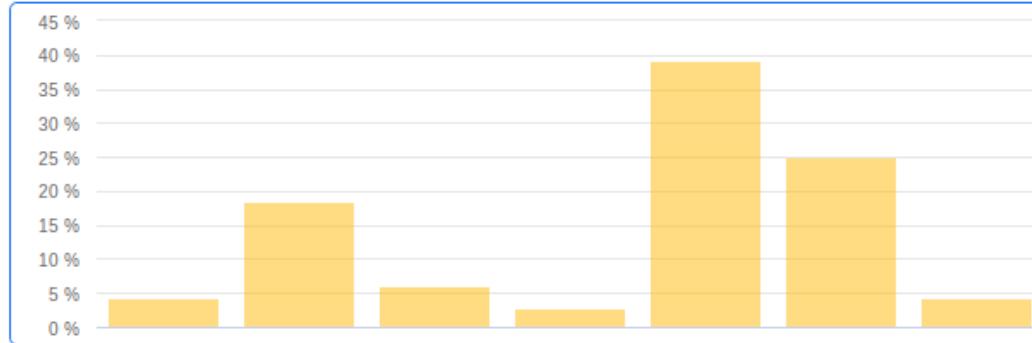
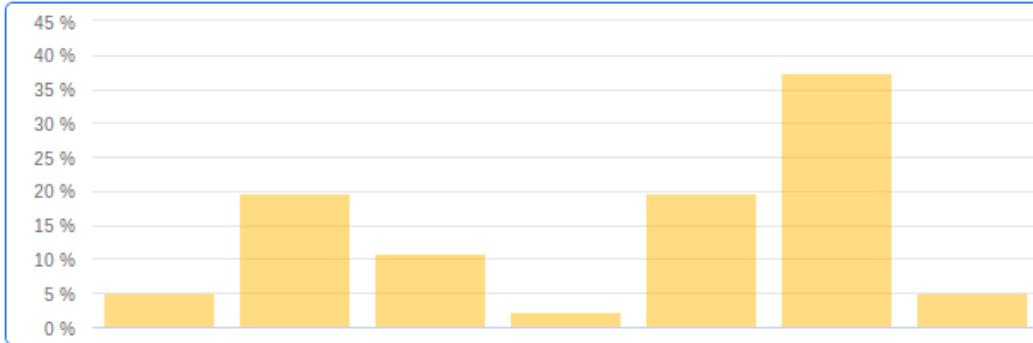
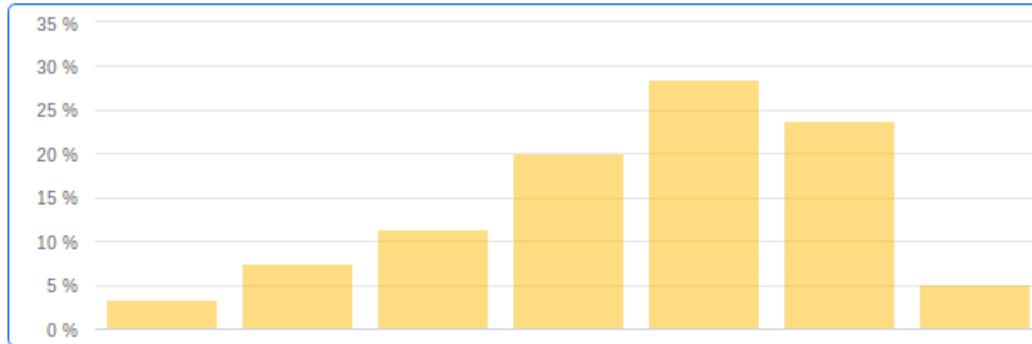
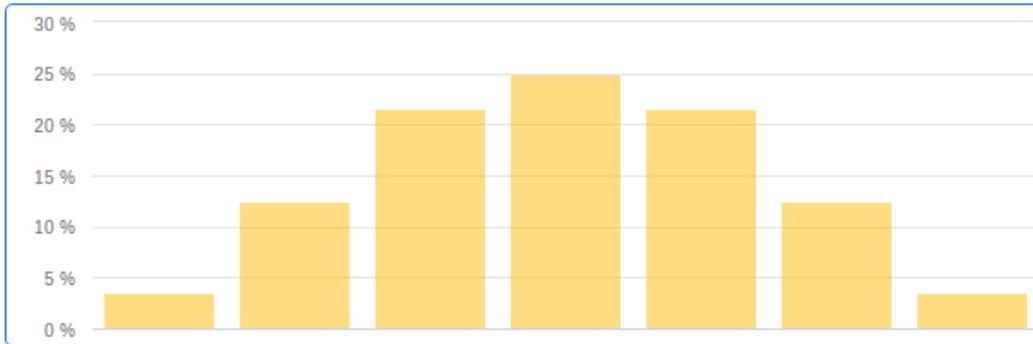
4

2

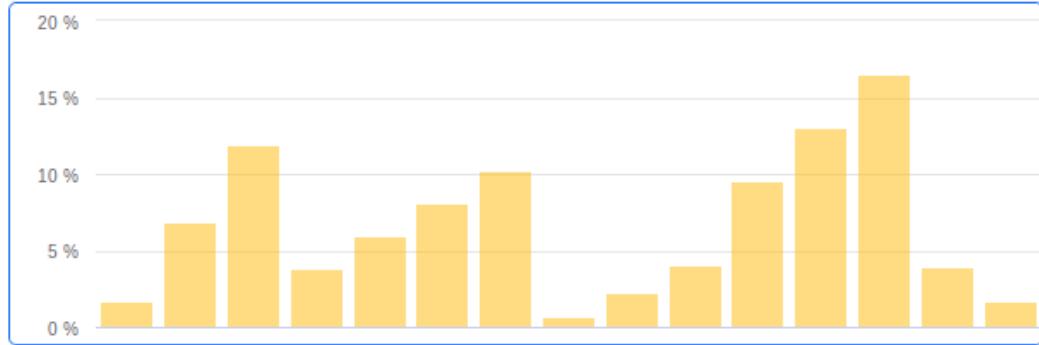
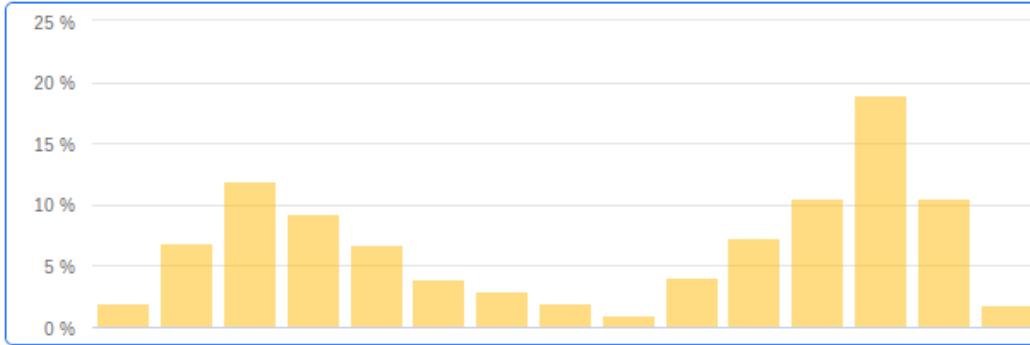
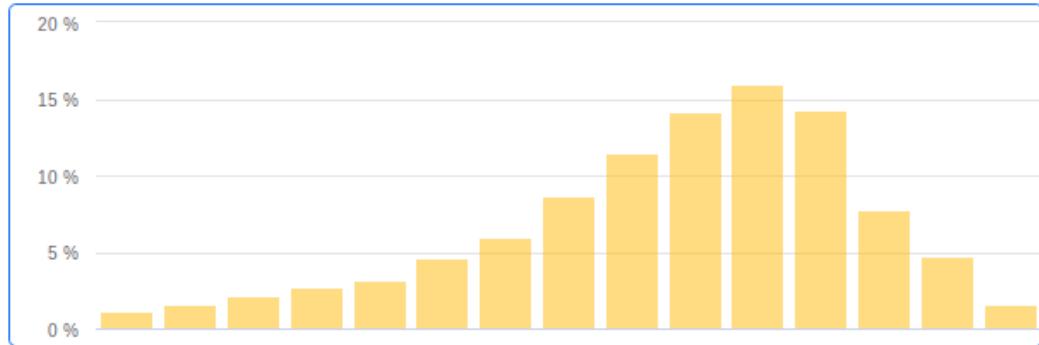
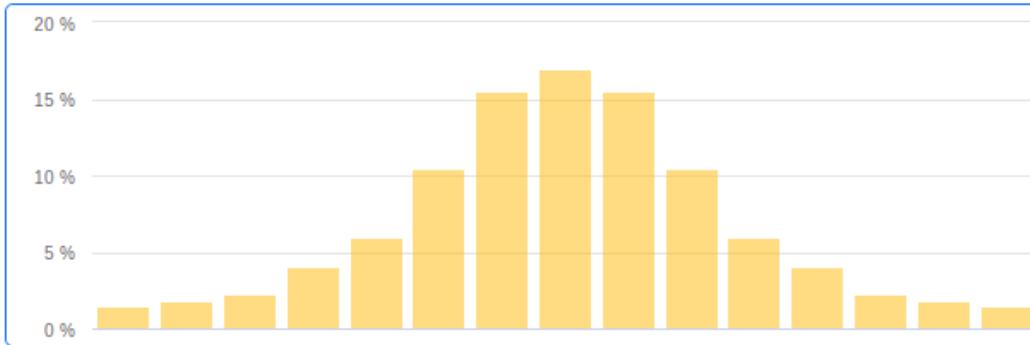
0

Add a slider

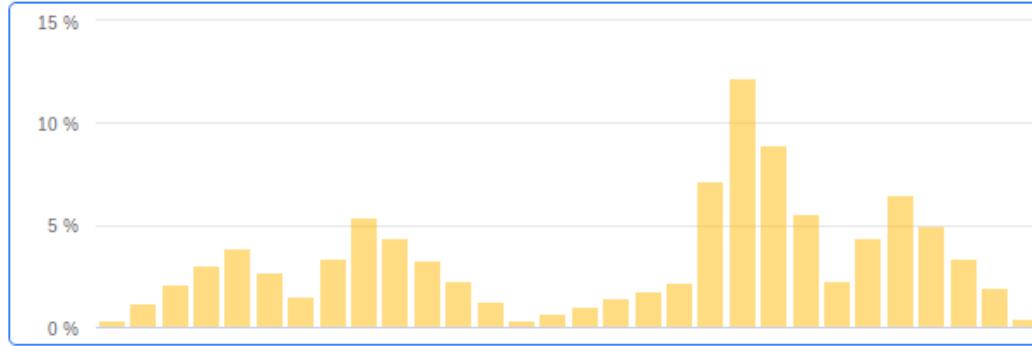
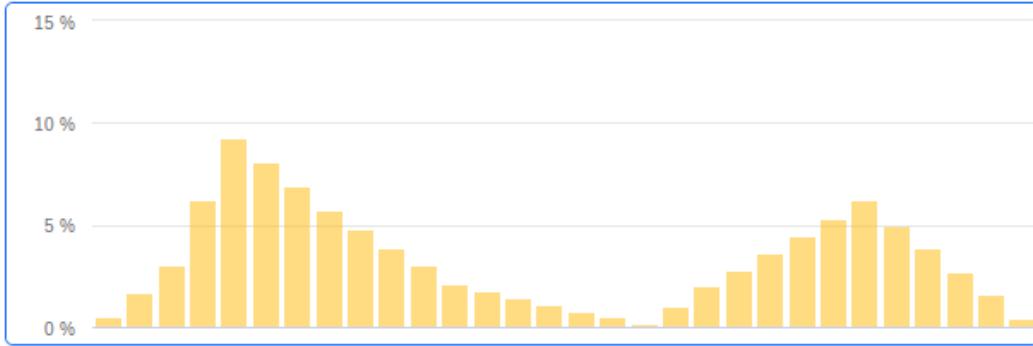
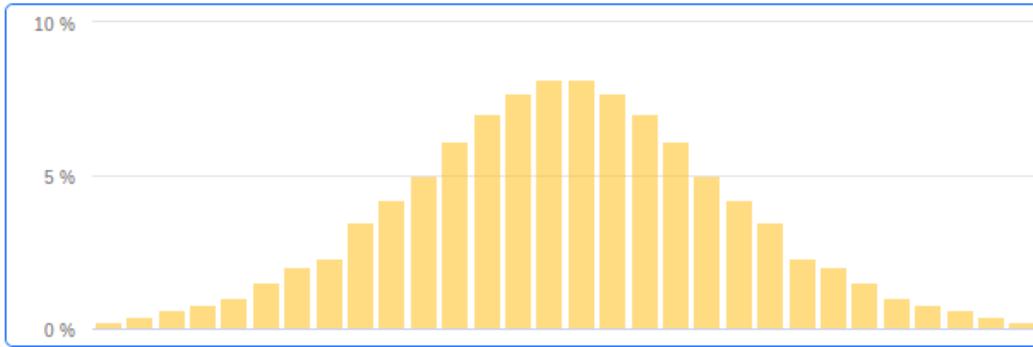
# Distributions to mimic: 7 bins



# Distributions to mimic: 15 bins



# Distributions to mimic: 30 bins



# Details

- ~360 Mturkers (90/arm)
- **24** screens: 3 nbins x 4 difficulty patterns x 2 time constraints
- **fixed order**: from less to more difficult / hurried
- **fixed time**: subjects cannot speed through, *must* spend 45(15) seconds

# Data collected

For each screen, each subject:

- submitted distribution - final distance to target
- path to submission (time/accuracy of each click -> speed of convergence)

For each subject:

- age, gender
- self-reported assessment (easy? frustrating? intuitive?)

# Pre-registered analysis

- submitted distance by screen type, shape, and time constraint
- path of the distance by screen type, shape, and time constraint
- self-reported assessments by interface

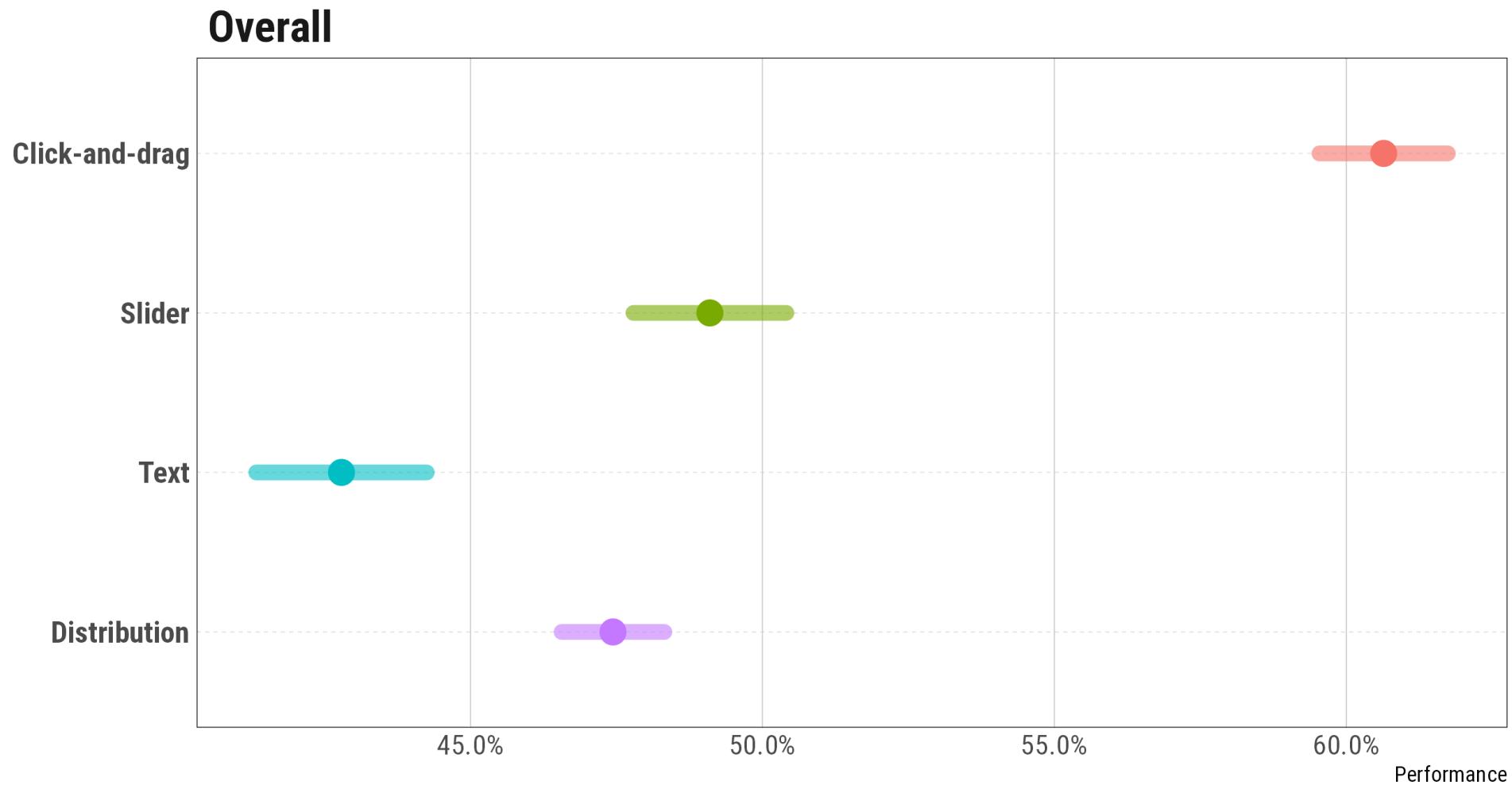
# Pre-registered hypotheses

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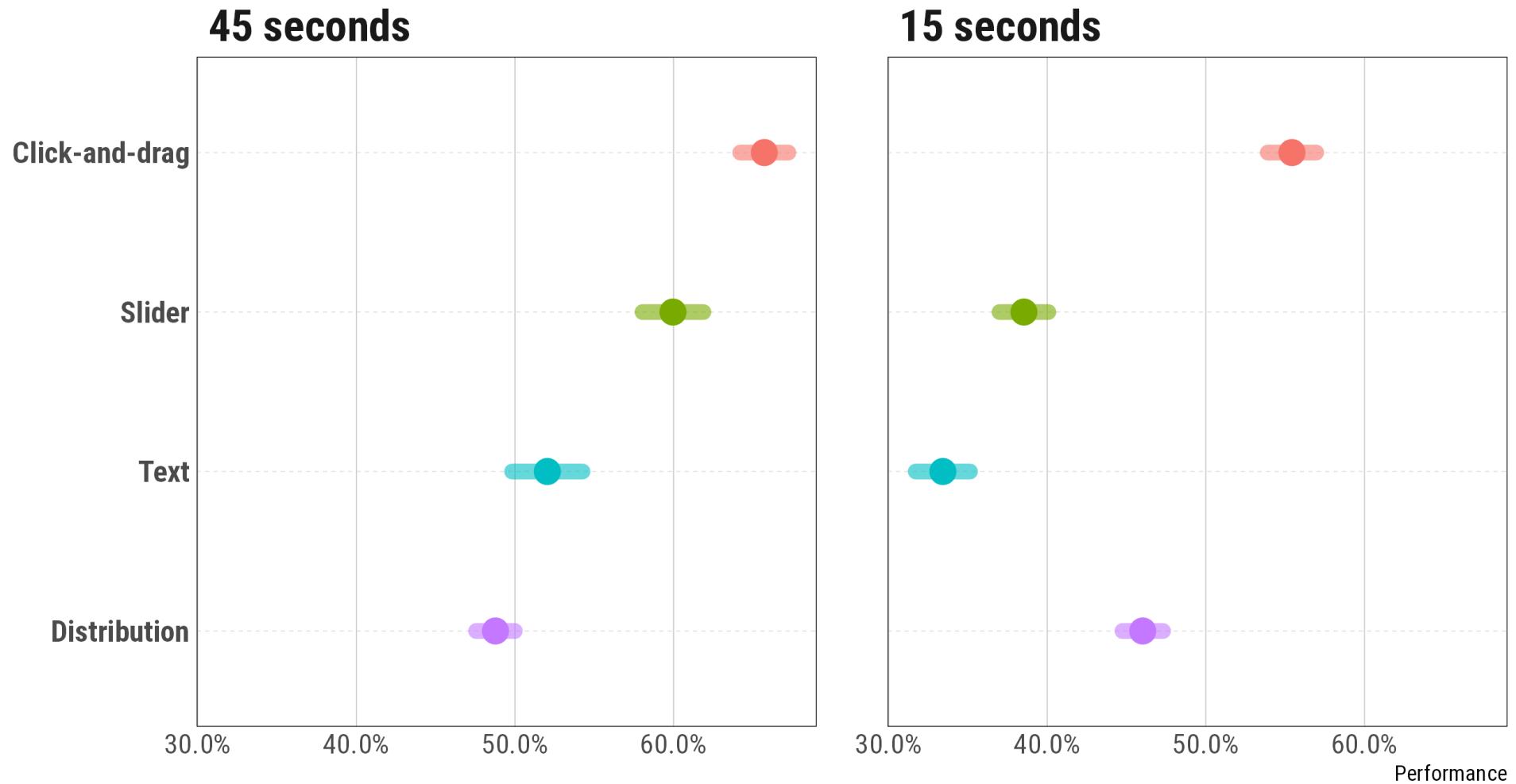
That's simple: our interface wins in all dimensions.

# Results

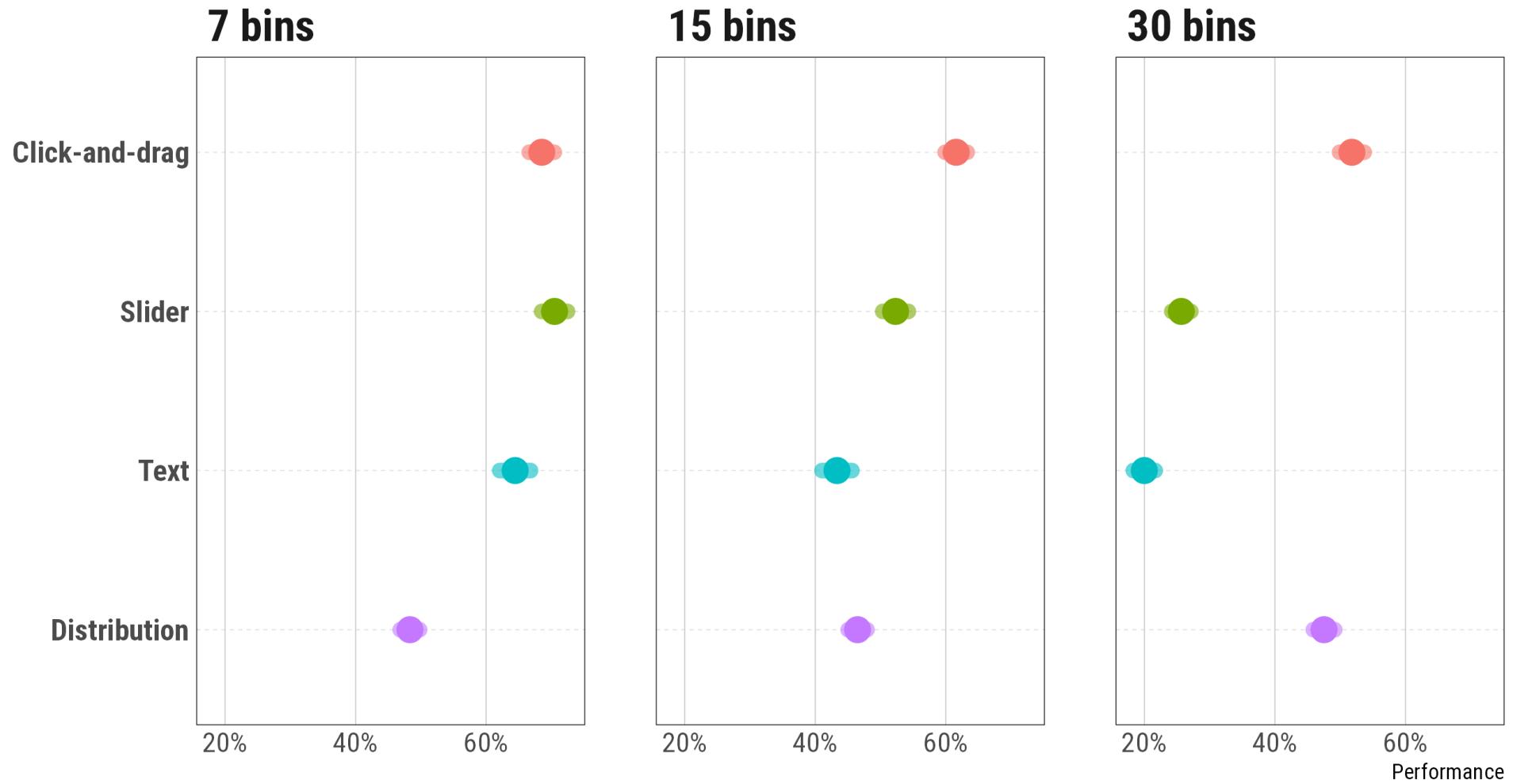
# Accuracy – all screens



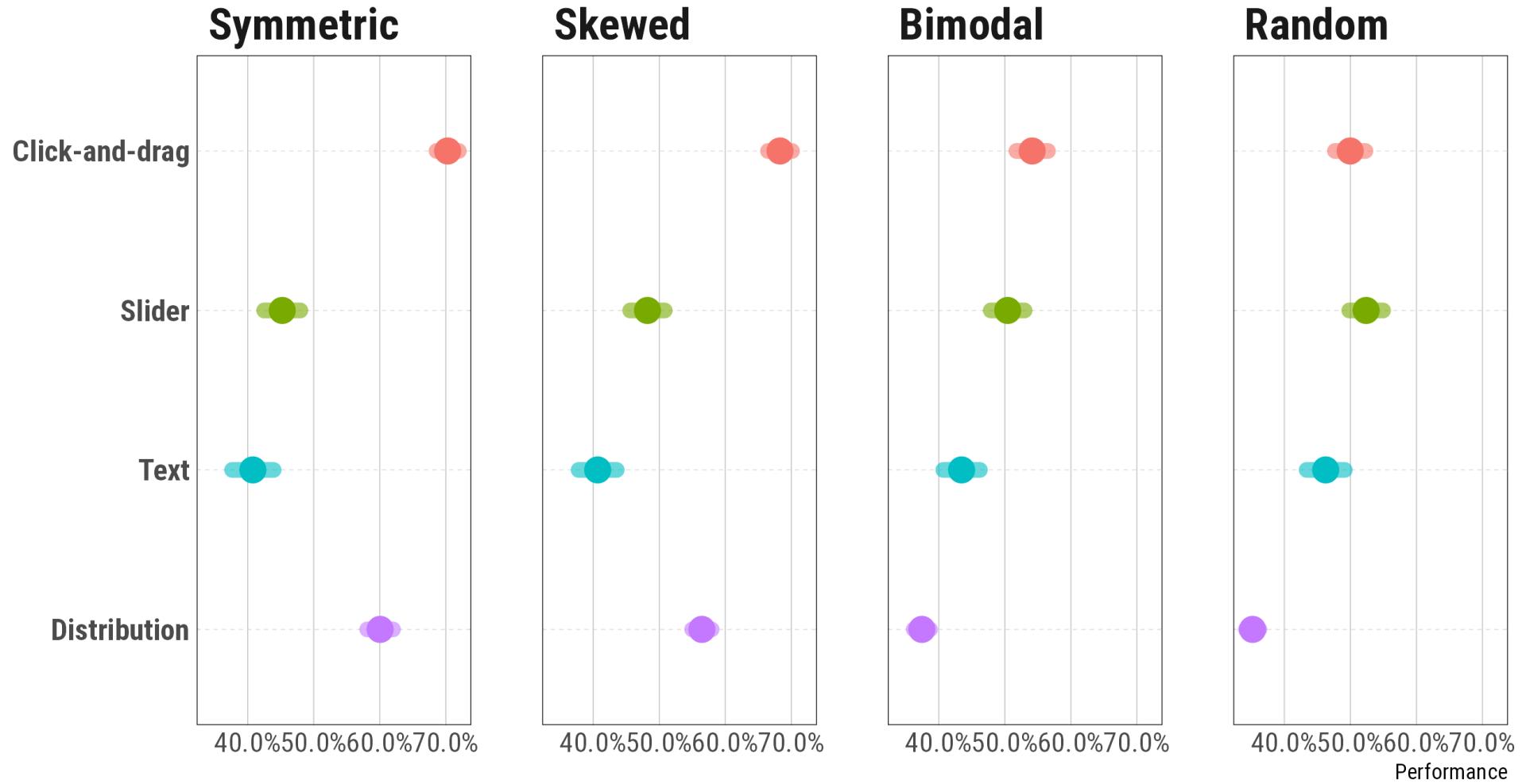
# Accuracy – by time constraint



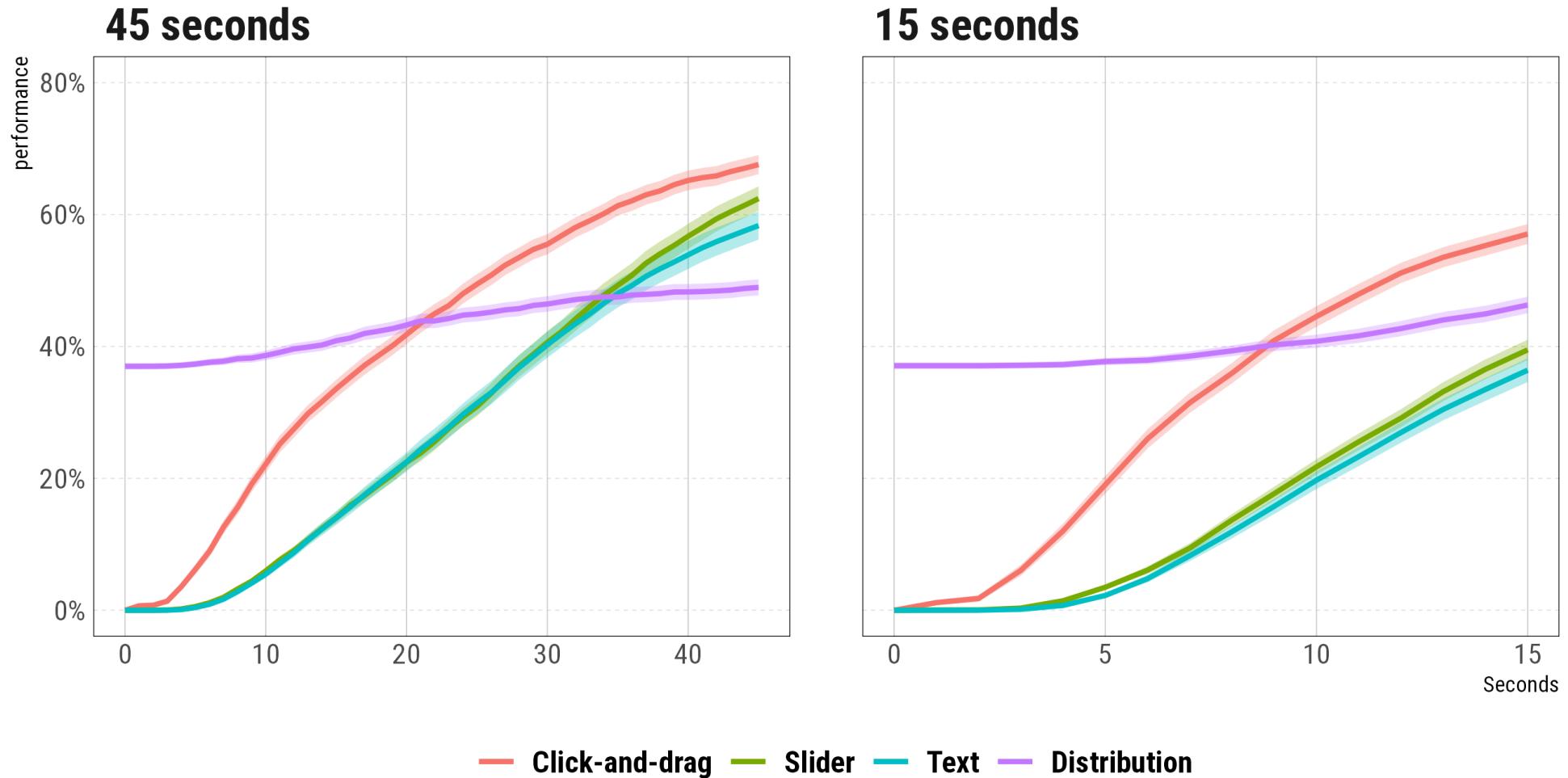
# Accuracy – by number of bins



# Accuracy – by distribution shape

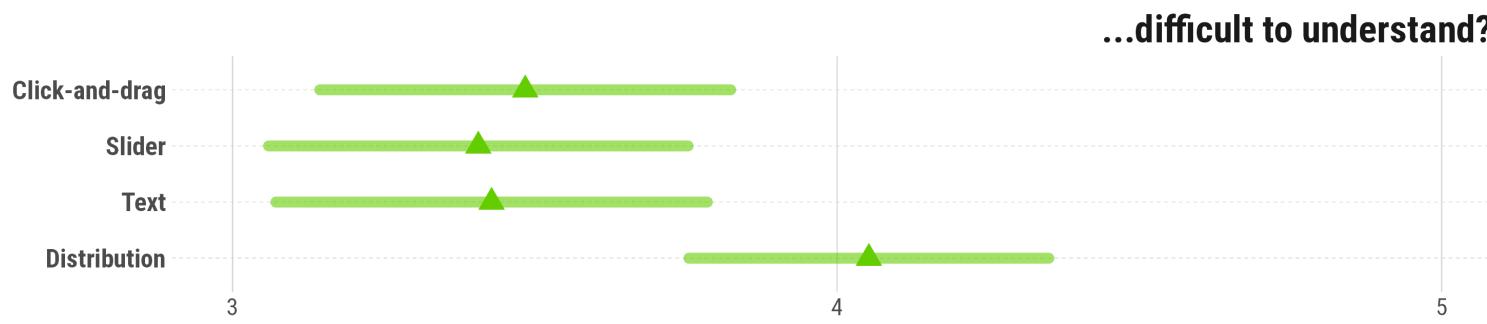
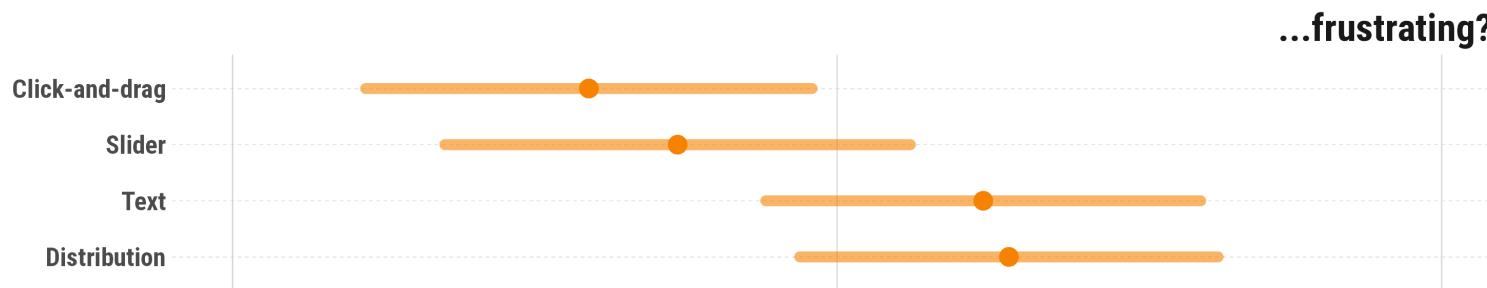


# Path of adjustment – all screens



# Self-reported assessment

From 1 to 7, did you find the interface...



The interfaces in action:  
temperature in NYC

# Eliciting beliefs: climate change

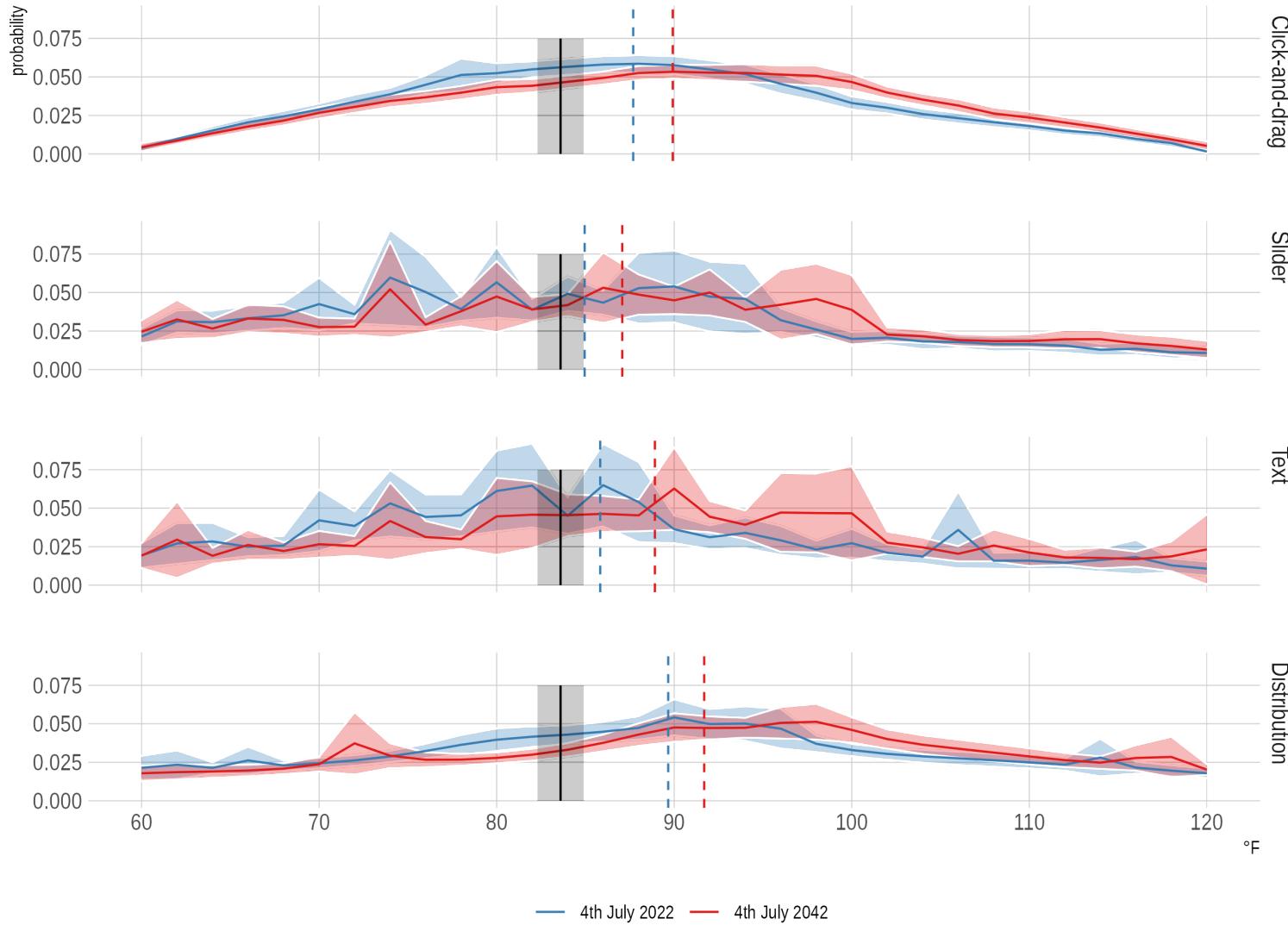
We use the 4 interfaces to elicit the *same* belief:

**Maximum temperature in NYC on July 4th, 2022 and 2042**

## Why doing so?

- do the interfaces *impact* the elicited *beliefs*?
- can we see any *bias* introduced?
- do people hold *correct beliefs*?
- *first test* in a real, homegrown belief setting

# 2.5°F warming expected in 20 years



# Summing up

# Summing up

Click-and-drag kicks ass. Think about using it!

# Summing up

- we believe in **experimentally testing** our very tools
- not usually done in ExEc: **time to grow up!**
- Click-and-drag beats all other interfaces
  - faster
  - more accurate
  - less frustrating
  - more appreciated
- In practice, tool does not seem to matter
  - so just use the most intuitive tool

# In practice

- Open data analysis tools at github
- Drop-in, minimal-configuration plugins available for:
  - oTree
  - Qualtrics
  - Limesurvey

# Uses so far

The interface is out there in the wild since June 2022. What happened?

- Agreement with **social norms\*** (in progress, Bologna)
- **Political beliefs** under polarization (in progress, Bergen)
- **Hazard rate** elicitation (planned, Bergen)
- Beliefs of French farmers about **pesticide** cost & benefit (planned, Bordeaux)
- Central Bank **inflation** forecasts (planned, Bank of Norway)

# Within the bigger picture



Scoring rules for forecasts horse race (see you at SEET 2024!)

