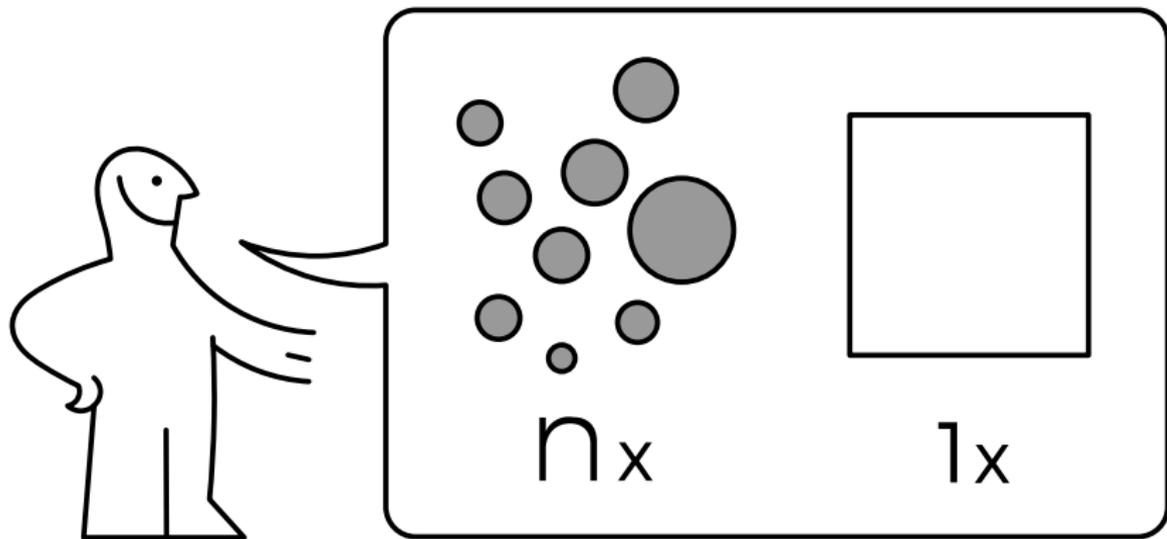
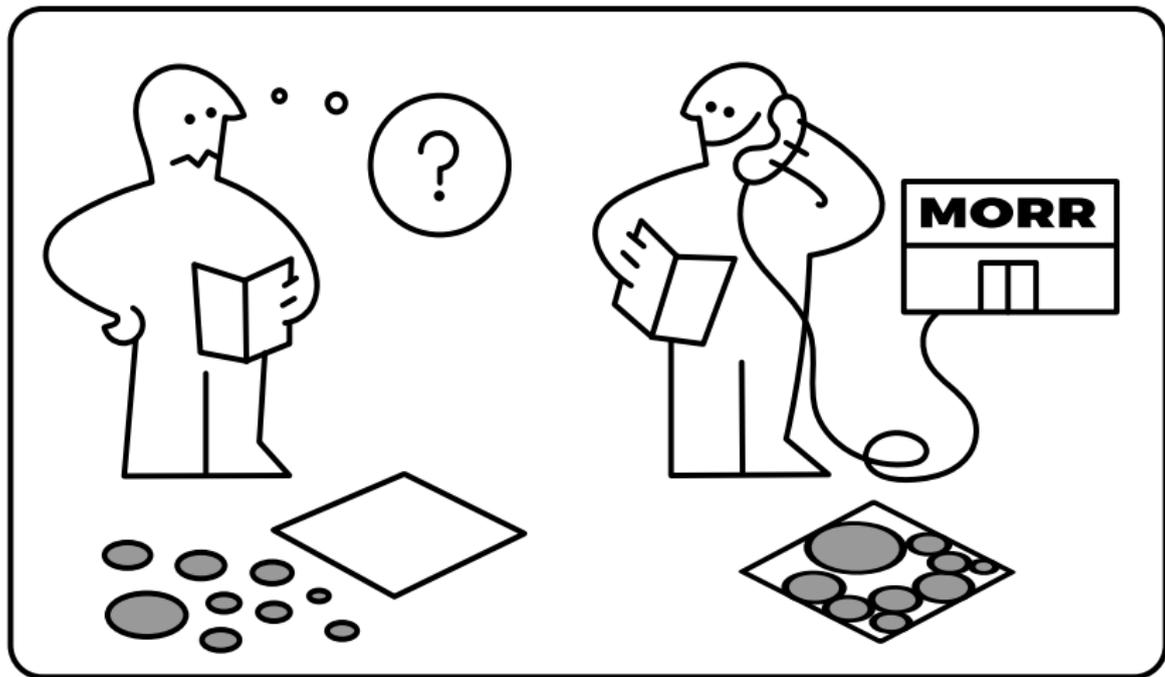


# Split Packing: An Algorithm for Packing Circles with up to Critical Density

Sebastian Morr

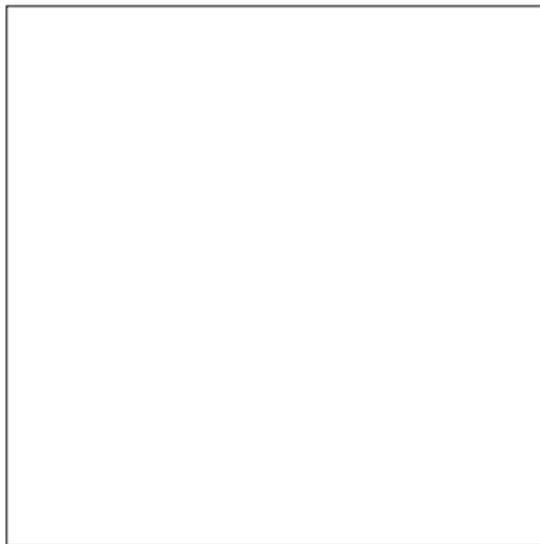
2016-06-09



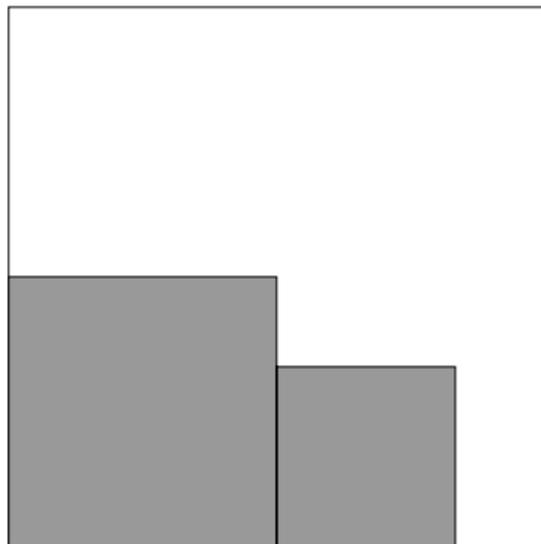


# Packing squares in a square

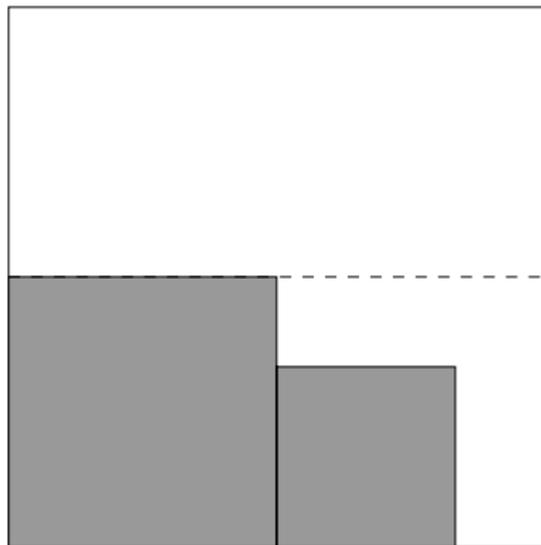
# Packing squares in a square



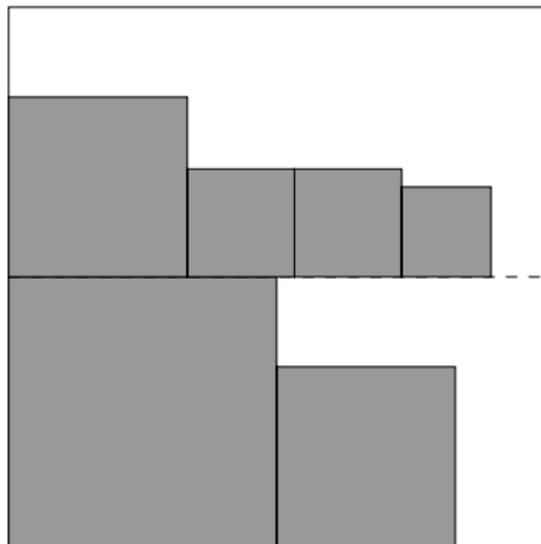
# Packing squares in a square



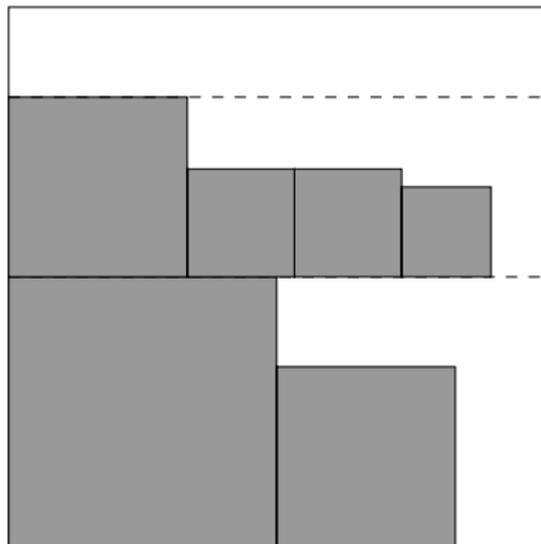
# Packing squares in a square



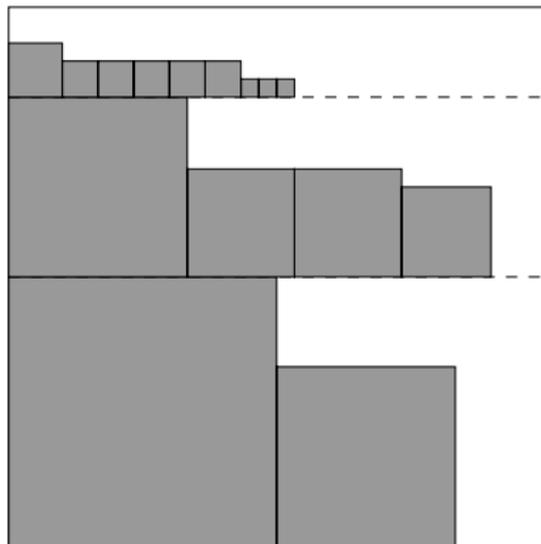
# Packing squares in a square



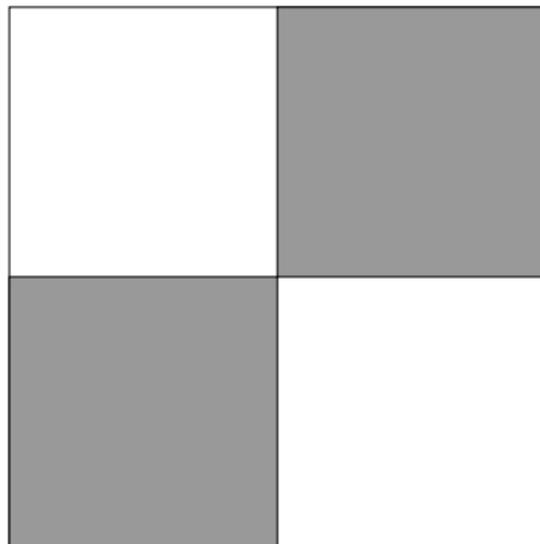
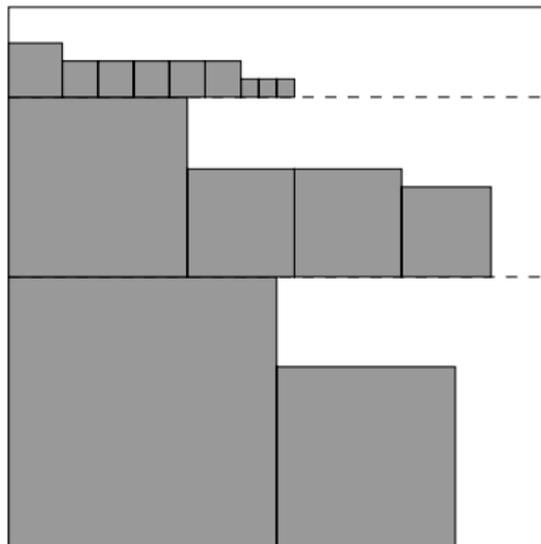
# Packing squares in a square



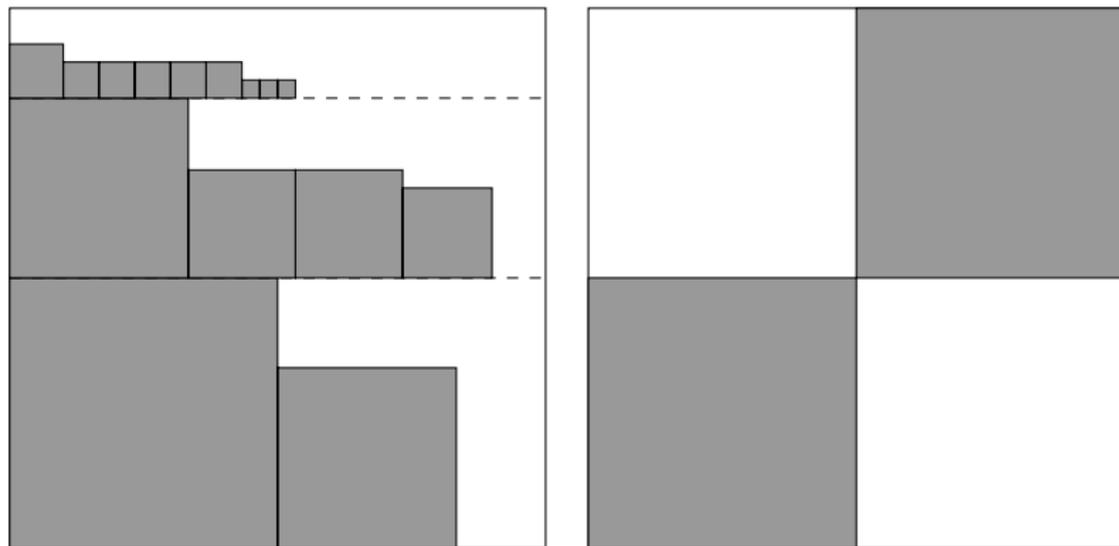
# Packing squares in a square



# Packing squares in a square



## Packing squares in a square



The critical density for packing squares is  $1/2$  [Moon & Moser, 1967]

# Outline

- 1 Packing circles in a square
- 2 Other container types
- 3 Other object types
- 4 Future work

# What about circles?

## Critical density for packing circles into a square

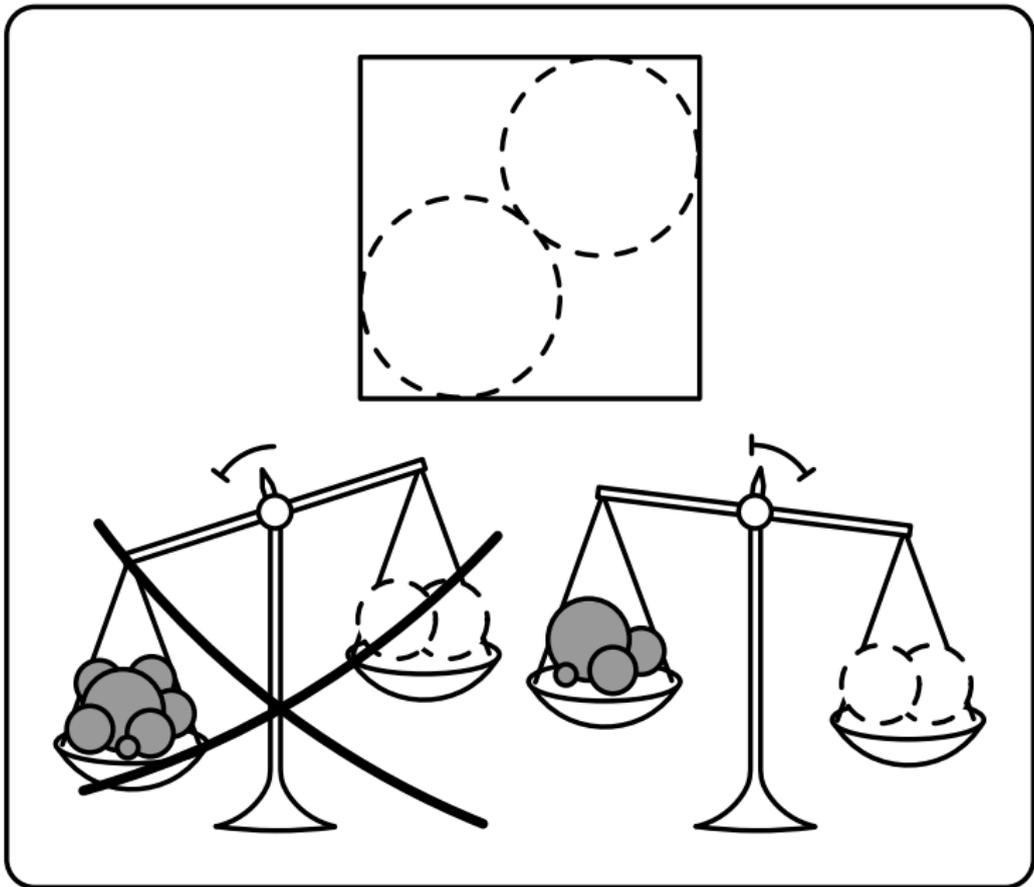
What is the largest  $a$  so that any set of circles with a combined area of  $a$  can be packed into the unit square?

## What about circles?

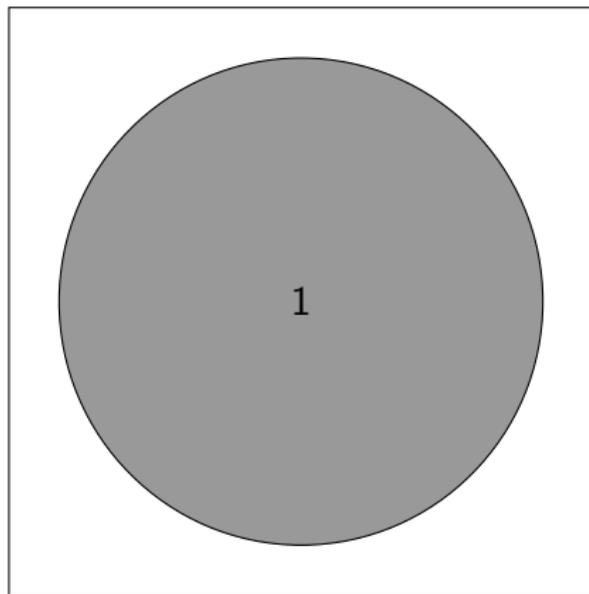
### Critical density for packing circles into a square

What is the largest  $a$  so that any set of circles with a combined area of  $a$  can be packed into the unit square?

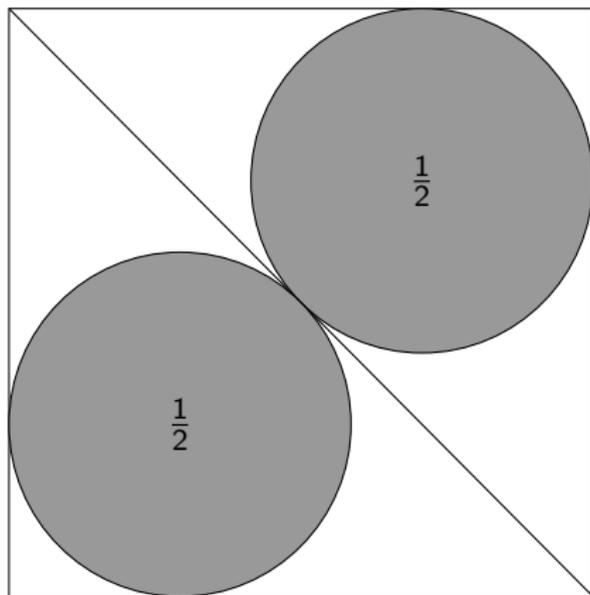
→ Now: Constructive proof!



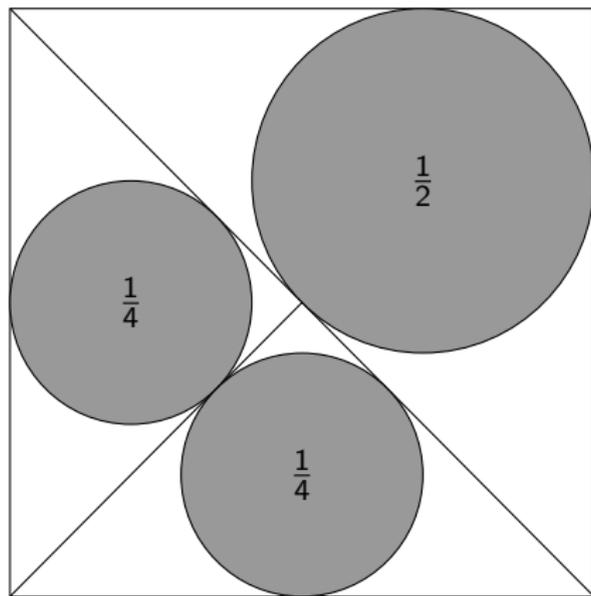
## Observation: Splitting in half is easy



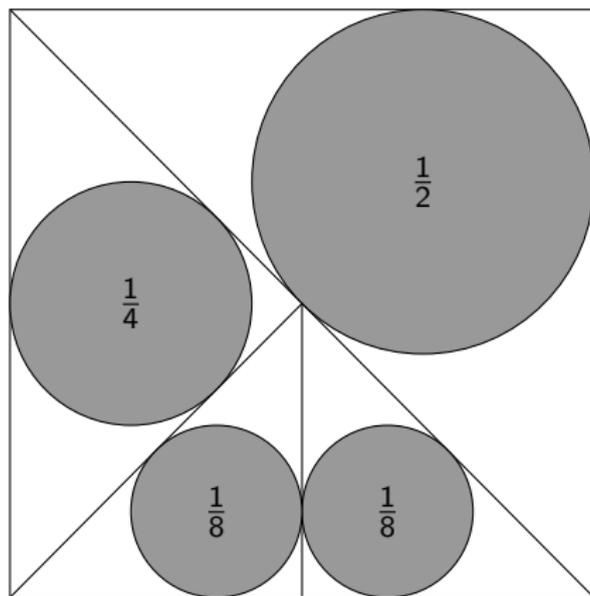
## Observation: Splitting in half is easy



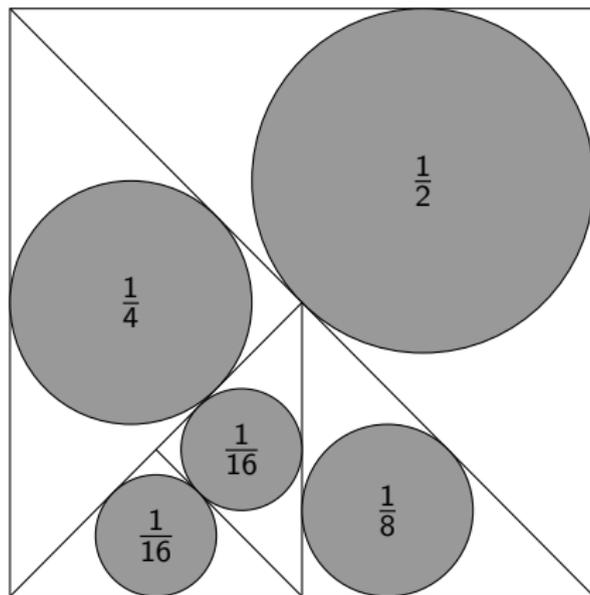
## Observation: Splitting in half is easy



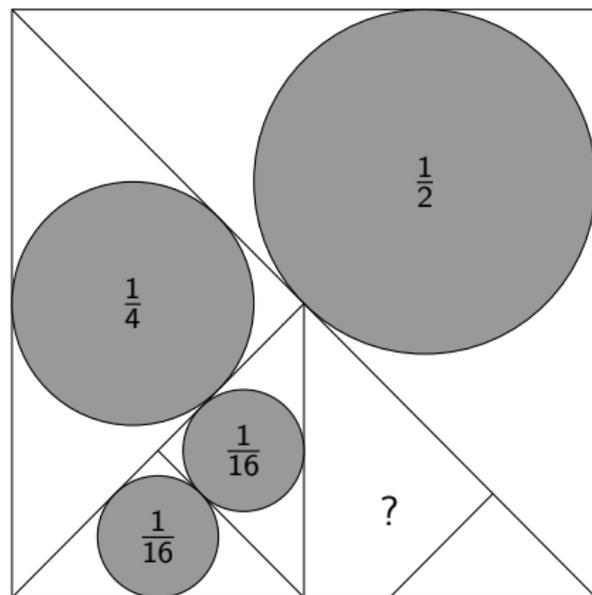
## Observation: Splitting in half is easy



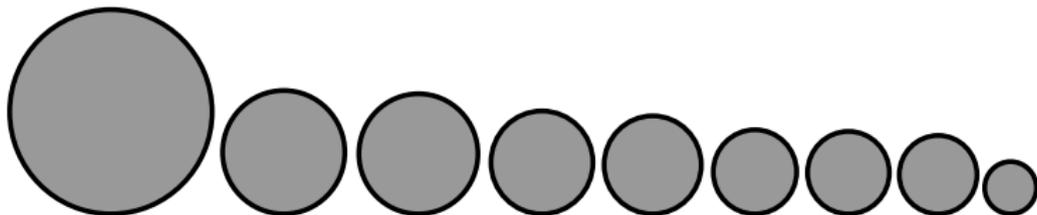
## Observation: Splitting in half is easy



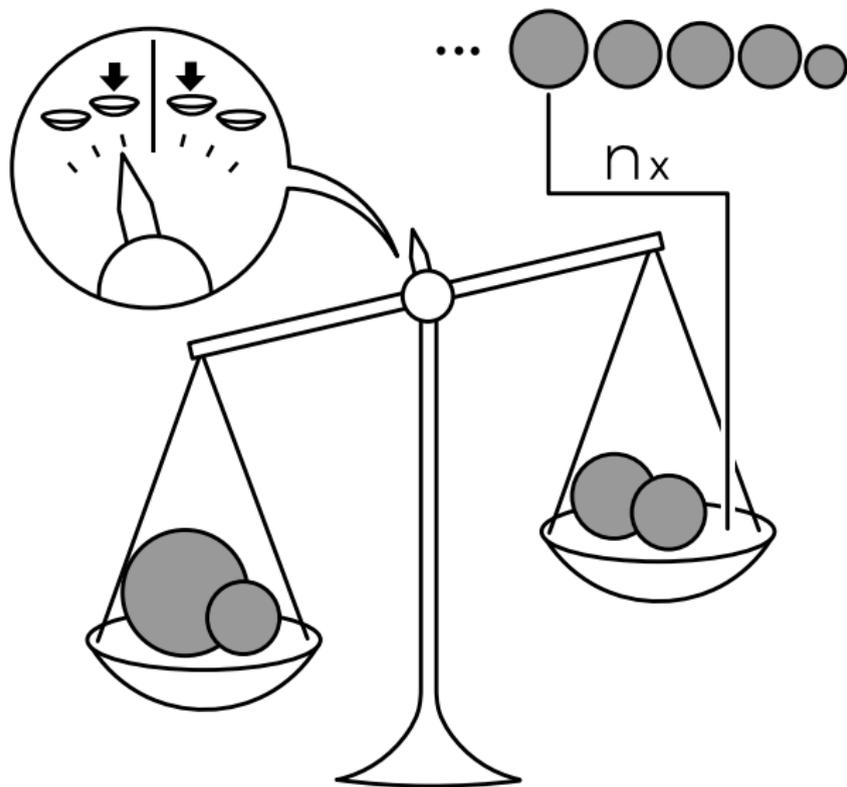
## Observation: Splitting in half is easy



1



# 2

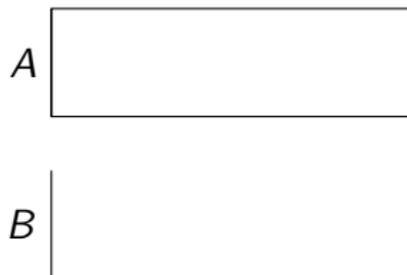


# Greedy splitting

$A$

$B$

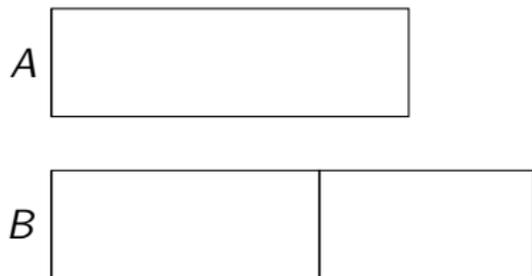
# Greedy splitting



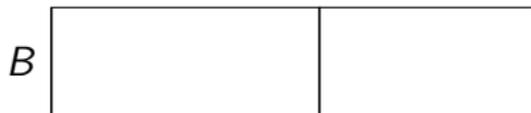
# Greedy splitting



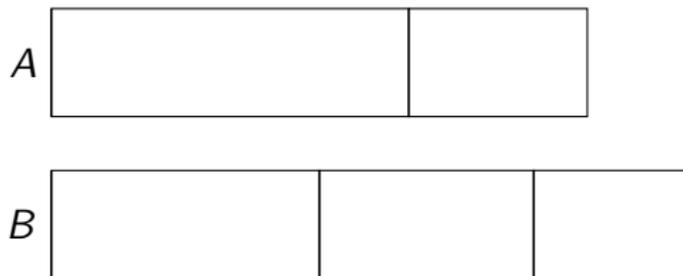
# Greedy splitting



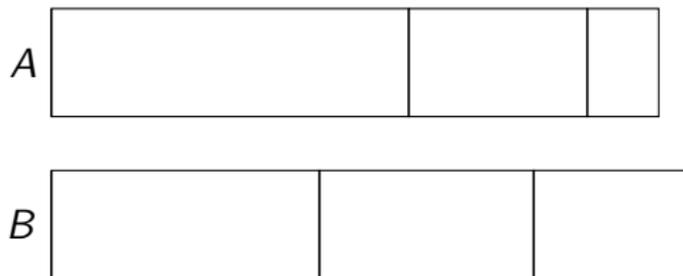
# Greedy splitting



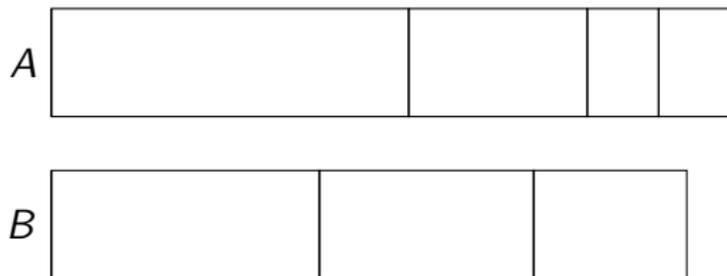
# Greedy splitting



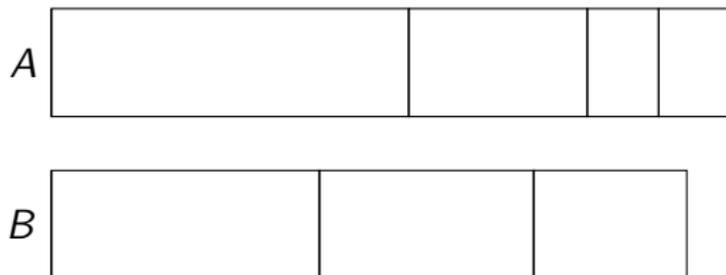
## Greedy splitting



## Greedy splitting



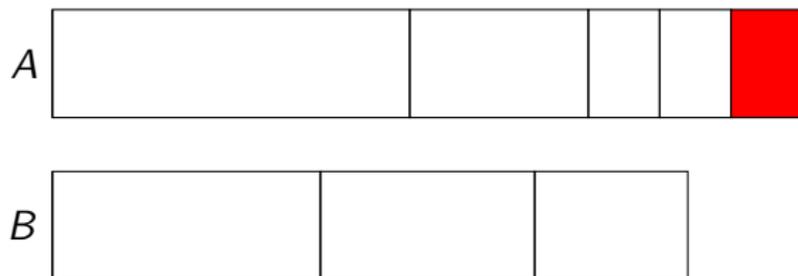
## Greedy splitting



Split property:

All elements of larger group  $\geq$  groups' difference.

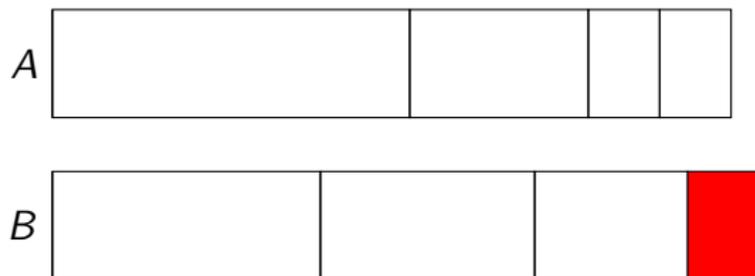
## Greedy splitting



Split property:

All elements of larger group  $\geq$  groups' difference.

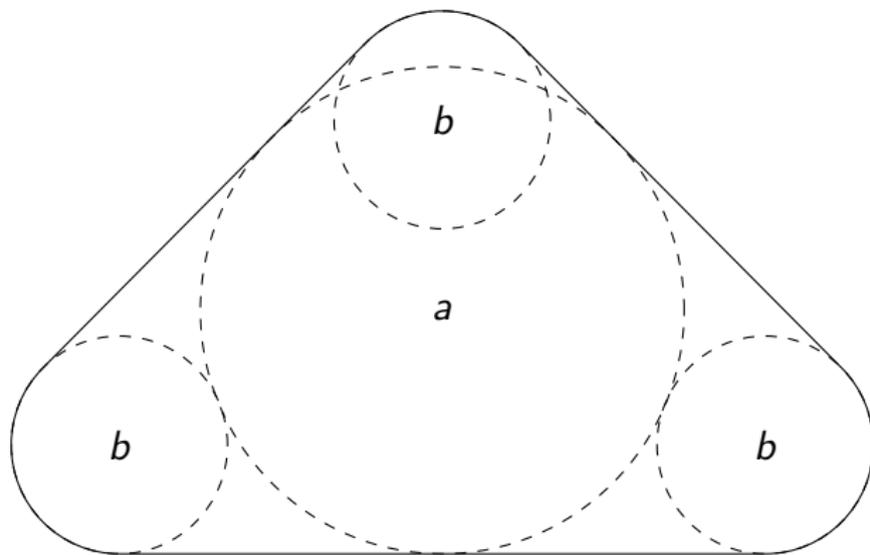
## Greedy splitting



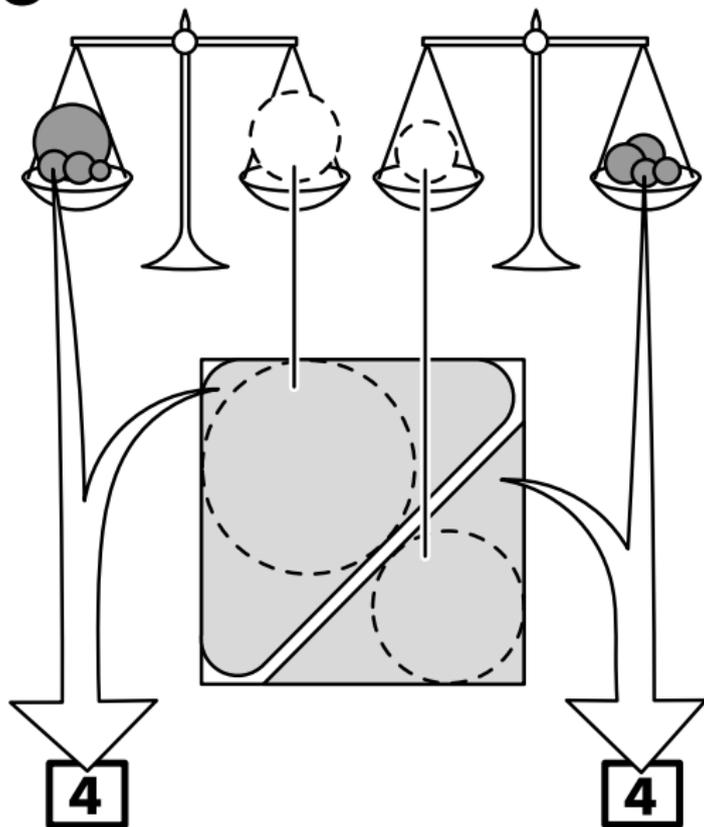
Split property:

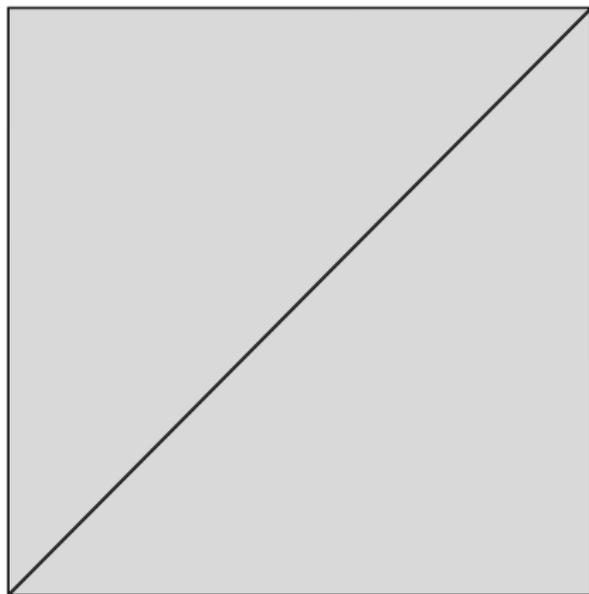
All elements of larger group  $\geq$  groups' difference.

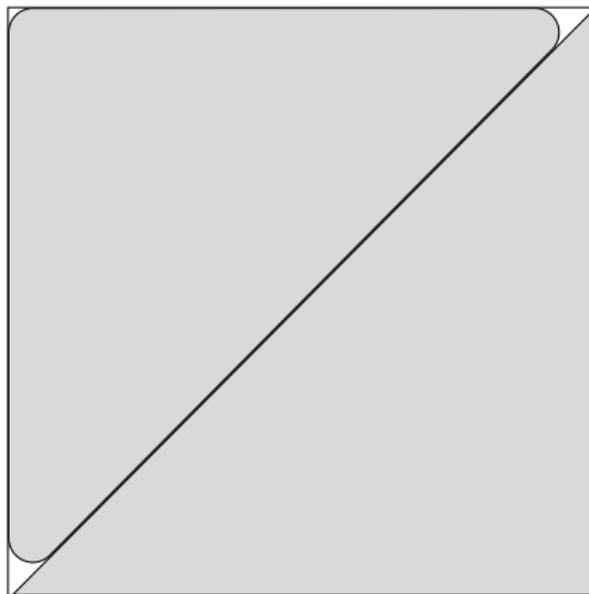
# An $(a, b)$ -hat

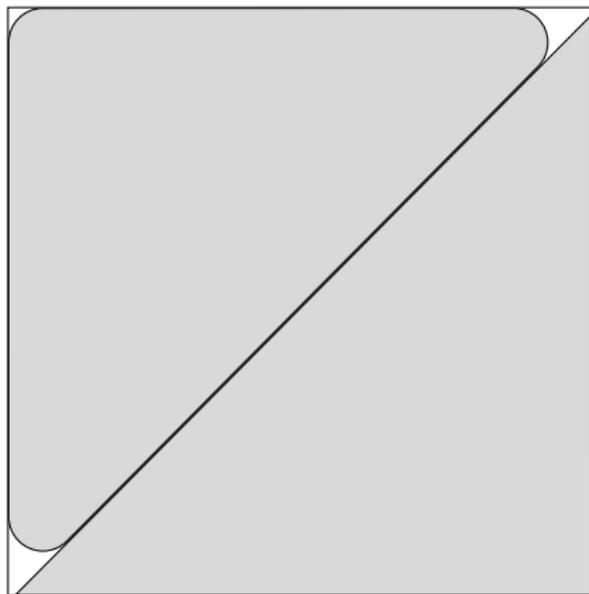


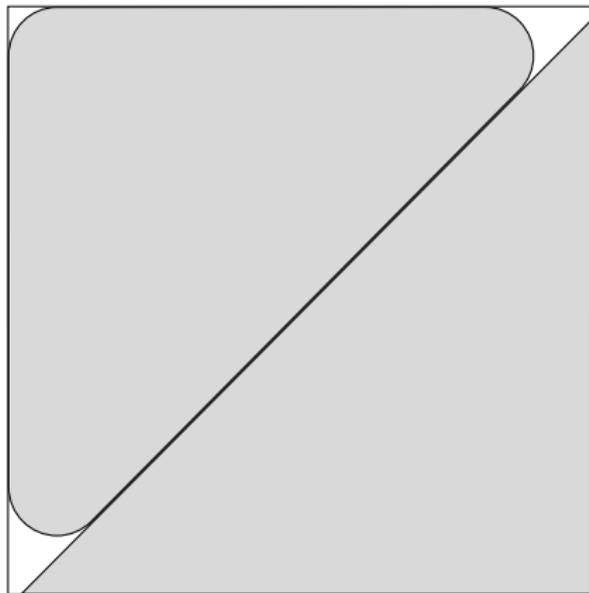
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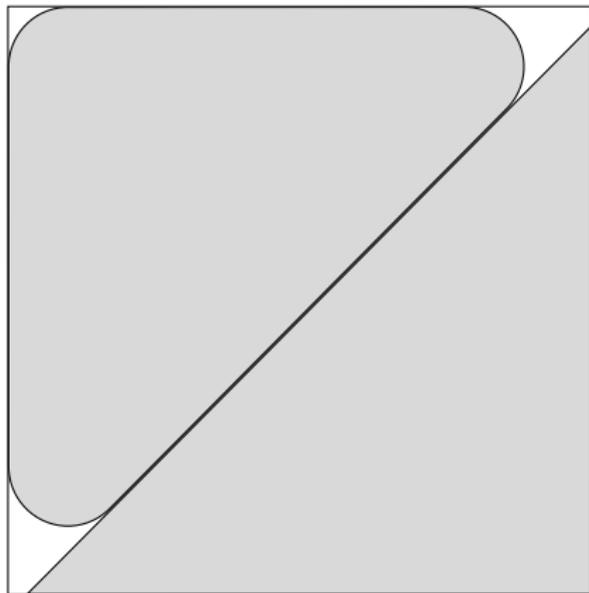


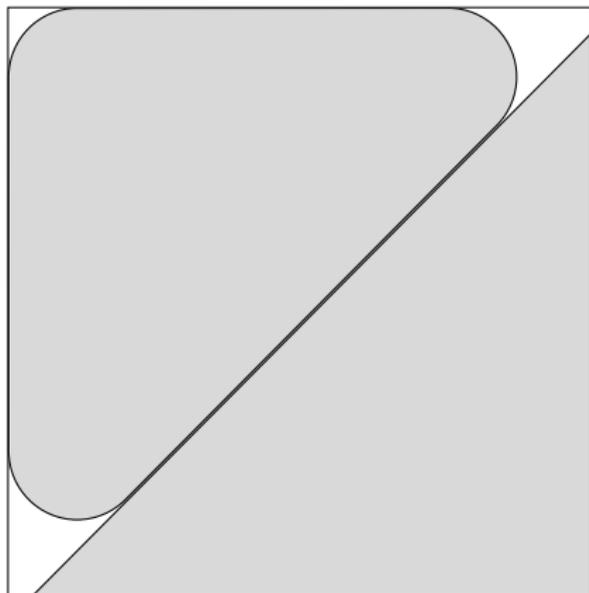


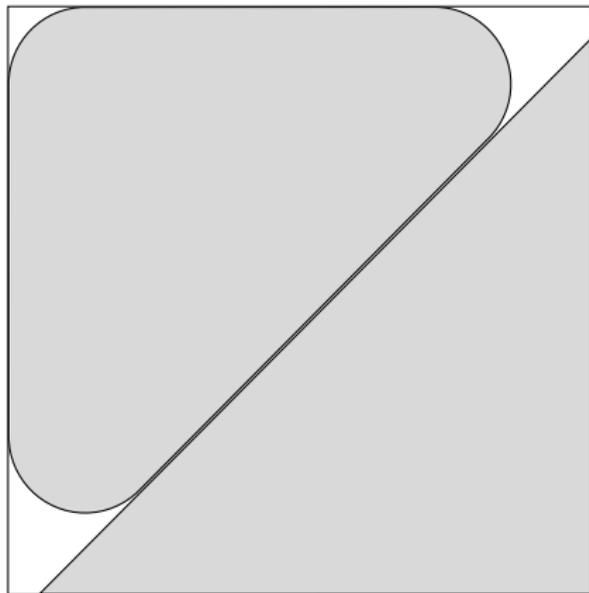


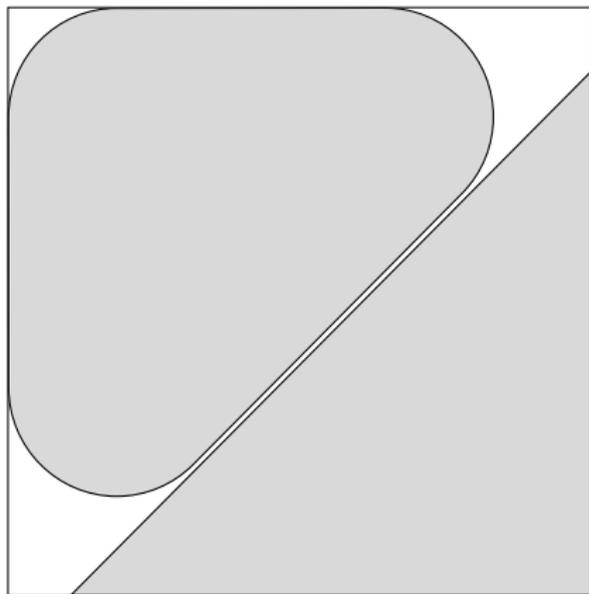


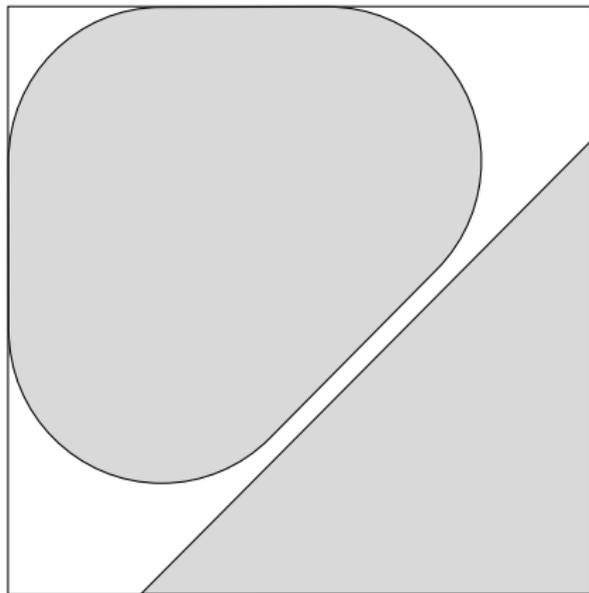


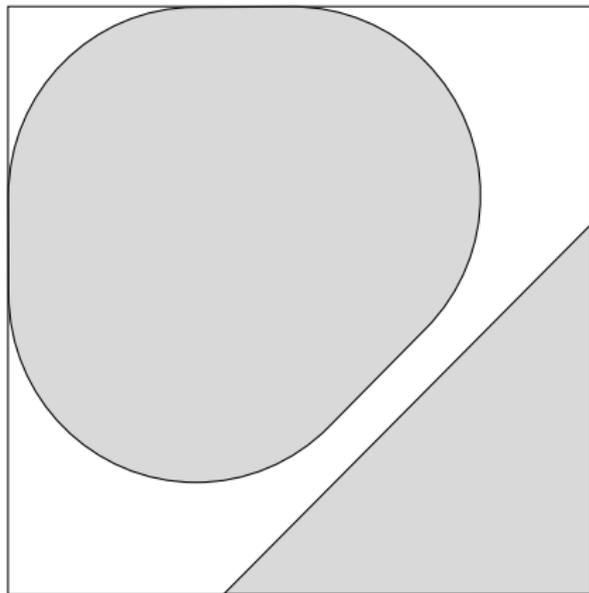


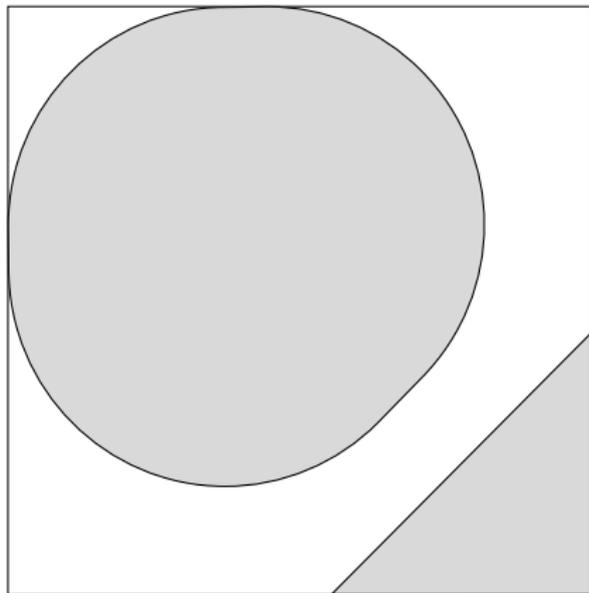


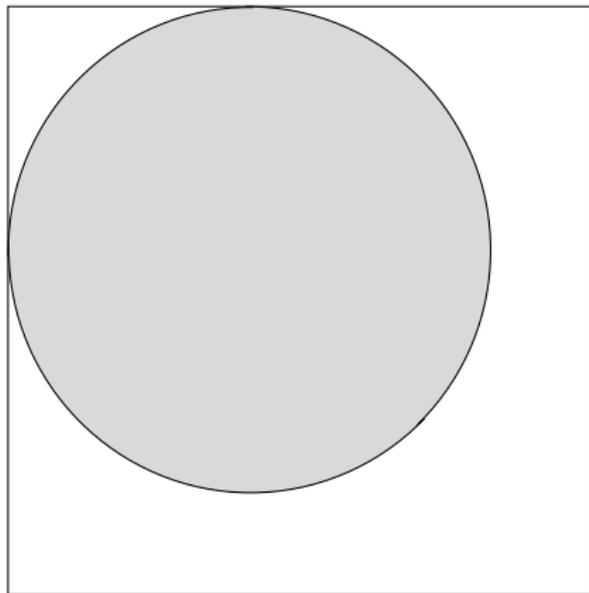




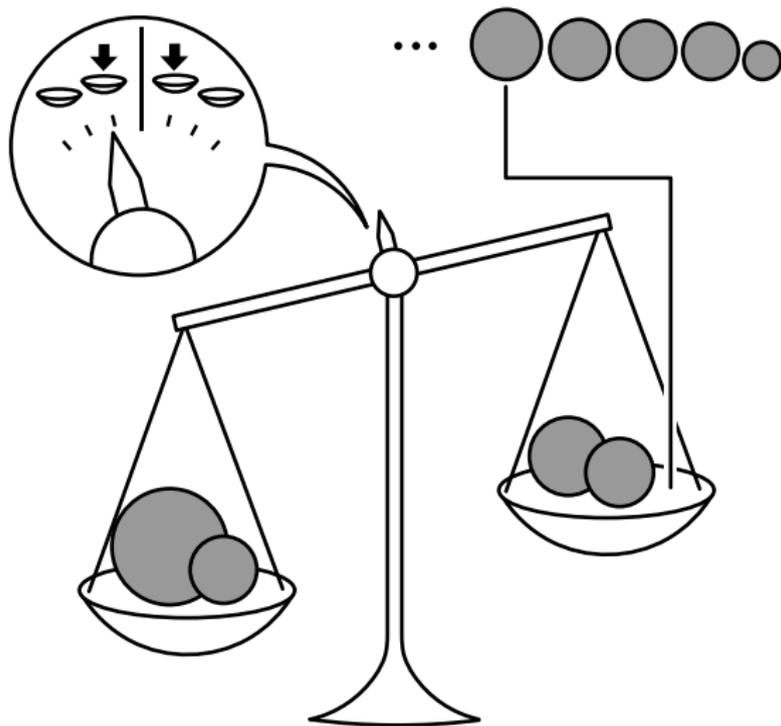


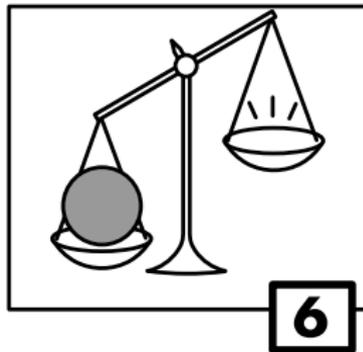
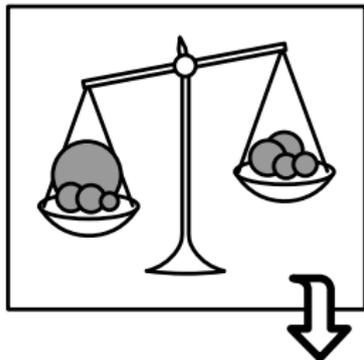




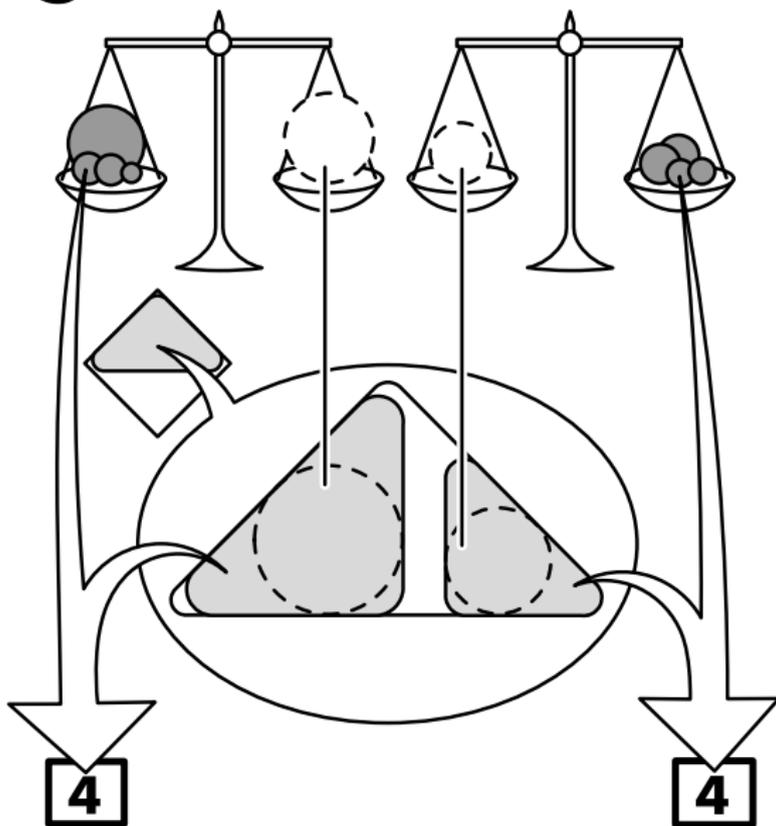


# 4

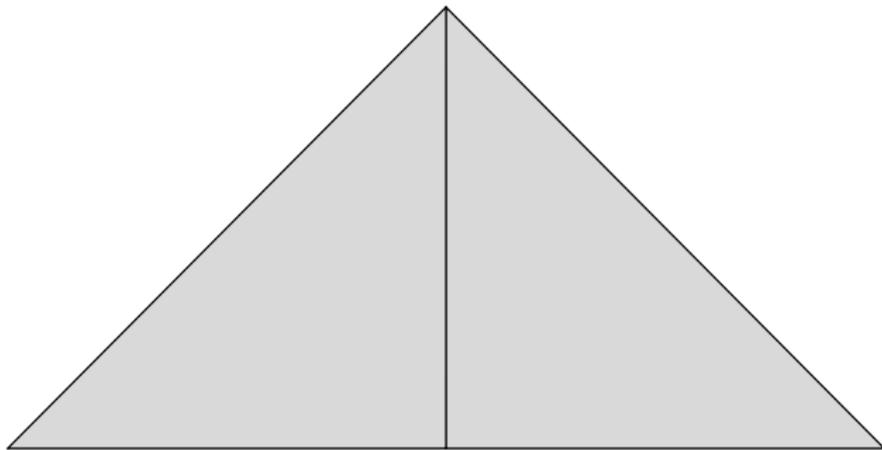




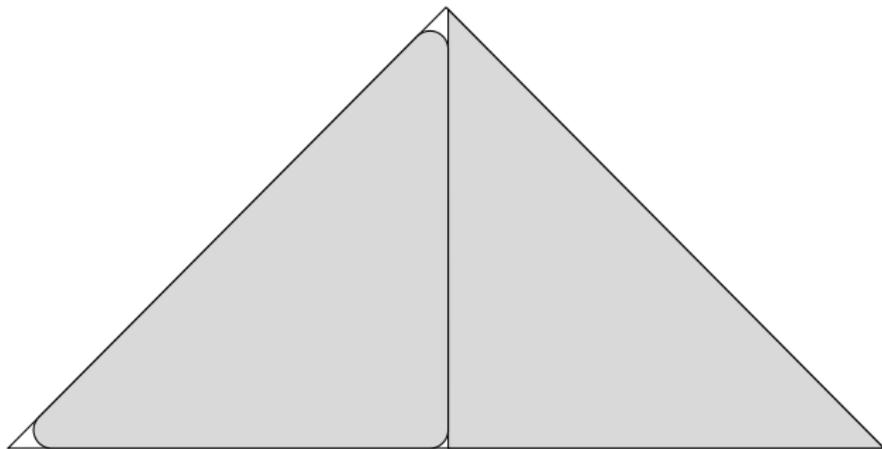
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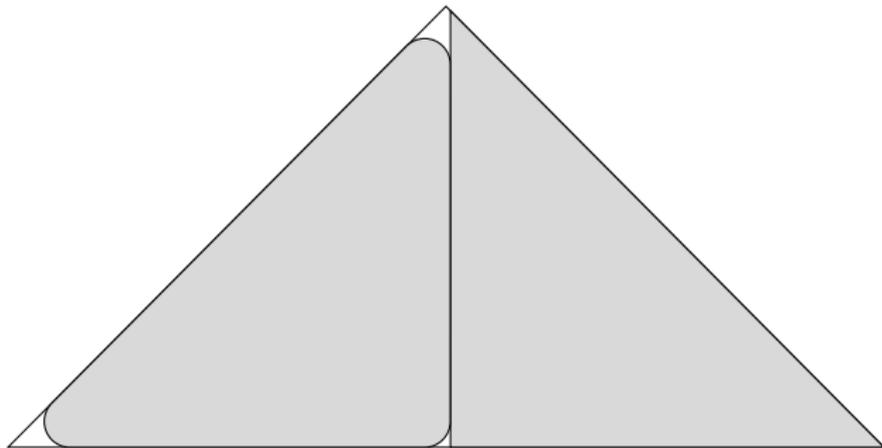
## Packing hats in a hat



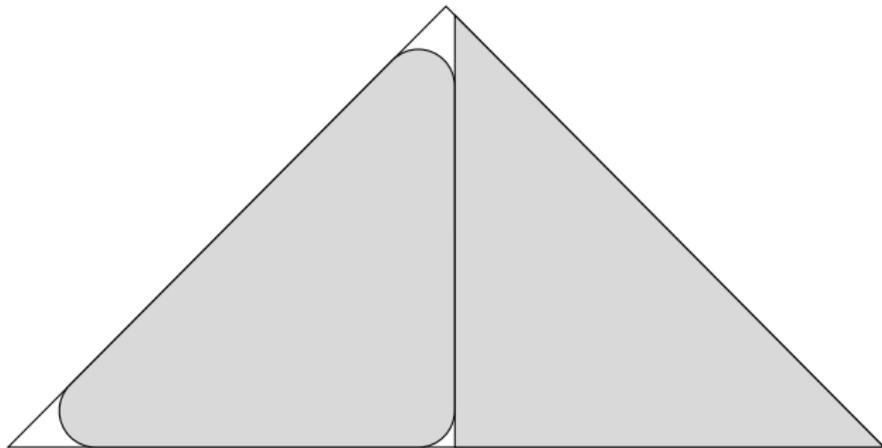
## Packing hats in a hat



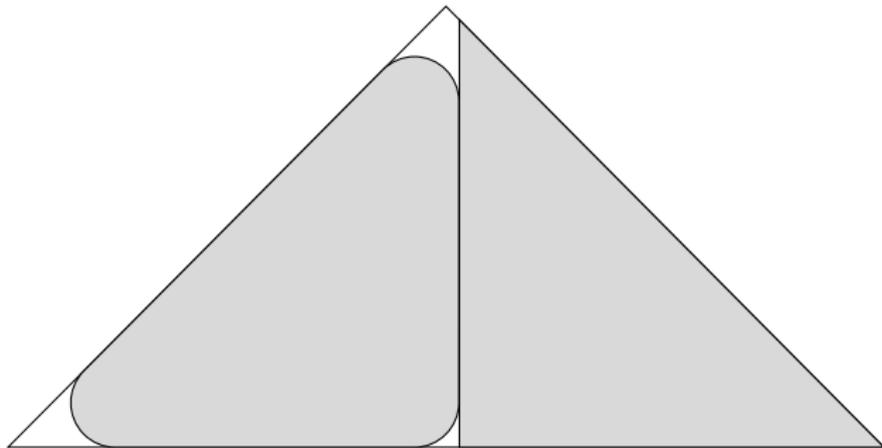
## Packing hats in a hat



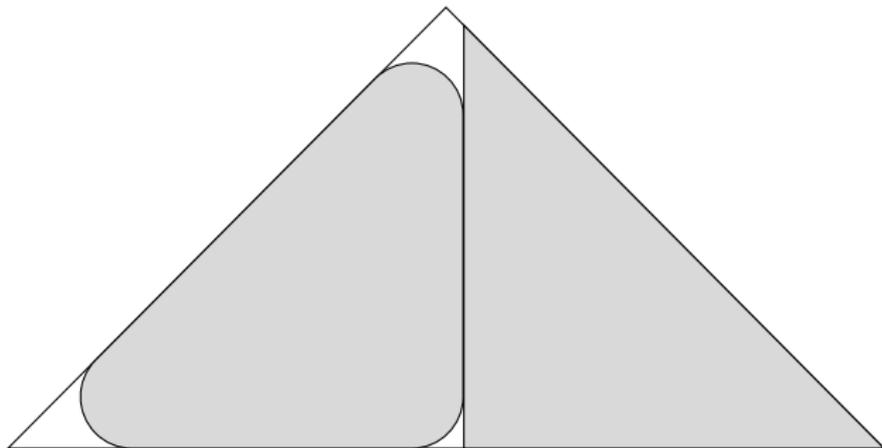
## Packing hats in a hat



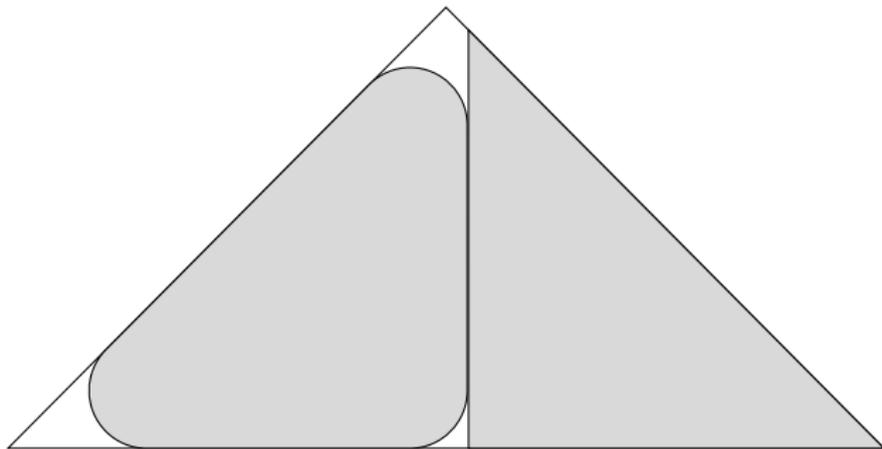
## Packing hats in a hat



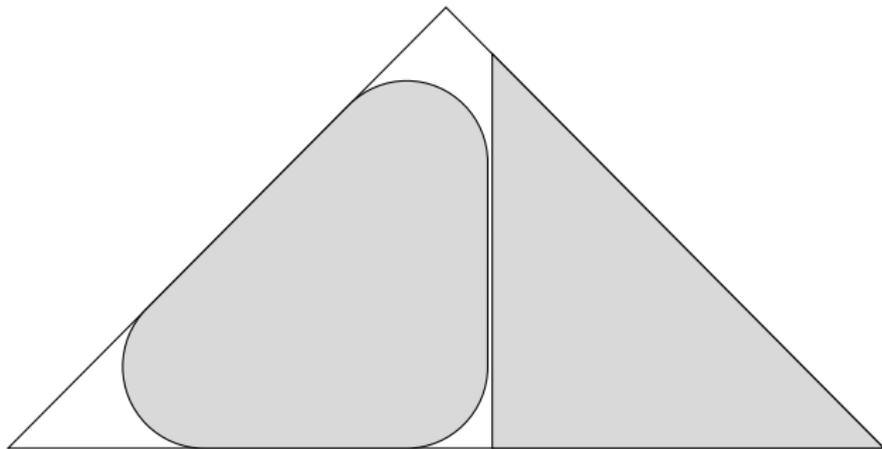
## Packing hats in a hat



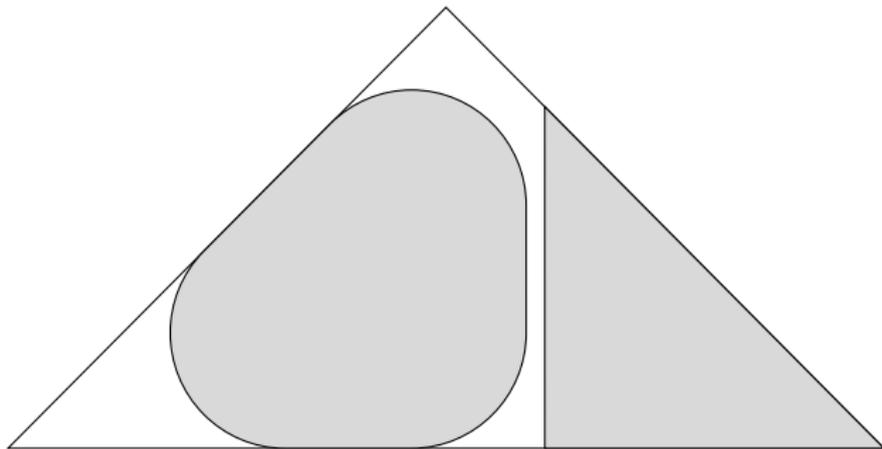
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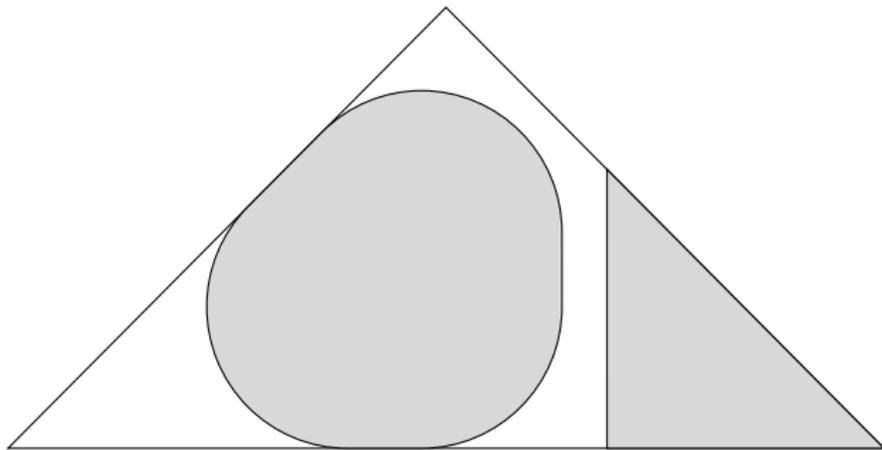
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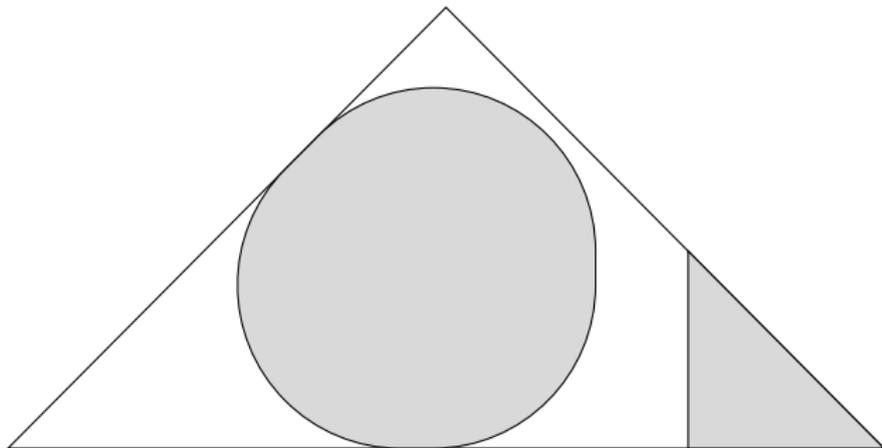
## Packing hats in a hat



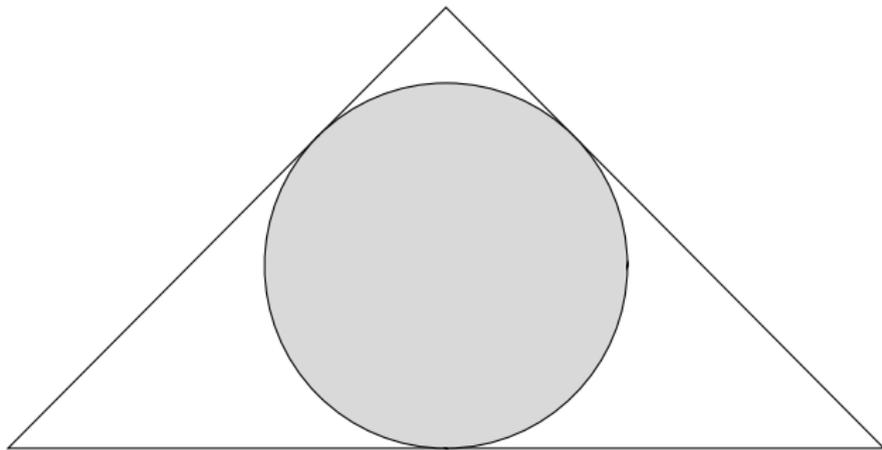
## Packing hats in a hat



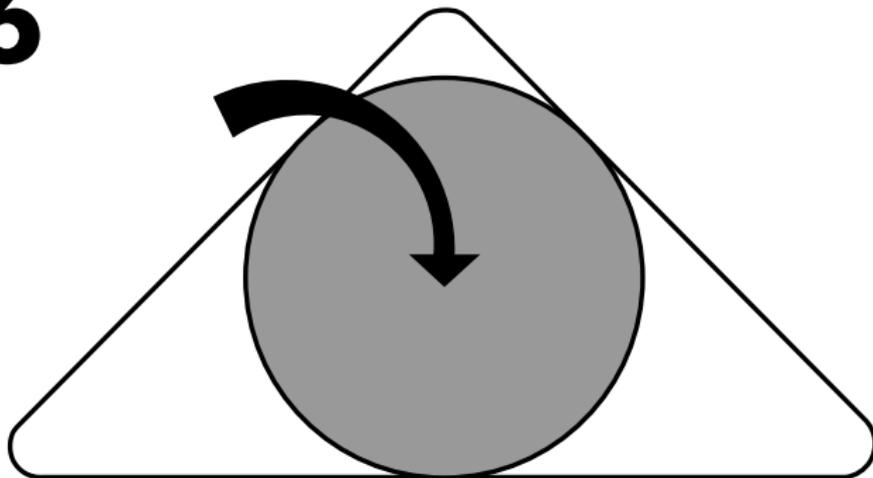
# Packing hats in a hat



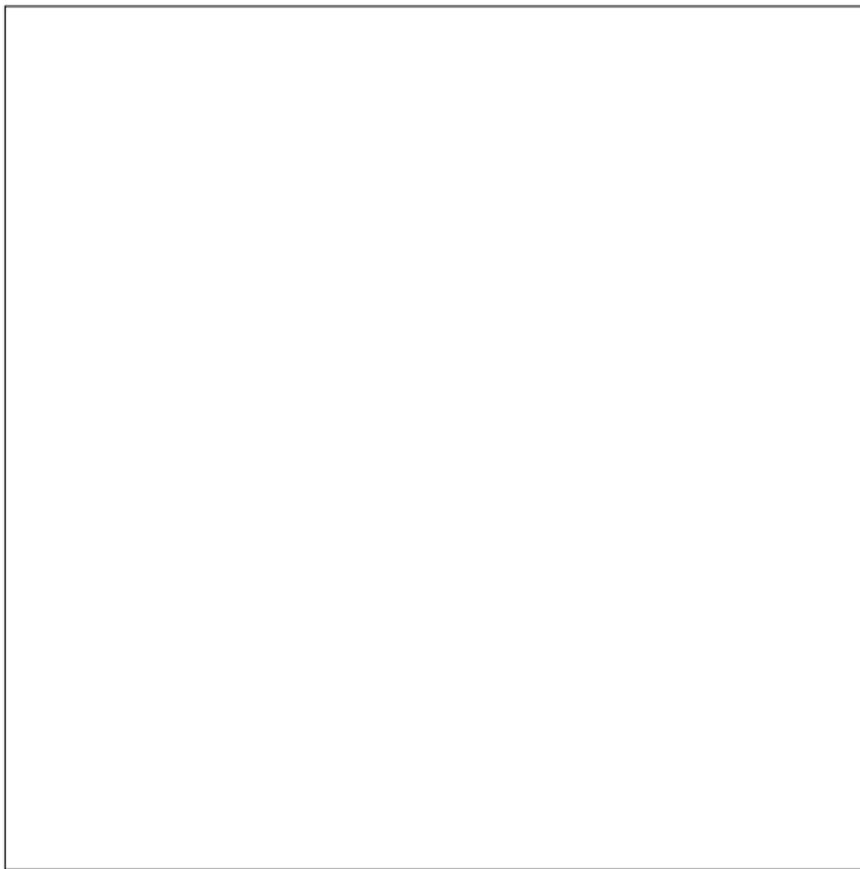
# Packing hats in a hat

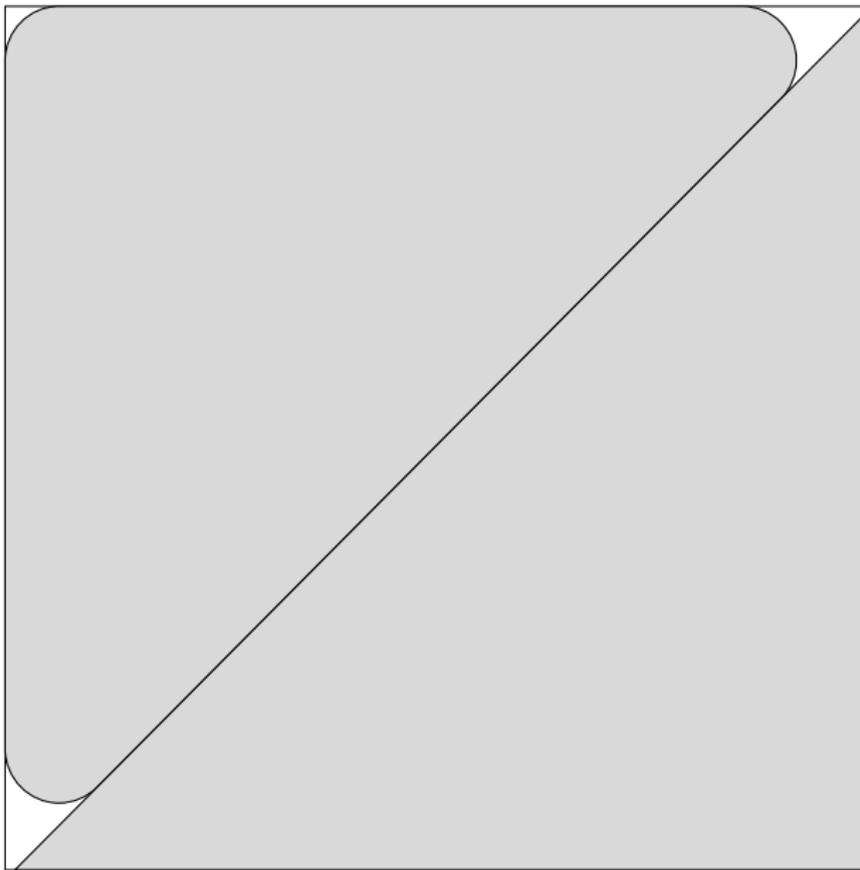


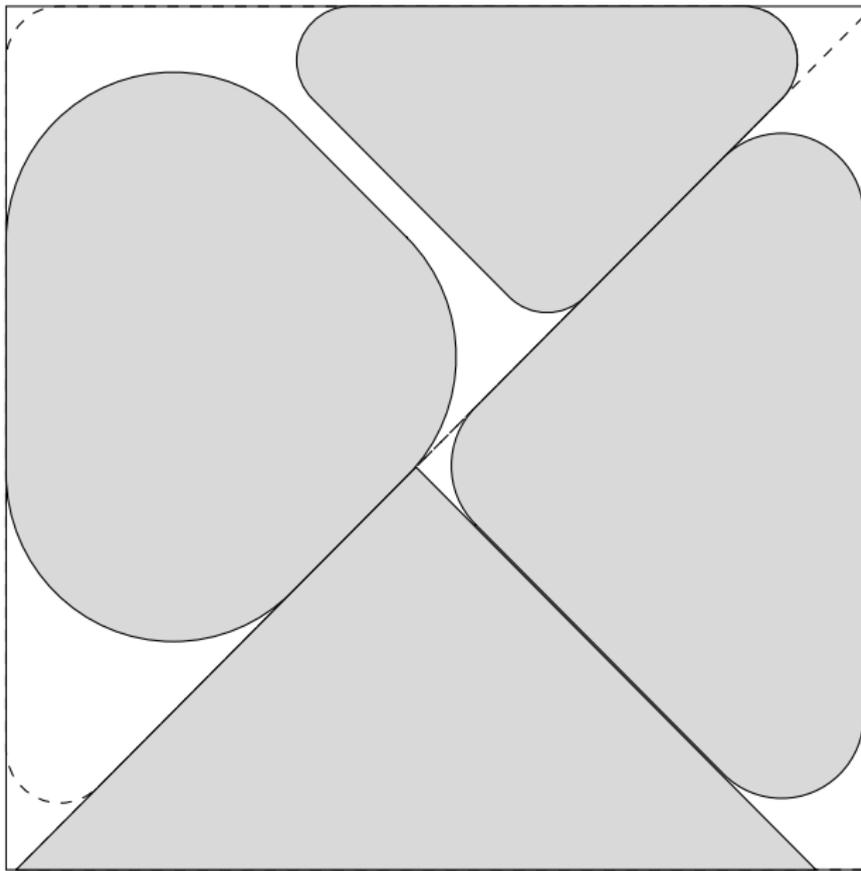
6

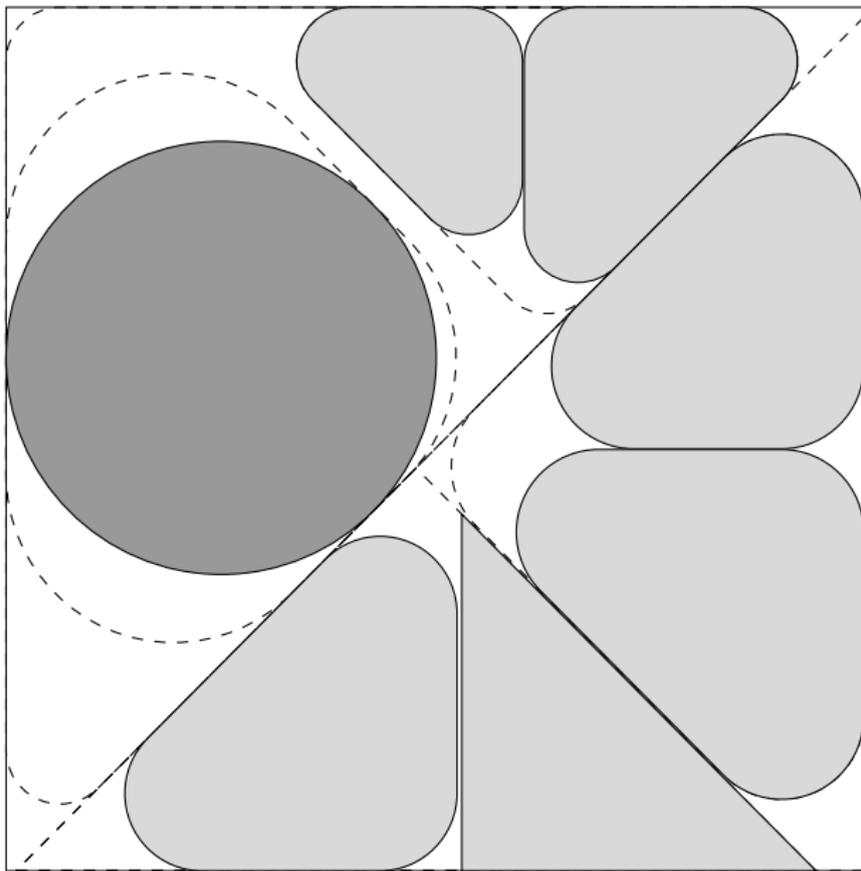


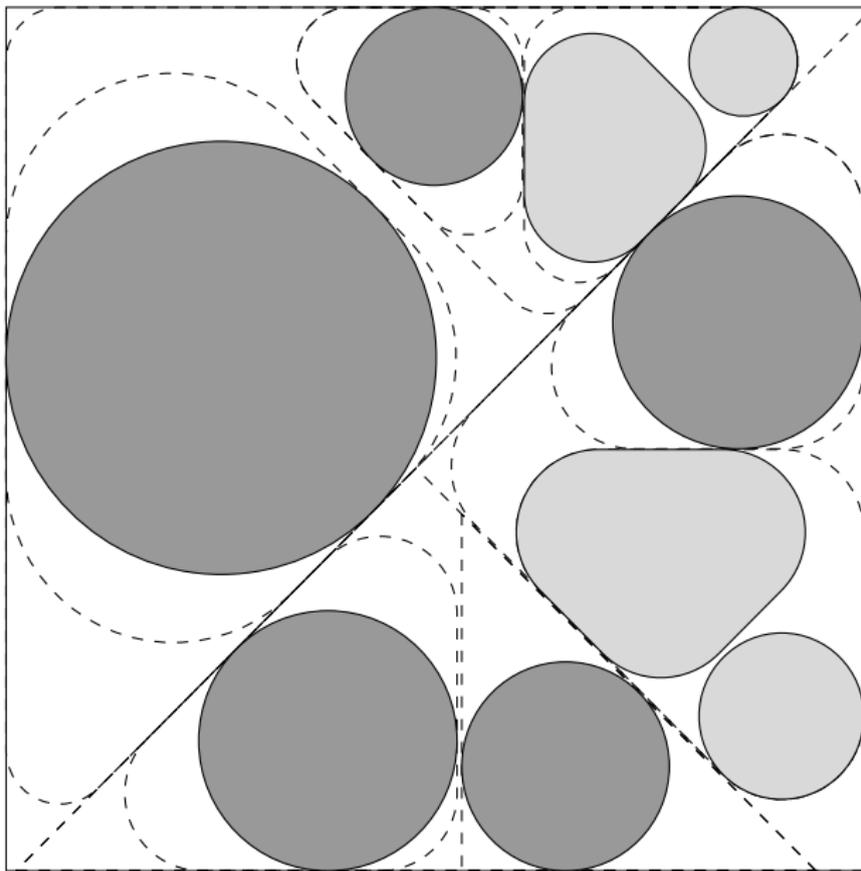
  $n_x \boxed{6}$

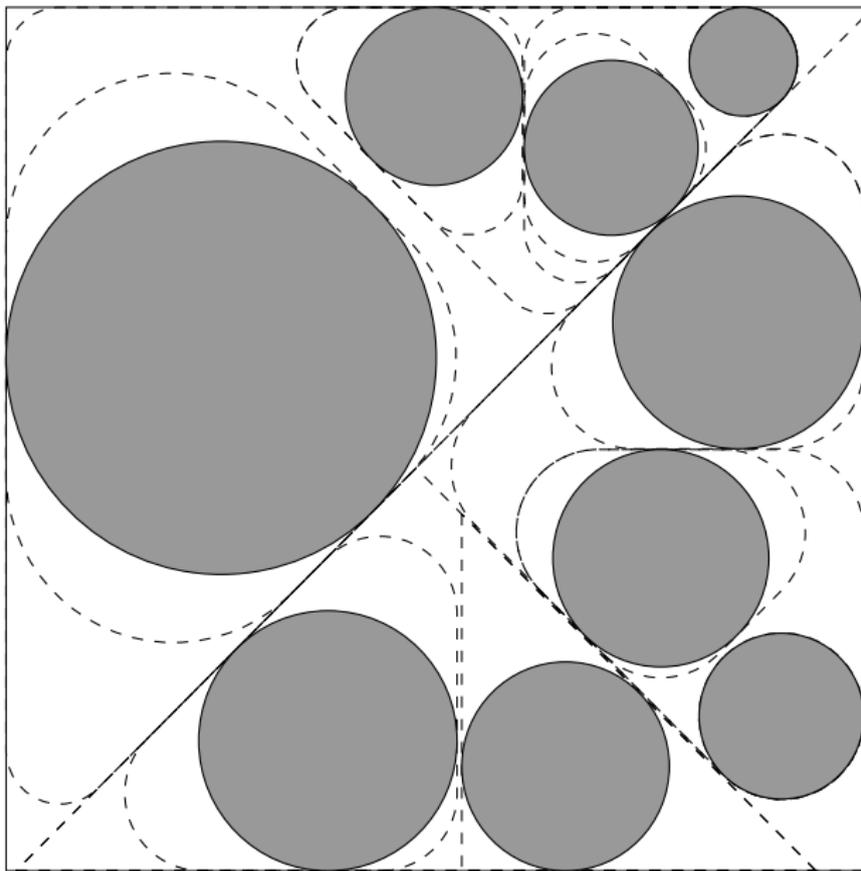




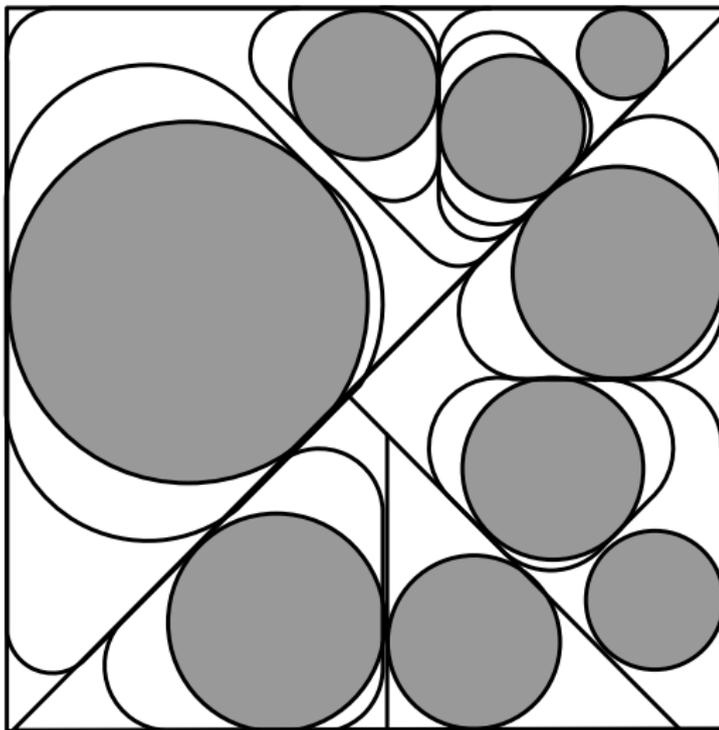




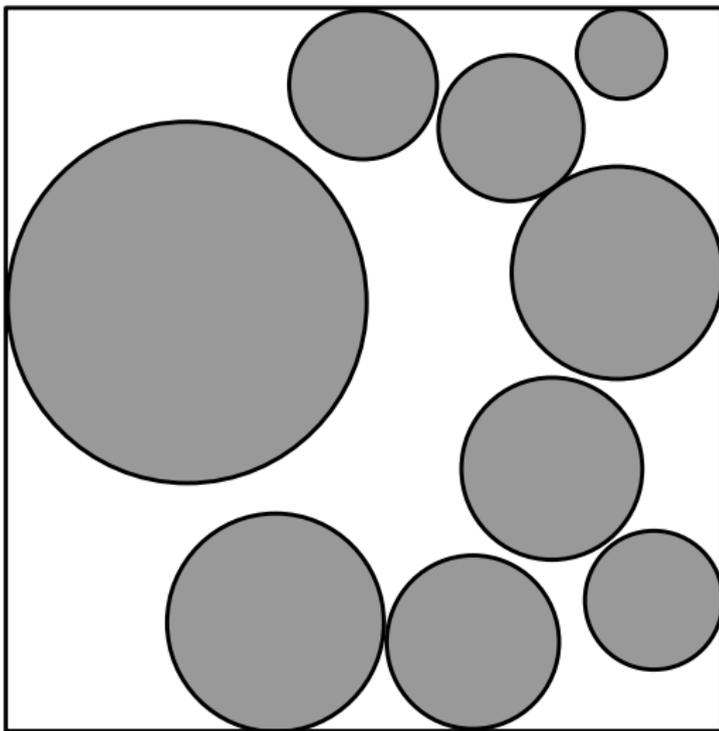




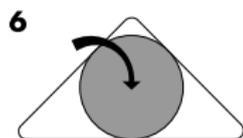
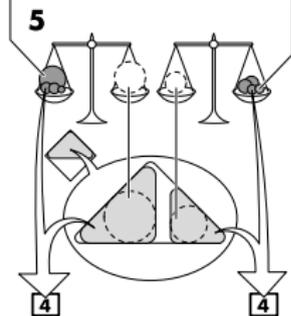
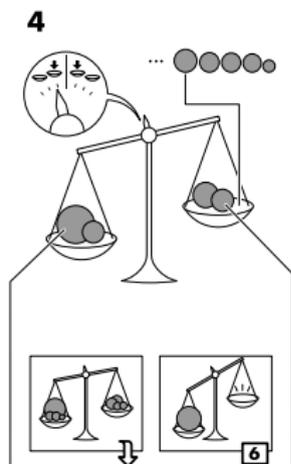
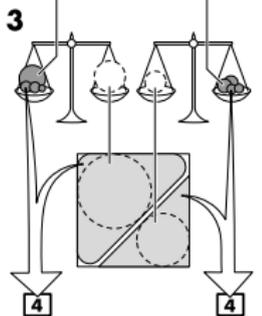
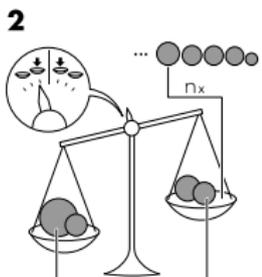
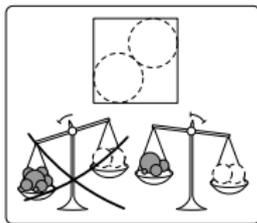
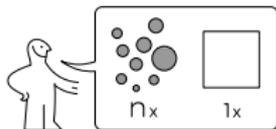
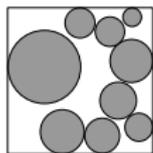
# 7



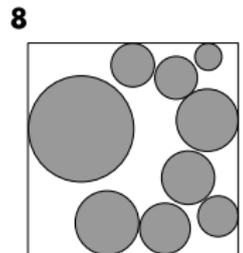
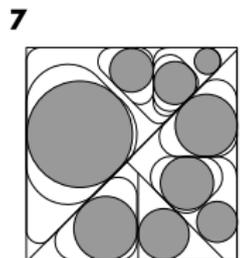
8



# SPLIT-PÄCK



$\{ n \times 6 \}$



<https://morr.cc/split-packing/>

# Analysis

Two perspectives:

# Analysis

Two perspectives:

## Deciding packability

A tight sufficient density condition:

Every instance with up to critical density  $d$  can be packed!

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## Minimizing the container's size

A constant-factor approximation algorithm:

The ratio between the approximated and the optimal container area is at most  $1/d$ .

# Analysis

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Runtime:

# Analysis

Two perspectives:

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Every instance with up to critical density  $d$  can be packed!

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A constant-factor approximation algorithm:

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Runtime:

- At most  $\mathcal{O}(n^2)$  numeric operations
  - ▶ Worst-case greedy split:  $n + (n - 1) + (n - 2) + \dots + 1$  operations

# Analysis

Two perspectives:

## Deciding packability

A tight sufficient density condition:

Every instance with up to critical density  $d$  can be packed!

## Minimizing the container's size

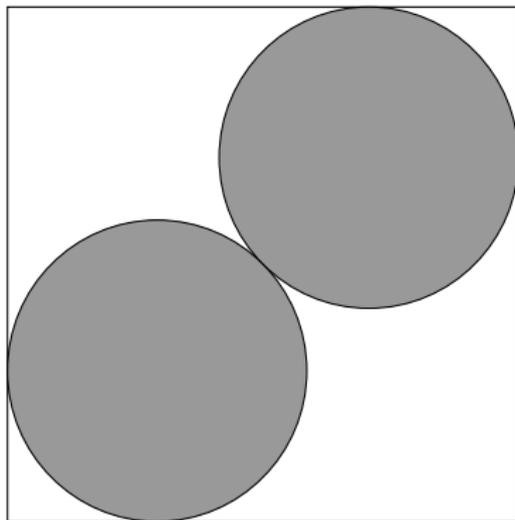
A constant-factor approximation algorithm:

The ratio between the approximated and the optimal container area is at most  $1/d$ .

Runtime:

- At most  $\mathcal{O}(n^2)$  numeric operations
  - ▶ Worst-case greedy split:  $n + (n - 1) + (n - 2) + \dots + 1$  operations
- Exactly  $3n - 2$  geometric constructions
  - ▶ Full binary recursion tree with  $n$  leaf nodes

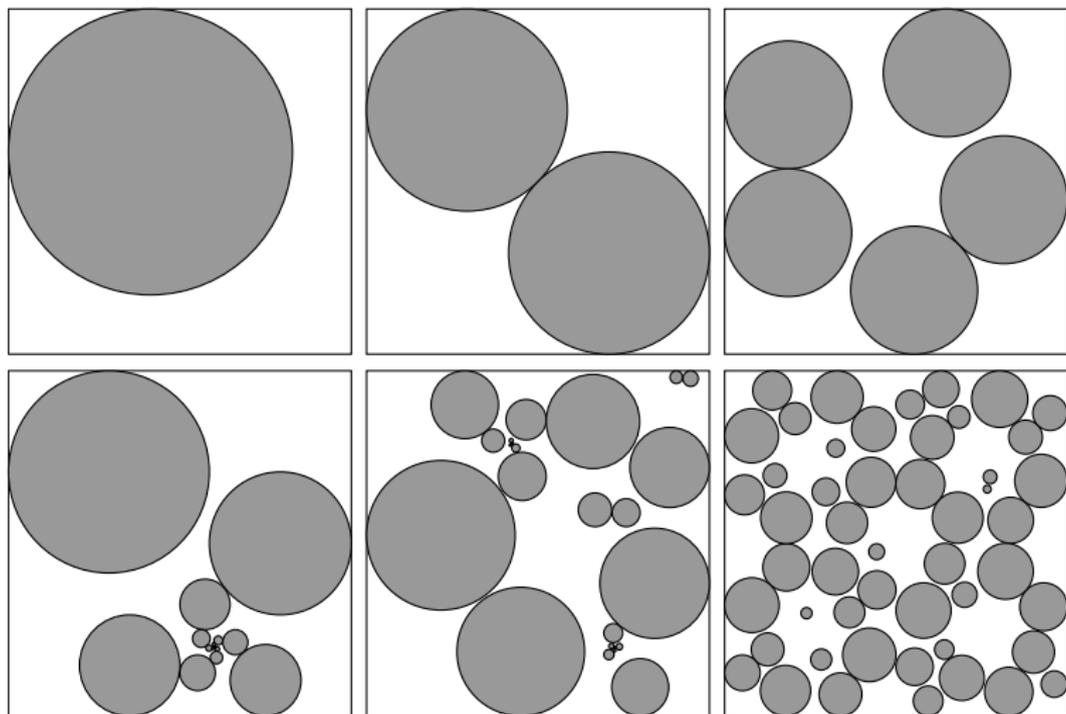
## Circles in a square



*Critical density:*  $\frac{\pi}{3 + 2\sqrt{2}} \approx 53.90\%$

*Approximation factor:*  $\frac{3 + 2\sqrt{2}}{\pi} \approx 1.8552$

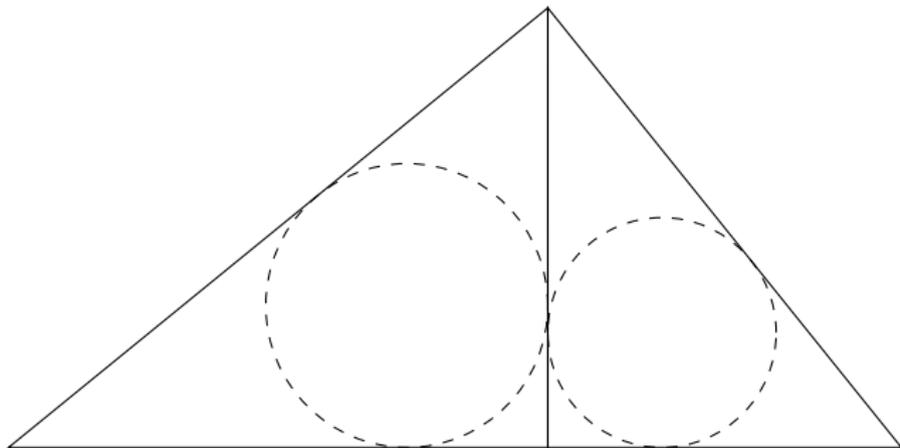
## Circles in a square: Examples



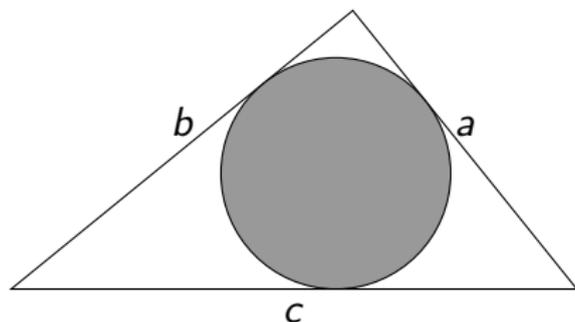
# Outline

- 1 Packing circles in a square
- 2 Other container types**
- 3 Other object types
- 4 Future work

## Splitting for asymmetric triangles



## Circles in a right/obtuse triangle

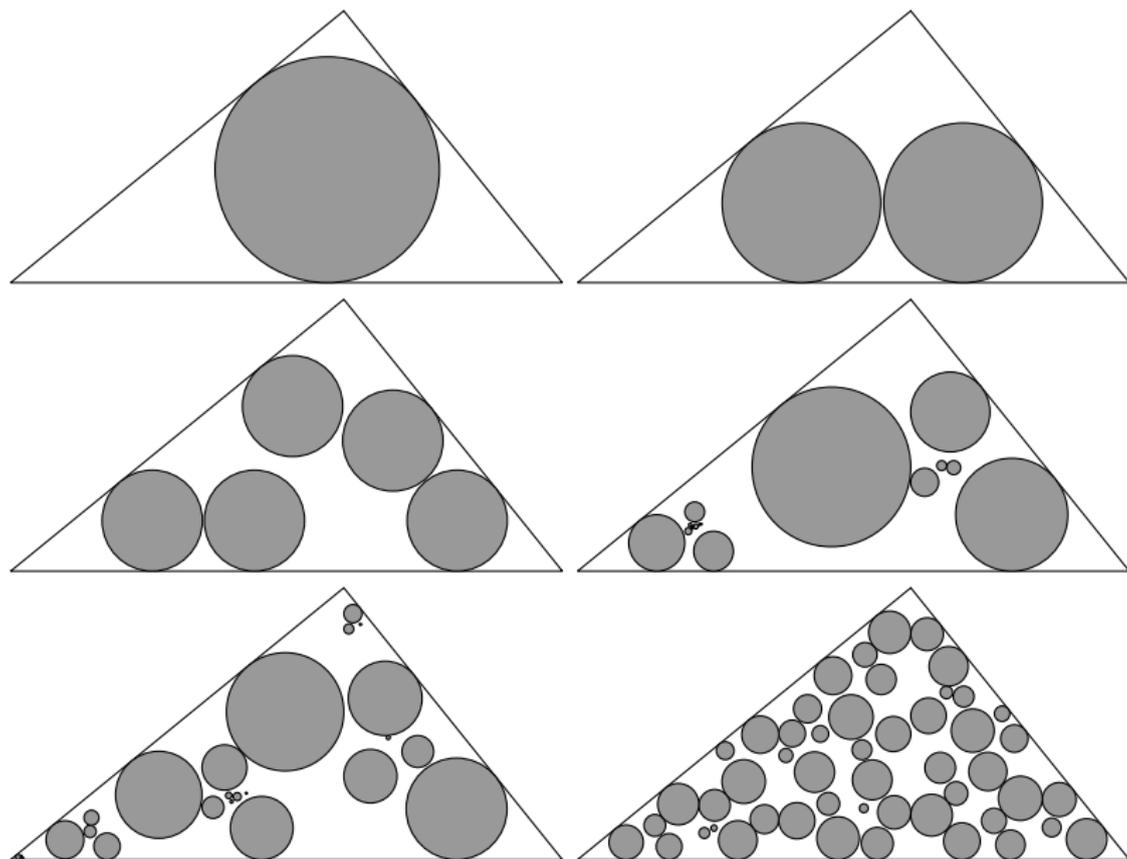


Condition:  $a^2 + b^2 \leq c^2$

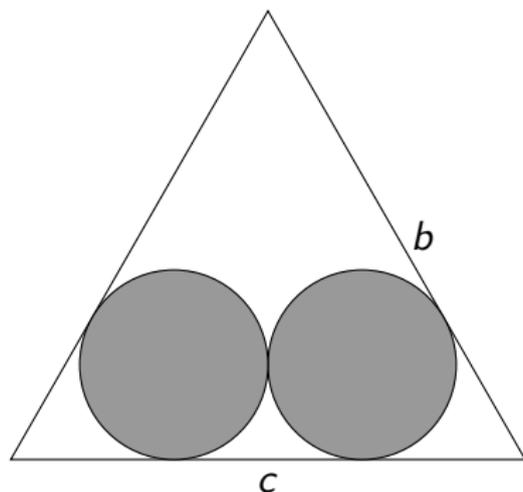
Critical density:  $\sqrt{\frac{-(a-b-c)(a+b-c)(a-b+c)}{(a+b+c)^3}} \pi < 53.91\%$

Approximation factor: Larger than 1.8552

## Circles in a right/obtuse triangle: Examples



## Circles in a thick isosceles triangle

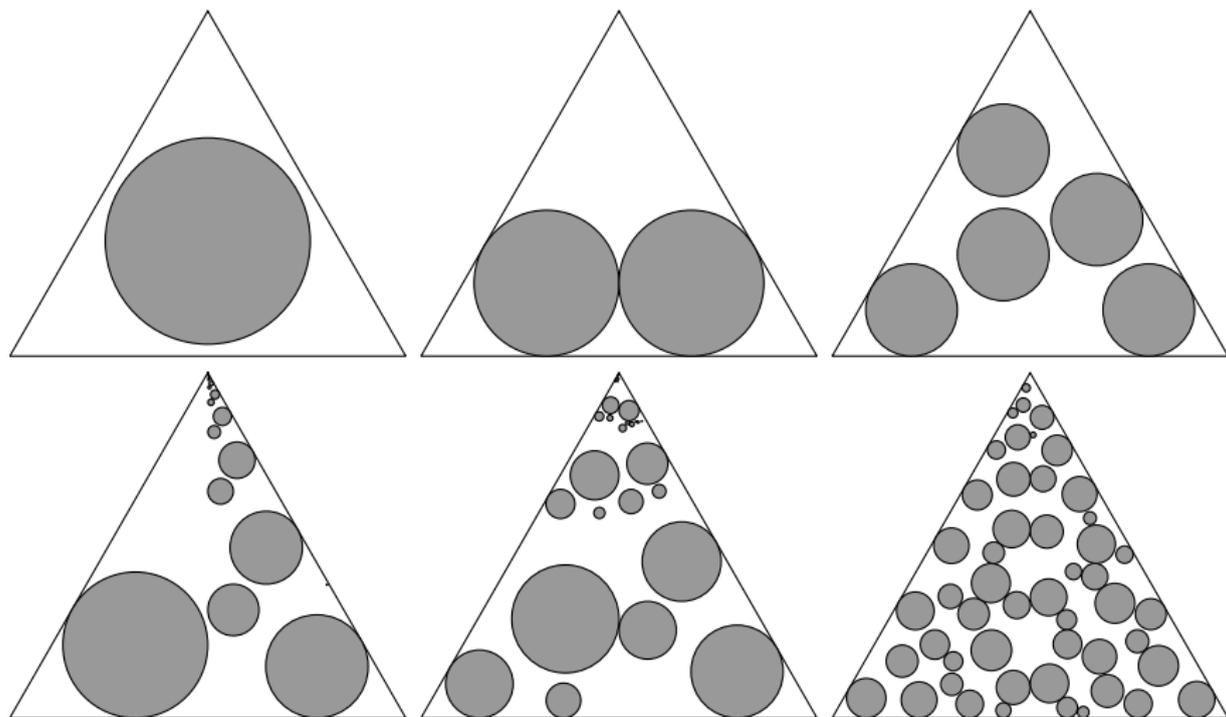


Condition:  $\frac{c}{\sqrt{2}} \leq b \leq c$

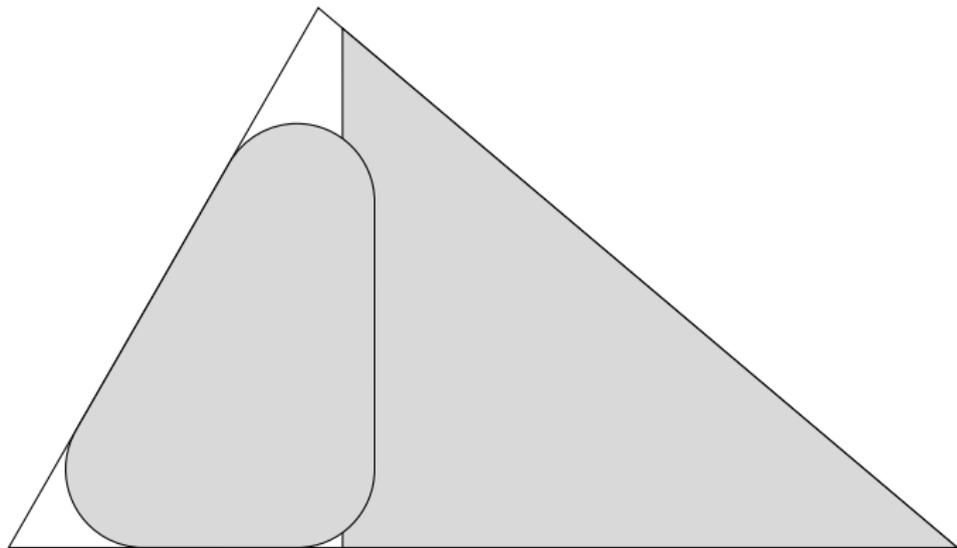
Critical density:  $48.60\% < \frac{(c - 2b + \sqrt{4b^2 - c^2})^2 \pi}{2c\sqrt{4b^2 - c^2}} < 53.91\%$

Approximation factor: Between 1.8552 and 2.0576

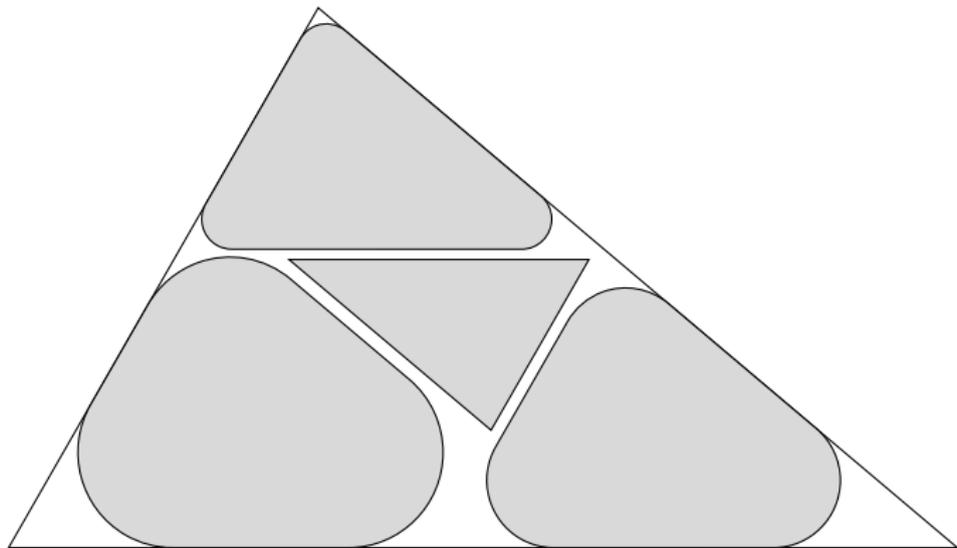
## Circles in a thick isosceles triangle: Examples



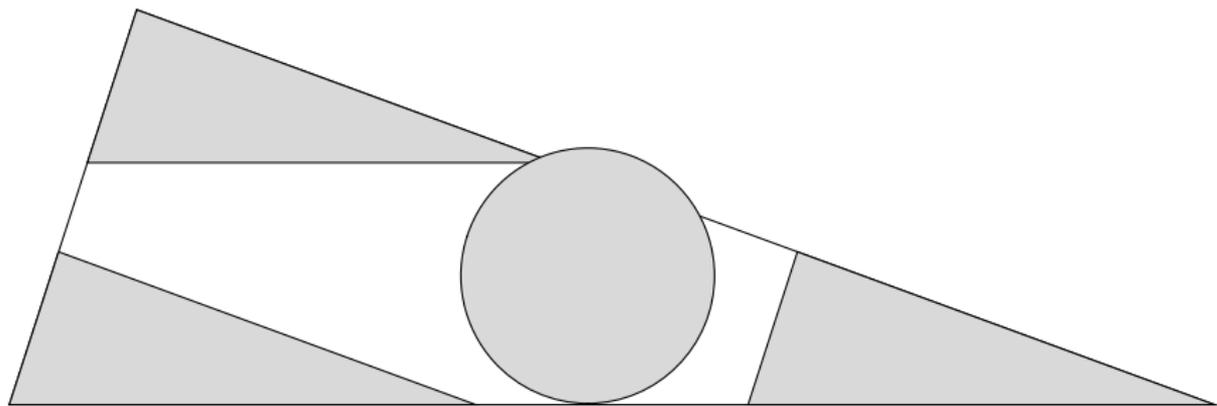
# The problem with acute triangles



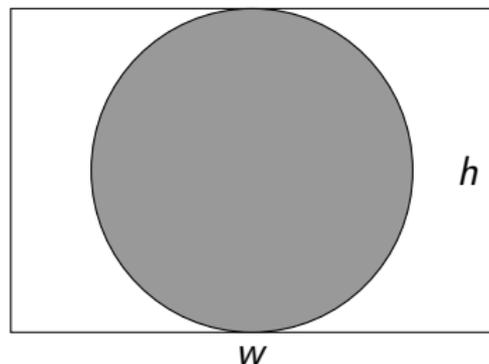
# The problem with acute triangles



## The problem with acute triangles



## Circles in a long rectangle

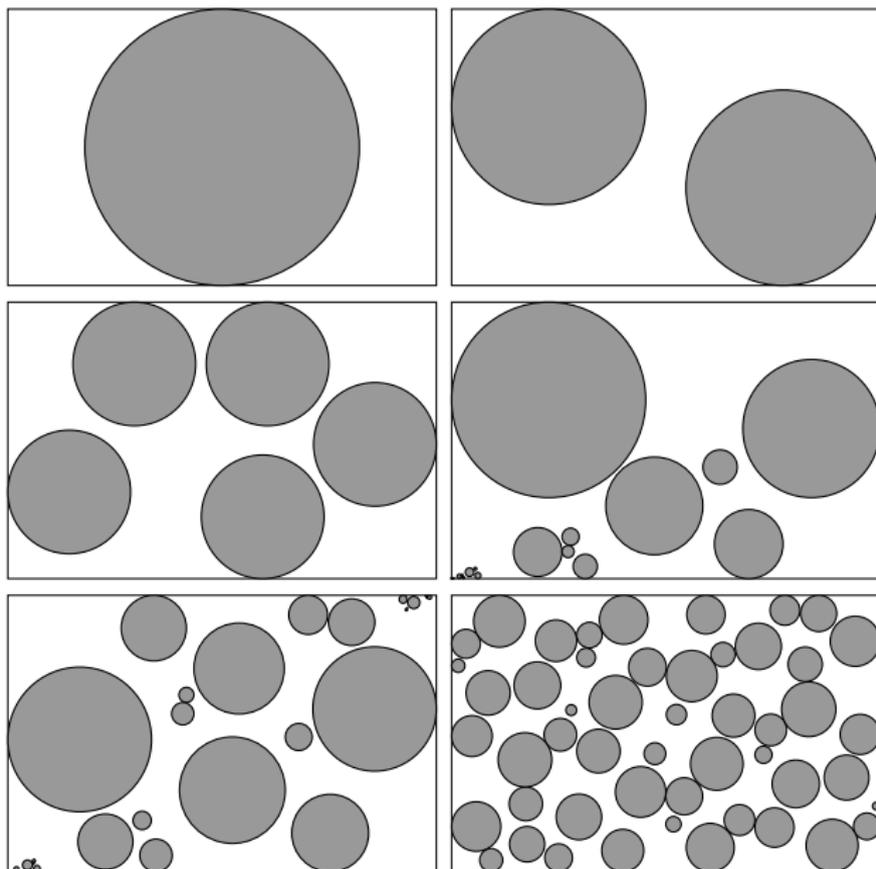


*Condition:*  $w \geq \frac{2 + 3\sqrt{2}}{4} h \approx 1.5607h$

*Critical density:*  $\frac{\pi h}{4w} < 50.33\%$

*Approximation factor:*  $\frac{4w}{\pi h} > 1.9870$

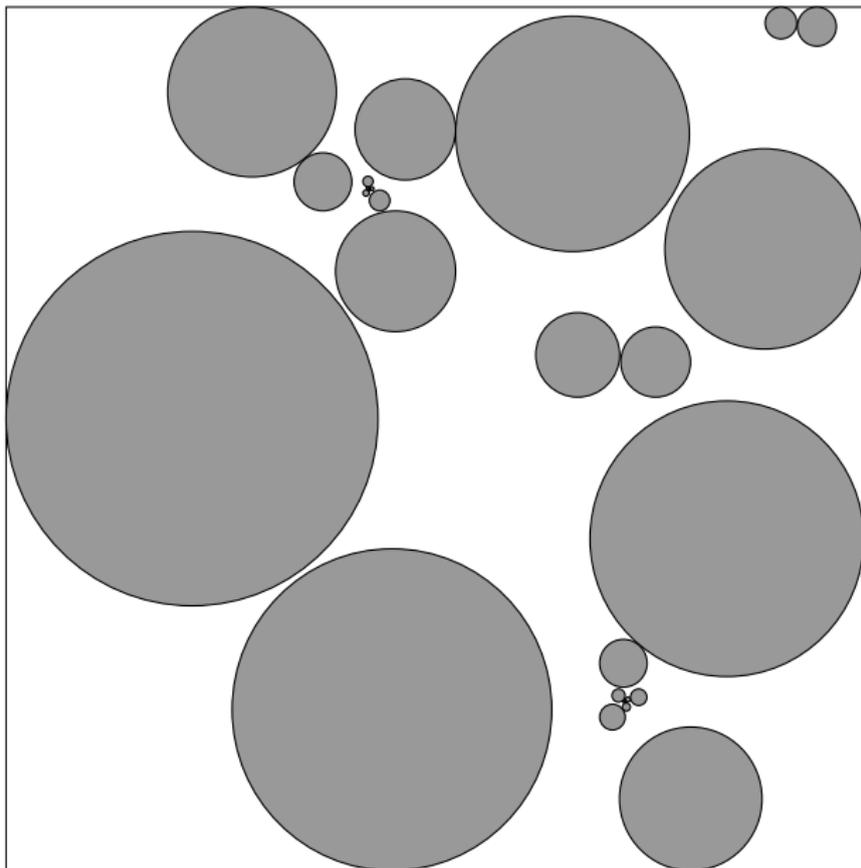
## Circles in a long rectangle: Examples



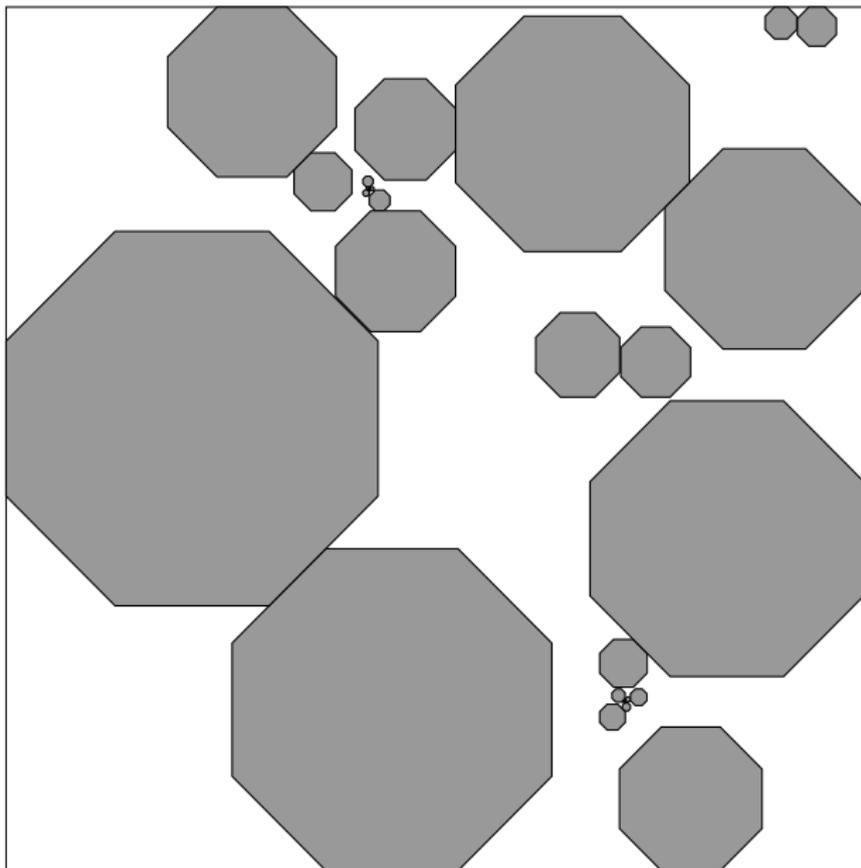
# Outline

- 1 Packing circles in a square
- 2 Other container types
- 3 Other object types**
- 4 Future work

## Other shapes in a square?



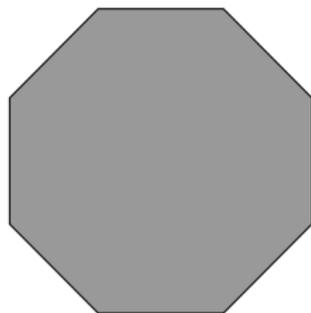
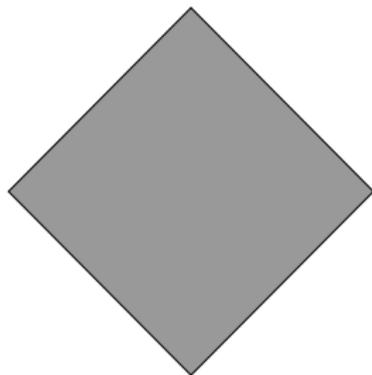
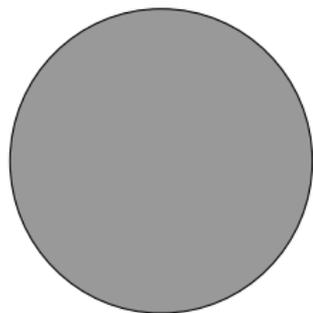
## Other shapes in a square?



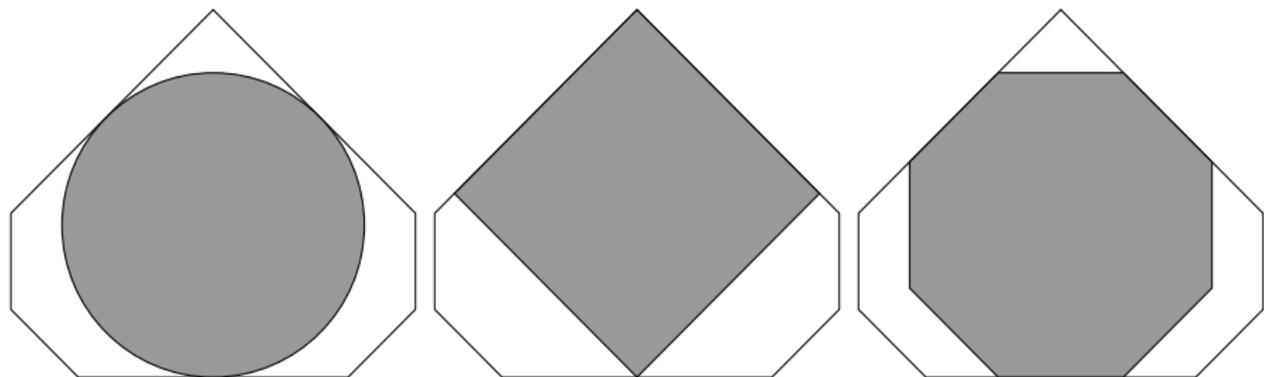
## Other shapes in a square?



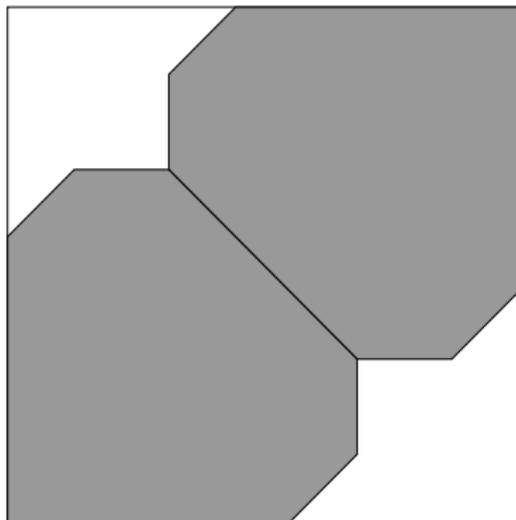
# Rubies!



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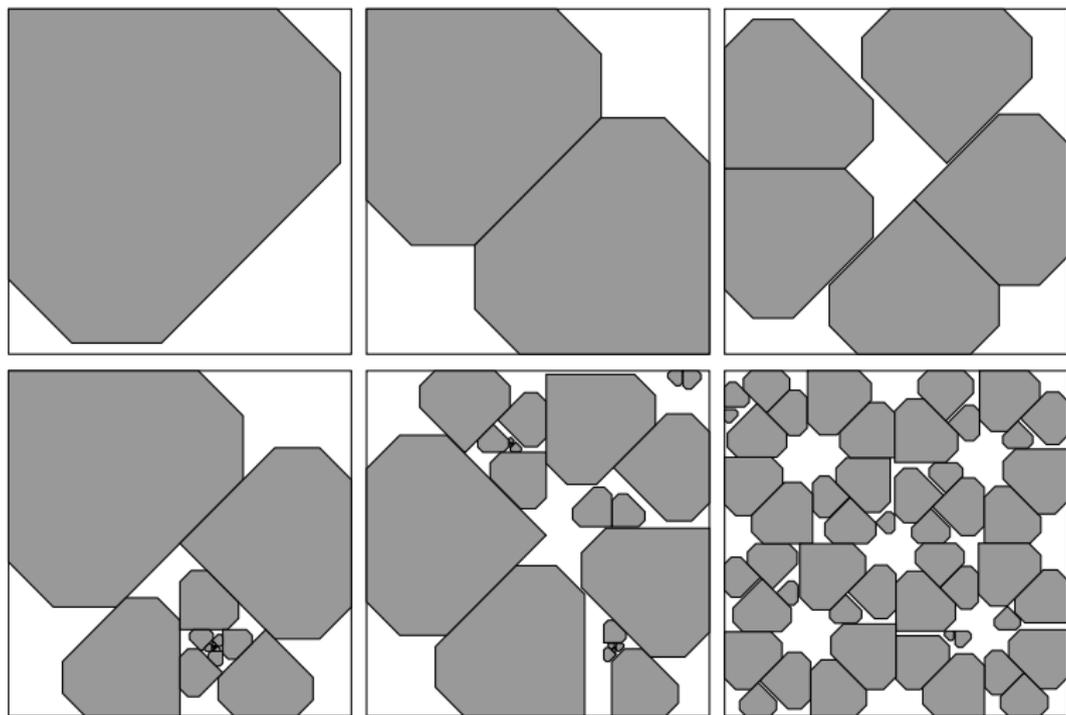
## Rubies in a square



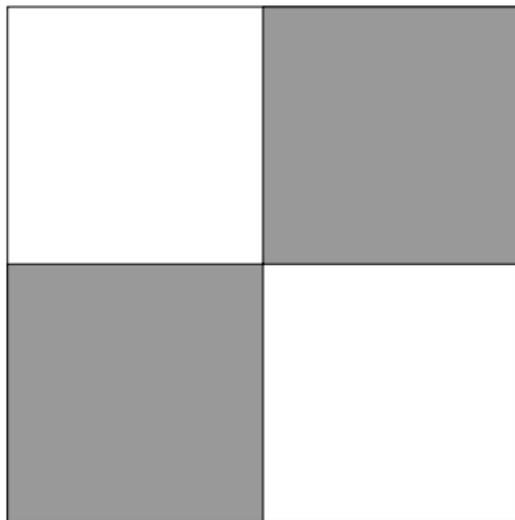
*Critical density:*  $8\sqrt{2(\sqrt{2}-1)} + 6\sqrt{2} - 15 \approx 76.67\%$

*Approximation factor:*  $\approx 1.3043$

## Rubies in a square: Examples



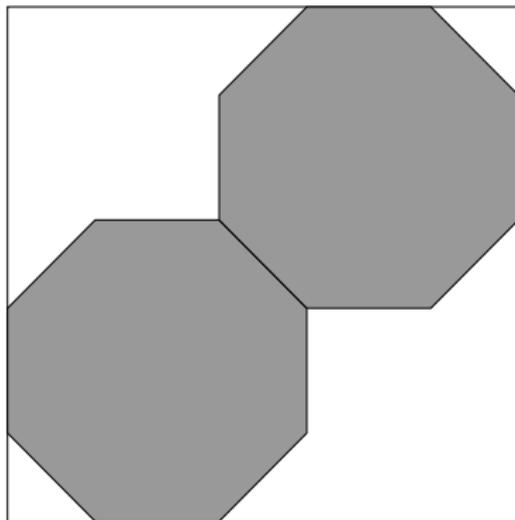
## Squares in a square



*Critical density: 50%*

*Approximation factor: 2*

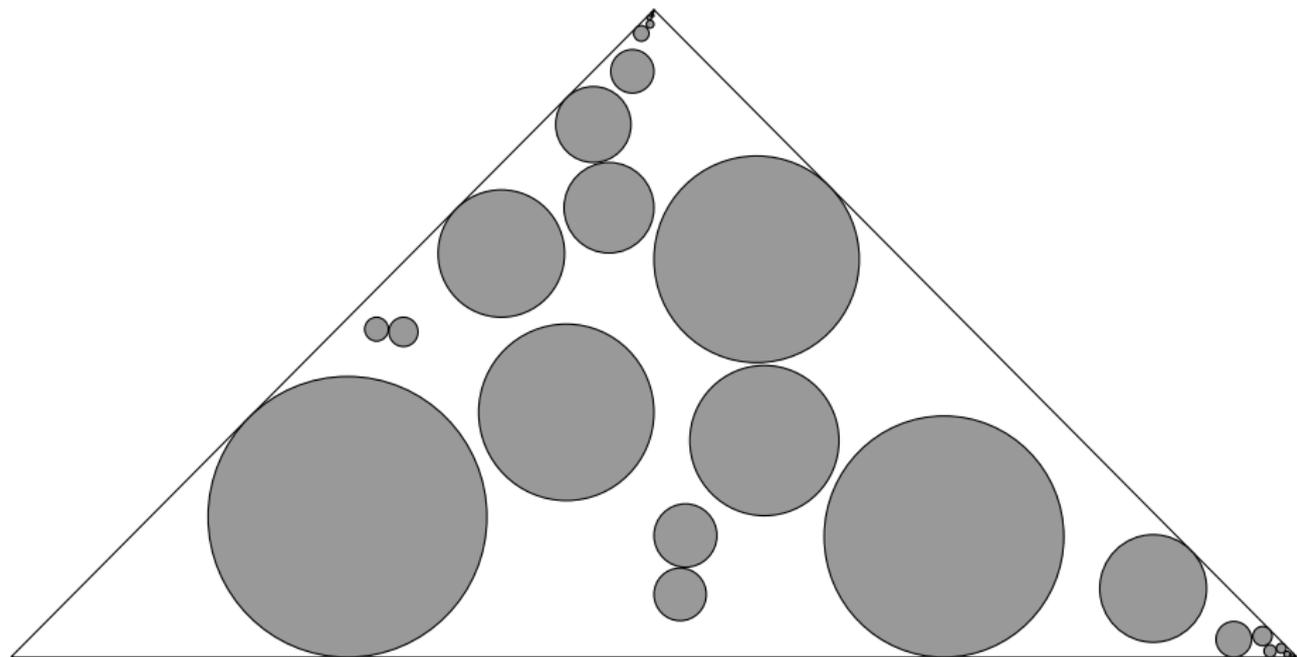
## Octagons in a square



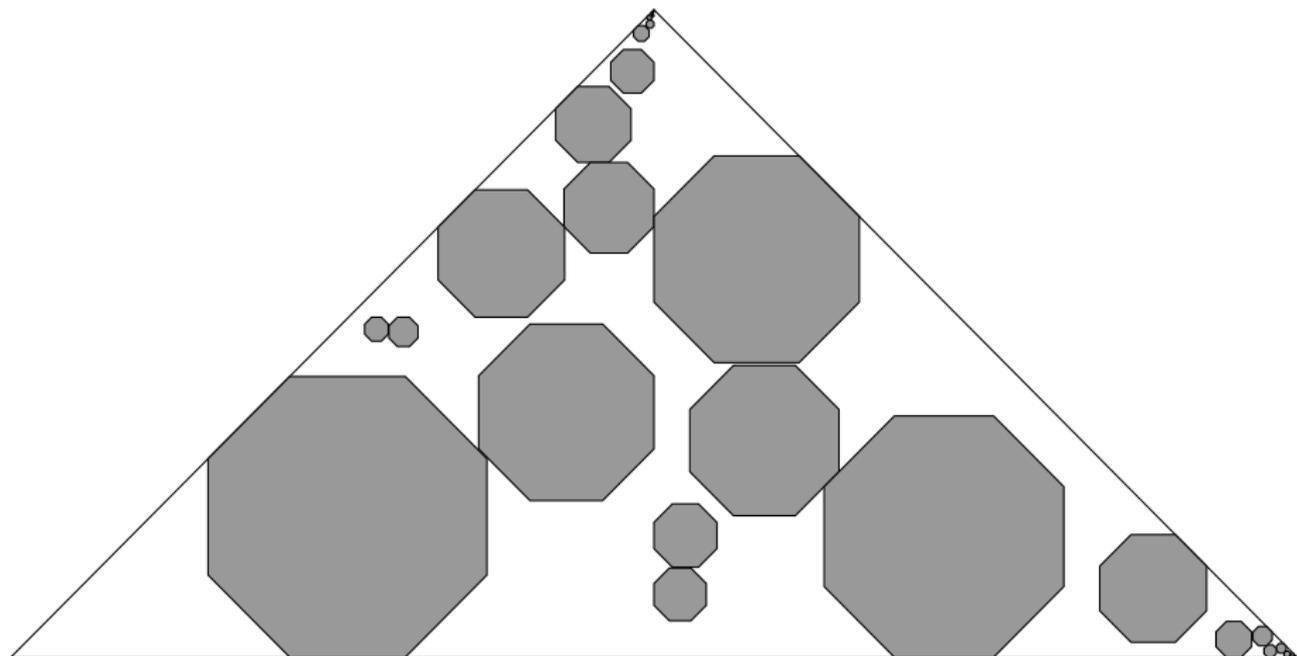
*Critical density:*  $8(5\sqrt{2} - 7) \approx 56.85\%$

*Approximation factor:*  $\approx 1.7589$

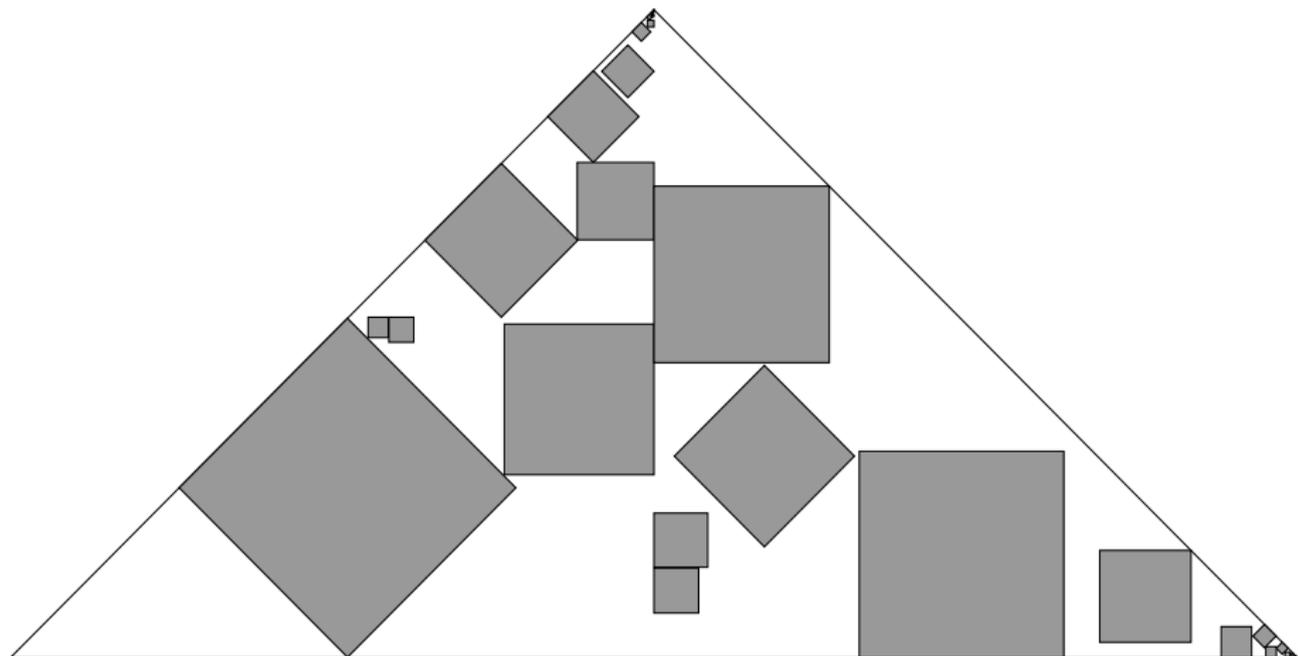
## Other shapes in an isosceles right triangle?



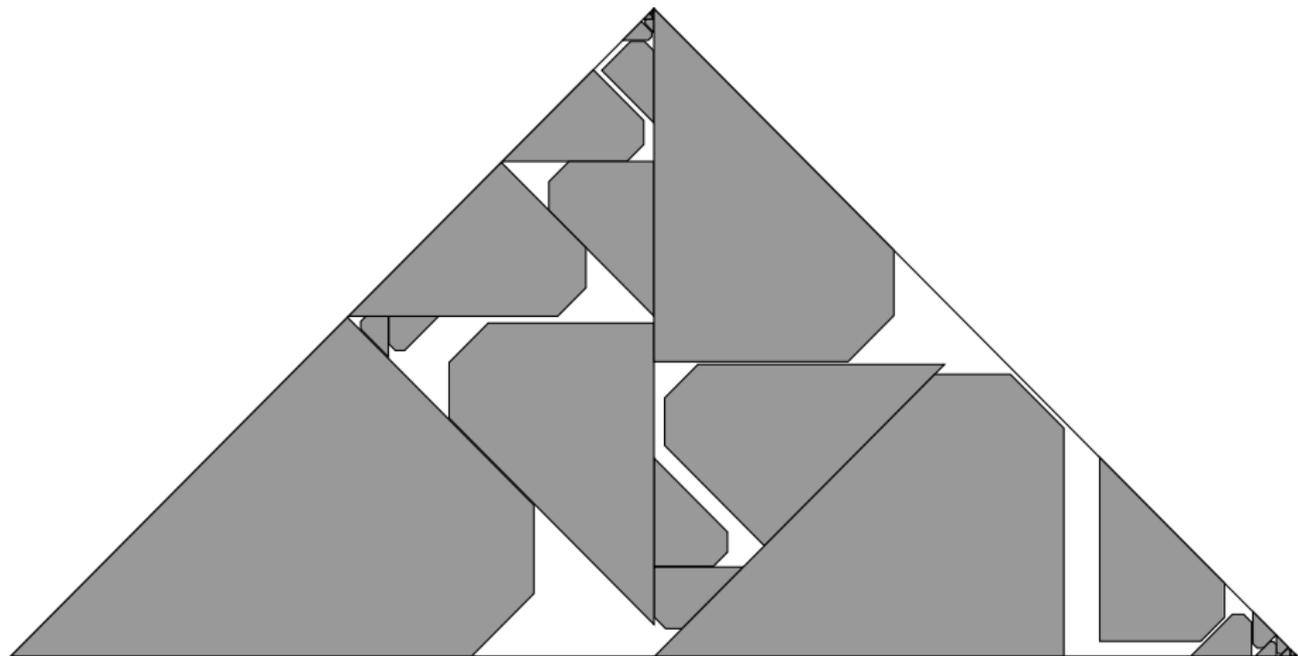
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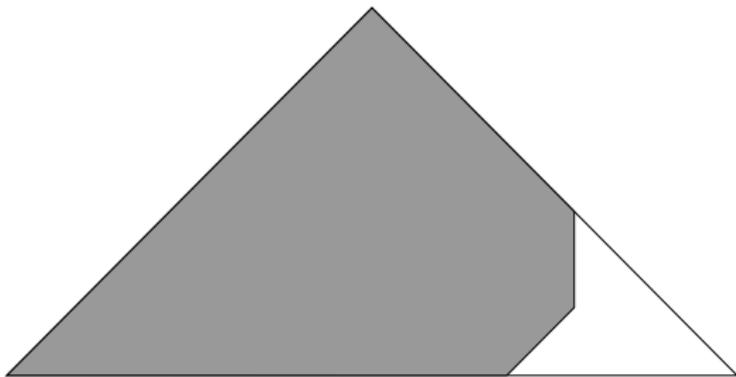
## Other shapes in an isosceles right triangle?



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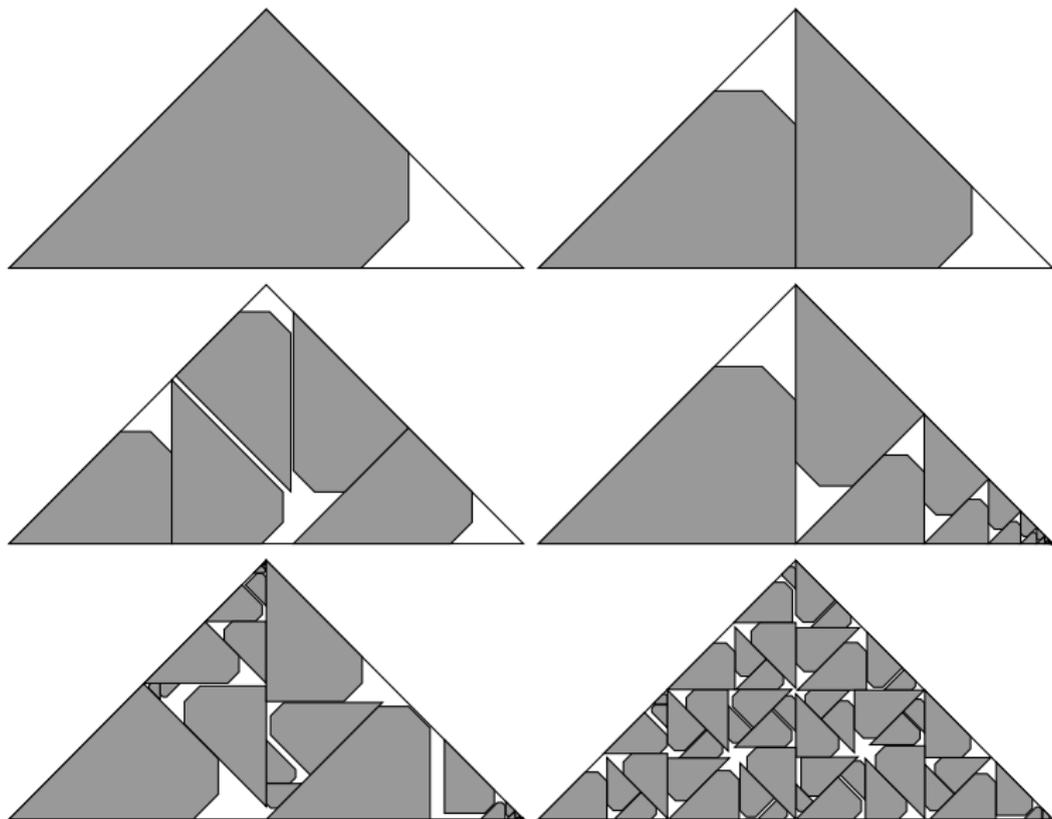
## “Sharp rubies” in an isosceles right triangle



*Critical density:*  $4\sqrt{2(\sqrt{2}-1)} + 3\sqrt{2} - 7 \approx 88.34\%$

*Approximation factor:*  $\approx 1.1320$

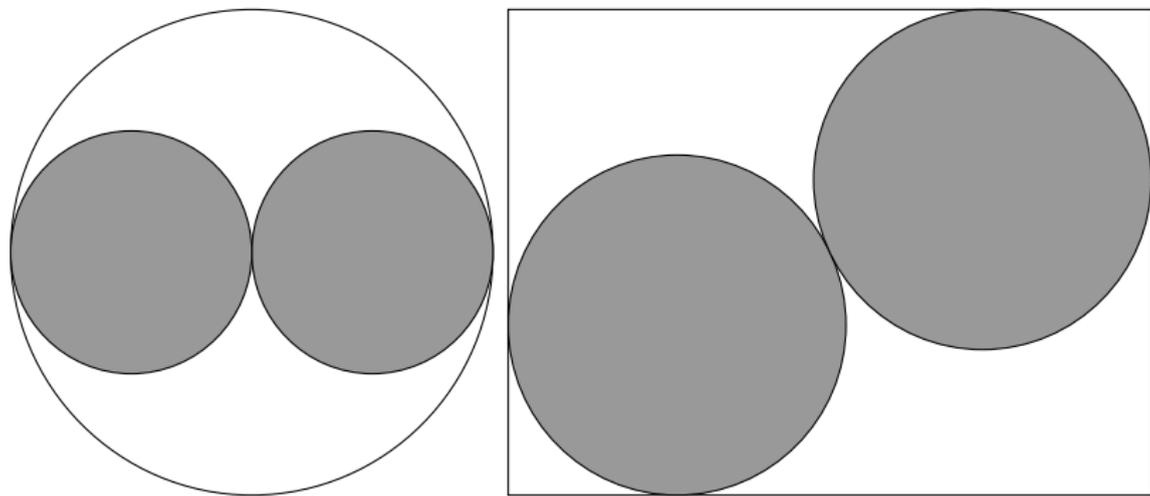
# “Sharp rubies” in an isosceles right triangle: Examples



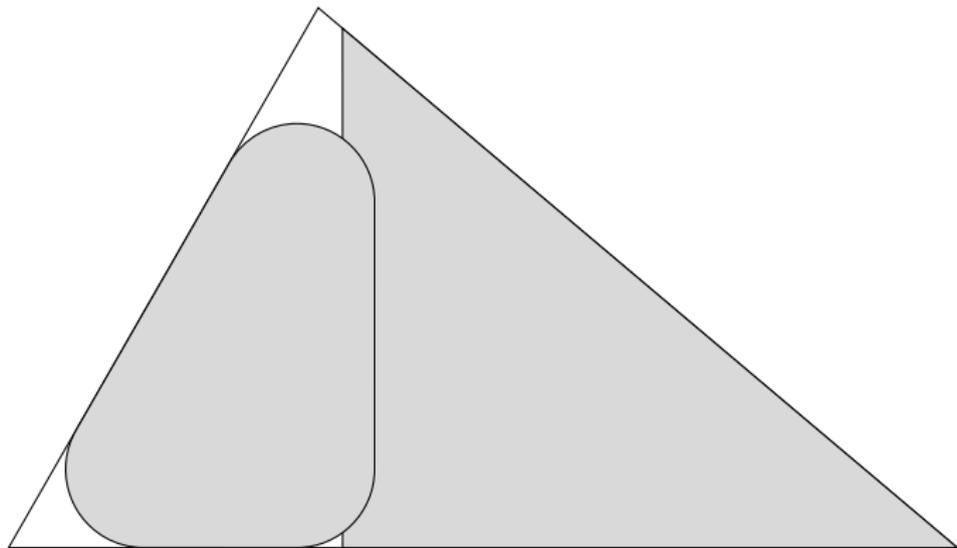
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## Future work: More container types



## Future work: Acute triangles

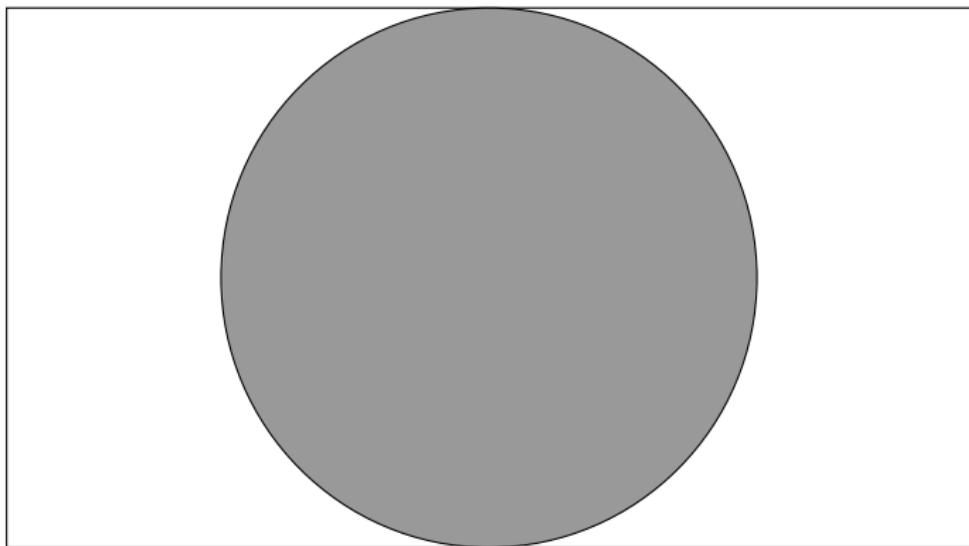


## Future work: More object types

- Ovals
- Rectangles
- General convex polygons?

What do the critical instances look like?

## Future work: Maximum object size

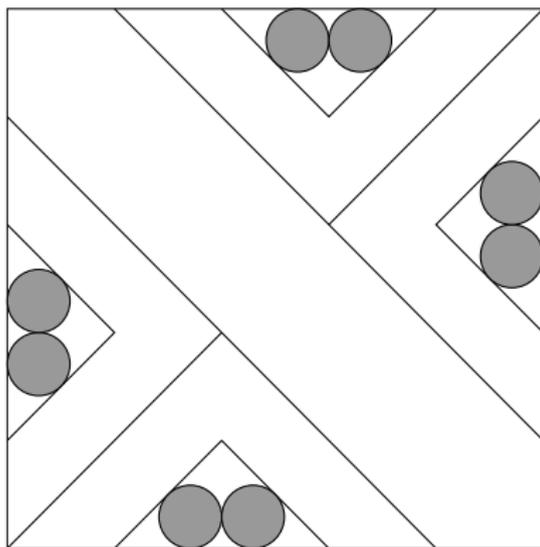
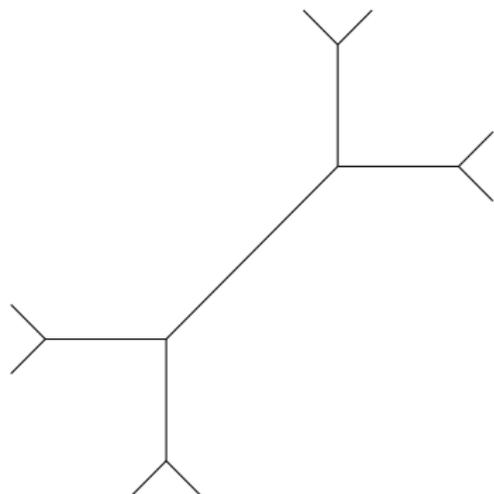


## Future work: Online

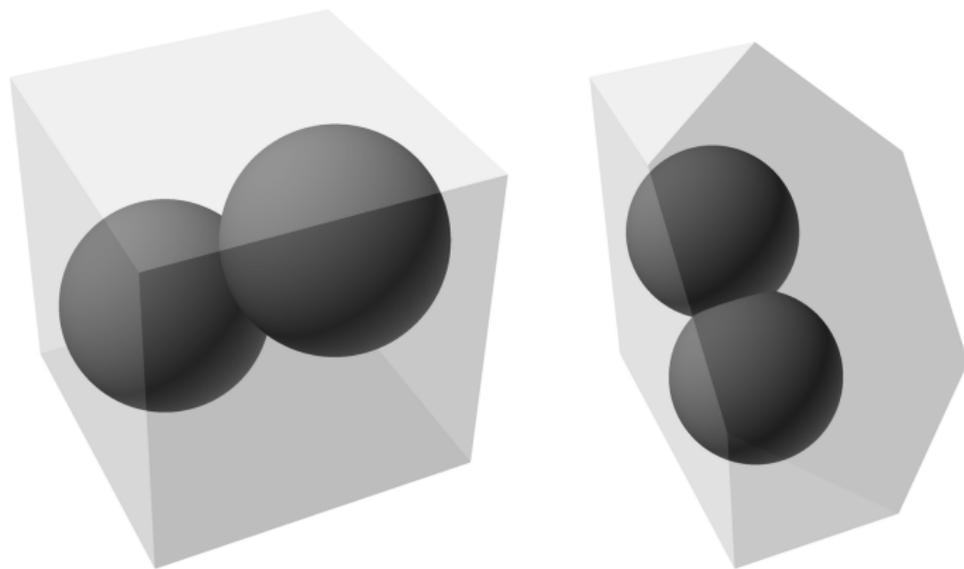
Current best achievable density for packing squares into a square in an online setting:  $\frac{2}{5}$

[Brubach 2015]

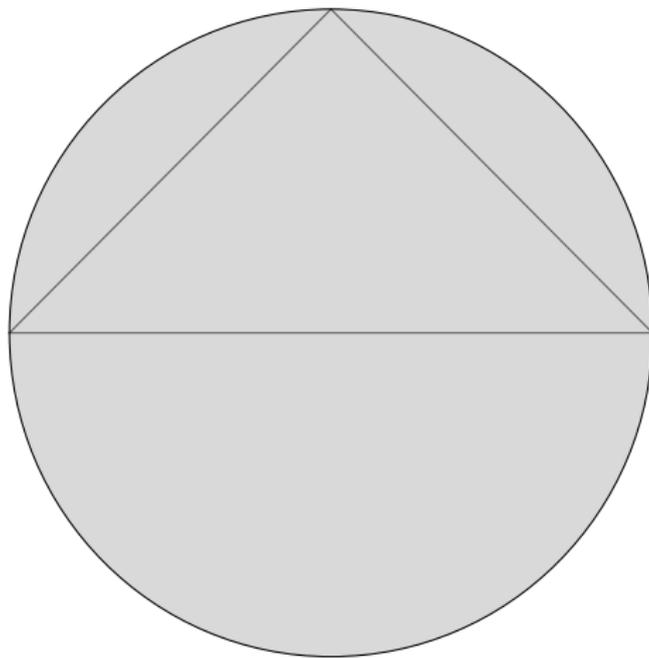
## Future work: Circle/river packing



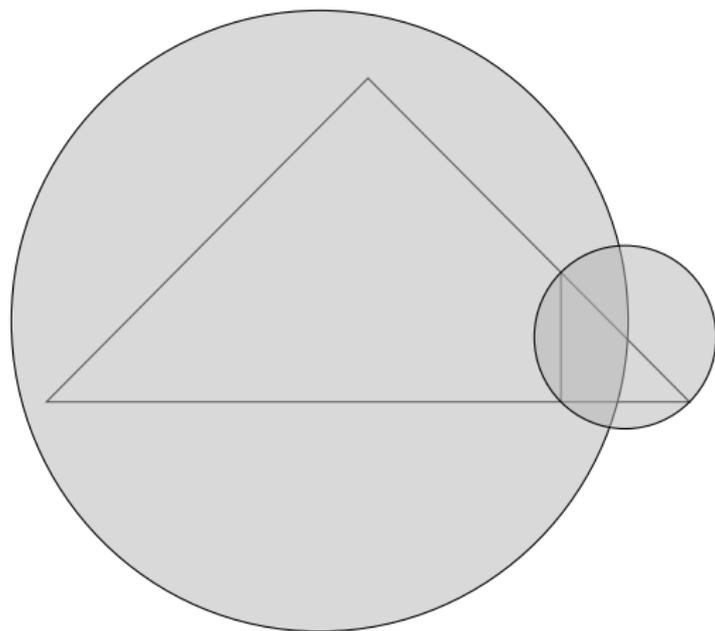
## Future work: 3D



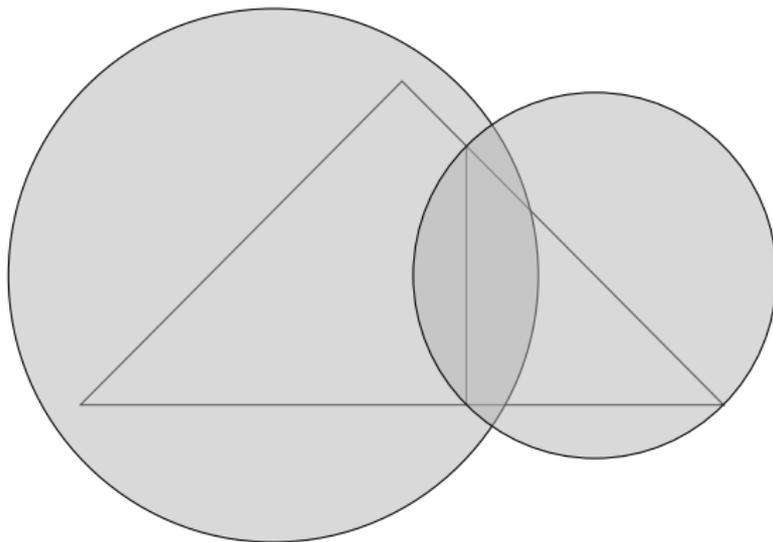
## Future work: Covering



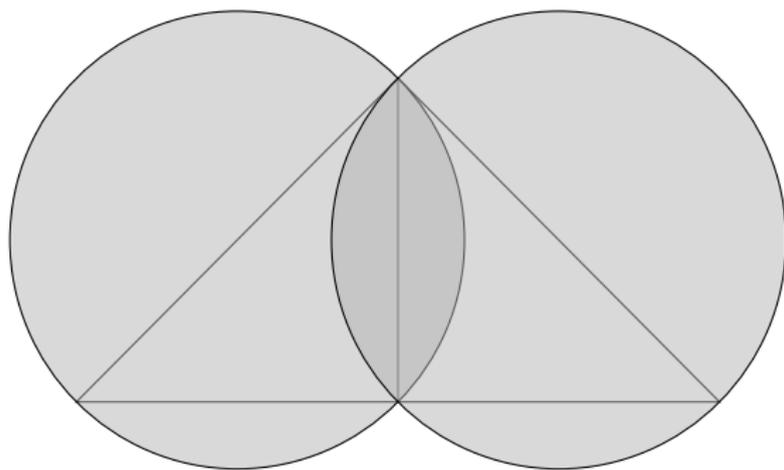
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## Future work: Covering



## Contributions

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  - ▶ circles, squares, and octagons into squares

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. . . with *critical density*!

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Thanks!

## Bonus slide: Applications

