

# RESEARCH AND DEVELOPMENT OF ALGORITHMS FOR SOLVING THE TWO-DIMENSIONAL IRREGULAR CUTTING STOCK PROBLEM

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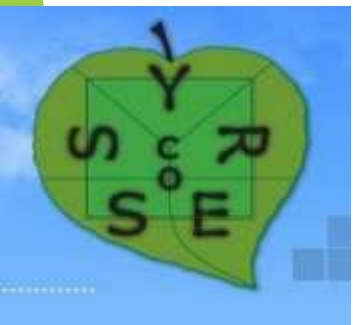
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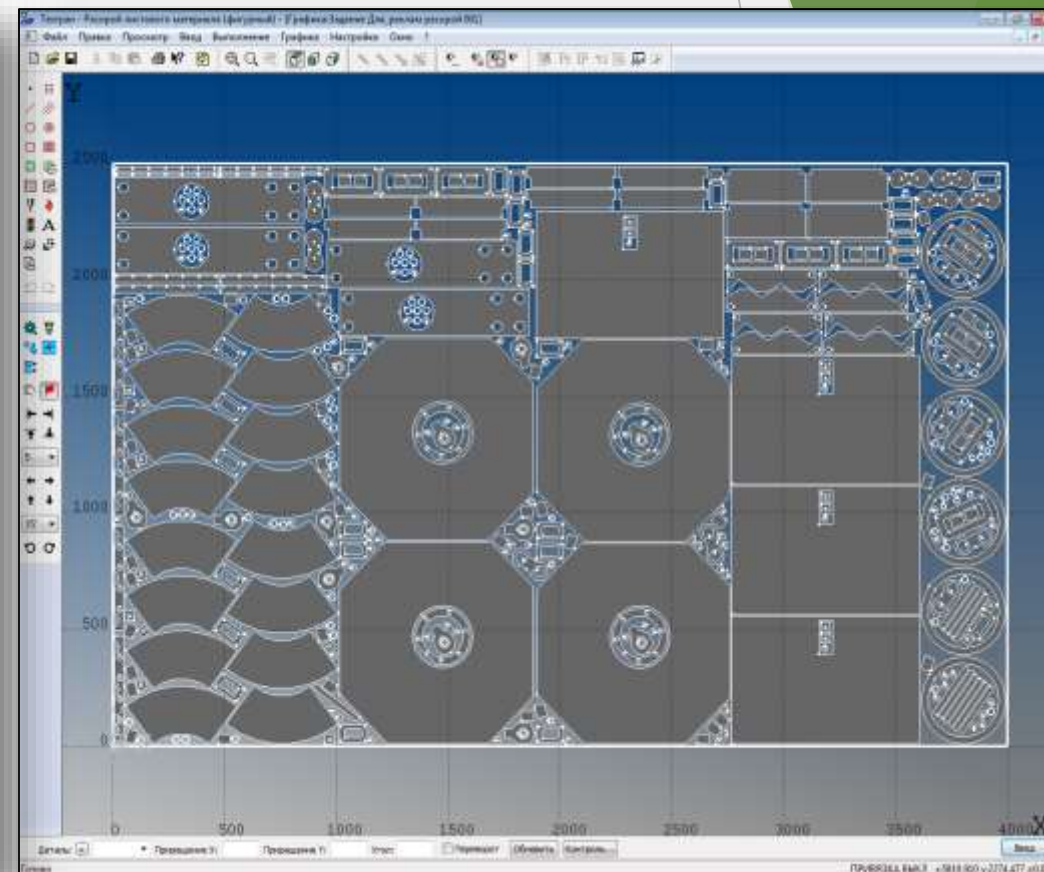
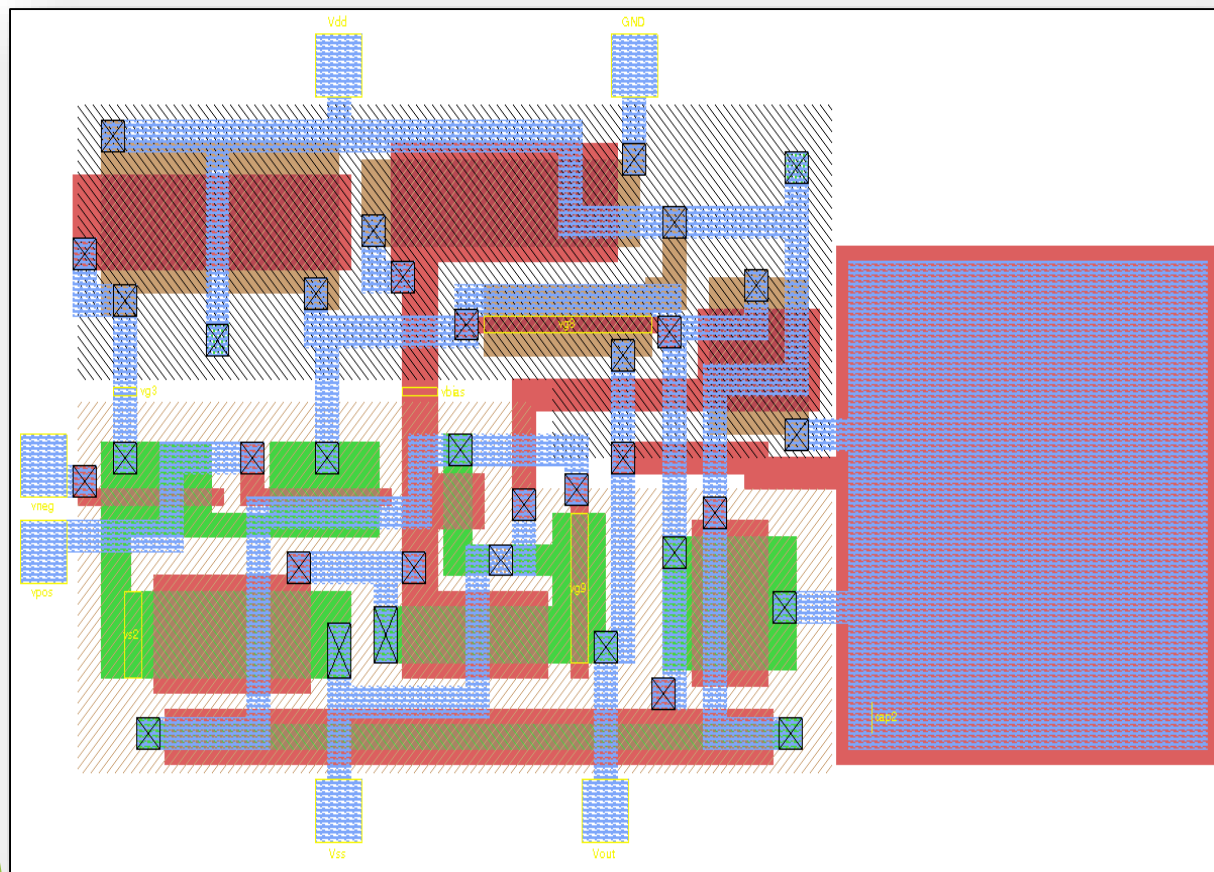
Faculty of Computational Mathematics and Cybernetics

Department for computer systems and automation

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# MOTIVATION



# PURPOSE OF RESEARCH

Creation of a **library containing implementations of various algorithms** in a unified style, with a unified class hierarchy

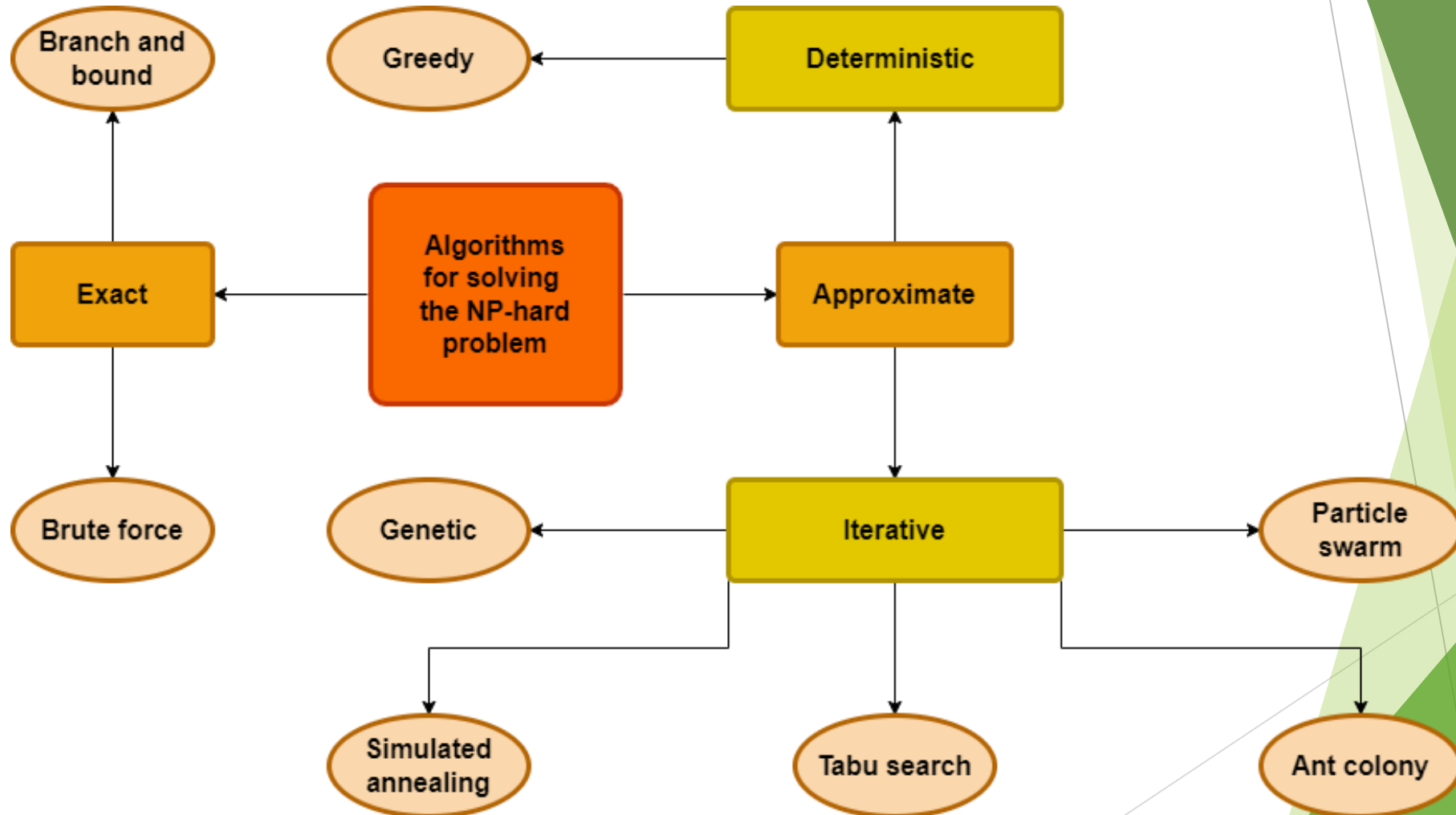
Conducting an **overview of the subject area**

**Development of a methodology** for research and comparison of algorithm implementations

**Experimental study** of algorithm implementations based on the developed methodology



# CLASSIFICATION OF ALGORITHMS





# NOTATIONS

1.  $Q = \{q_i, i = 1, \dots, M, \dots\}$  — rectangular sheets with the same size
2.  $S = \{s_i, i = 1, \dots, n\}$  — figures (polygons)
3. Each polygon  $s_i$  is given by the sequence of its vertices  $s_{ij} = (x_{ij}, y_{ij}), j = 1, \dots, k_i$
4.  $M$  — the number of sheets used to place a given set of figures  $S$
5.  $d_i$  — convex hull for the figures placed on  $q_i$
6.  $e_i$  — envelope (minimal bounding rectangle) for the figures placed on  $q_i$
7.  $ar(x)$  — area of  $x$ ,  $x \in S \cup Q \cup \{d_i, i = 1, \dots, M\} \cup \{e_i, i = 1, \dots, M\}$
8. If the figure  $s_j$  is placed on the sheet  $q_i$ , we will write  $s_j \in q_i$

$$9. FF_a = \frac{\sum_{i=1}^{M-1} \{(1 - \sum_{s_j \in q_i} ar(s_j)) / ar(q_i)\} + (1 - \sum_{s_j \in t_M} ar(s_j)) / ar(e_M)}{M}$$

$$10. FF_b = \frac{\sum_{i=1}^M (1 - \sum_{s_j \in q_i} ar(s_j)) / ar(d_i)}{M}$$



# MATHEMATICAL FORMULATION

## Given

1.  $Q, a$  — sheet length,  $b$  — sheet width
2.  $S, s_{ij}$  ( $i = 1, \dots, n; j = 1, \dots, k_i$ )

## Constraints

1.  $\forall i \in \{1, \dots, n\}$ :  $s_i$  has no holes
2.  $\forall i \in \{1, \dots, n\}$ :  $s_i$  can be rotated by angles  $\alpha = 90t$  ( $t \in \{0, 1, 2, 3\}$ ) degrees using the following transformation:  
 $\forall j \in \{1, \dots, k_i\}$  :  
 $(x_{ij}, y_{ij}) \rightarrow (x_{ij} \cdot \cos \alpha - y_{ij} \cdot \sin \alpha, x_{ij} \cdot \sin \alpha + y_{ij} \cdot \cos \alpha)$
3.  $\forall i \in \{1, \dots, n\}$ :  $s_i$  can be mirrored by the following transformation:  
 $\forall j \in \{1, \dots, k_i\}$  :  $(x_{ij}, y_{ij}) \rightarrow (x_{ij}, -y_{ij})$

## Find

$$FF = 1 - (A \cdot FF_a + B \cdot FF_b) \rightarrow \max \quad (1)$$



# GREEDY ALGORITHM

## Pseudocode:

sort the figures in descending area order or in random order (set on startup)

while number of remaining figures  $> 0$ :

take the next figure

apply all possible transformations to it

set the value of the maximum of the fitness function to -1

for each transformed variant of current figure:

for each of the current sheets:

calculate the value of the fitness function for the lowest left possible figure placement

if it was not possible to place the figure anywhere:

take a new sheet

place the figure in the bottom-left corner of a new sheet

else:

apply the change with the maximum value of the fitness function

remove a figure from the list of unplaced figures



# SIMULATED ANNEALING ALGORITHM

## Pseudocode:

generate the initial placement of the figures (sorting is random or in descending area order; set at startup; differs from the greedy algorithm in that the shapes are not transformed and are each time placed in the lowest left allowed place only on the last of the current sheets)

calculate the value of the “energy of the system”  $E = 100000 * (1 - FF)$  after the initial placement

while temperature > 0:

    try to make a **change** (take a random figure from each of two random sheets and change the sheets for these figures: on the new sheet, the placement for both figures is lowest left possible)

if the attempt is successful:

        calculate the difference between the values of the “energies” after the change and before it

if (difference < 0) OR (random number from [0, 1] <  $\exp(-\text{difference} / \text{temperature})$ ):

            apply the **change**

            update the “system energy” value

            temperature = temperature – step

else:

            temperature = temperature – step \* 0.1

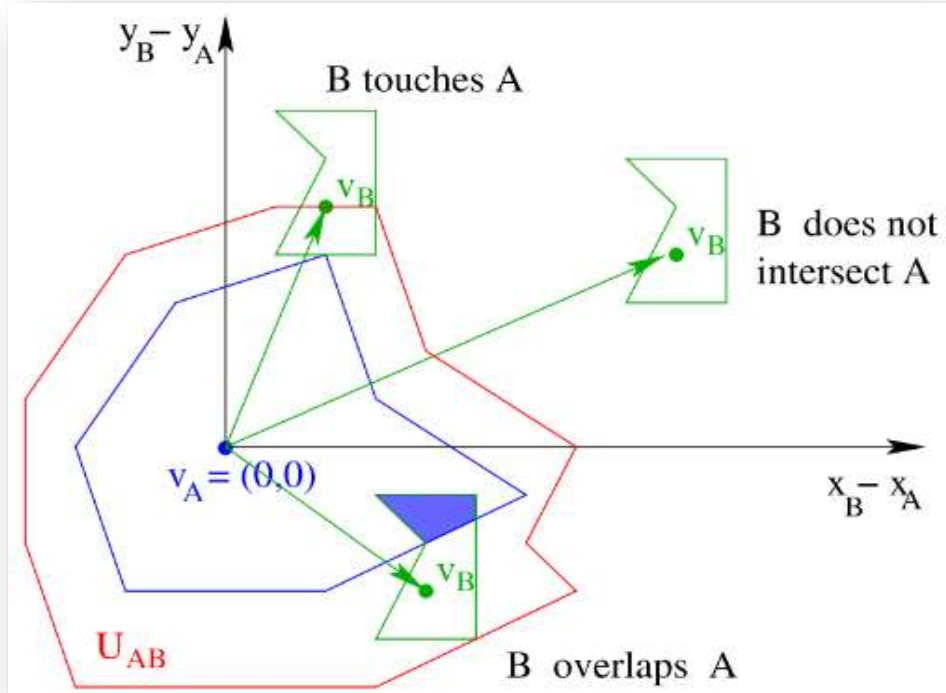
else:

        temperature = temperature – step \* 0.1

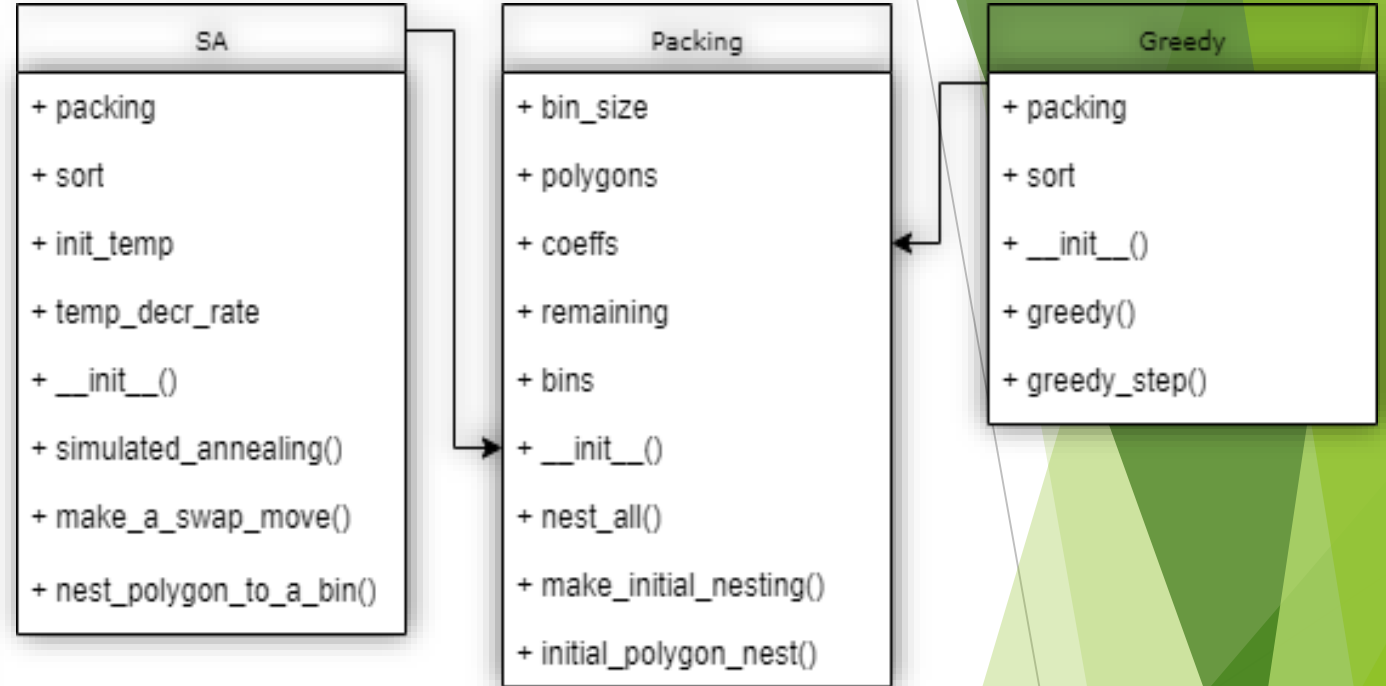




# IMPLEMENTATION



No-Fit Polygon (NFP)

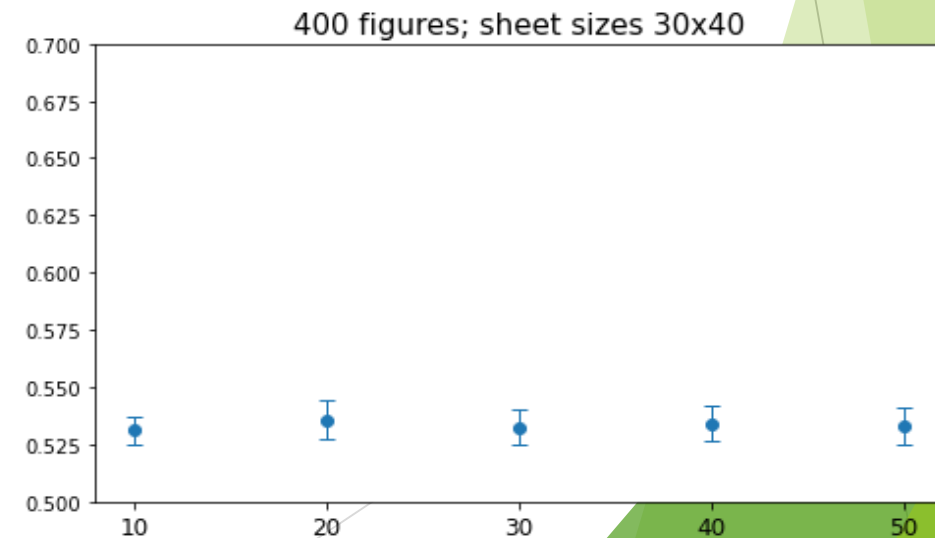
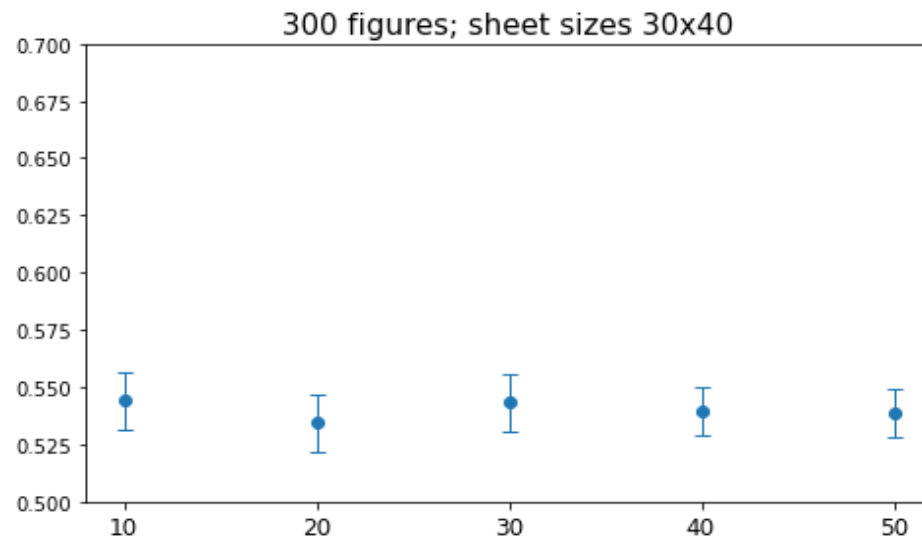
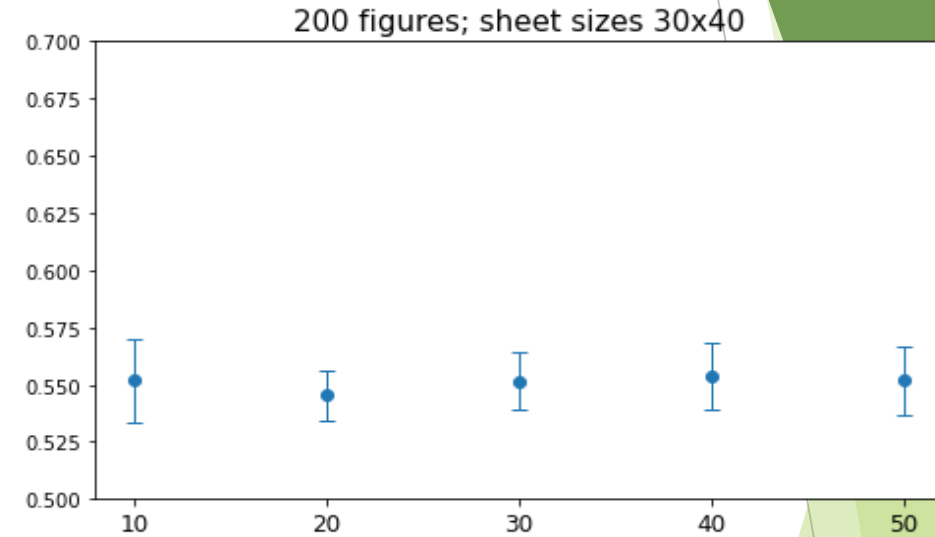
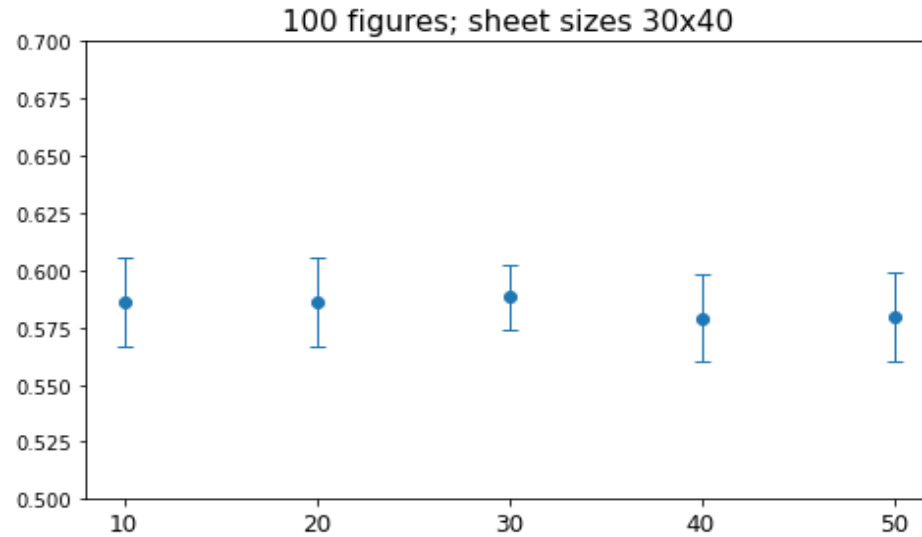


Class diagram



# METHODOLOGY

Mean and standard deviation of the fitness function values depending on the number of runs



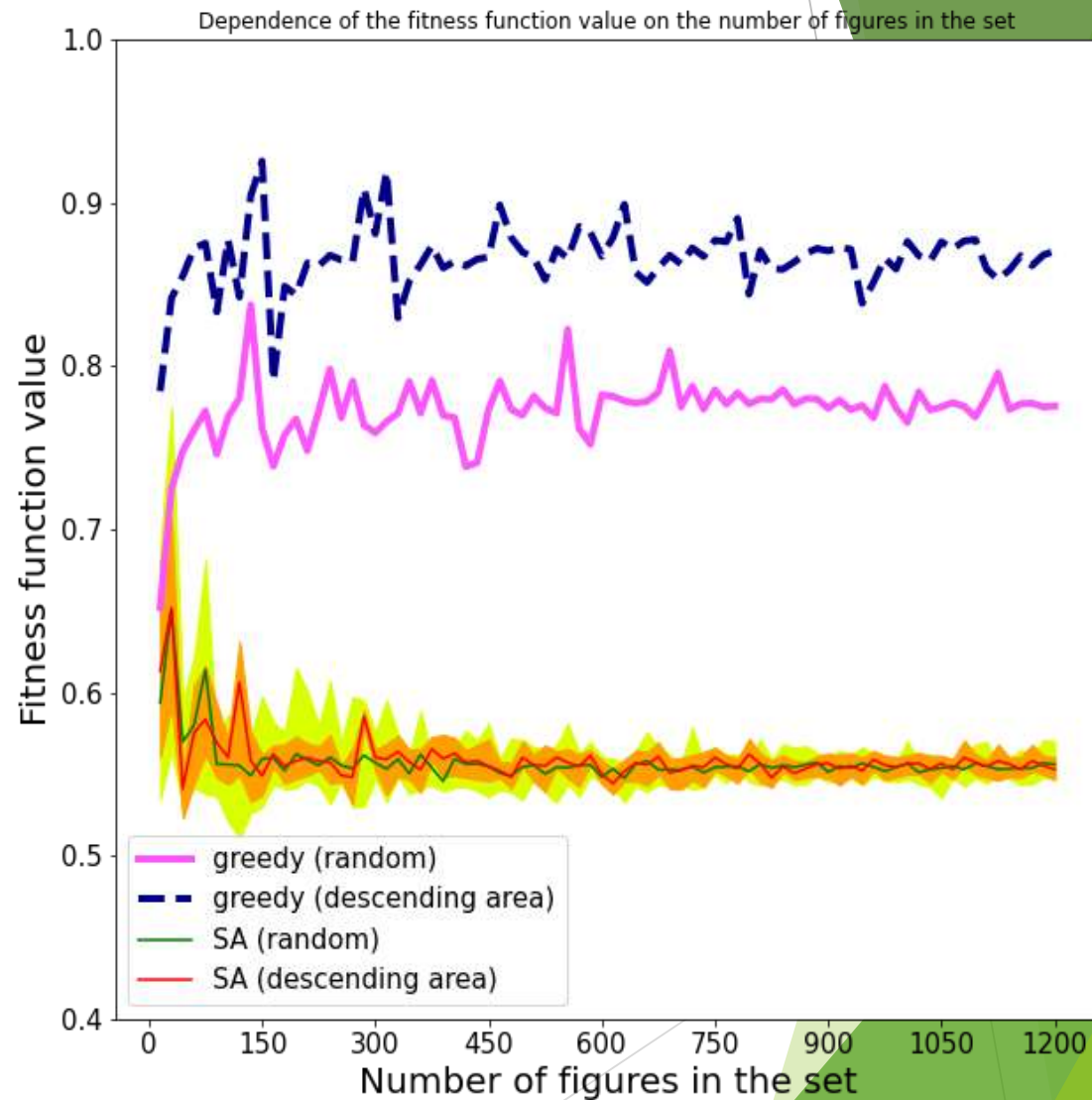
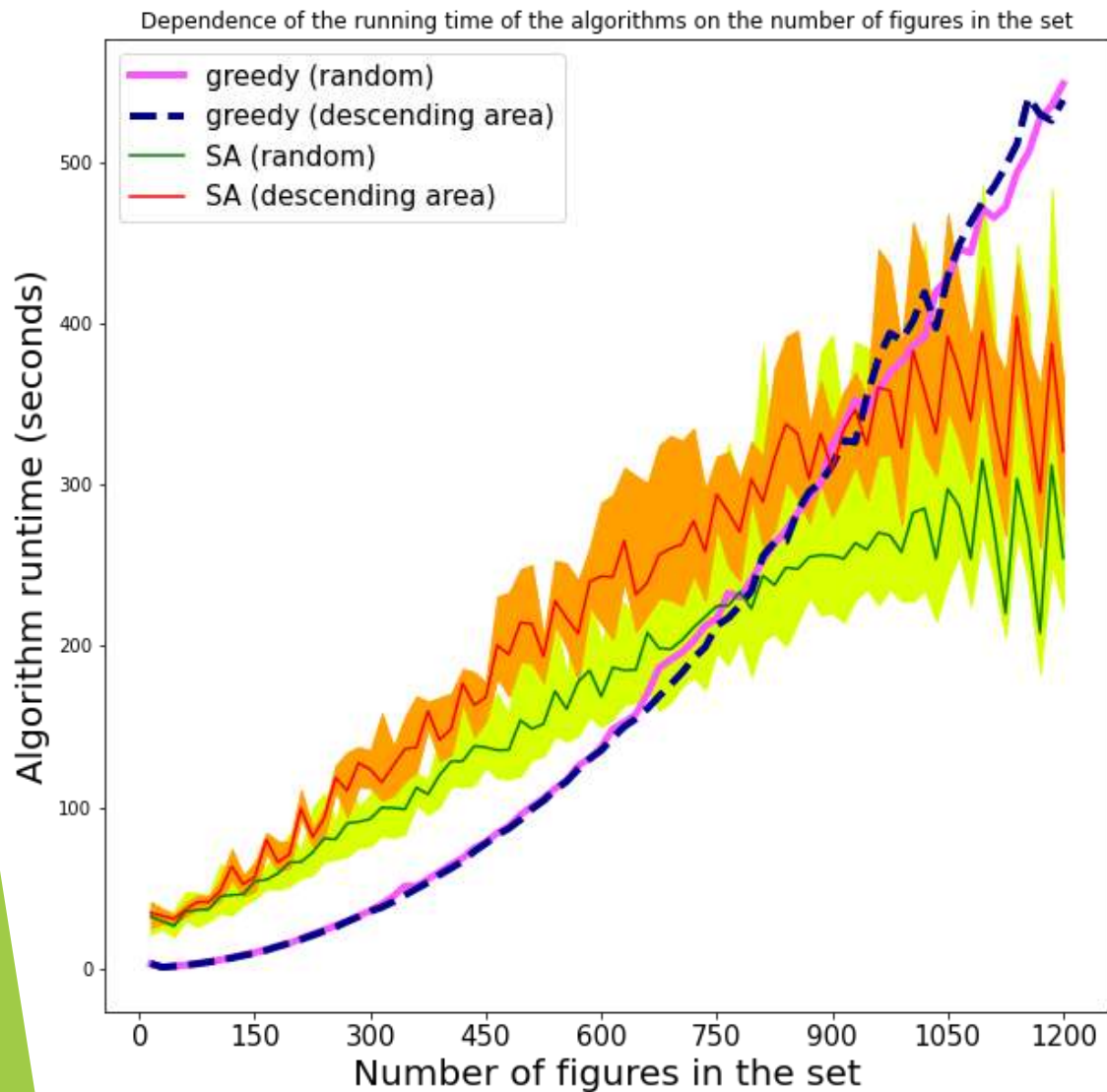
# EXPERIMENTAL STUDY

The following parameters for the generator function were used for the experiments:

- sizes of sheets: **30x40**;
- algorithm: **greedy, simulated annealing (initial temperature: 1200, temperature decrease rate: 1)**;
- types of figures: **rectangle (5x4), equilateral triangle (side length: 10), isosceles trapezium (bases: 9 and 3; height: 3)**;
- initial number of each figure: **5**;
- final number of each figure: **400**;
- number increase step of each figure: **5**;
- figures sorting type: **random, in descending area order**.



# RESULTS



# FUTURE WORK

Expand the review of the algorithms by considering newer papers presenting modifications of classical algorithms as well as possibly new approaches to solving the cutting problem

Implement other algorithms to solve the problem and add the implementations to the library

Modify and optimize algorithm implementations to improve quality and reduce runtime

After completing the Python code, rewrite the time-critical parts in C++, which will also speed up the algorithms implementations





# Thank you for your attention

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<https://github.com/maxporyvay/2D-irregular-stock-cutting-problem-multi-algorithm-solution>

- Project repository

