



HPI_Quantastic (Annealing): Starbattle / Two Not Touch

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iQuHACK 2021

Why Star Battle / Two Not Touch?

“Challenge Problems”

1. Implement the Knapsack problem with the DQM solver
2. Implement the Nurse Scheduling Problem with the DQM solver
- ➡ 3. Implement the game “Star Battle/Two Not Touch” (Google it)
4. Implement the puzzle “TetraVex” (Google it)
5. Find the famous Andrew Lucas paper <https://arxiv.org/abs/1302.5843>. Implement one of the NP-hard problems. If you find a D-Wave example for it (for example, graph partitioning), implement it using the DQM solver

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Chart 2

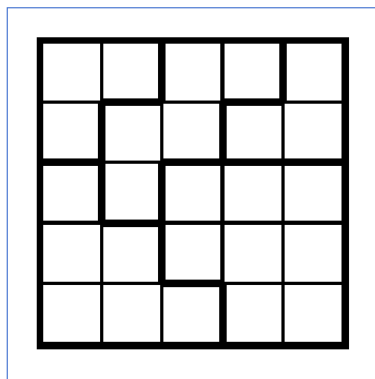
Why Star Battle / Two Not Touch? (2)

- Lots of fun to play
- Educate players on the power of Quantum Computing
 - → create interactive system

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Chart **3**

What is Starbattle / Two Not Touch?

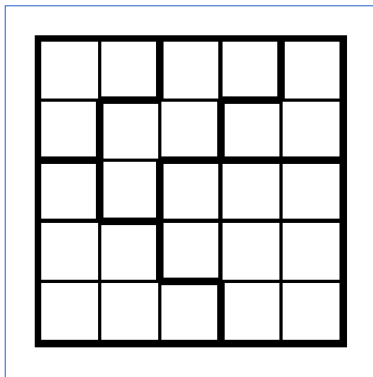


5x5/1★ Normal Star Battle Puzzle ID: 9,053,837

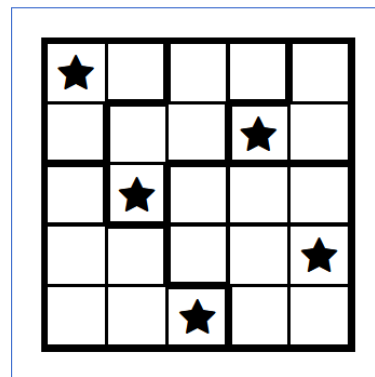
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What is Starbattle / Two Not Touch?



5x5/1★ Normal Star Battle Puzzle ID: 9,053,837



5x5/1★ Normal Star Battle Puzzle ID: 9,053,837

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Playing the game...

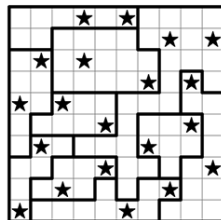
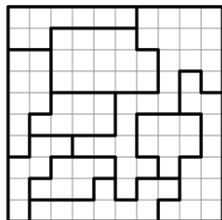
- ... is **hard**:
 - lots of constraints
 - lots of possibilities
 - advanced strategies limit the search space, but no one strategy



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Advanced Strategies for Two Not Touch Puzzles

A tutorial by Krazydad



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Chart 6

Deciding on a model

- Choice between
 - Binary Quadratic Model (BQM)
 - Discrete Quadratic Model (DQM)

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Chart **7**

Deciding on a model

- Choice between
 - **Binary Quadratic Model (BQM)**
 - Discrete Quadratic Model (DQM)
- Every cell of the board is a boolean variable:
 - 0 = no star
 - 1 = star
- → Quadratic Unconstrained Binary Optimization (QUBO)

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Chart 8

Modelling the constraints (1)

- Penalize adjacent stars:

x_i	x_j	$E(x_i, x_j)$
0	0	0
0	1	0
1	0	0
1	1	1

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Chart 9

Modelling the constraints (1)

- Penalize adjacent stars:

x_i	x_j	$E(x_i, x_j)$
0	0	0
0	1	0
1	0	0
1	1	1

- AND function
- $ax_i + bx_j + cx_ix_j + d = x_ix_j$
- c could be any other positive value $\rightarrow 1$ is a good value

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Modelling the constraints (2)

- k stars per...
 1. ...row
 2. ...column
 3. ...block
- → exactly k of the cells to be chosen

Modelling the constraints (3)

Let R be the set of qubit indices of the selected row, column or block

- $\sum_{i \in R} x_i = k$
- $\sum_{i \in R} x_i - k = 0$
- $\rightarrow \text{QUBO: } (\sum_{i \in R} x_i - k)^2$
 $= (\sum_{i \in R} x_i)^2 - 2k(\sum_{i \in R} x_i) + k^2$
 $= \sum_{i \in R} x_i + \sum_{i, j \in R, i < j} 2x_i x_j - 2k(\sum_{i \in R} x_i) + k^2$
 $= (1 - 2k) \sum_{i \in R} x_i + \sum_{i, j \in R, i < j} 2x_i x_j + k^2$

Implementing the BQM (1)

```
bqm = BinaryQuadraticModel({}, {}, 0.0, BINARY)

# constraint 1: n stars per row
for y, row in enumerate(cells):
    row_coords = [(y,x) for x,_ in enumerate(row)]
    row_bqm = combinations(row_coords, num_stars)
    bqm.update(row_bqm)
```

...

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Chart **13**

Implementing the BQM (2)

- n choose k constraints:

`dimod.generators.constraints.combinations`

```
combinations(n, k, strength=1, vartype=<Vartype.BINARY: frozenset({0, 1})>) \[source\]
```

Generate a bqm that is minimized when k of n variables are selected.

More fully, we wish to generate a binary quadratic model which is minimized for each of the k -combinations of its variables.

The energy for the binary quadratic model is given by $(\sum_i x_i - k)^2$.

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Chart **14**

Implementing the BQM (3)

- Coupling between adjacent qubits:

`dimod.BinaryQuadraticModel.add_interaction`

```
BinaryQuadraticModel.add_interaction(u, v, bias, vartype=None) \[source\]
```

Add an interaction and/or quadratic bias to a binary quadratic model.

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Sampling the BQM (1)

- We tried lots of samplers, but LeapHybridSampler performed the best

LeapHybridSampler

```
class LeapHybridSampler(solver=None, connection_close=True, **config) \[source\]
```

A class for using Leap's cloud-based hybrid BQM solvers.

Leap's quantum-classical hybrid BQM solvers are intended to solve arbitrary application problems formulated as binary quadratic models (BQM).

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Chart **16**

Sampling the BQM (2)

- 3 puzzle categories (KrazyDad):
 - *Easy* (8x8, 1☆)
 - *Medium* (10x10, 2☆)
 - *Hard* (14x14, 3☆)
- 100% valid samples on *Easy* & *Medium*
- Samples on *Hard* are not always valid

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Chart **17**

Sampling the BQM (2)

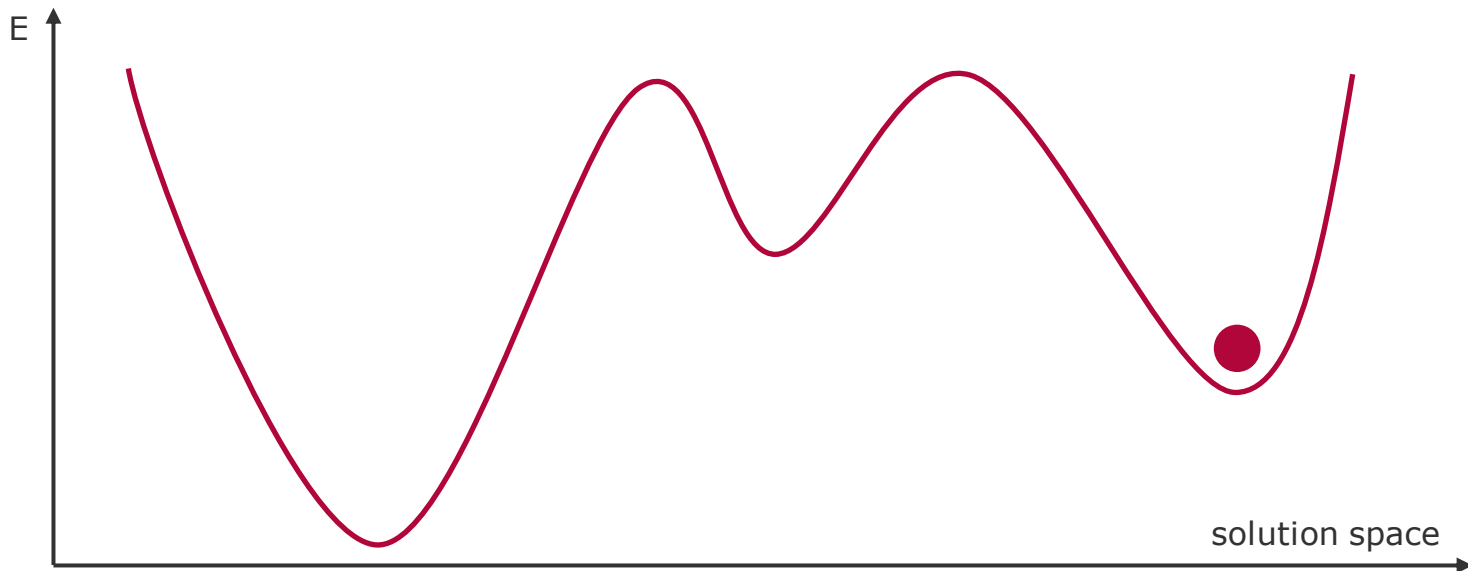
- 3 puzzle categories (KrazyDad):
 - *Easy* (8x8, 1☆)
 - *Medium* (10x10, 2☆)
 - *Hard* (14x14, 3☆)
- 100% valid samples on *Easy* & *Medium*
- Samples on *Hard* are not always valid
 - ~ 90% of samples are valid

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Sampling the BQM (3)

- Why might the BQM be inaccurate on big problems?
 - Lots of local minima that are far away from the optimal solution
- Energy landscape:



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Chart **19**

User Interface: game files (1)

- Puzzles are stored in text files, repository contains examples

1

0 0 0 1 2 2 2 2

0 0 0 1 2 2 2 2

0 0 0 1 1 2 2 2

1 1 1 1 1 2 3 2

4 1 1 1 3 2 3 2

4 4 4 1 3 3 3 5

4 4 4 1 3 6 6 6

4 7 7 3 3 3 6 6

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Chart **20**

User Interface: solve (2)

```
$ python main.py solve games/hard/hard-1.txt
puzzle (3☆):
/ / / / $ $ $ ? ? ? ? ? ? ?
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```

```
found valid solution:
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- - - * - - - - * - * -
- - * - * - - - - - * -
- - - - - * - * - * - -
```

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Chart **21**

User Interface: play (3)

You need 1 star per block, row and column

		+				
		+				
+						
		+				
				+		
						+
	+					
					+	

one column has 3 stars

Show solution



You need 1 star per block, row and column

						+
			+			
+						
		+				
						+
	+					
					+	

You won!
Your time: 10.07s
QPU time: 20.98s

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Chart 22

Live Demo

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Chart **23**



Thank you for your attention!
Questions?

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