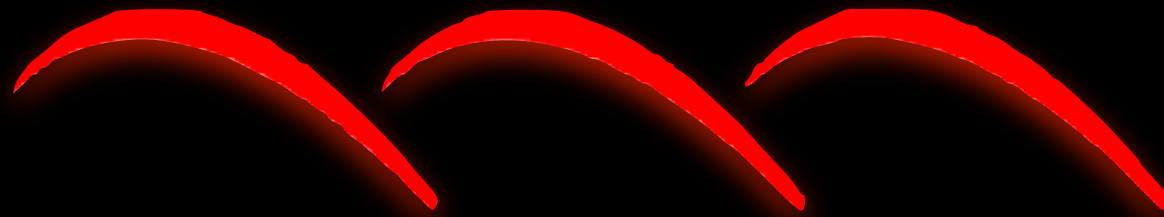


Search Based Software Engineering

SBSE

CREST



Mark Harman

Thanks for slides

Yue Jia, CREST

Spiros Mancoridis, Drexel

Shin Yoo, CREST

Joachim Wegener, B&M

Yuanyuan Zhang, CREST

Overview

Context

What is SBSE? Why should I care?

Examples

Pointers to literature

Scientists' and Engineers' viewpoints

Scientists' and Engineers' viewpoints

scientist:

Scientists' and Engineers' viewpoints

scientist:

Scientists' and Engineers' viewpoints

scientist:

what is true

Scientists' and Engineers' viewpoints

scientist:

what is true
correctness

Scientists' and Engineers' viewpoints

scientist:

what is true

correctness

model the world

Scientists' and Engineers' viewpoints

scientist:

what is true

correctness

model the world

to understand

Scientists' and Engineers' viewpoints

scientist:

what is true
correctness
model the world
to understand

engineer:

Scientists' and Engineers' viewpoints

scientist:

what is true
correctness
model the world
to understand

engineer:

what is possible

Scientists' and Engineers' viewpoints

scientist:

what is true
correctness
model the world
to understand

engineer:

what is possible
within tolerance

Scientists' and Engineers' viewpoints

scientist:

what is true
correctness
model the world
to understand

engineer:

what is possible
within tolerance
model the world

Scientists' and Engineers' viewpoints

scientist:

what is true
correctness
model the world
to understand

engineer:

what is possible
within tolerance
model the world
to manipulate

Scientists' and Engineers' viewpoints

computer scientist:

what is true
about computation

prove correctness
make it perfect

software engineer:

what is possible
with software

test for imperfection
find where to improve

Combining Science and Engineering

prove correctness
make it perfect

test for imperfection
find where to improve

Combining Science and Engineering

prove correctness
make it perfect

test for imperfection
find where to improve

Combining Science and Engineering

prove correctness
make it perfect

where possible ...
... and where impossible ...
test for imperfection
find were to improve

Combining Science and Engineering

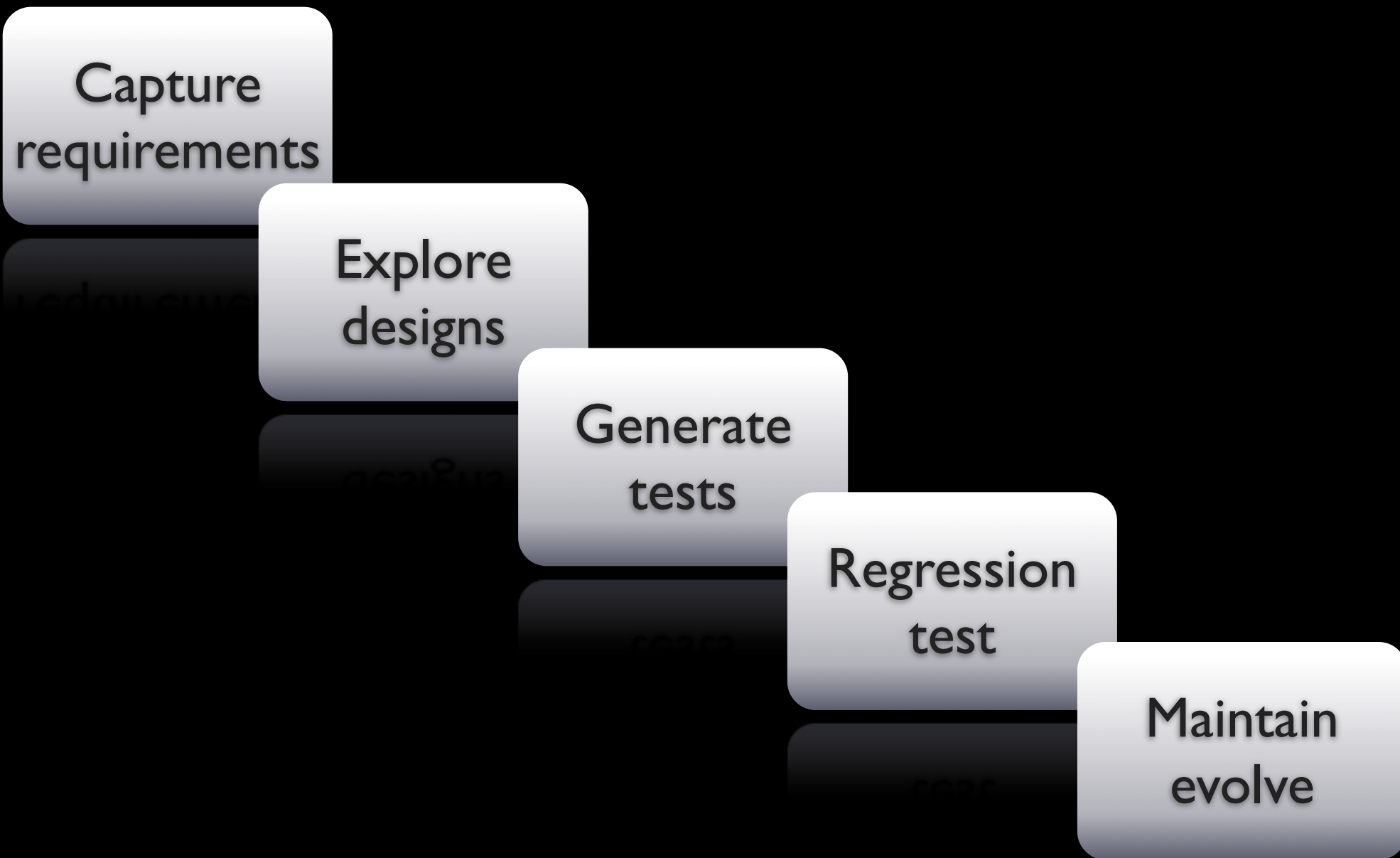
prove correctness
make it perfect

where possible ...
... and where impossible ...

test for imperfection
find where to improve

Software Engineering Problems

Software Engineering Problems



Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Minimize

Maximize

Capture
requirements

Generate
tests

Explore
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test

Minimize

Maximize

Capture
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?

Explore
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Regression
test

Minimize

Maximize

Capture
requirements

?

Explore
designs

Maintain
evolve

Regression
test

Minimize

Cost
Development time

Maximize

Satisfaction
Fairness

Capture
requirements

Generate
tests

Explore
designs

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evolve

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test

Minimize

Cost
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tests

Explore
designs

Maintain
evolve

Regression
test

Minimize

Number of tests

Development time

Maximize

Satisfaction
Fairness

Capture
requirements

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tests

Explore
designs

Maintain
evolve

Regression
test

Minimize

Number of tests
Execution time

Maximize

Satisfaction
Fairness

Capture
requirements

Generate
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Explore
designs

Maintain
evolve

Regression
test

Minimize

Number of tests
Execution time

Maximize

Fairness
Code coverage

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Minimize

Number of tests
Execution time

Maximize

Code coverage
Test adequacy

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Minimize

Maximize

Coupling

Cohesion

Capture
requirements

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Explore
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evolve

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Minimize

Maximize

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Cohesion

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Minimize

Number of tests
Execution time

Maximize

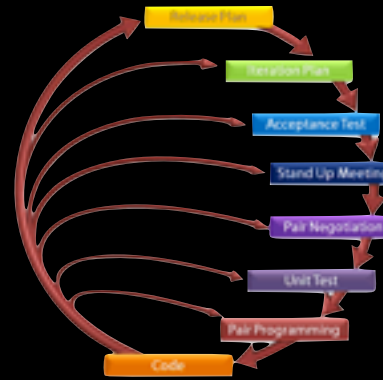
Code coverage
Fault coverage

Emergent paradigms

Emergent paradigms



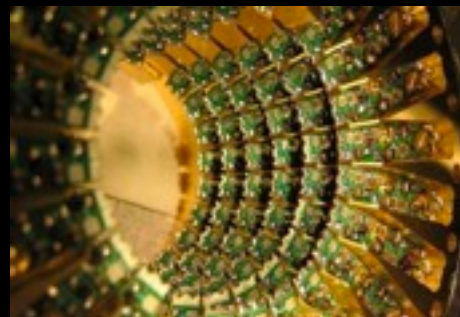
Cloud



Agile



Ambient



Quantum



Non functional
properties

Emergent paradigms



Cloud

Objectives:

distribution
availability
performance

Emergent paradigms



Cloud

Objectives:

distribution
availability
performance

Jim Larus: Friday's CC Keynote@ETAPS

Emergent paradigms



Agile

Objectives:

cost

value

refactoring split points

Emergent paradigms



Ambient

Objectives:

coverage
response

Emergent paradigms

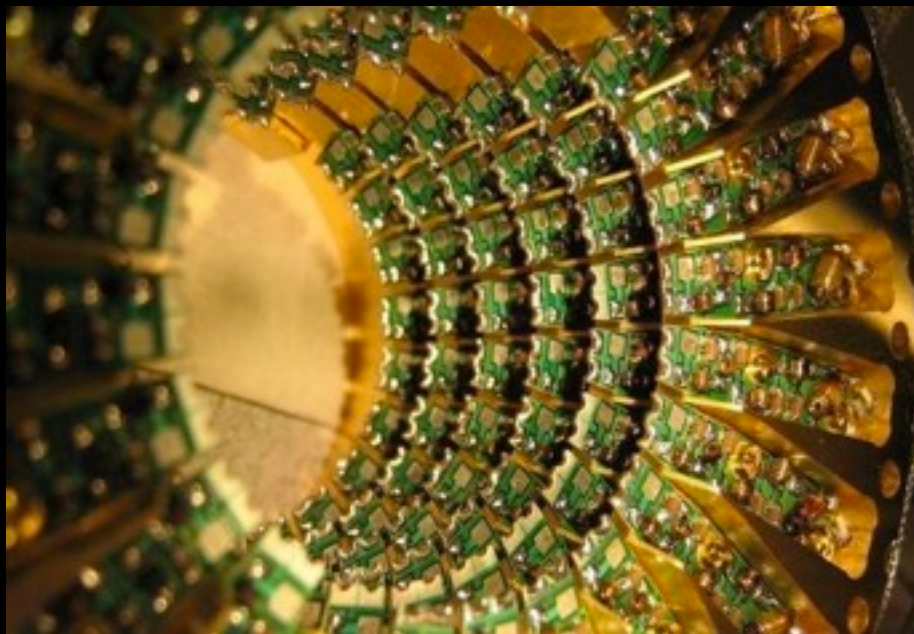


Non functional
properties

Objectives:

heat dissipation
WCET
resource use

Emergent paradigms



Quantum

Objectives:

entanglement
functionality

What is SBSE



Search Based
Optimization

Software
Engineering

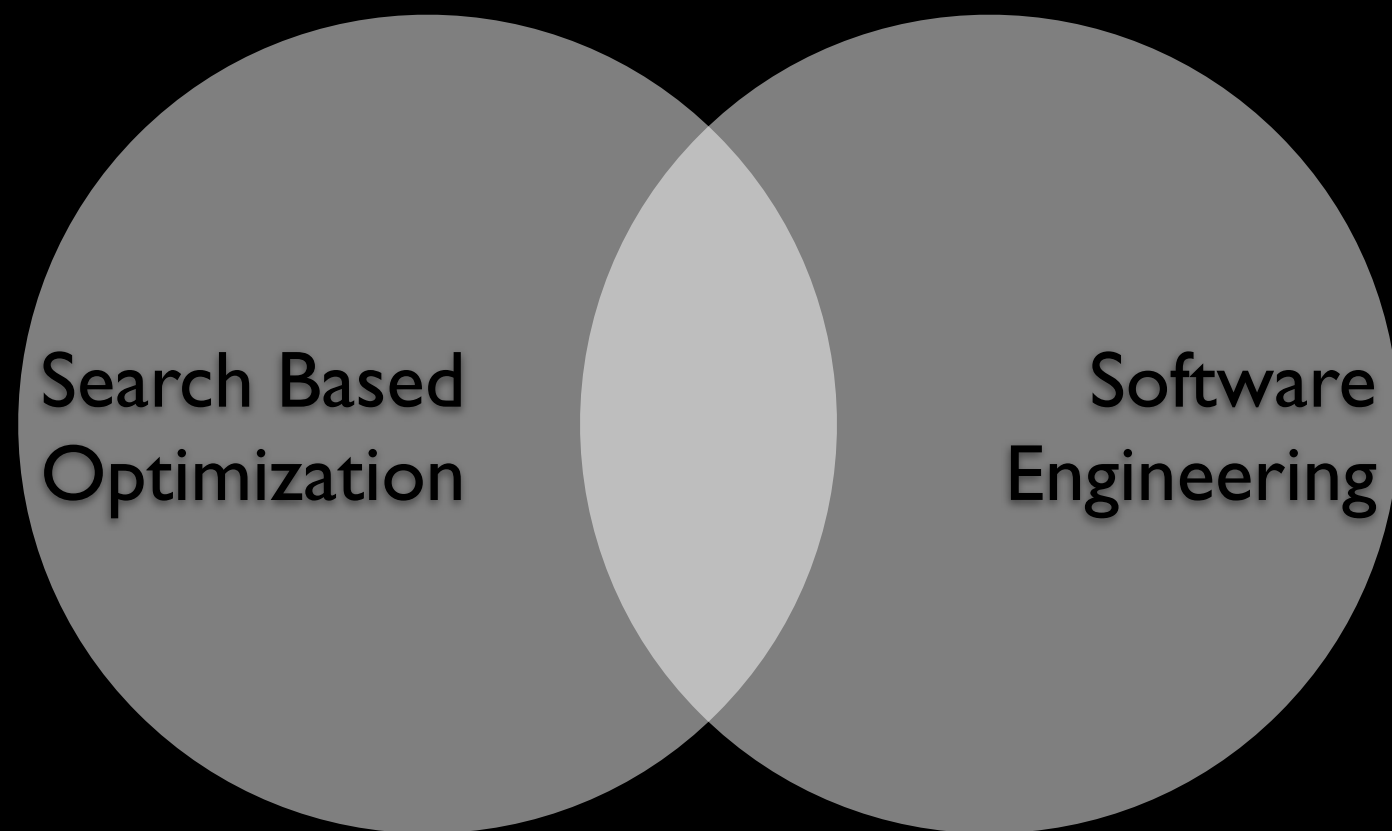
What is SBSE



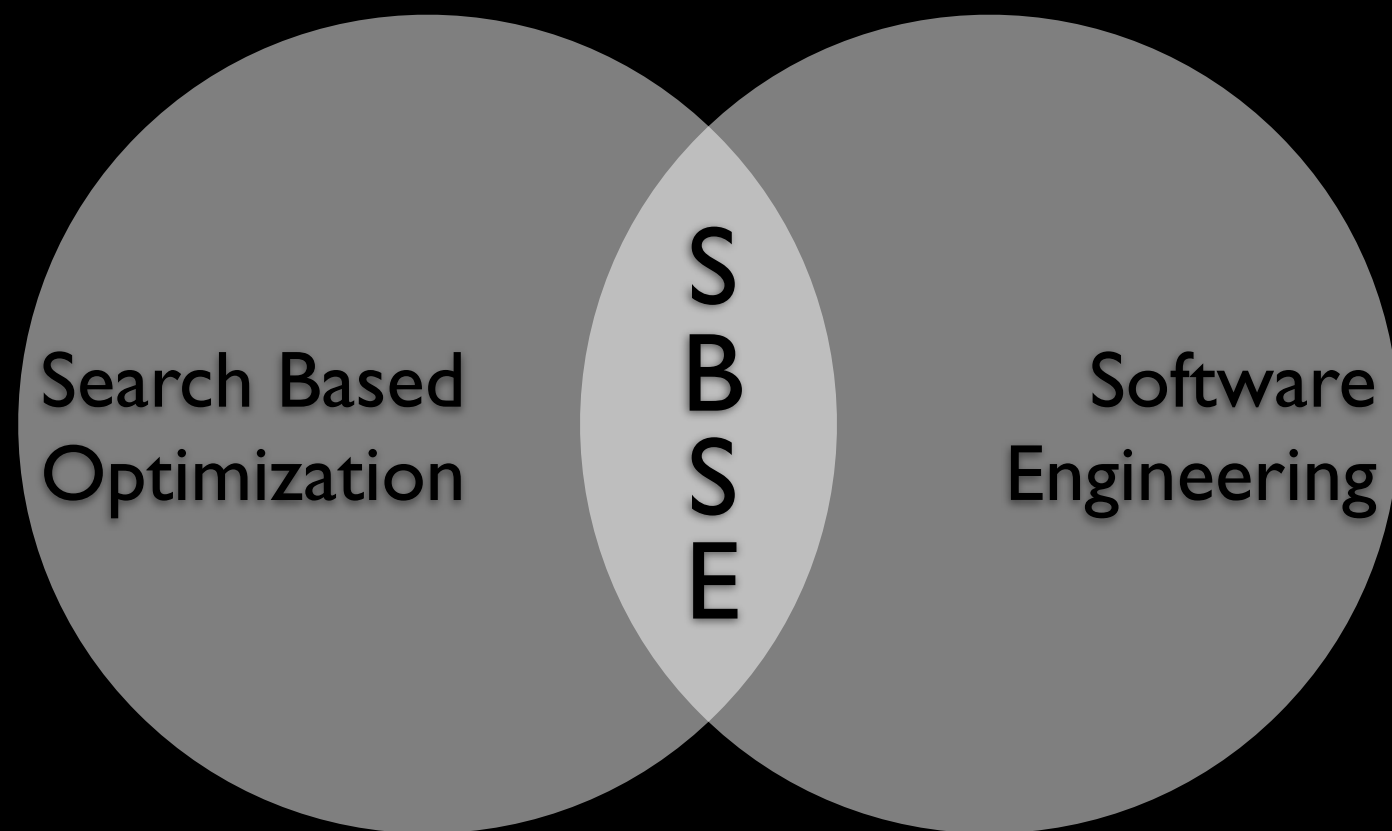
Search Based
Optimization

Software
Engineering

What is SBSE



What is SBSE



What is SBSE

In SBSE we apply search techniques to search large search spaces, guided by a fitness function that captures properties of the acceptable software artefacts we seek.

What is SBSE

In SBSE we apply **search techniques** to search large search spaces, guided by a fitness function that captures properties of the acceptable software artefacts we seek.

What is SBSE

In SBSE we apply **search techniques** to search large search spaces, guided by a fitness function that captures properties of the acceptable software artefacts we seek.

Tabu Search Ant Colonies Particle Swarm Optimization
Hill Climbing Genetic Algorithms
Genetic Programming
Simulated Annealing Greedy LP Random
Estimation of Distribution Algorithms

The advantages of SBSE

The advantages of SBSE



Insight-rich



Scalable



Robust



Generic



Realistic

The advantages of SBSE



Insight-rich



Scalable



Robust



Generic



Realistic

The advantages of SBSE



Insight-rich



Scalable



Robust



Generic



Realistic

The advantages of SBSE



Insight-rich



Scalable



Robust



Generic



Realistic

The advantages of SBSE



Insight-rich



Scalable



Robust



Generic



Realistic

The advantages of SBSE



Insight-rich



Scalable



Robust



Generic



Realistic

?

World Wide Activity

24 countries

every continent

> 600 papers

World Wide Activity

24 countries

every continent

> 600 papers

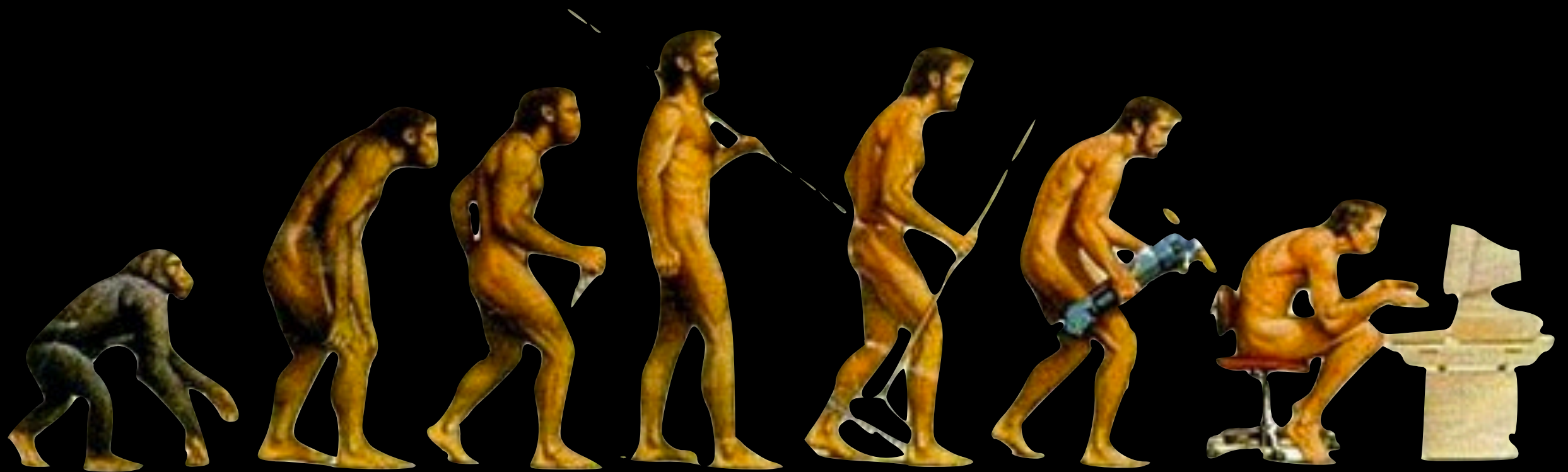
At ETAPS

Gal Katz and Doron Peled: *Code mutation in verification and automatic code correction*. **TACAS**, Thursday afternoon.

JunChao Xiao, Leon Osterweil, Qing Wang and MingShu Li: *Dynamic Resource Scheduling in Disruption-Prone Software Development Environments*. **FASE**, this afternoon

Evolutionary Testing

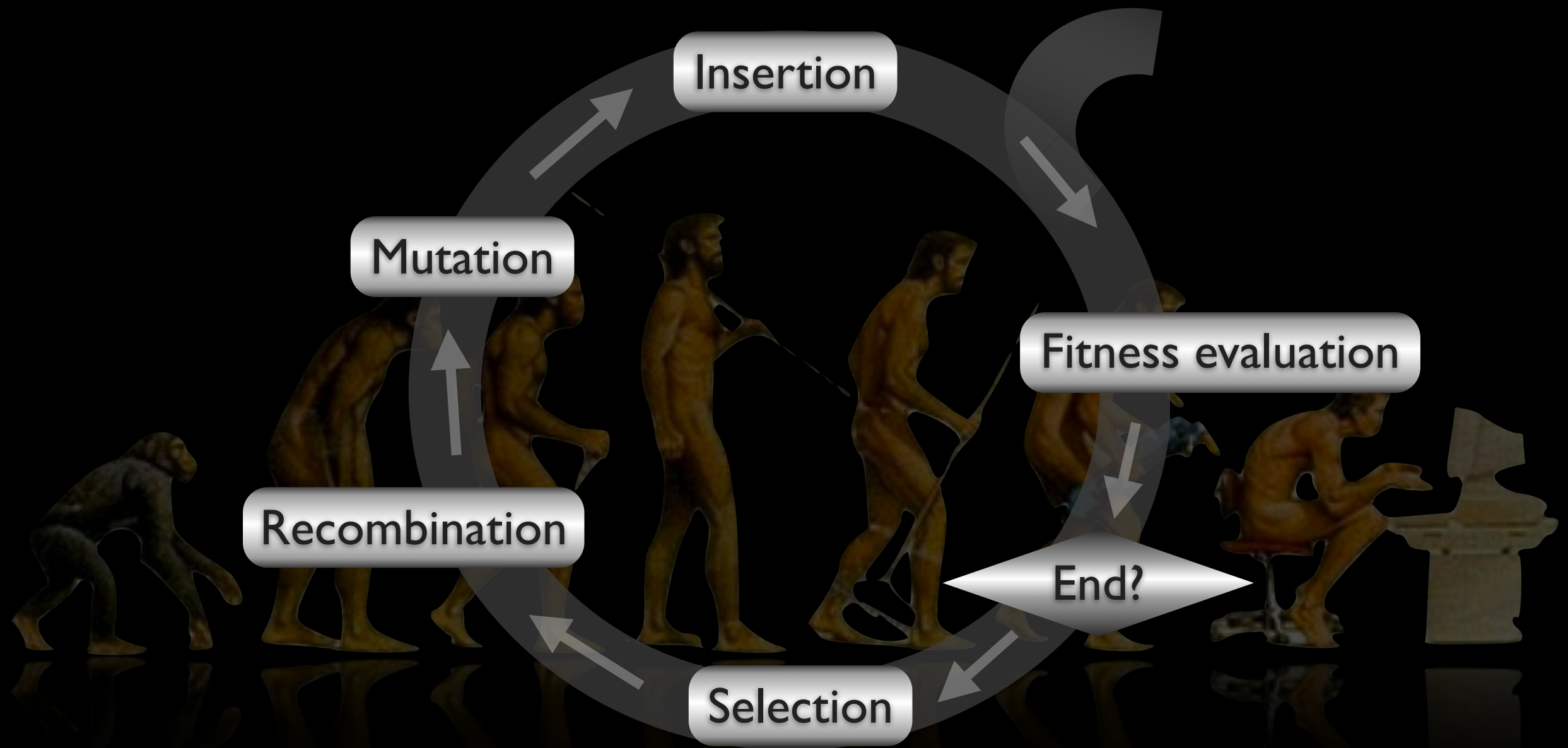
Evolutionary Testing



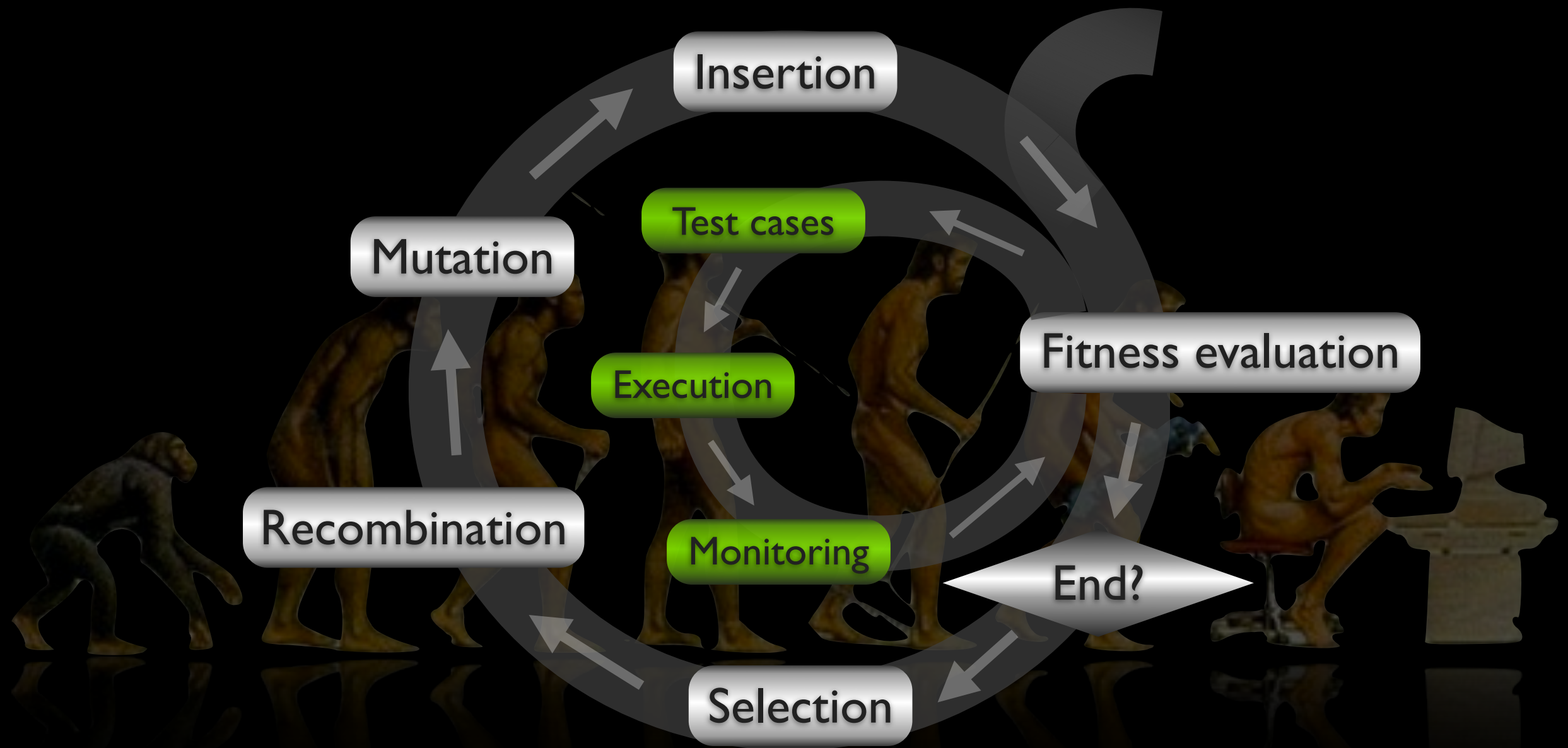
Evolutionary Testing



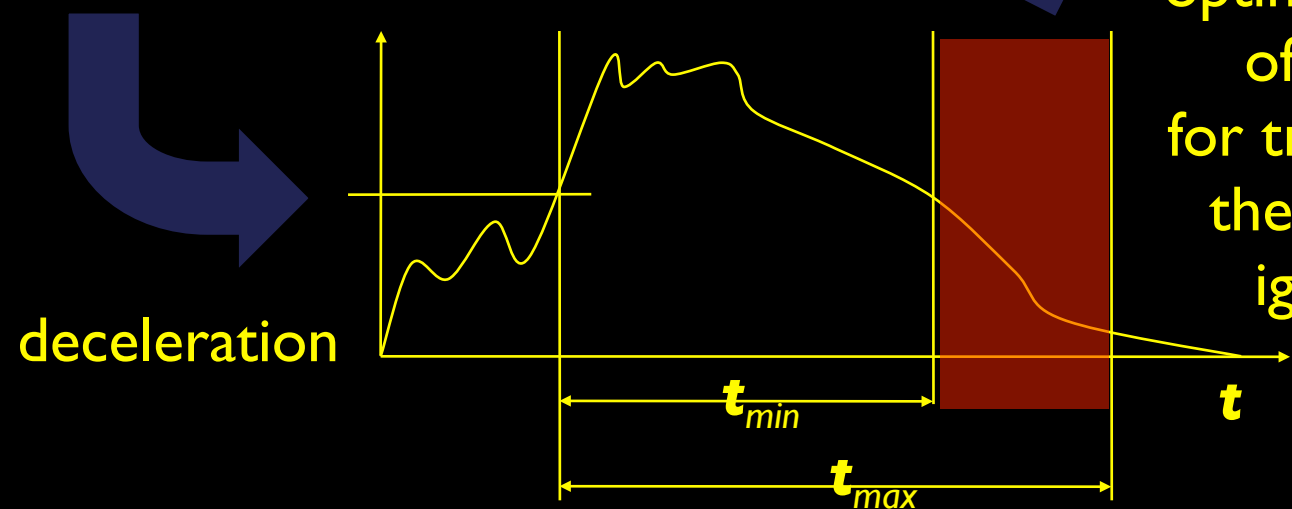
Evolutionary Testing



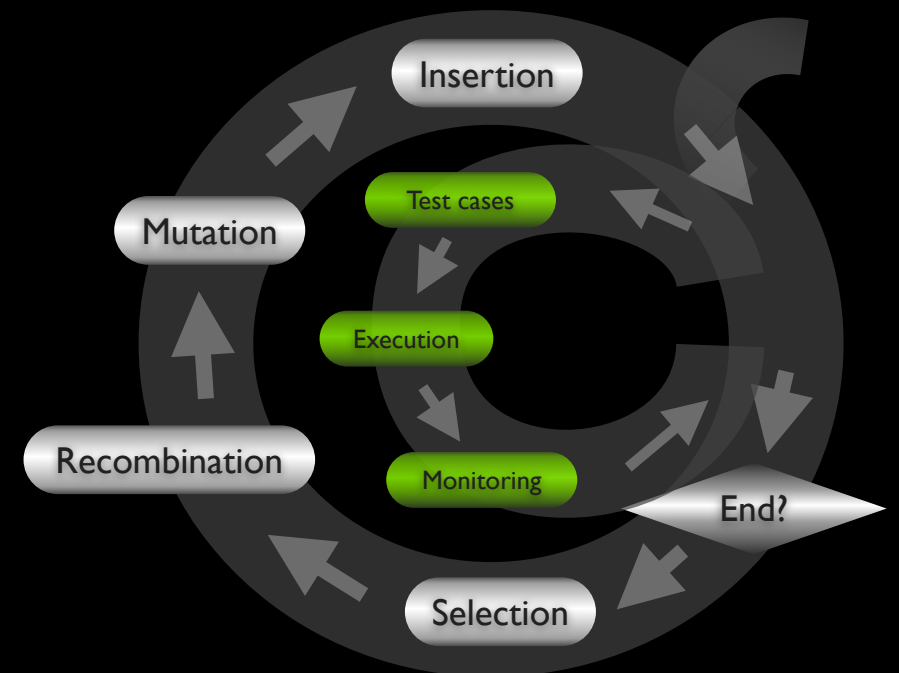
Evolutionary Testing



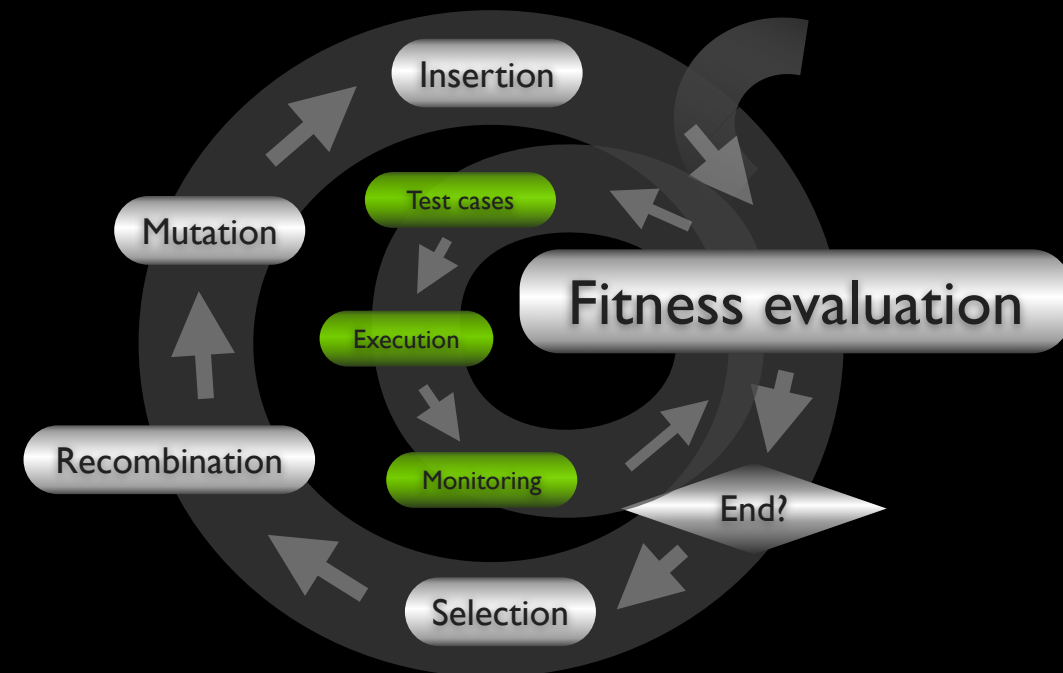
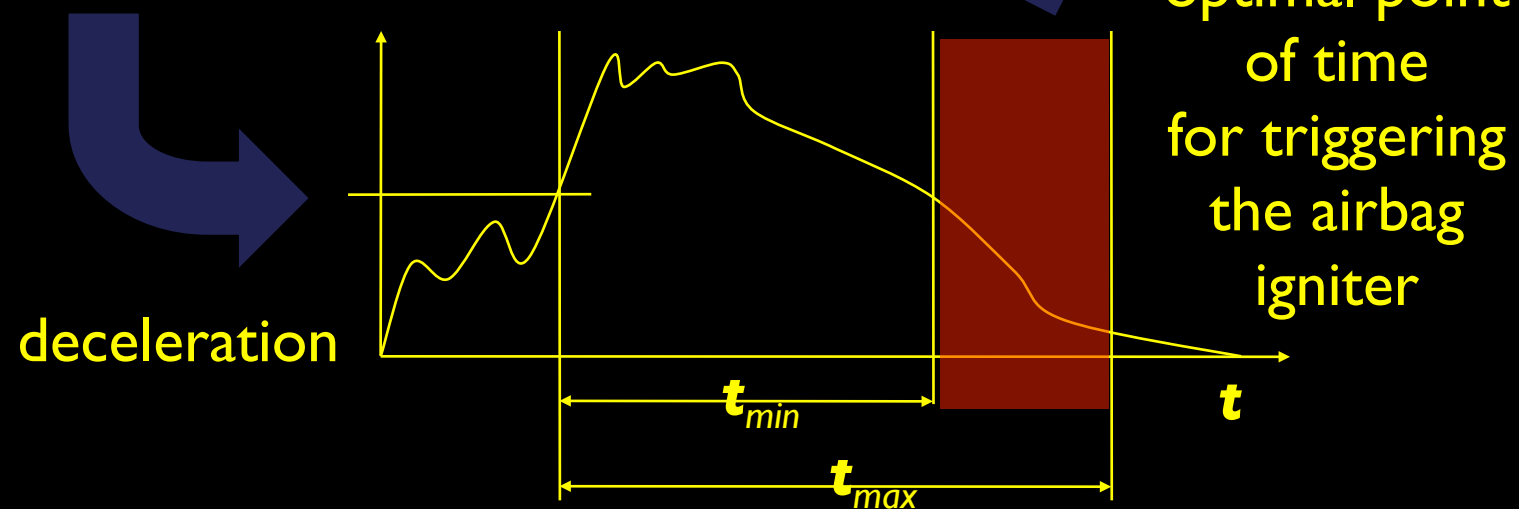
Daimler Temporal Testing



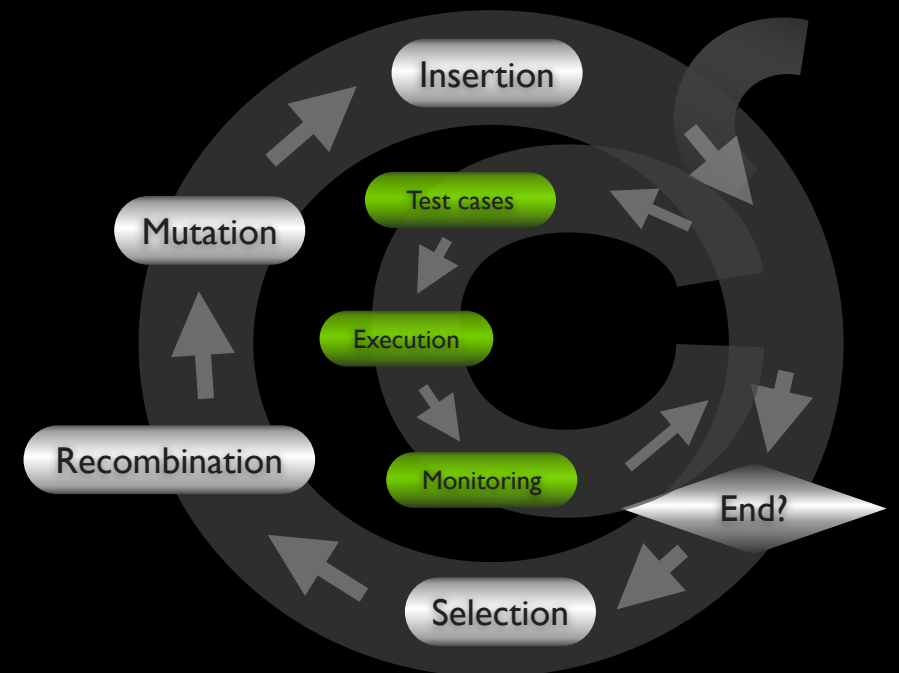
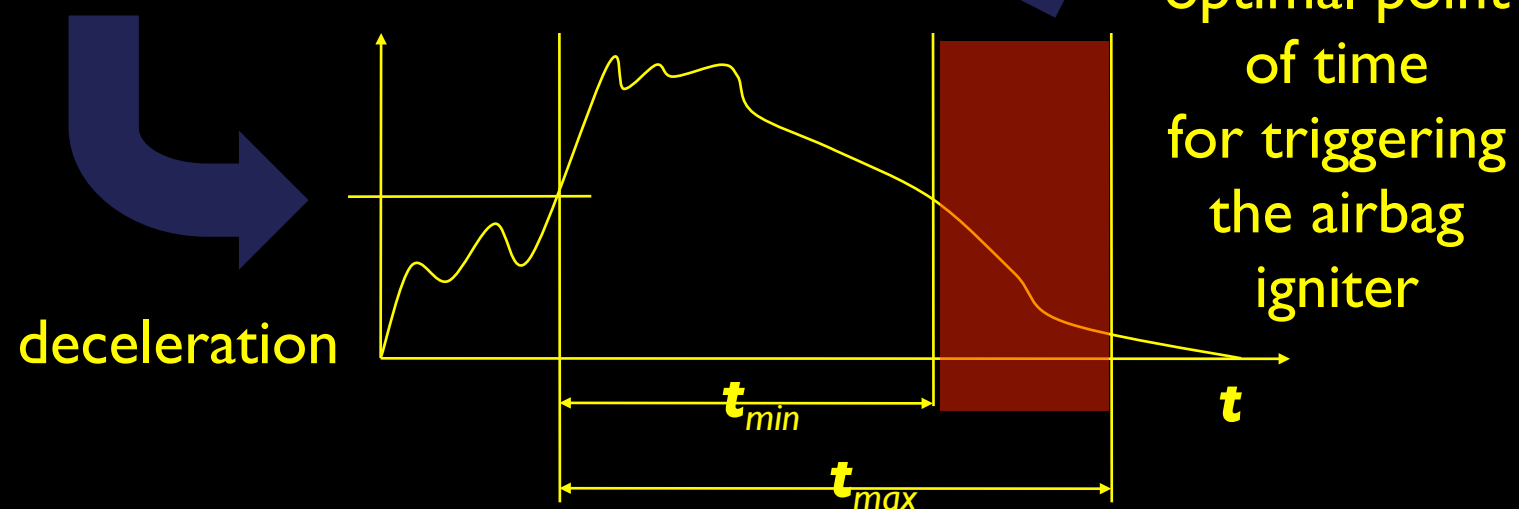
optimal point
of time
for triggering
the airbag
igniter



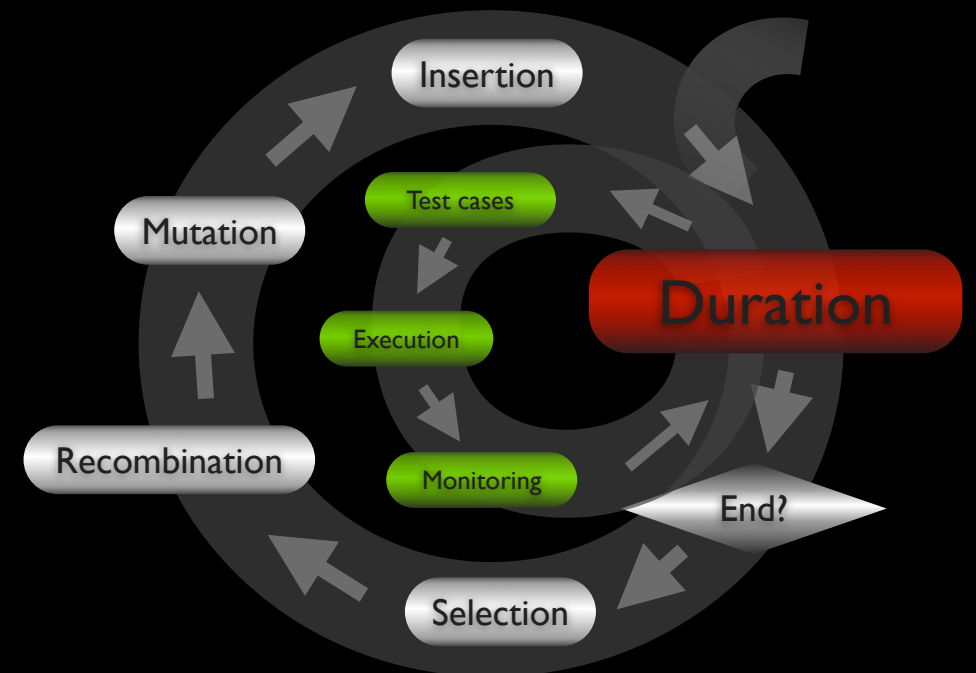
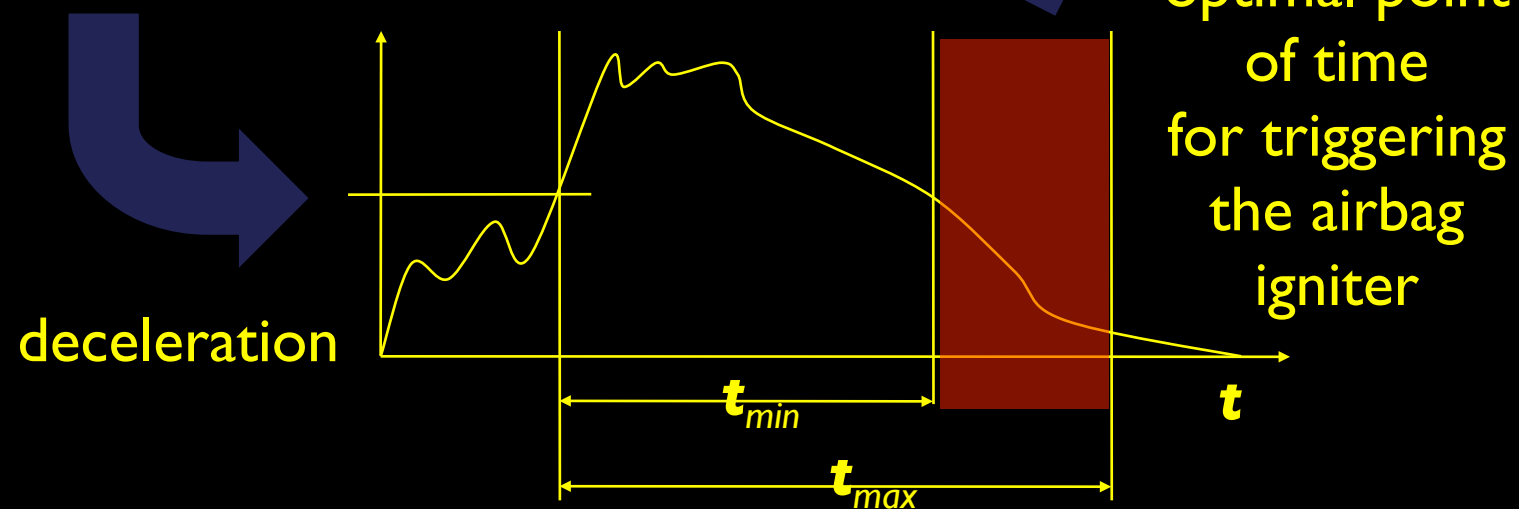
Daimler Temporal Testing



Daimler Temporal Testing



Daimler Temporal Testing



Multi Objective Search

Many problems have multiple objectives

Often we have many metrics

Recent SBSE work has been multi objective

Pareto optimality can yield insight

Multi Objective Search

Many problems have multiple objectives

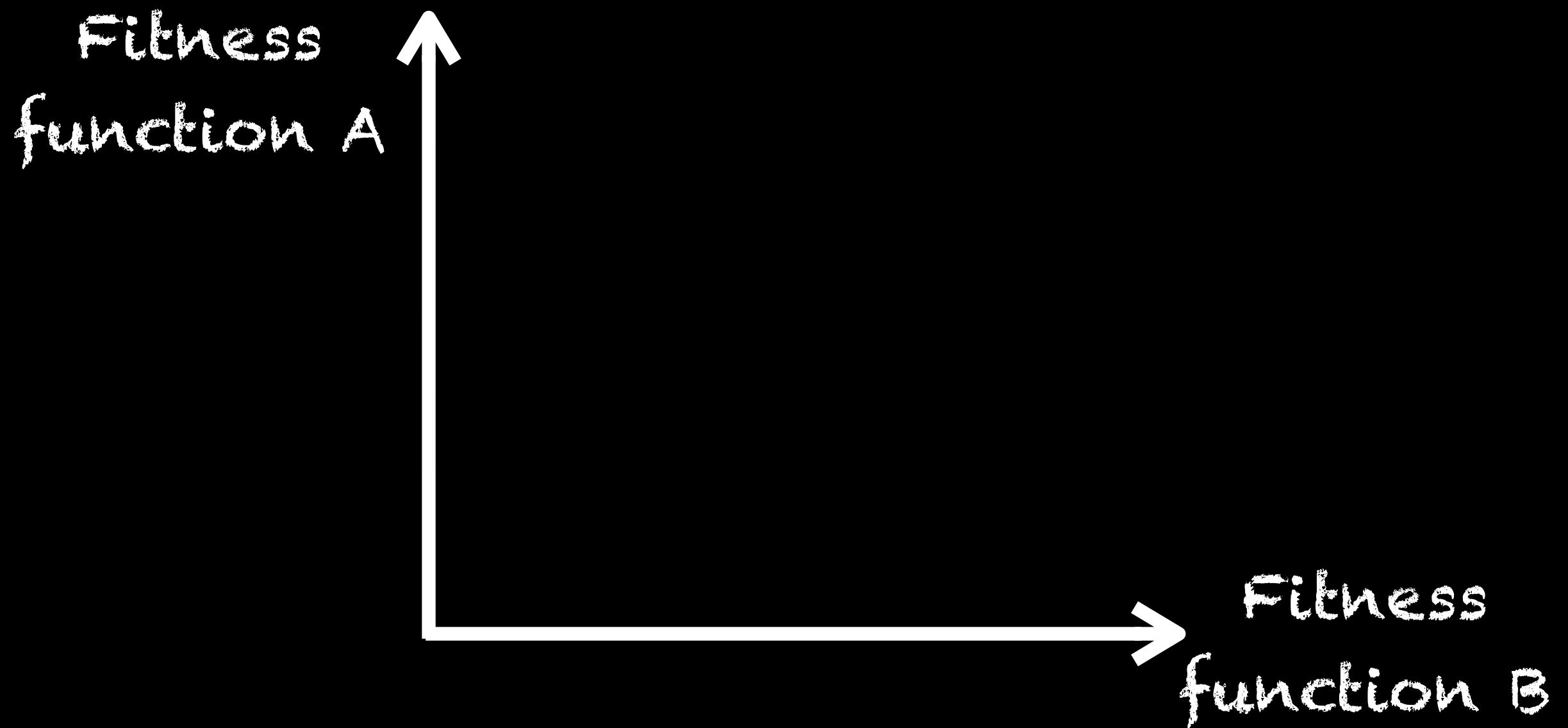
Often we have many metrics

Recent SBSE work has been multi objective

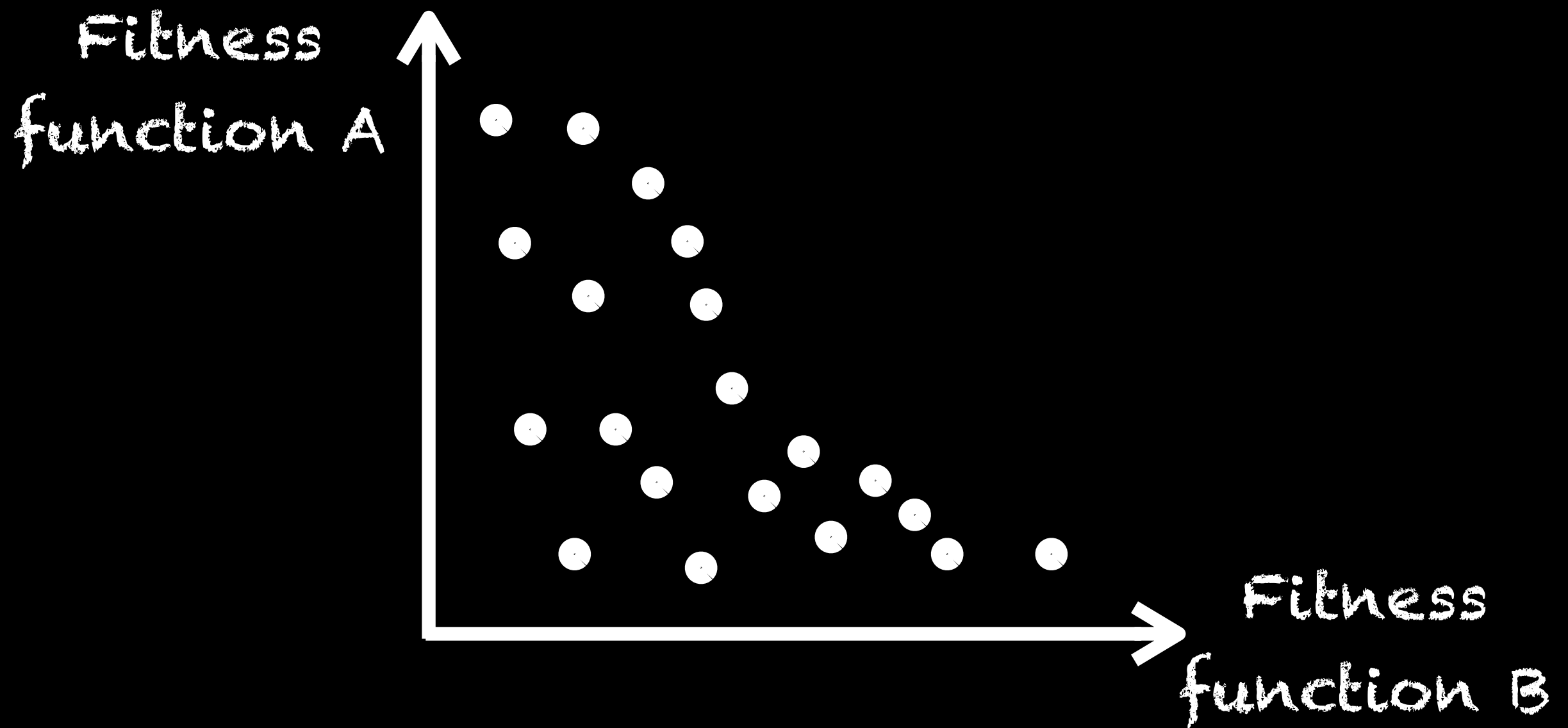
Pareto optimality can yield insight

Multi Objective Search

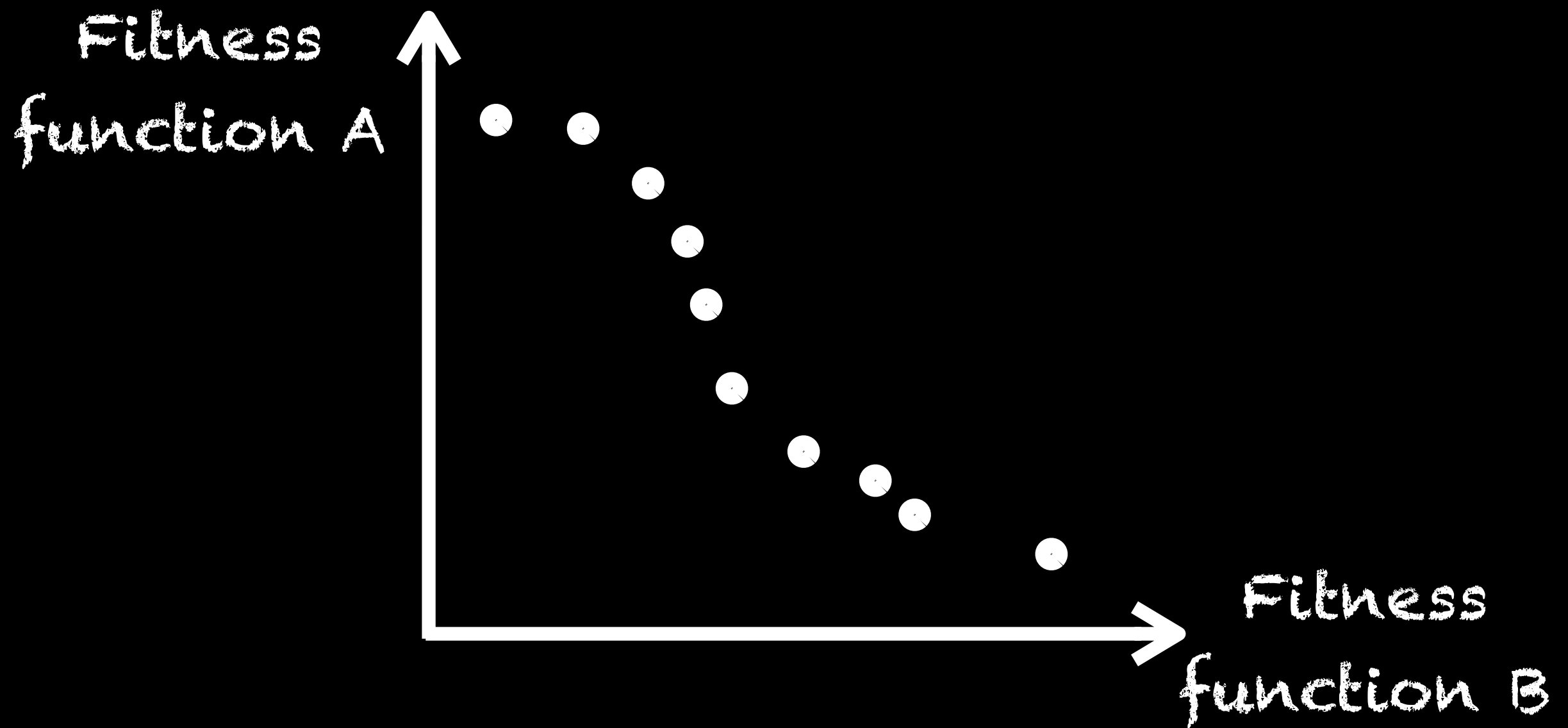
Multi Objective Search



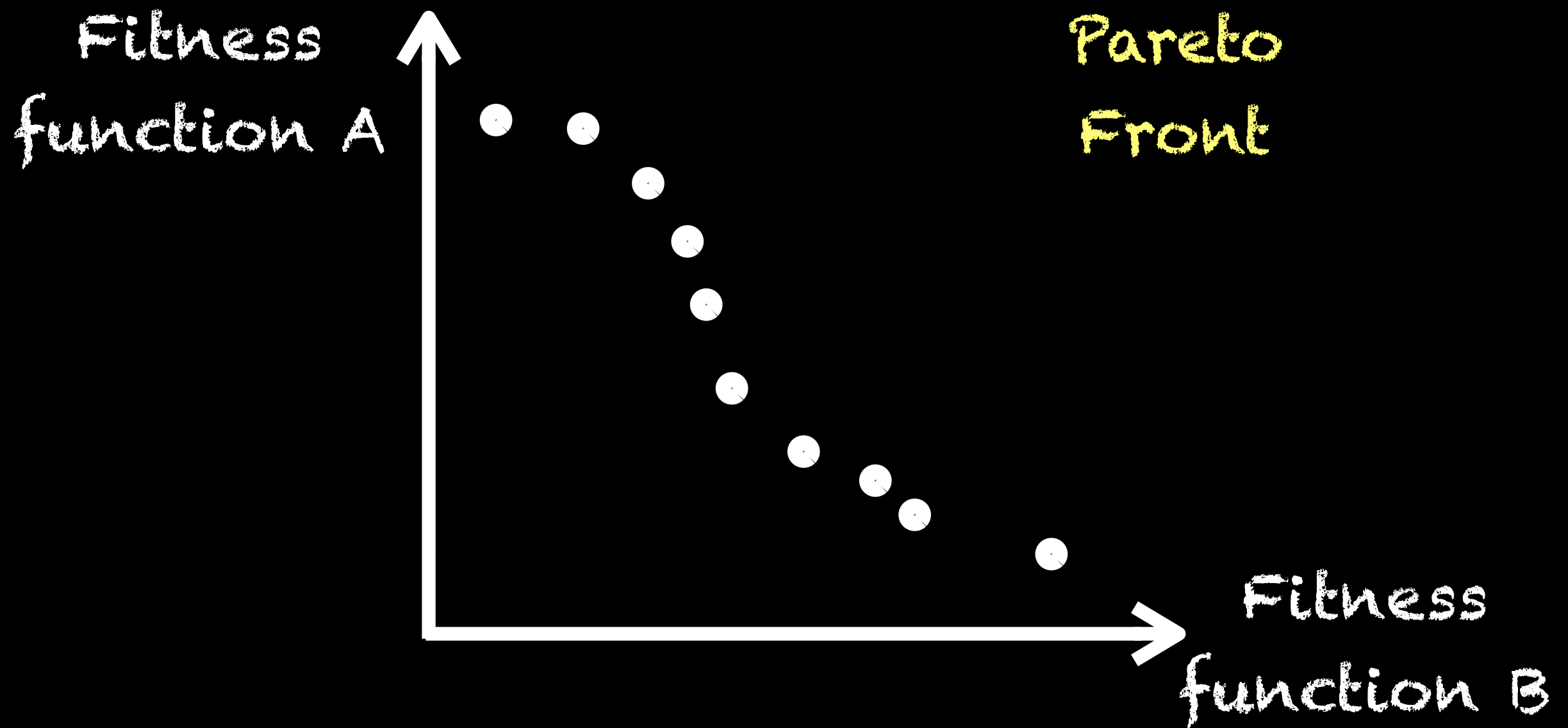
Multi Objective Search



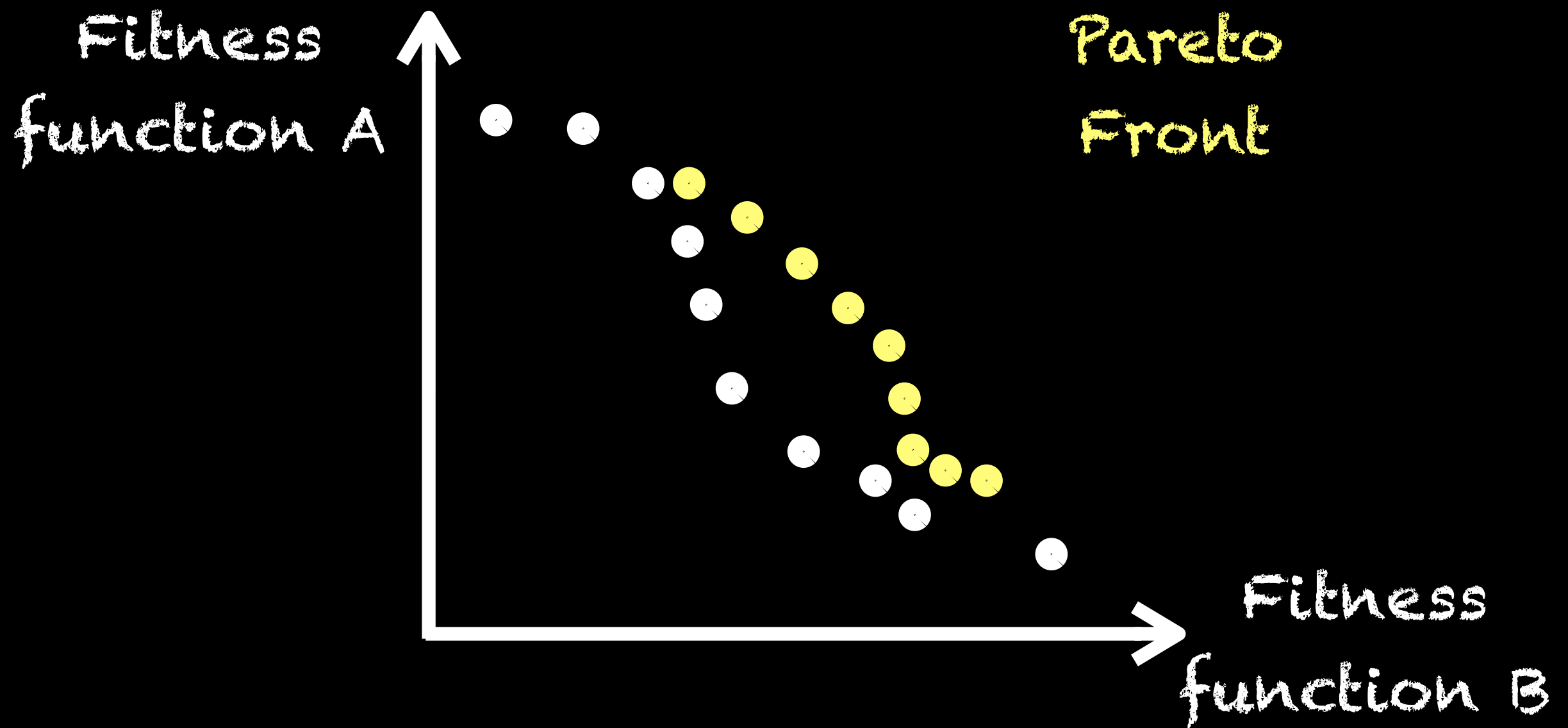
Multi Objective Search



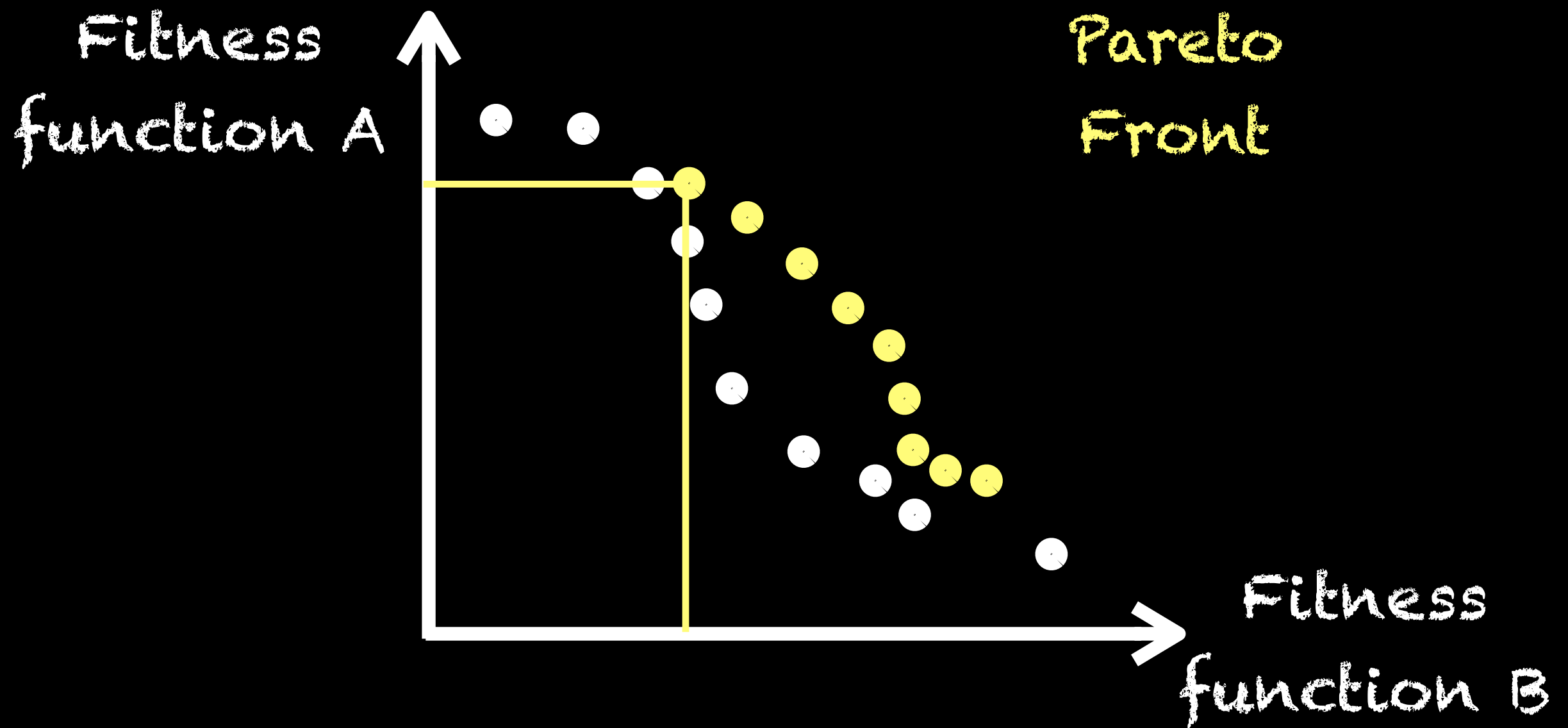
Multi Objective Search



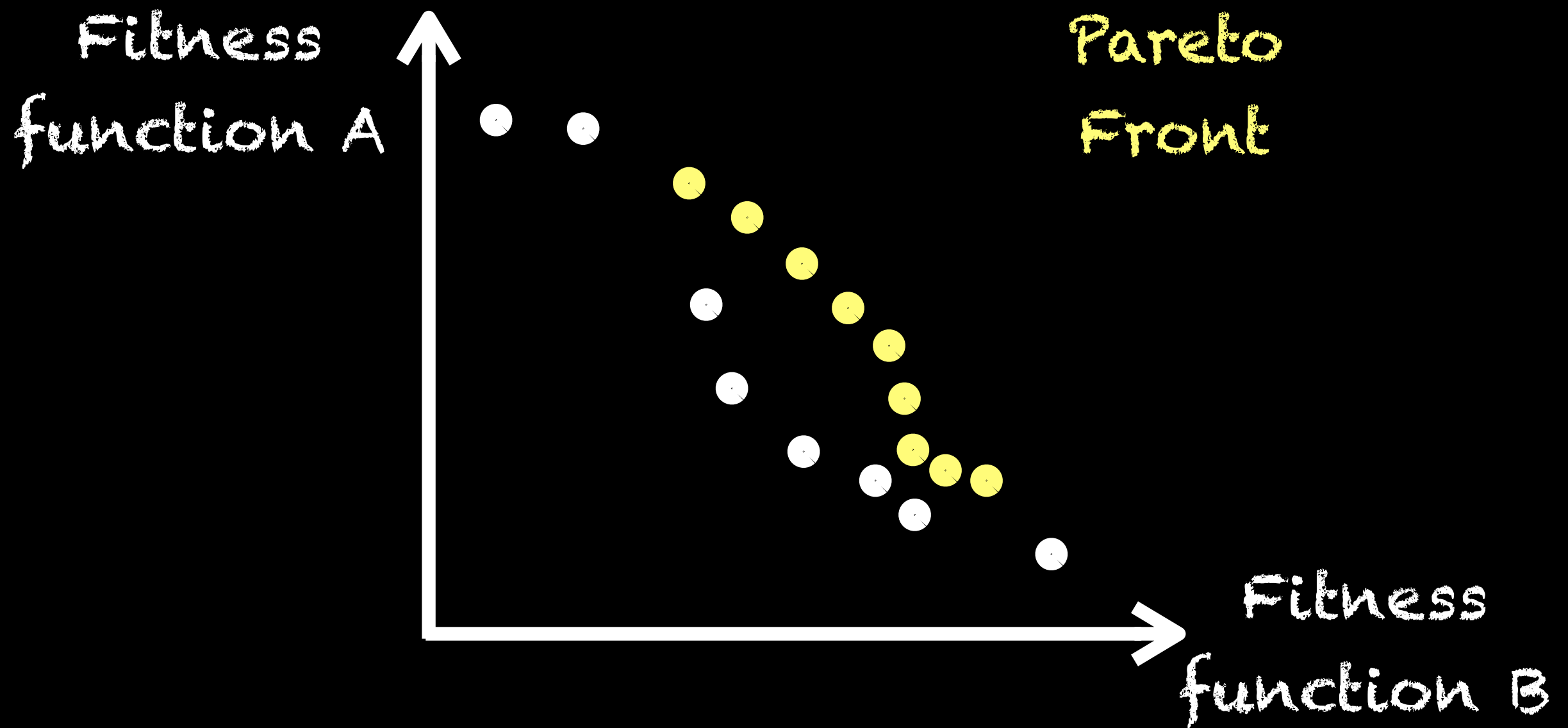
Multi Objective Search



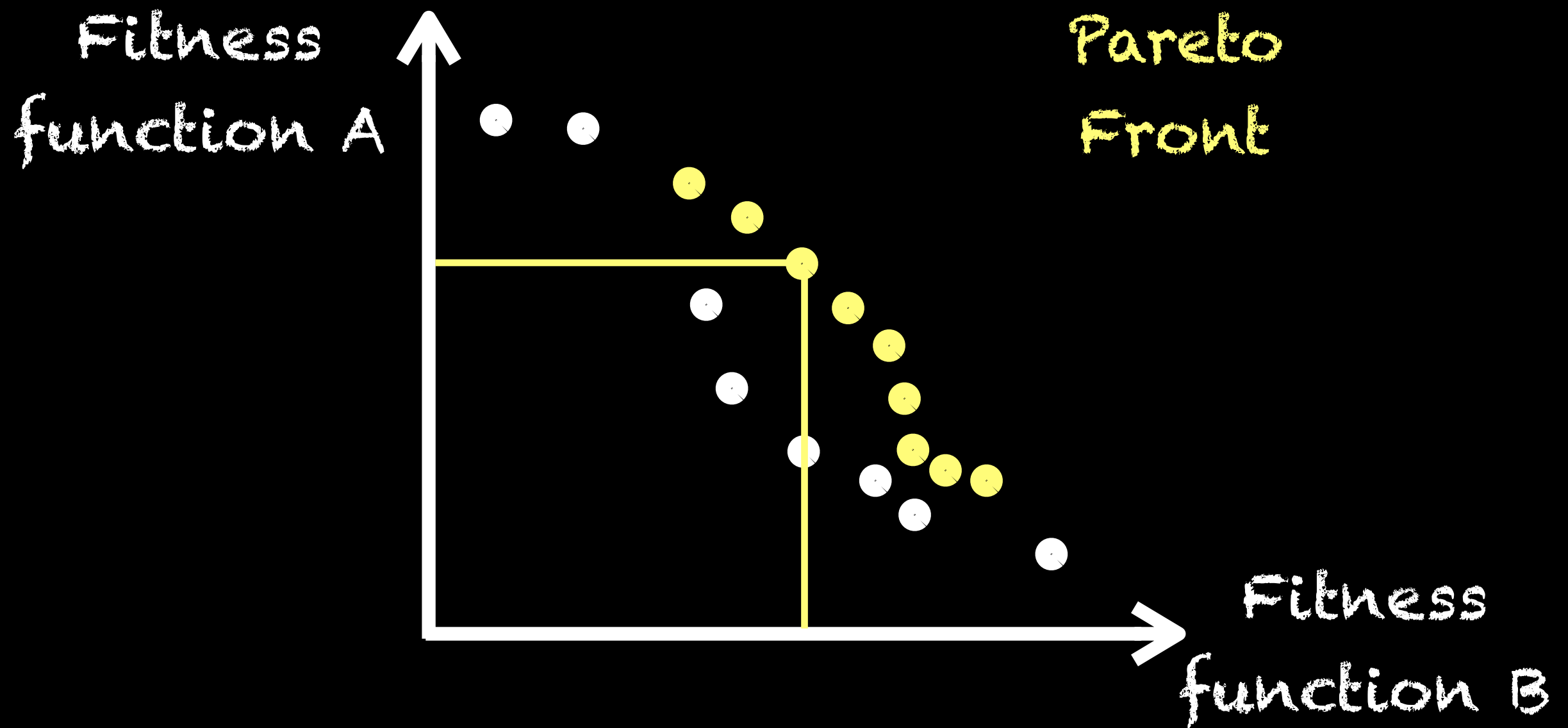
Multi Objective Search



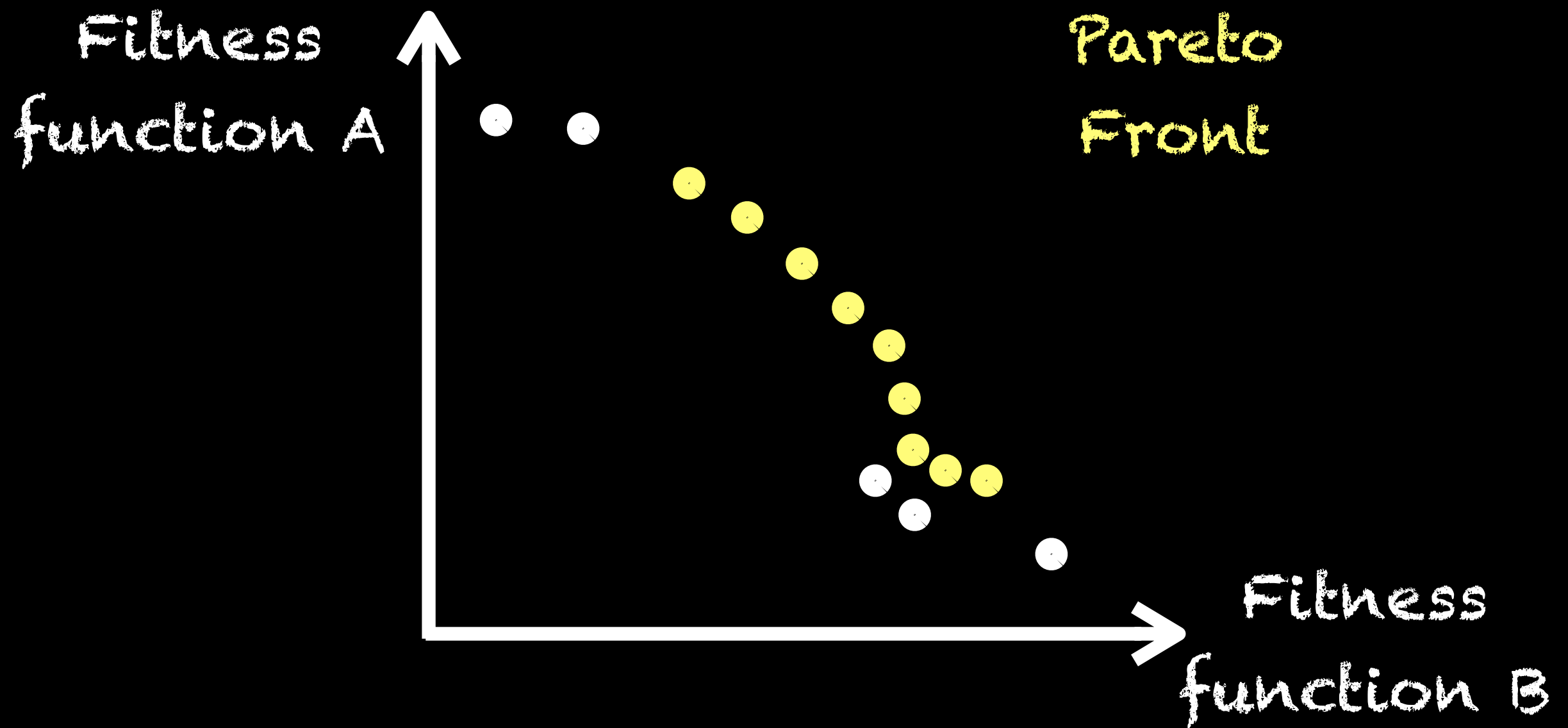
Multi Objective Search



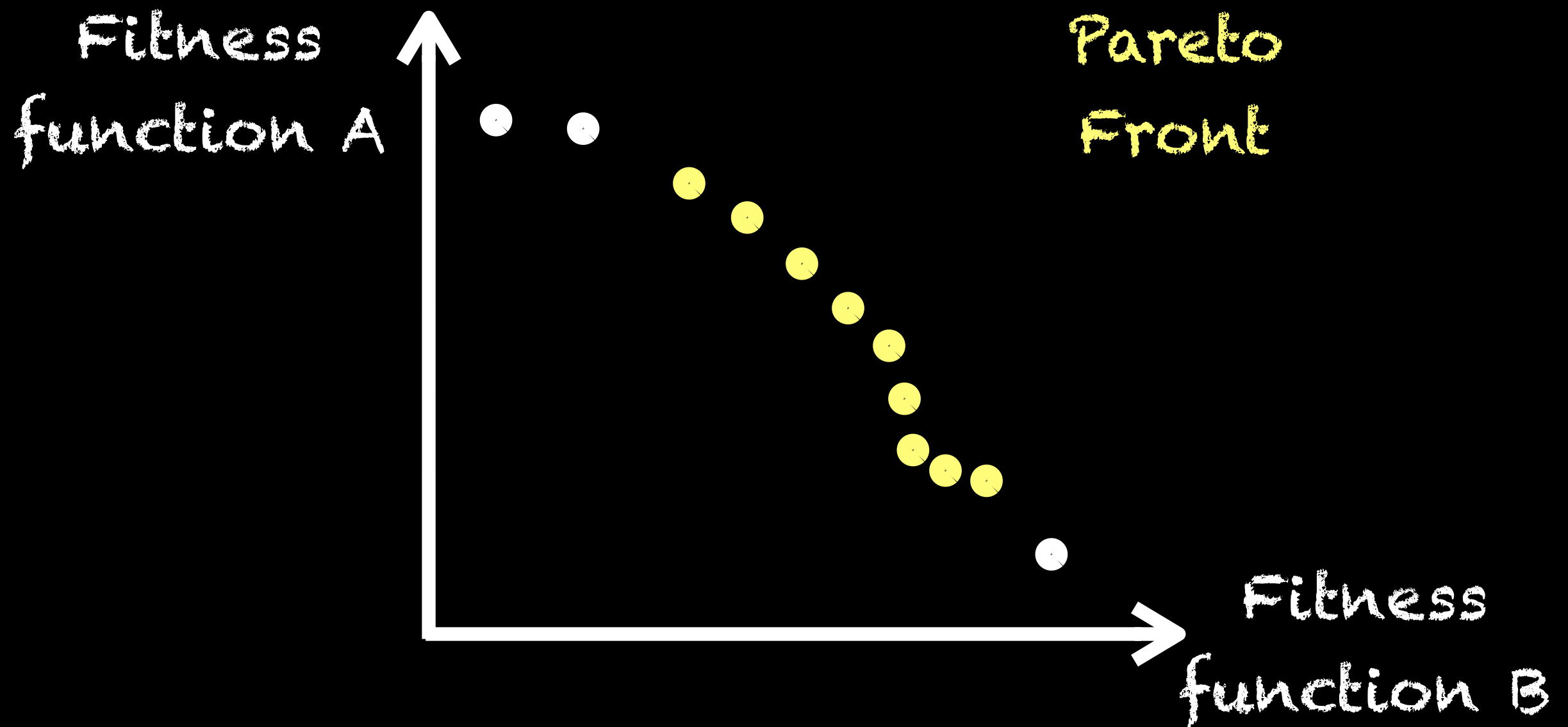
Multi Objective Search



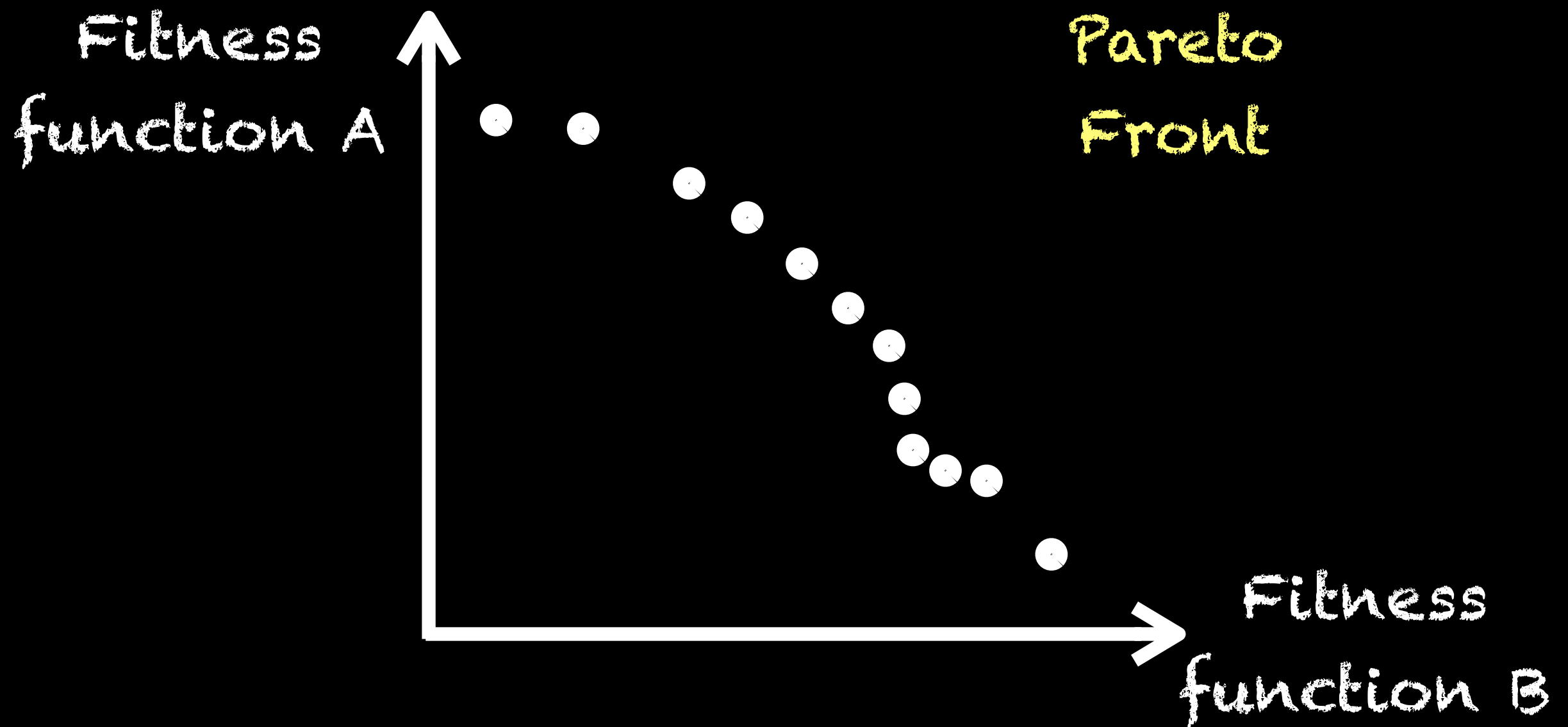
Multi Objective Search



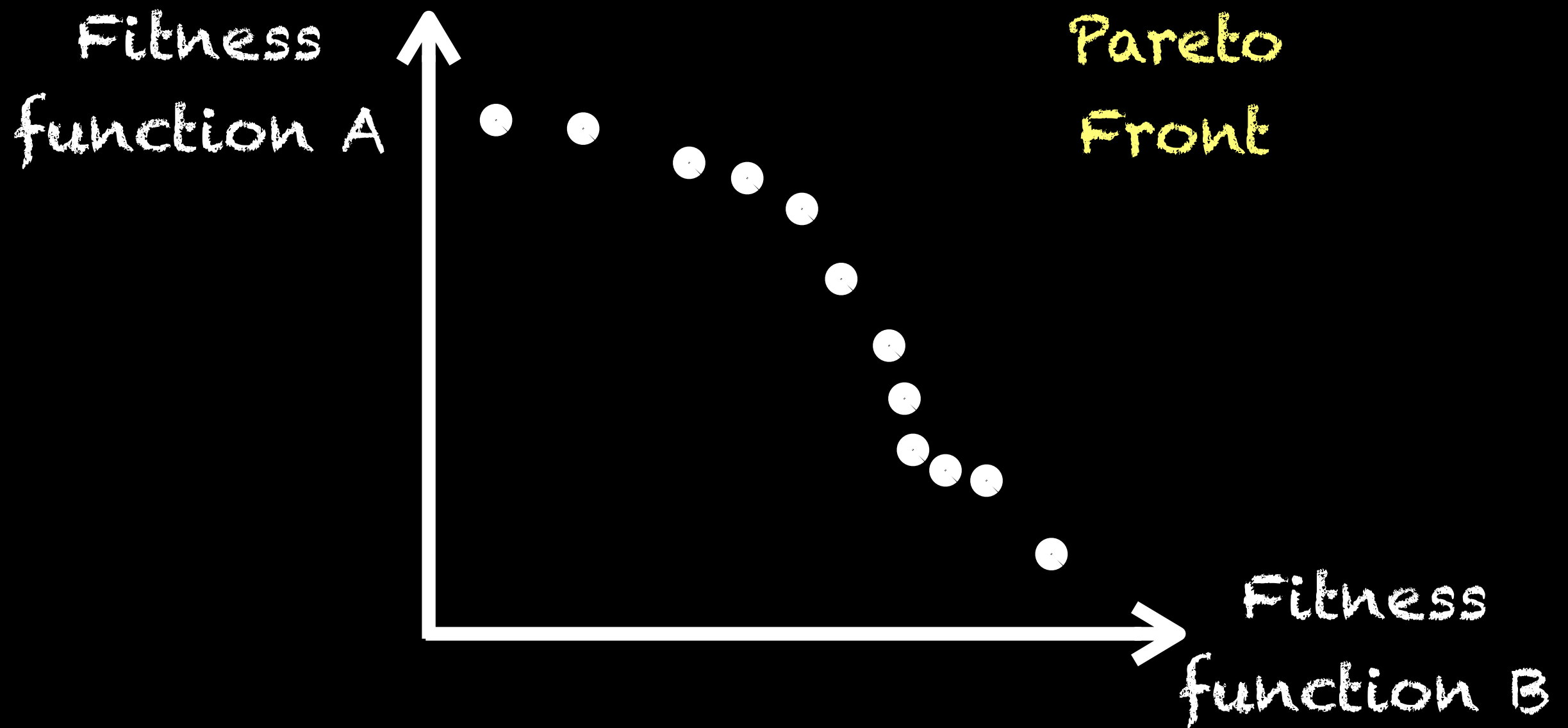
Multi Objective Search



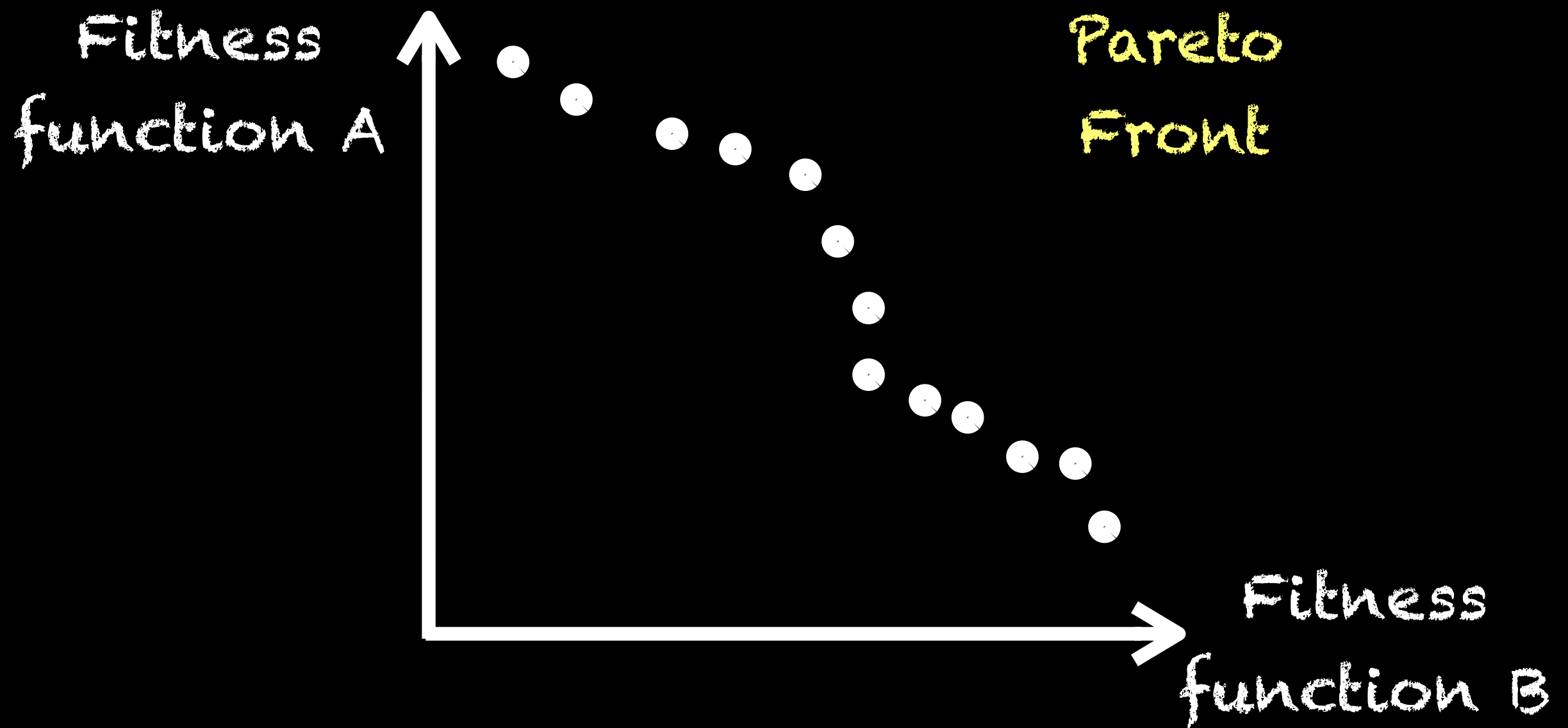
Multi Objective Search



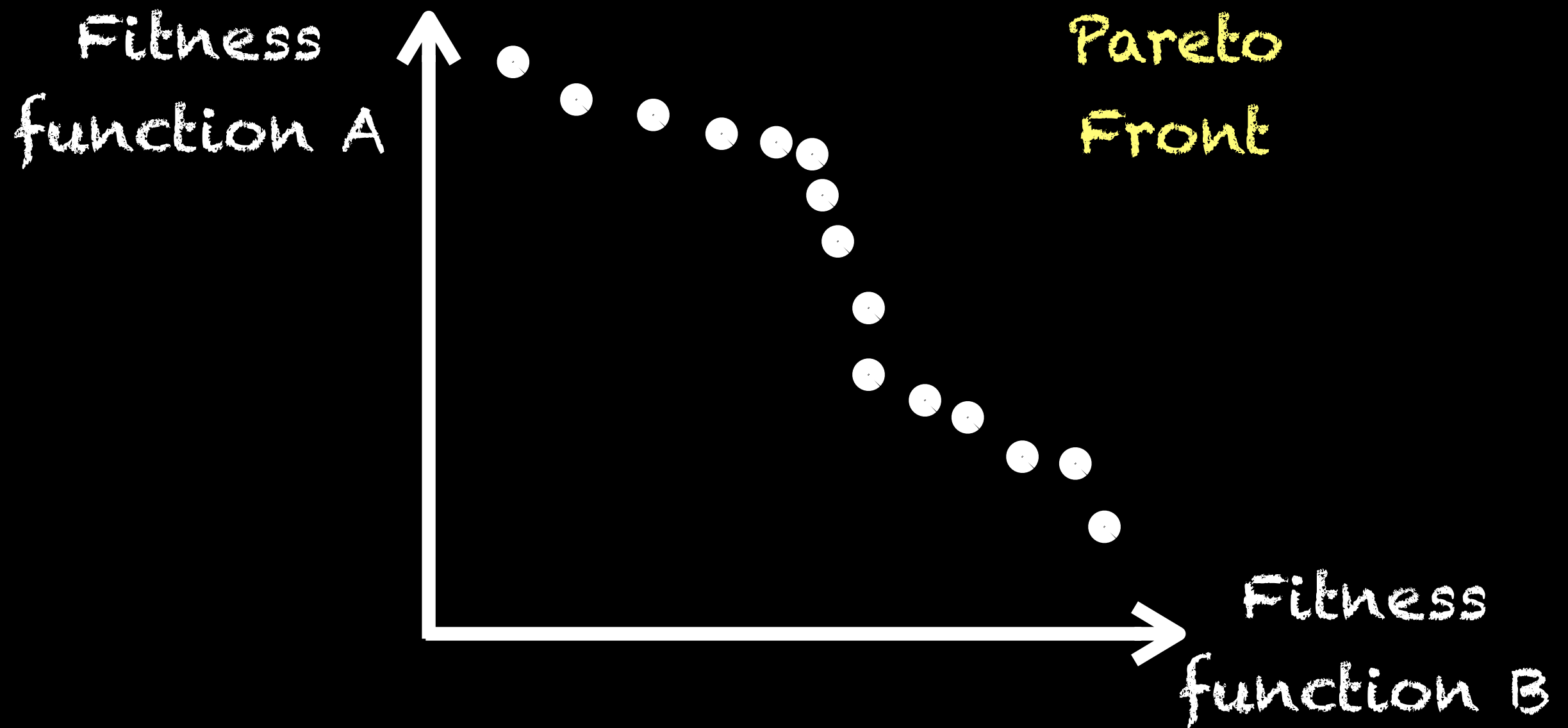
Multi Objective Search



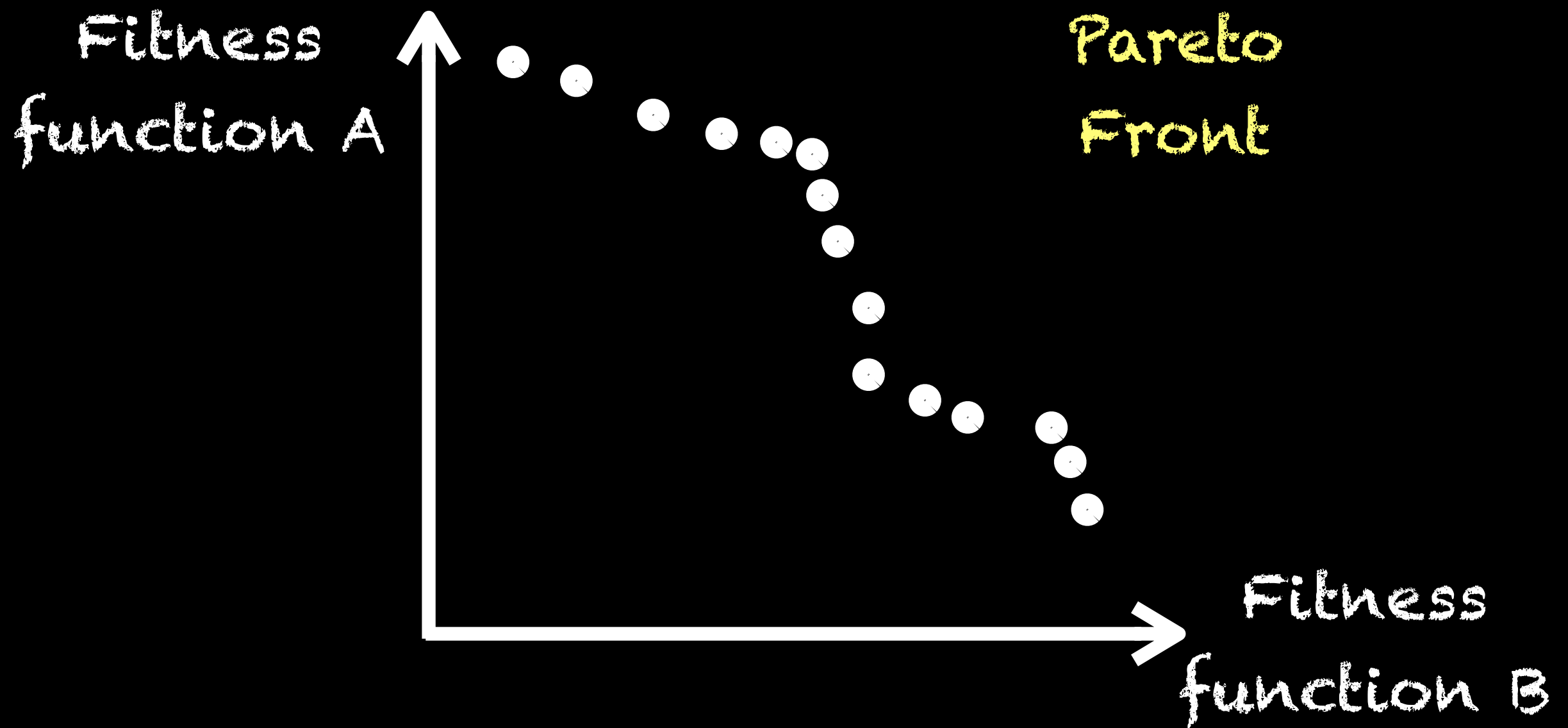
Multi Objective Search



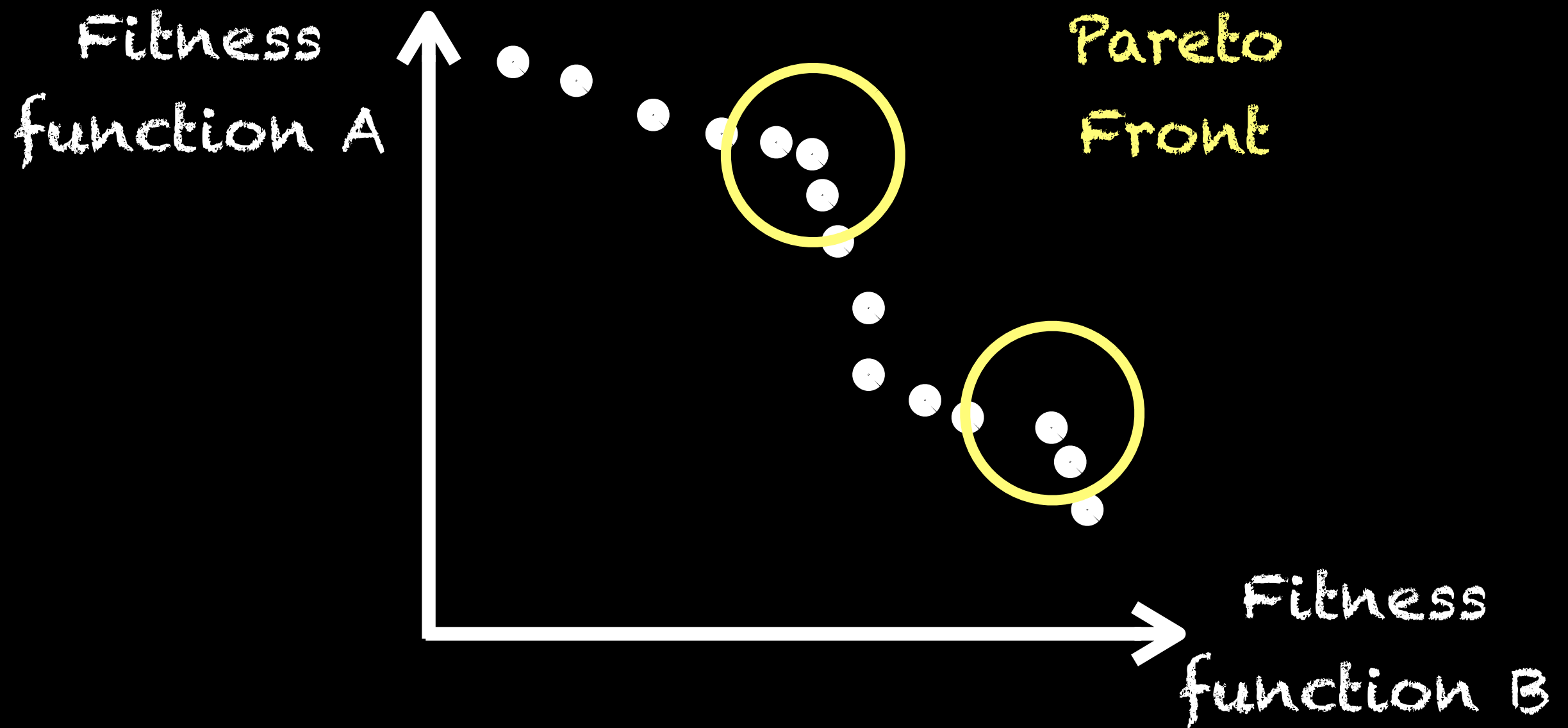
Multi Objective Search



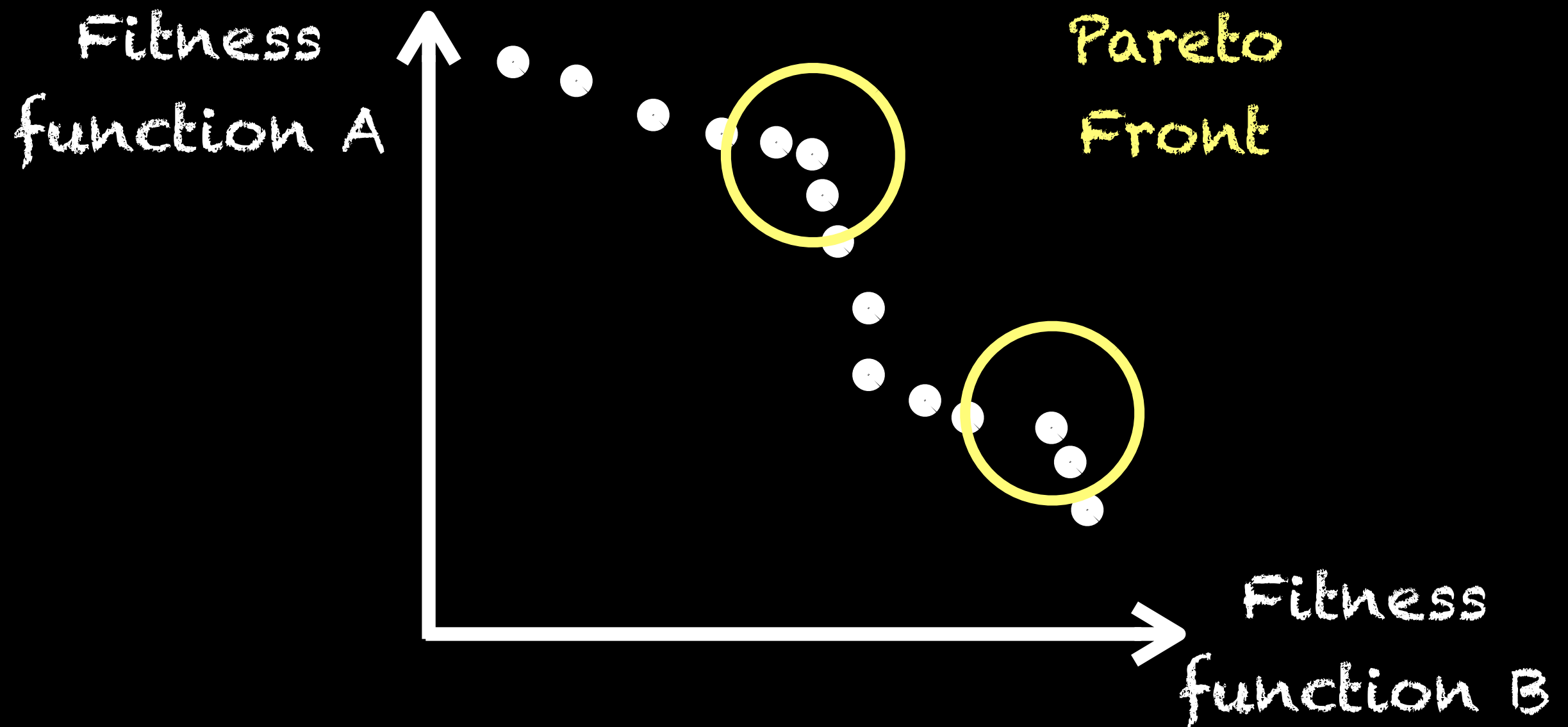
Multi Objective Search



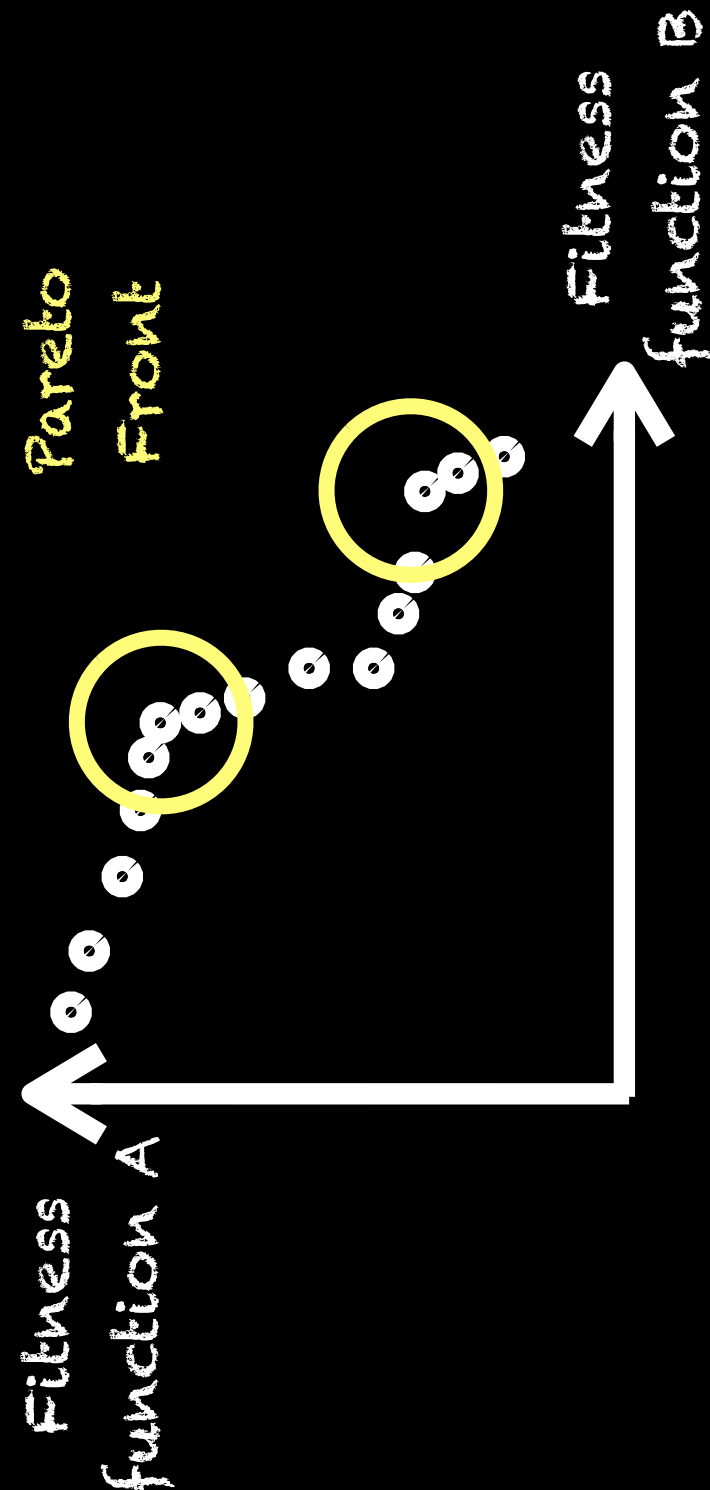
Multi Objective Search



Direction of front growth



Direction of front growth



Pareto Optimal SBSE

Regression Testing

Requirements Analysis

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Regression Testing

Requirements Analysis

Capture
requirements

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Requirements Analysis

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Generate
tests

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Maintain
evolve

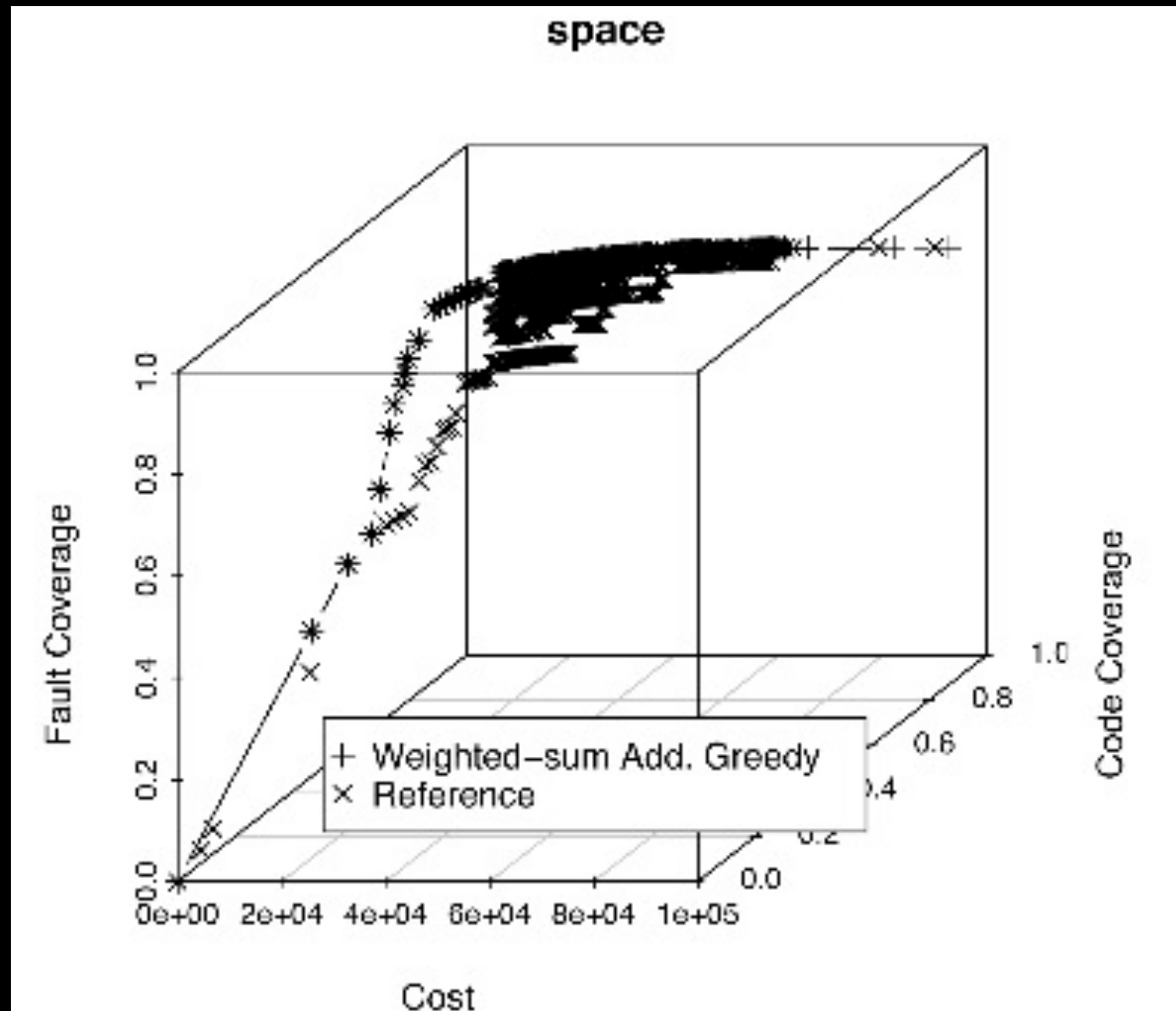
Regression
test

Regression Testing

Requirements Analysis

Regression Test Selection

Regression Test Selection



Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Regression Testing

Requirements Analysis

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Regression Testing

Requirements Analysis

Capture
requirements

Generate
tests

Explore
designs

Maintain
evolve

Regression
test

Regression Testing

Requirements Analysis





Customers



Requirements



Cost



Customers' value for
each requirement



The Next Release Problem

$$C = \{c_1, \dots, c_j, \dots, c_m\} \quad R = \{r_1, \dots, r_i, \dots, r_n\}$$

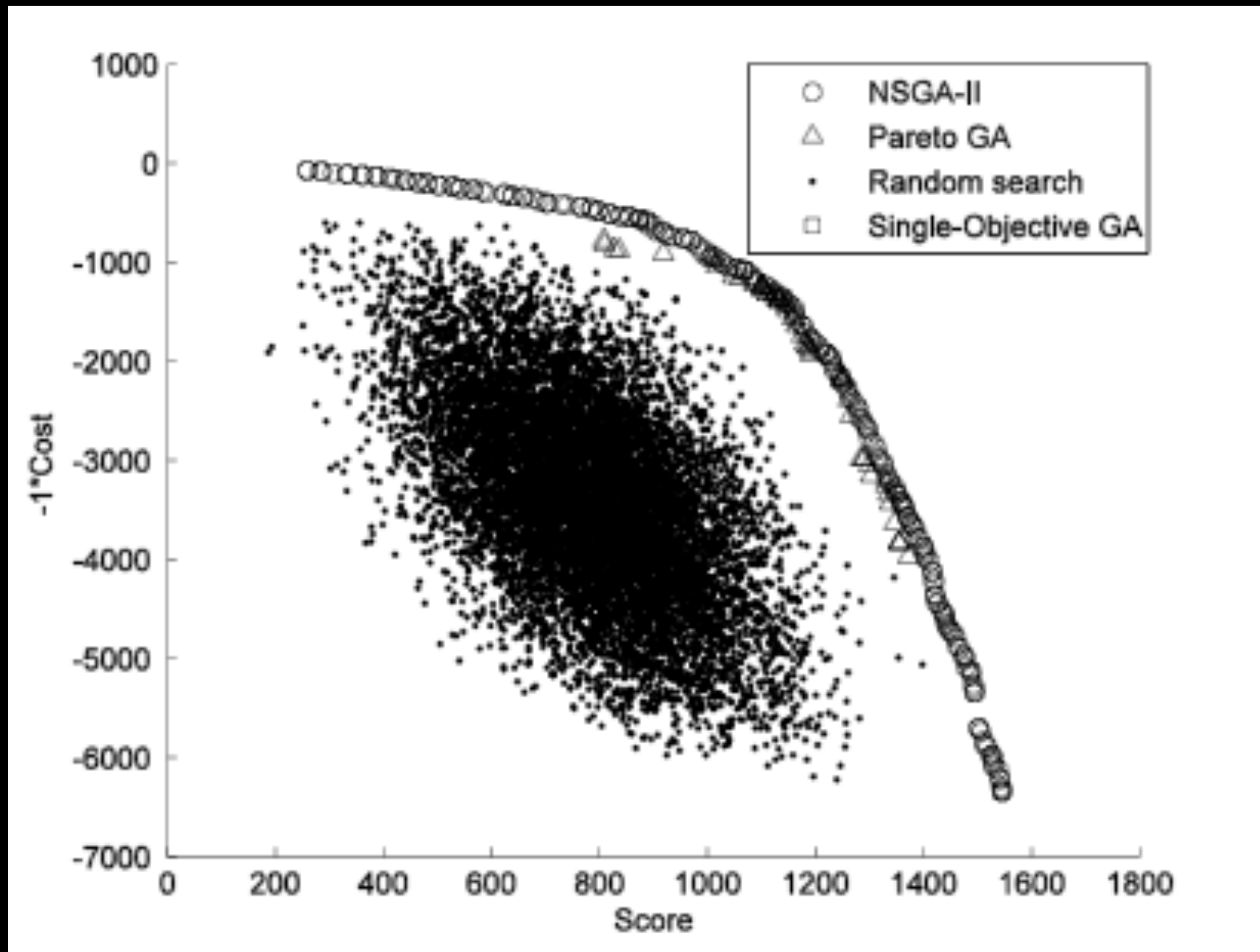
$$Weight = \{w_1, \dots, w_j, \dots, w_m\} \quad Cost = \{cost_1, \dots, cost_n\}$$

$$value(r_i, c_j)$$

$$score_i = \sum_{j=1}^m w_j \times value(r_i, c_j)$$

Motorola Cell Phone Requirements

Motorola Cell Phone Requirements



SBSE is so generic

SBSE is so generic

Test generation

Fitness function: time ...

Representation: input vector

SBSE is so generic

Test generation

Fitness function: time ...

Representation: input vector

Requirements

Fitness function: cost, value ...

Representation: bitset of requirements

SBSE is so generic

Test generation

Fitness function: time ...

Representation: input vector

Requirements

Fitness function: cost, value ...

Representation: bitset of requirements

Regression

Fitness function: coverage, time, faults

Representation: bitset of test cases

SBSE is so generic

Test generation

Fitness function: time ...

Representation: input vector

Requirements

Fitness function: cost, value ...

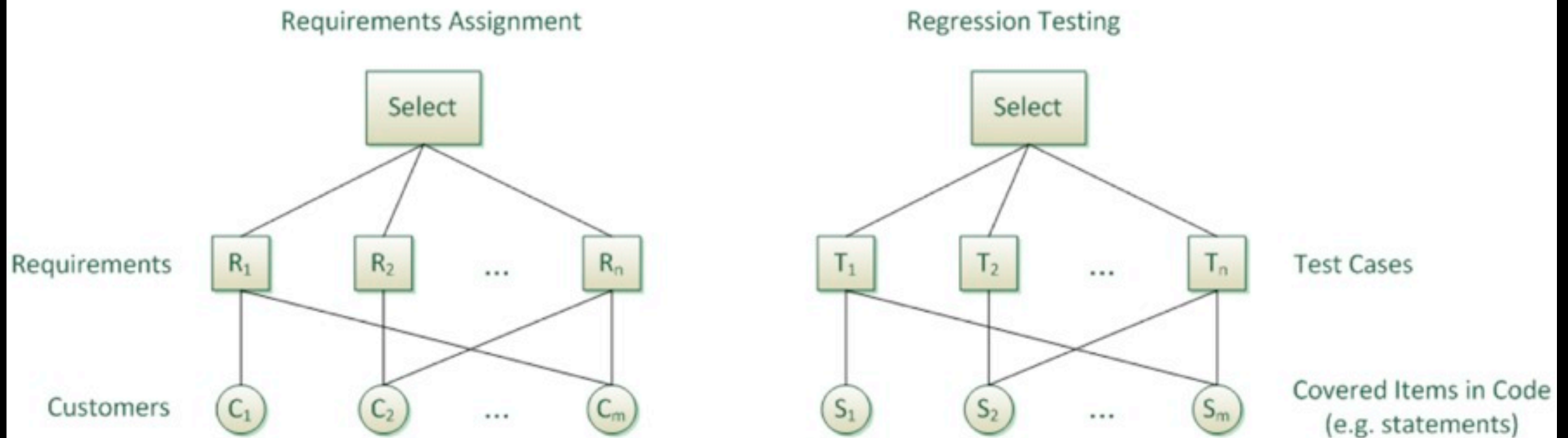
Representation: bitset of requirements

Regression

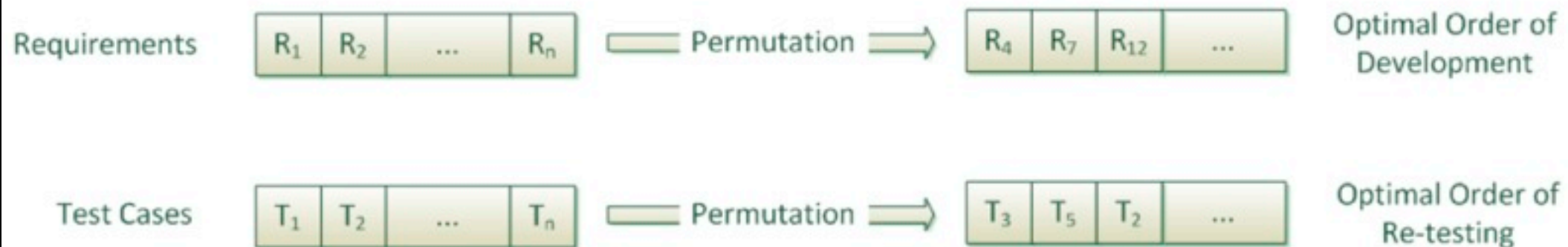
Fitness function: coverage, time, faults

Representation: bitset of test cases

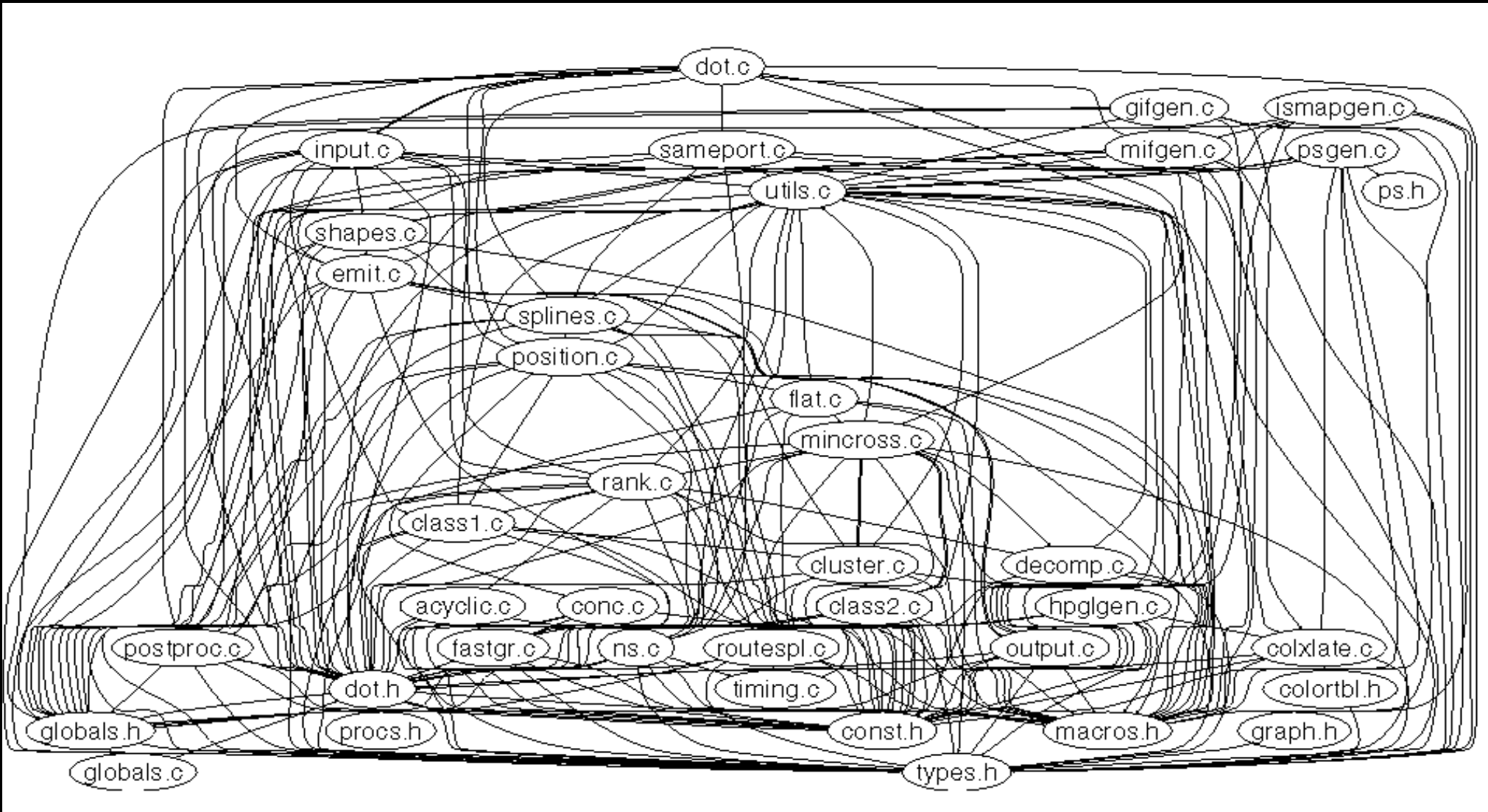
Selection Problems



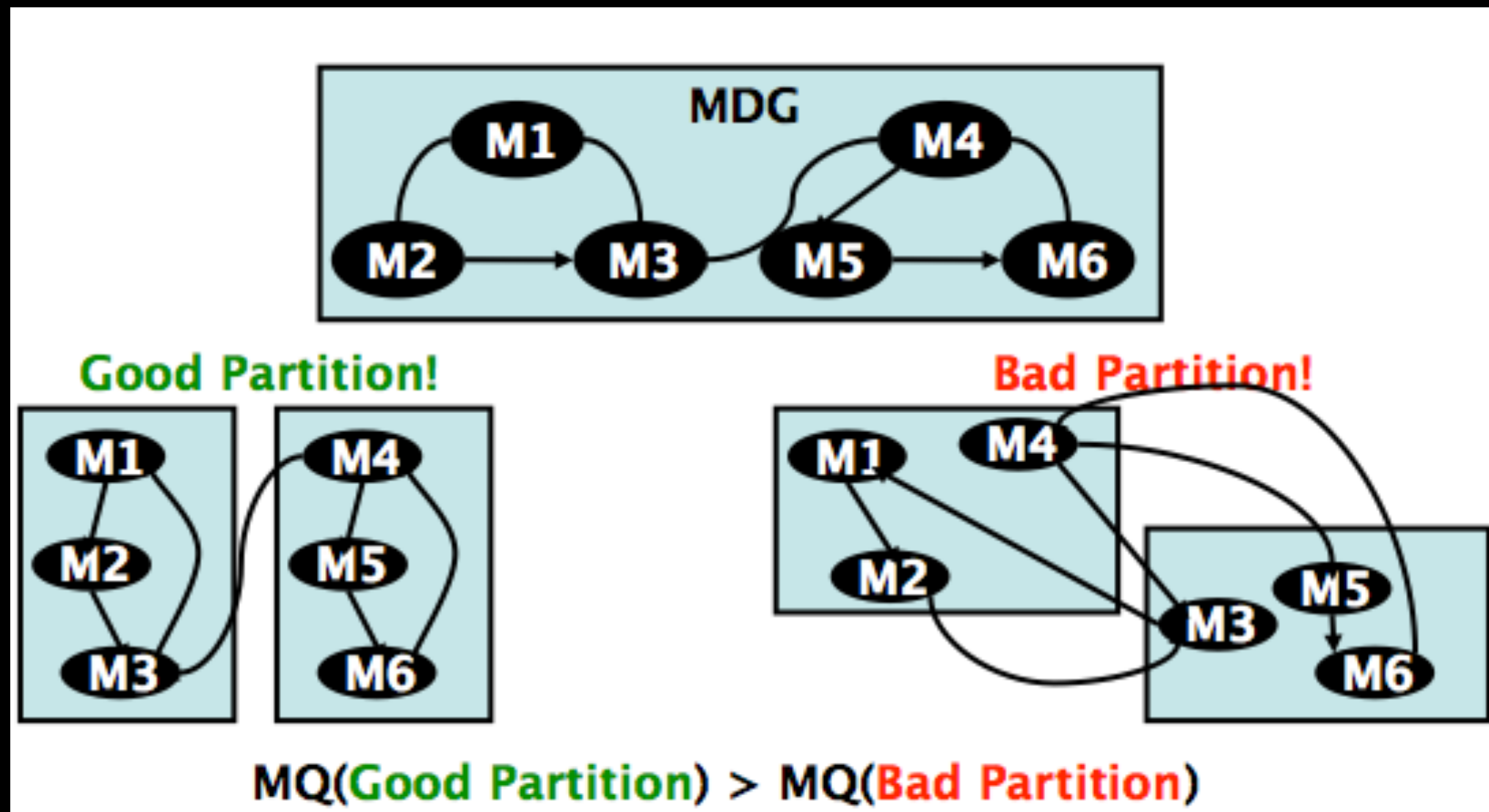
Prioritization Problems



Familiar?



Bunch System

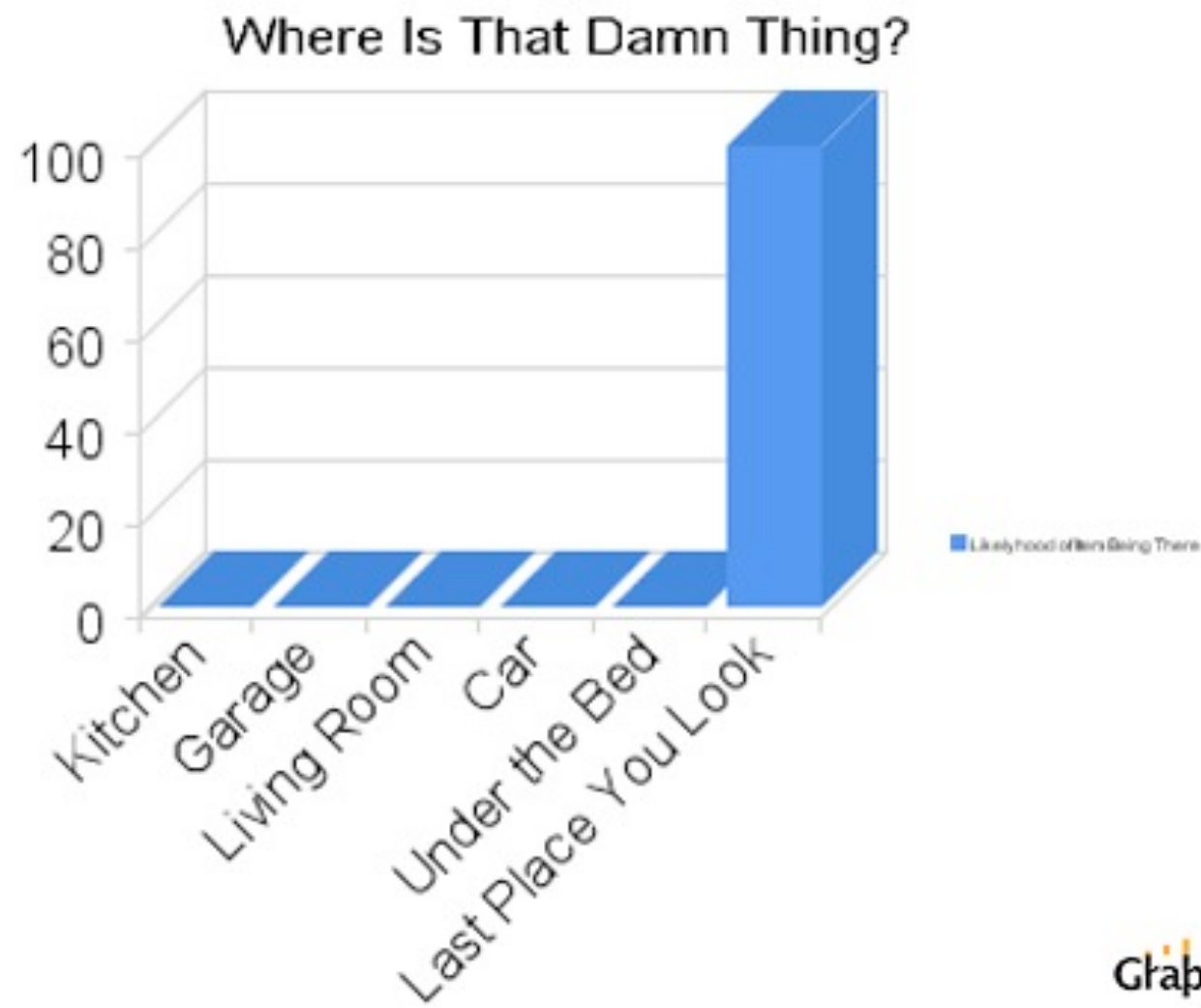


Some papers

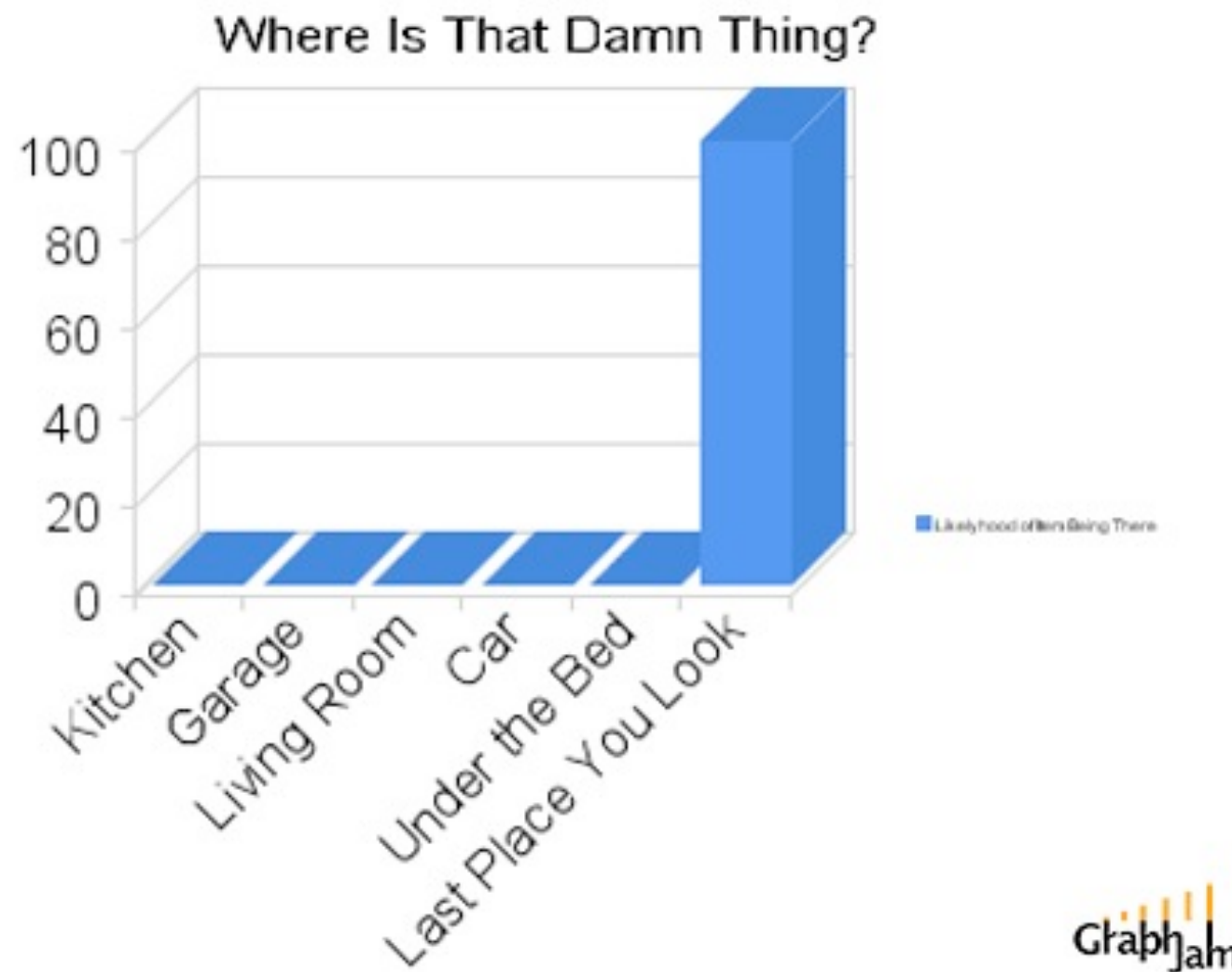
1. Kata Praditwong, Mark Harman and Xin Yao: Software Module Clustering as a Multi-Objective Search Problem. TSE. To appear
2. Michael Bowman, Lionel C. Briand, Yvan Labiche: Multi-Objective Genetic Algorithm to Support Class Responsibility Assignment. ICSM, 124-133, 2007
3. Kristen R. Walcott, Mary Lou Soffa, Gregory M. Kapfhammer, Robert S. Roos: TimeAware test suite prioritization. ISSTA, 1-12, 2006
4. Shin Yoo, Mark Harman: Pareto efficient multi-objective test case selection. ISSTA, 140-150, 2007
5. Kiran Lakhotia, Mark Harman, Phil McMinn: A multi-objective approach to search-based test data generation. GECCO, 1098-1105, 2007

Some papers

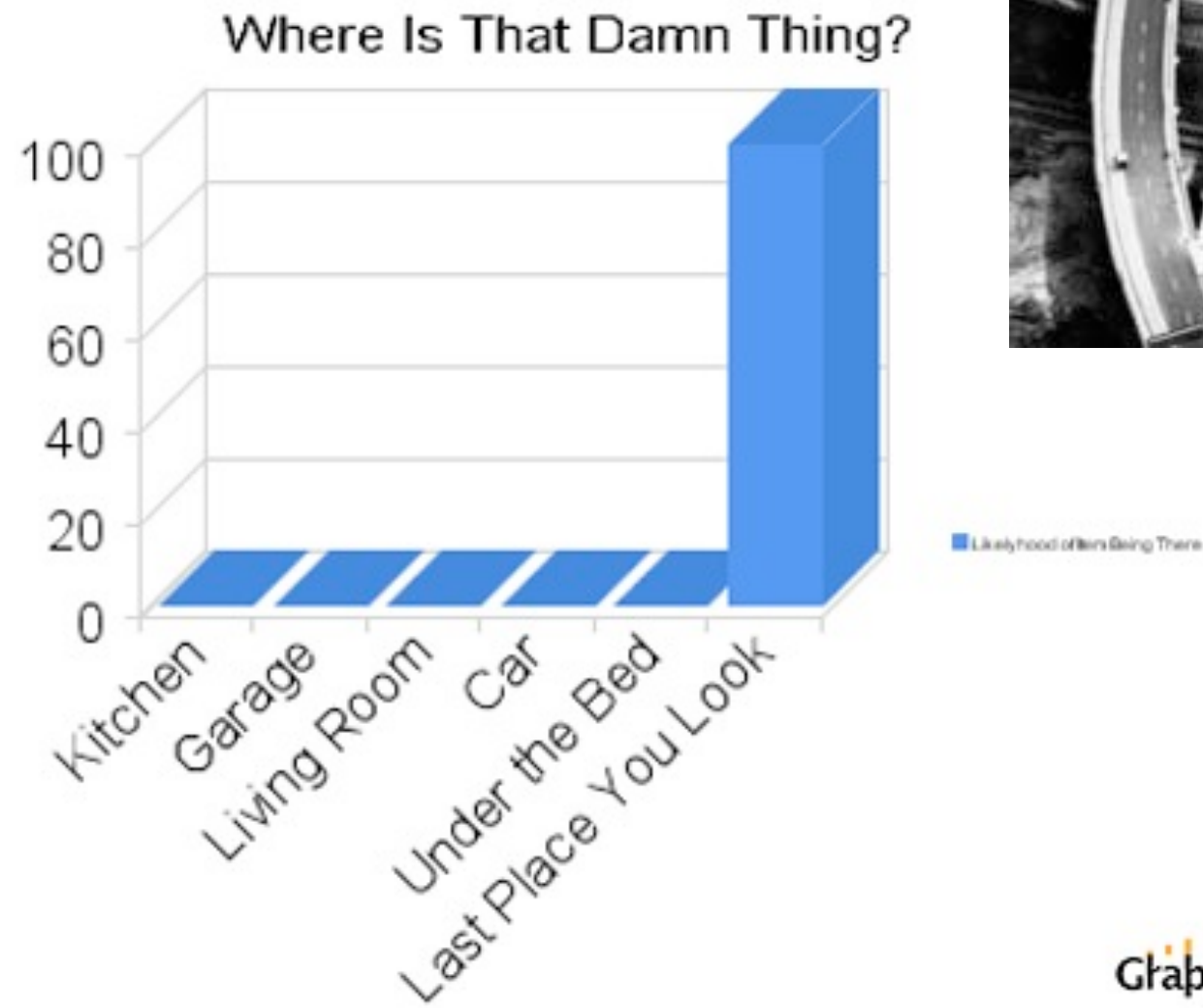
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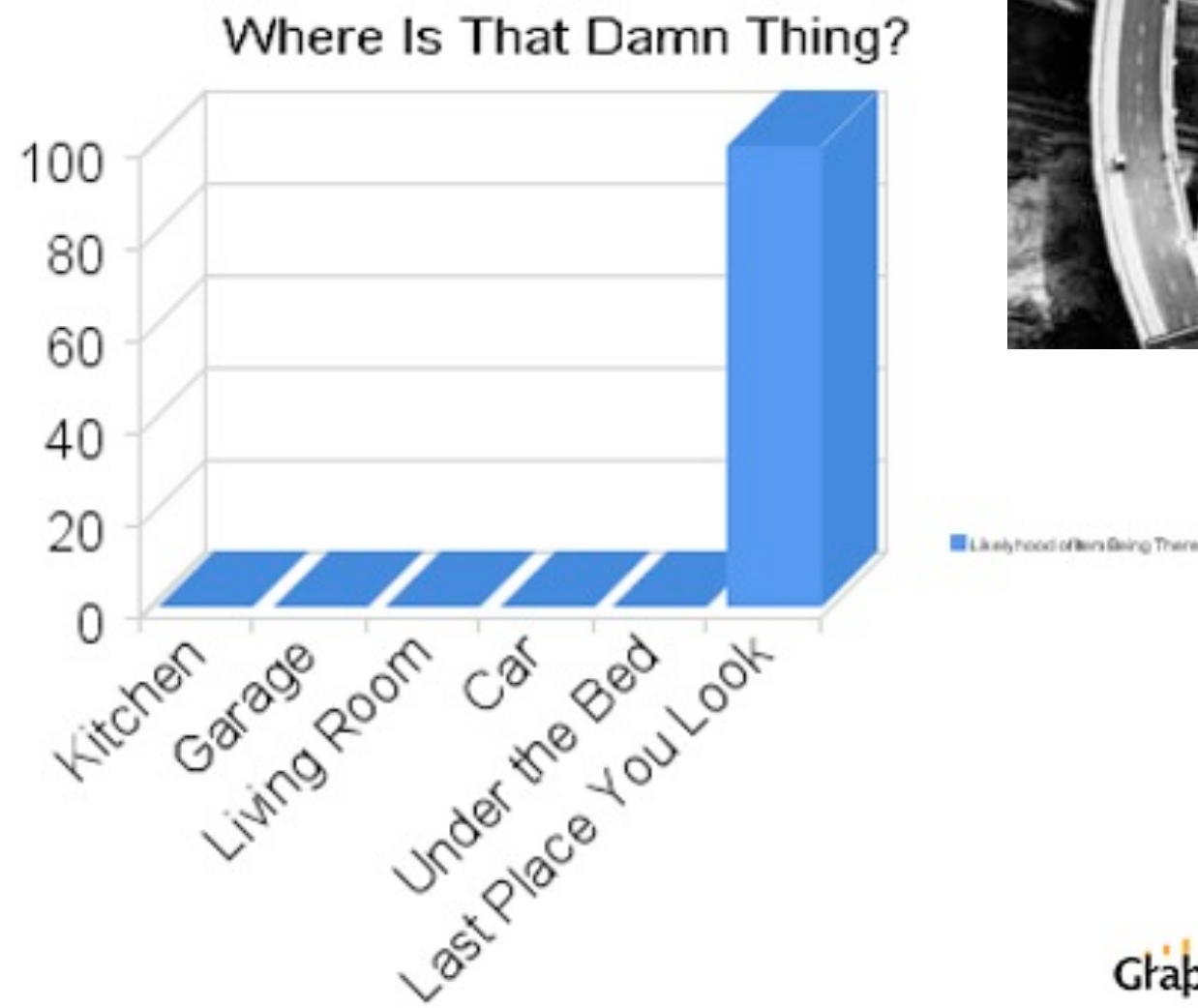
Several searchers following different paths



Several searchers following different paths



Several searchers
following different paths



multi beats single
at its own game

Transformation	Cooper, Ryan, Schielke, Subramanian, Fatiregun, Williams
Requirements	Bagnall, Mansouri, Zhang
Effort prediction	Aguilar-Ruiz, Burgess, Dolado, Lefley, Shepperd
Management	Alba, Antoniol, Chicano, Di Pentam Greer, Ruhe
Heap allocation	Cohen, Kooi, Srisa-an
Regression test	Li, Yoo, Elbaum, Rothermel, Walcott, Soffa, Kampfhamer
SOA	Canfora, Di Penta, Esposito, Villani
Refactoring	Antoniol, Briand, Cinneide, O'Keeffe, Merlo, Seng, Tratt
Test Generation	Alba, Binkley, Bottaci, Briand, Chicano, Clark, Cohen, Gutjahr, Harrold, Holcombe, Jones, Korel, Pargass, Reformat, Roper, McMin, Michael, Sthamer, Tracy, Tonella, Xanthakis, Xiao, Wegener, Wilkins
Modularization	Antoniol, Lutz, Di Penta, Madhavi, Mancoridis, Mitchell, Swift
Model checking	Alba, Chicano, Godefroid
Probe dist'ion	Cohen, Elbaum
UIOs	Derderian, Guo, Hierons
Comprehension	Gold, Li, Mahdavi
Protocols	Alba, Clark, Jacob, Troya
Component sel	Baker, Skaliotis, Steinhofel, Yoo
Agent Oriented	Haas, Peysakhov, Sinclair, Shami, Mancoridis

Transformation	Cooper, Ryan, Schielke, Subramanian, Fatiregun, Williams
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Probe dist'ion	Cohen, Elbaum
UIOs	Derderian, Guo, Hierons
Comprehension	Gold, Li, Mahdavi
Protocols	Alba, Clark, Jacob, Troya
Component sel	Baker, Skaliotis, Steinhofel, Yoo
Agent Oriented	Haas, Peysakhov, Sinclair, Shami, Mancoridis

Why Search Based Software Engineering

Why Search Based Software Engineering



Why Search Based Software Engineering



***La trahison des images* 1929**

René Magritte, 1898–1967

*“The famous pipe. How people reproached me for it!
And yet, could you stuff my pipe?
No, it's just a representation, is it not?
So if I had written on my picture 'This is a pipe,'
I'd have been lying!”*

Quoted in: Harry Torczyner. *Magritte: Ideas and Images*. Alcuin Books.

*“The famous pipe. How people reproached me for it!
And yet, could you stuff my pipe?
No, it's just a **representation**, is it not?
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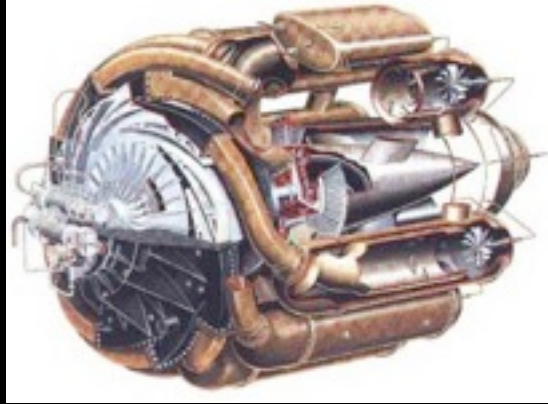
Quoted in: Harry Torczyner. *Magritte: Ideas and Images*. Alcuin Books.

*“The famous pipe. How people reproached me for it!
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No, it's just a **representation**, is it not?
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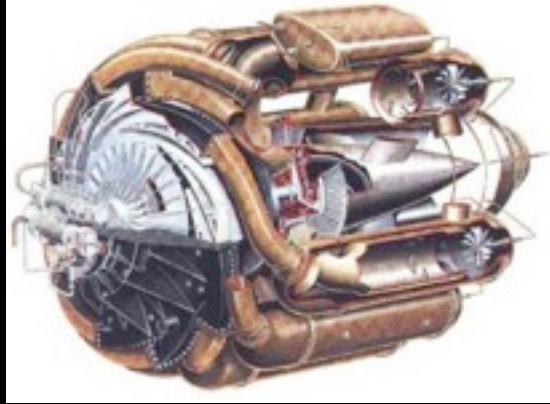
Quoted in: Harry Torczyner. *Magritte: Ideas and Images*. Alcuin Books.

Traditional Engineering Artifact

Traditional Engineering Artifact

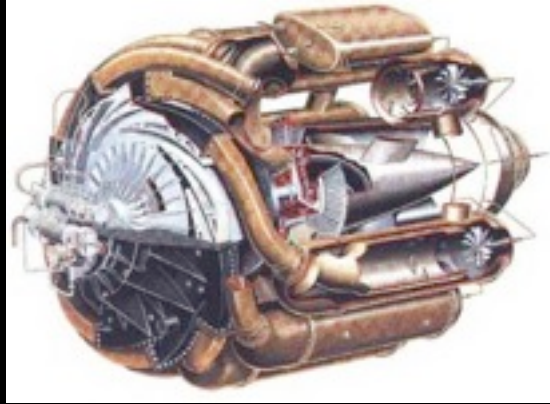


Traditional Engineering Artifact



Optimization goal

Traditional Engineering Artifact



Optimization goal

Maximize compression

Traditional Engineering Artifact

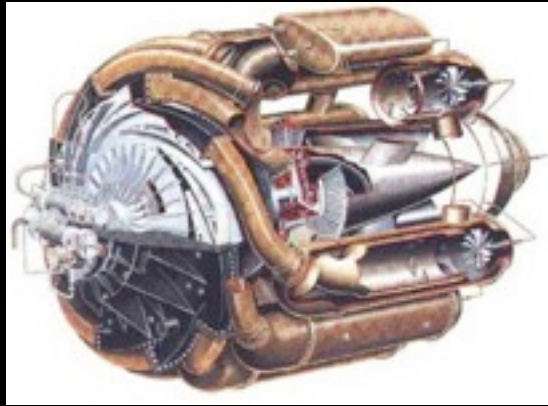


Optimization goal

Maximize compression

Minimize fuel consumption

Traditional
Engineering Artifact

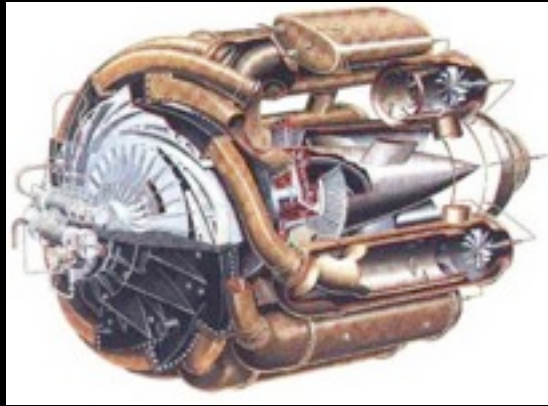


Optimization
goal

Maximize compression
Minimize fuel consumption

Fitness computed
on a representation

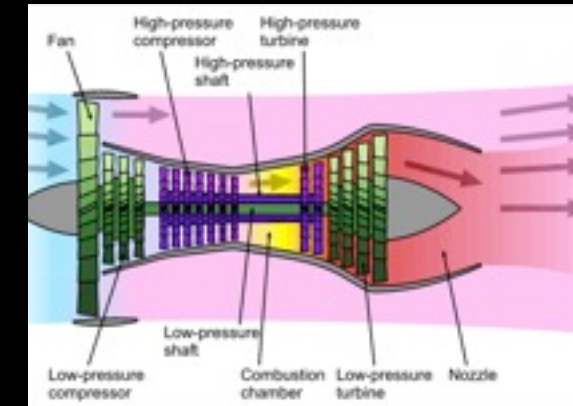
Traditional Engineering Artifact



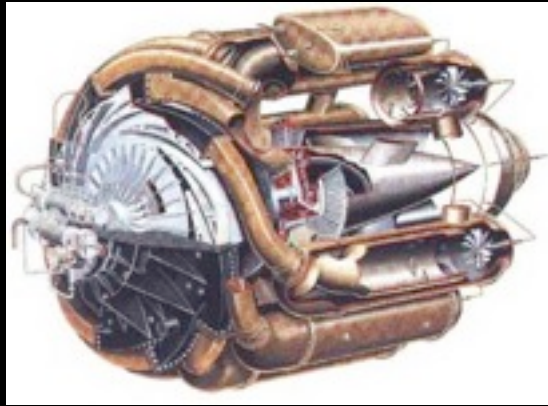
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Minimize fuel consumption

Fitness computed on a representation



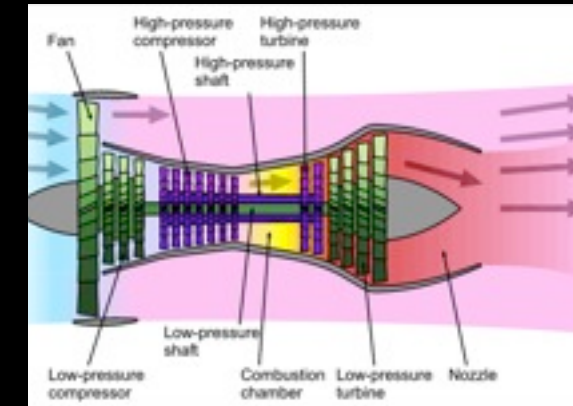
Traditional Engineering Artifact



Optimization goal

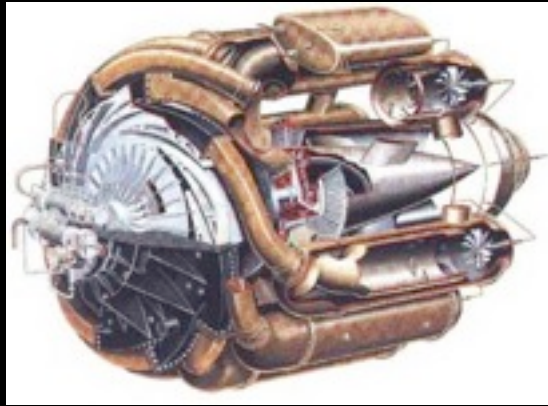
Maximize compression
Minimize fuel consumption

Fitness computed on a representation



Software Engineering Artifact

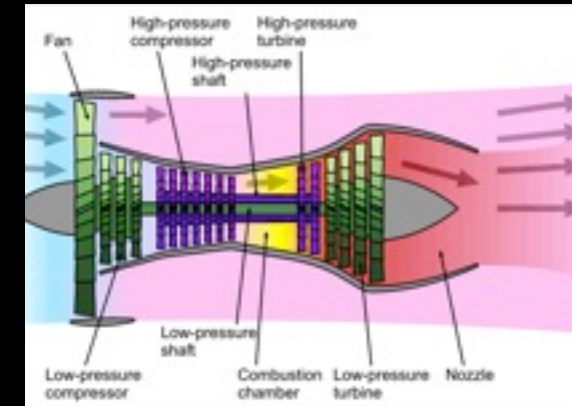
Traditional Engineering Artifact



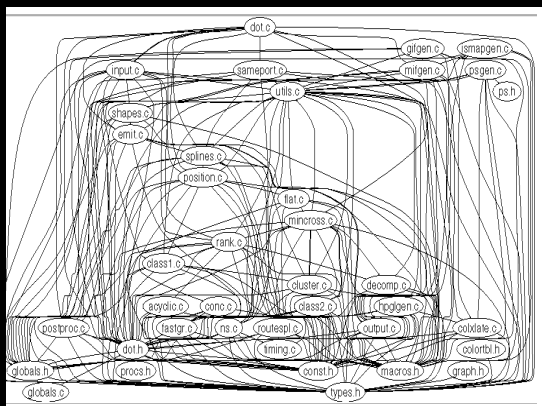
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



Software Engineering Artifact



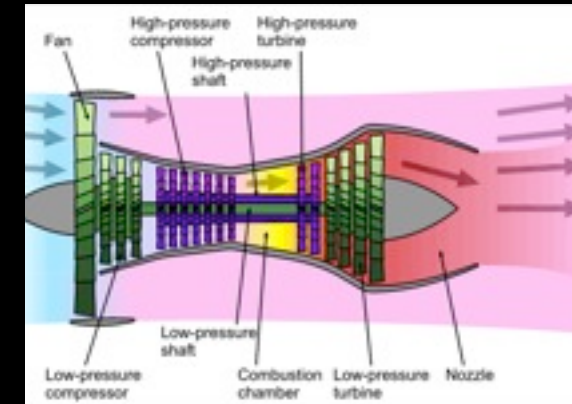
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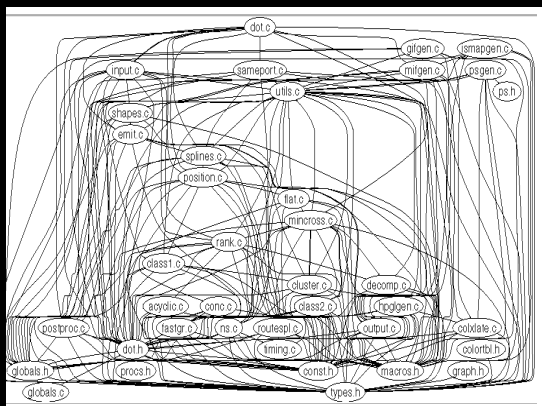
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



Software Engineering Artifact



Optimization goal

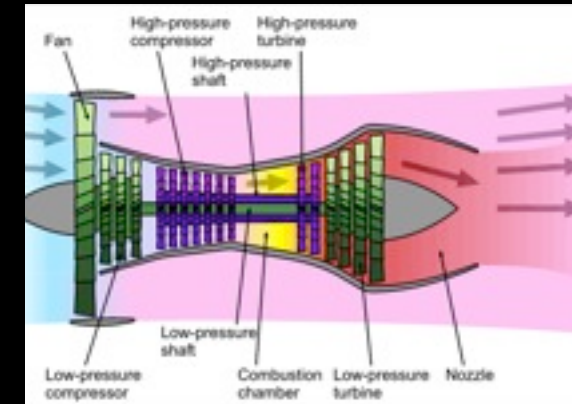
Traditional Engineering Artifact



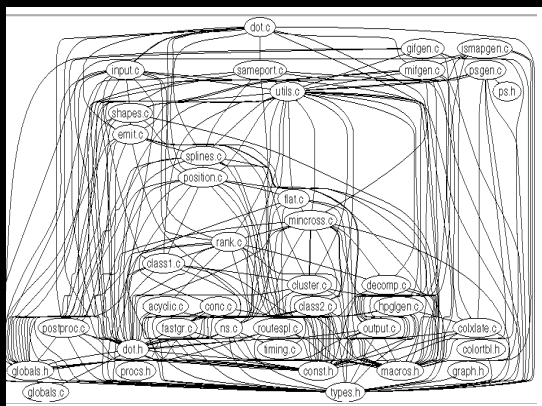
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



Software Engineering Artifact



Optimization goal

Maximize cohesion

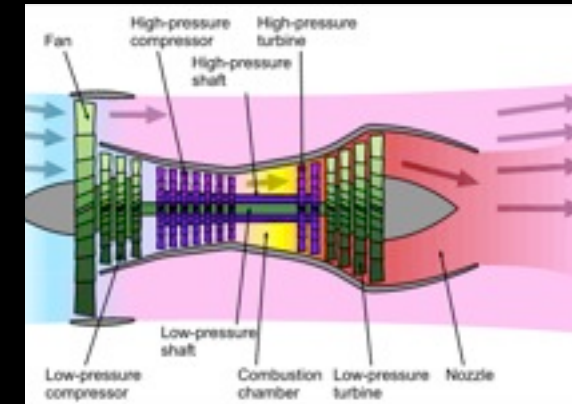
Traditional Engineering Artifact



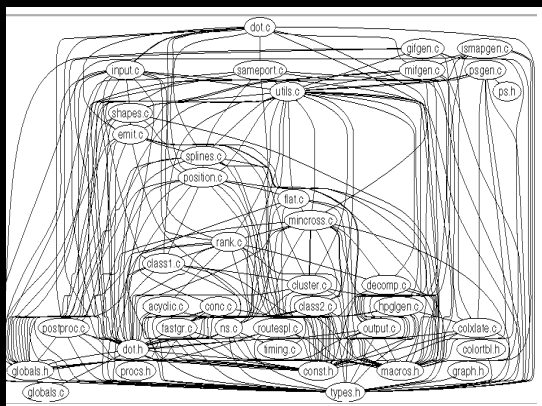
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



Software Engineering Artifact



Optimization goal

Maximize cohesion
Minimize coupling

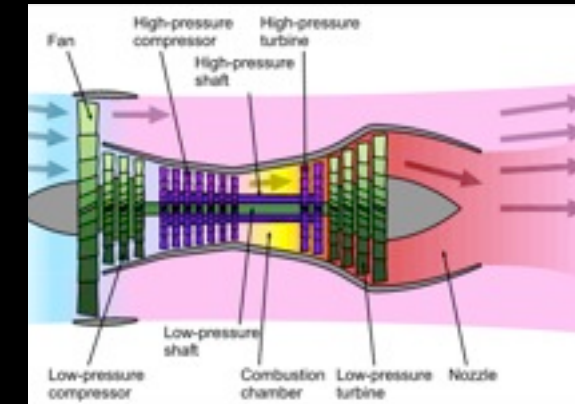
Traditional Engineering Artifact



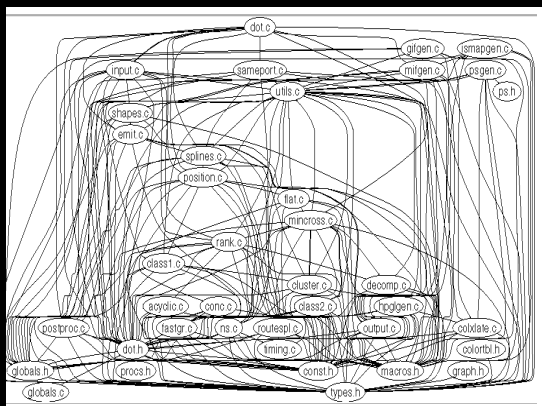
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



Software Engineering Artifact

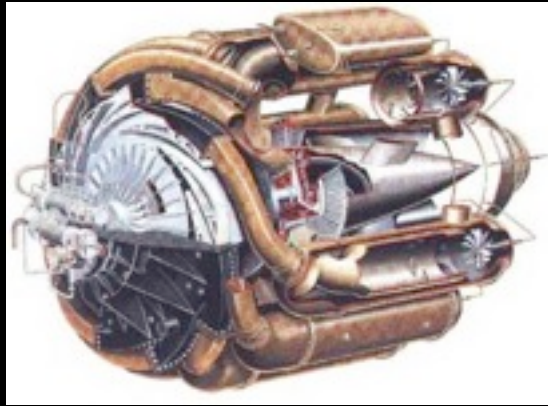


Optimization goal

Maximize cohesion
Minimize coupling

Fitness computed Directly

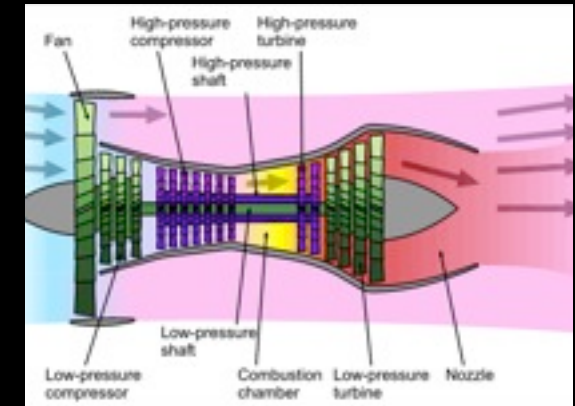
Traditional Engineering Artifact



Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation

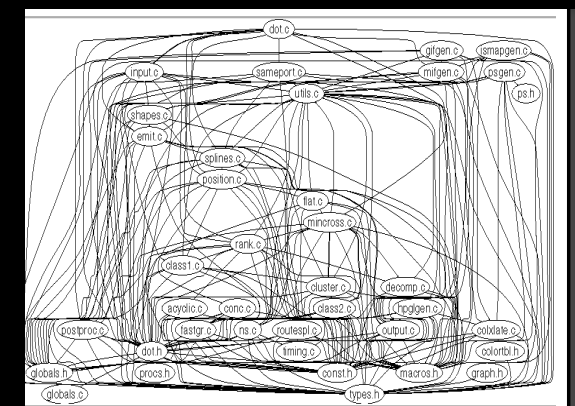


Software Engineering Artifact

Optimization goal

Maximize cohesion
Minimize coupling

Fitness computed Directly



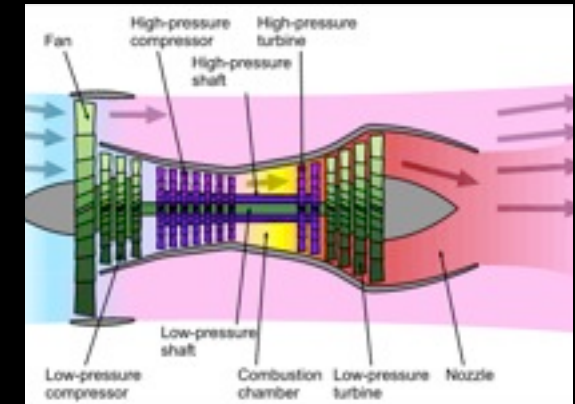
Traditional Engineering Artifact



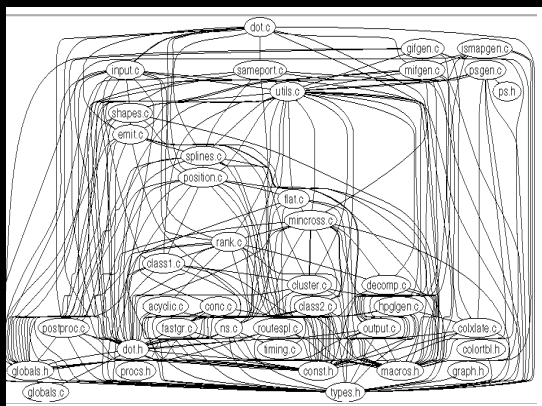
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



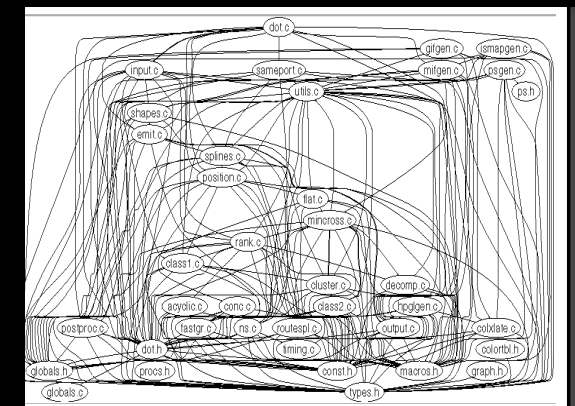
Software Engineering Artifact



Optimization goal

Maximize cohesion
Minimize coupling

Fitness computed Directly



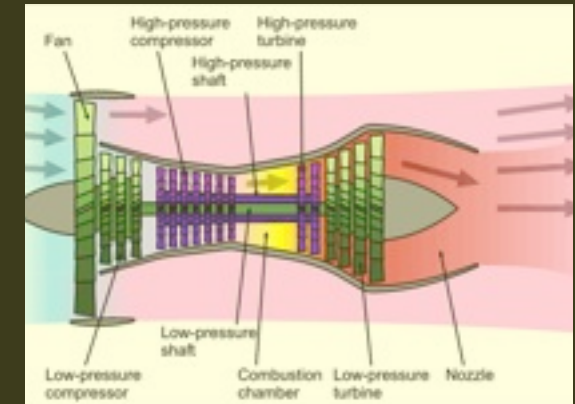
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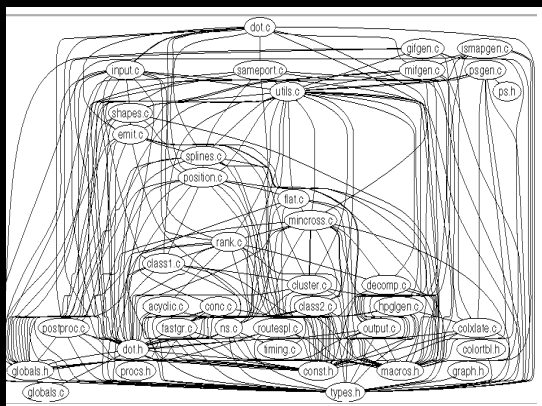
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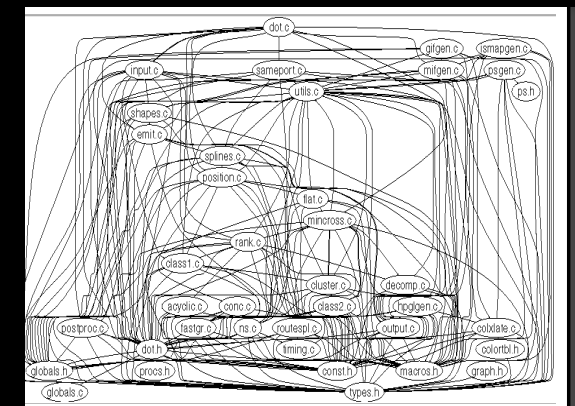
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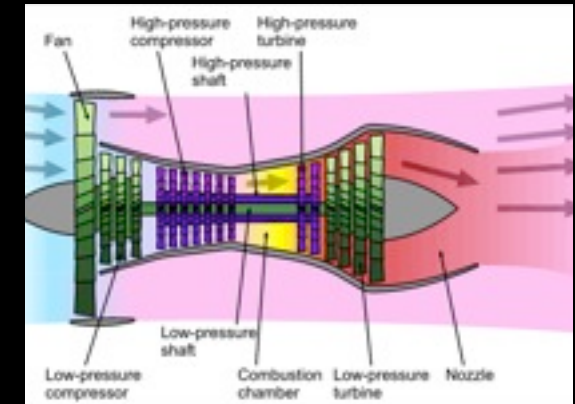
Traditional Engineering Artifact



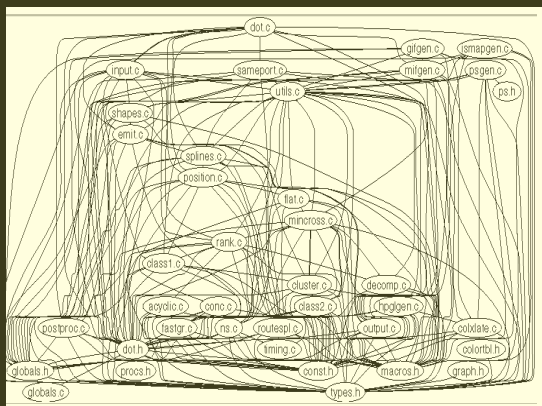
Optimization goal

Maximize compression
Minimize fuel consumption

Fitness computed on a representation



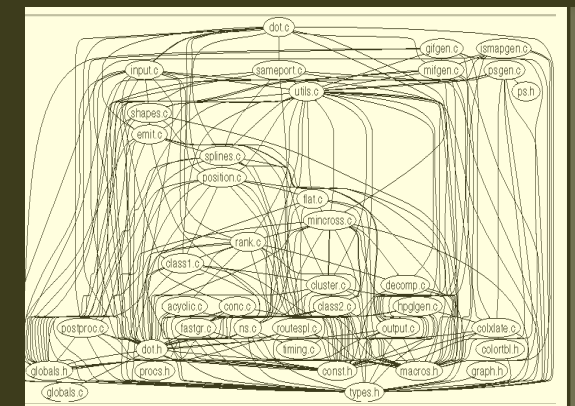
Software Engineering Artifact



Optimization goal

Maximize cohesion
Minimize coupling

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Papers on Info-Theory SBSE

1. Rudi Lutz: Evolving Good Hierarchical Decompositions of Complex Systems. Journal of Systems Architecture, Vol. 47(7), pp. 613-634, 2001.
2. Robert Feldt, Richard Torkar, Tony Gorschek & Wasif Afzal: Searching for Cognitively Diverse Tests: Test Variability and Test Diversity Metrics. Proceedings of 1st International Workshop on Search-Based Software Testing (SBST) in conjunction with ICST 2008, pp. 178-186, Lillehammer Norway. Best paper award winner

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Conclusion

Search is what you seek

www.sebase.org

Mark Harman: The current state and future of SBSE
ICSE 2007 Future of Software Engineering paper.

Overviews and Survey Paper

1. Mark Harman, Bryan Jones: Search-based software engineering. *Information & Software Technology* 43(14): 833-839, 2001
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Conclusion

www.sebase.org

repository of papers

extra slides ...

sensitivity analysis ...

Sensitivity analysis

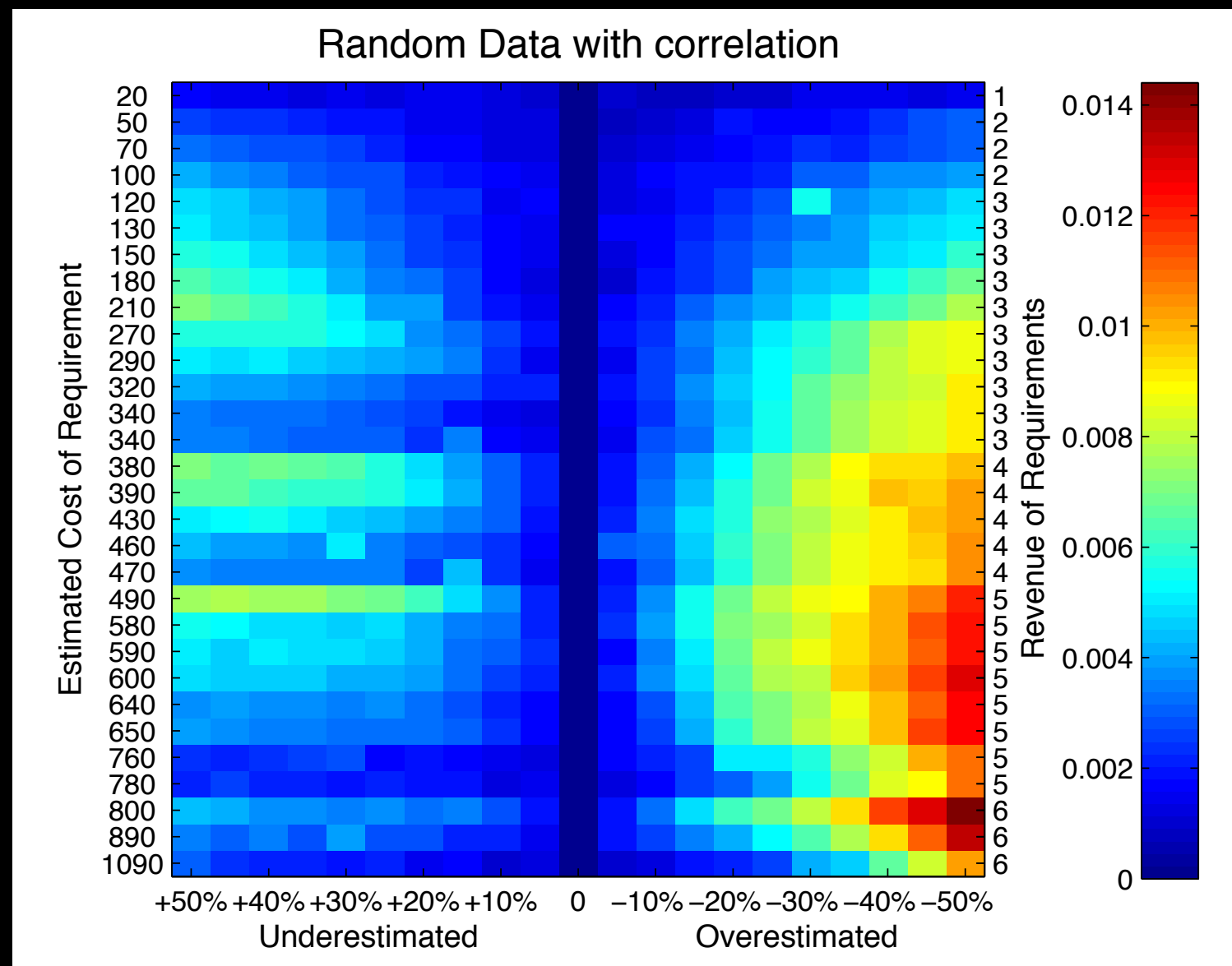
Inputs to search are typically estimates

Estimated Software Engineering attributes

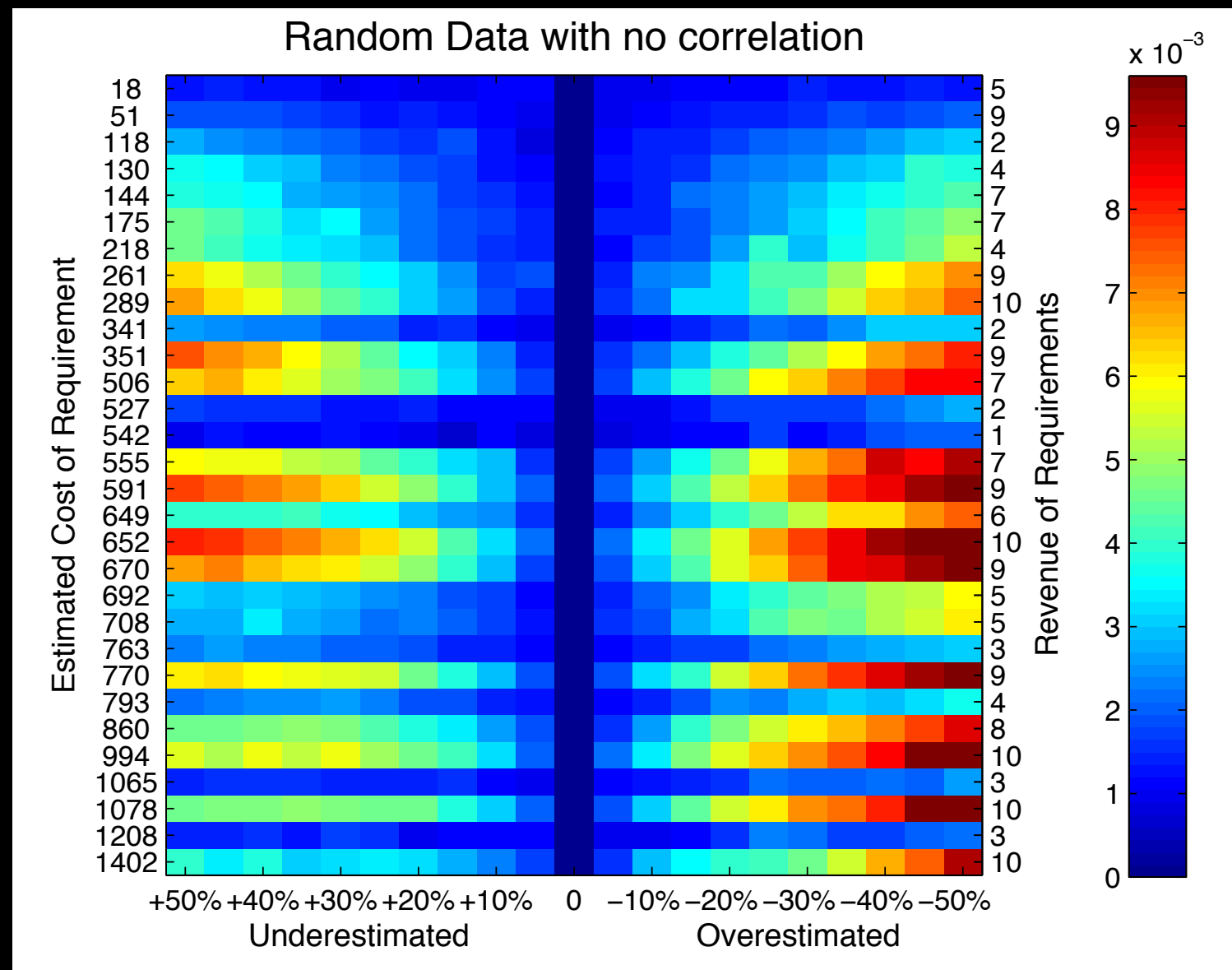
Which estimates matter most?

Applied to component selection ...

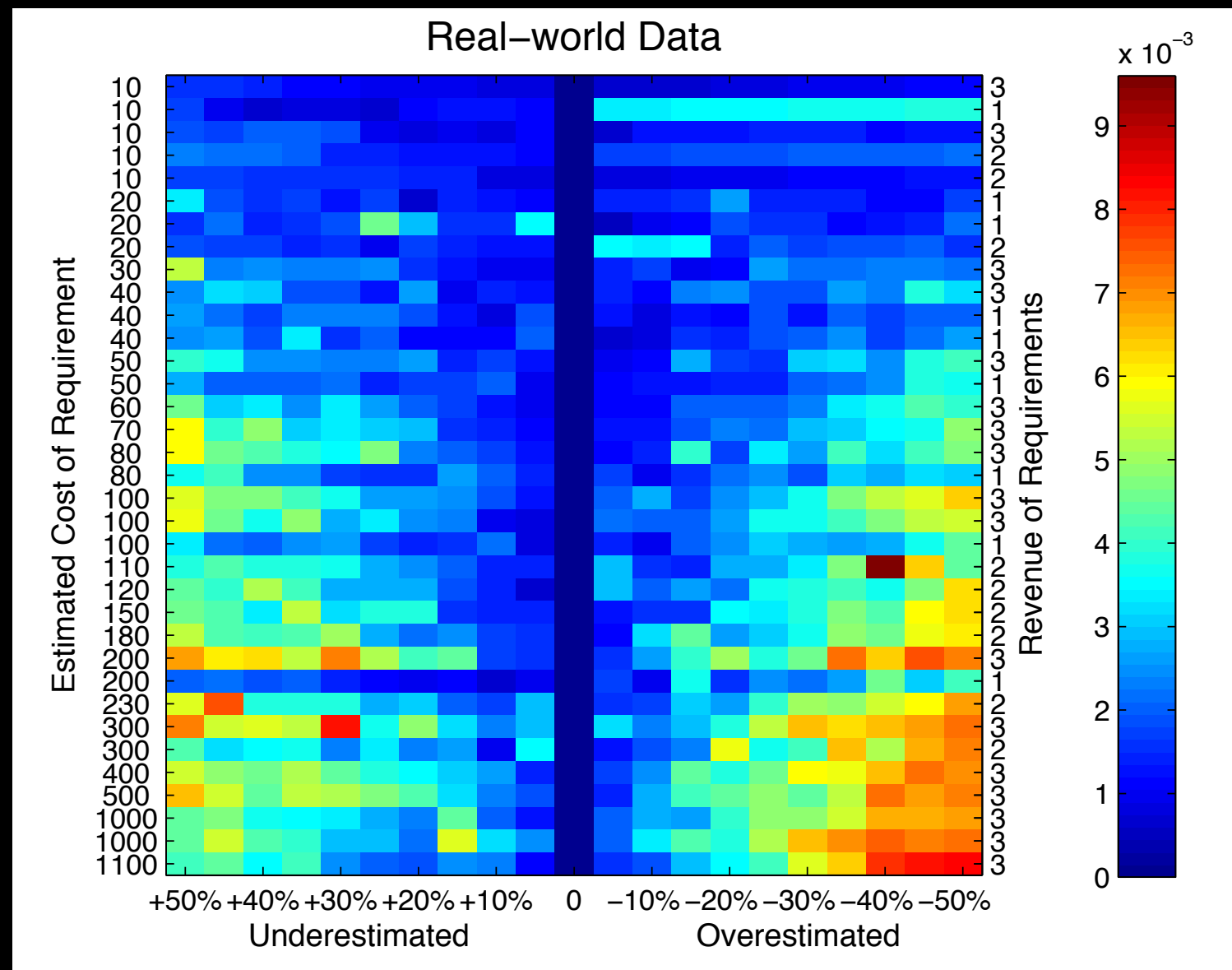
Motorola Cell Phone Requirements



Motorola Cell Phone Requirements



Motorola Cell Phone Requirements



for mutation testers

Co Evolution

Two populations; Two fitness functions

Collaboration, and competition

Co Evolution

Two populations; Two fitness functions

Collaboration, and competition

We have applied this to mutation testing ...


```
Main(){  
  ...  
  c = a + b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a + b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a - b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a + b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a - b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a && b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a + b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a - b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a && b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a * b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a + b ;  
}
```

```
Main(){  
  ...  
  c = a - b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a && b ;  
  ...  
}
```

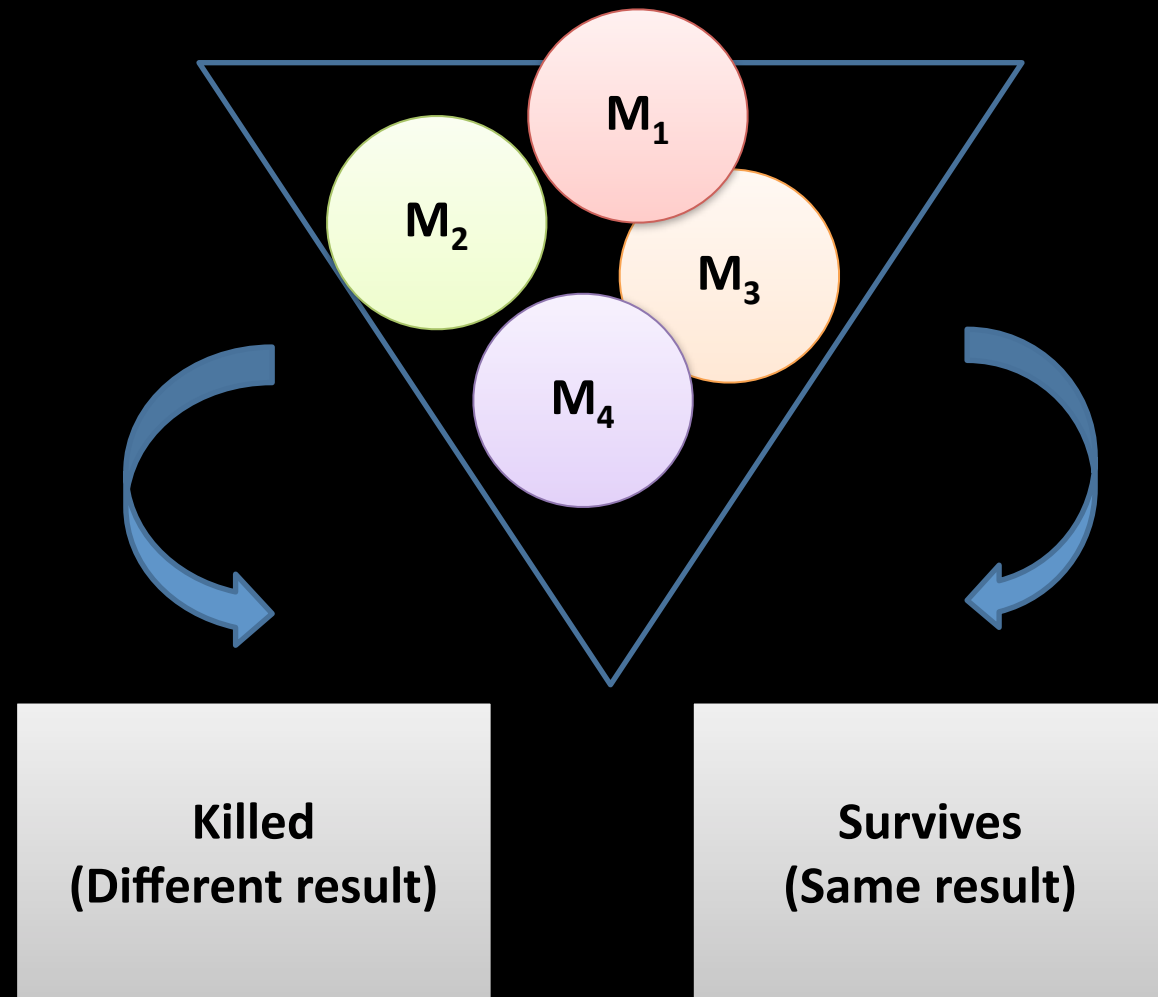
```
...  
c = a * b ;  
...  
}
```

```
Main(){  
  ...  
  c = a + b ;  
}
```

```
Main(){  
  ...  
  c = a - b ;  
  ...  
}
```

```
Main(){  
  ...  
  c = a && b ;  
  ...  
}
```

```
...  
c = a * b ;  
...  
}
```



Equivalent mutant

Equivalent mutant

```
Main() {  
  ...  
  c = a + b ;  
  ...  
}
```


Equivalent mutant

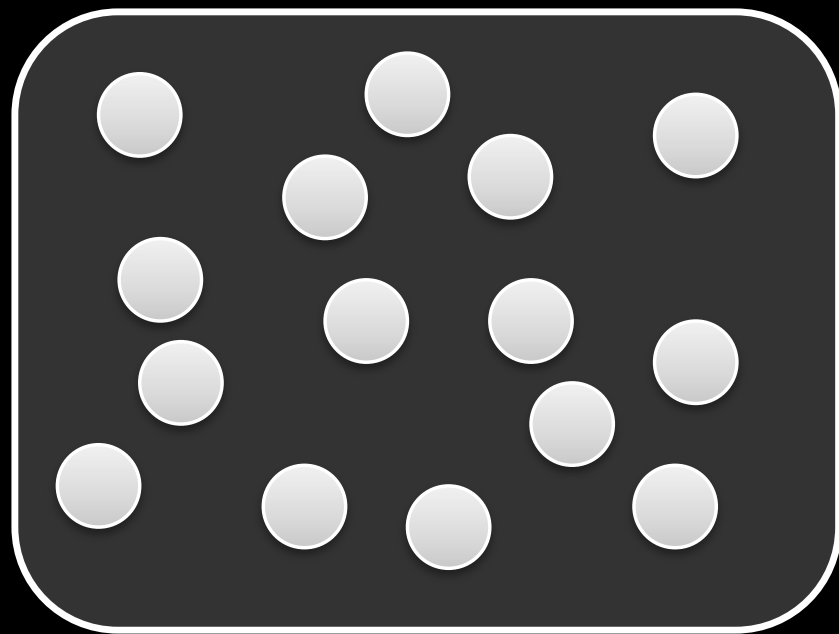
```
Main() {  
  ...  
  c = a + b ;  
  ...  
}
```



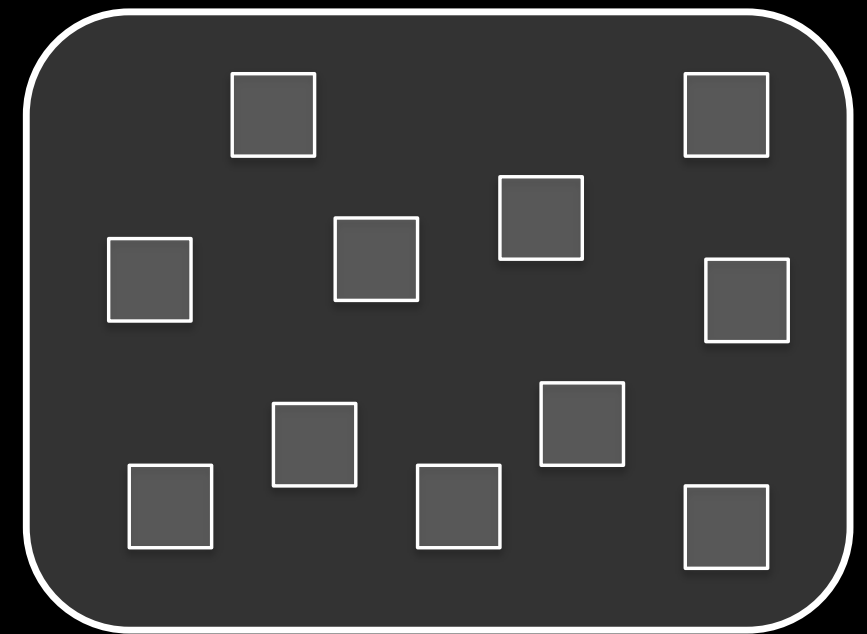
Equivalent mutant



Equivalent mutant

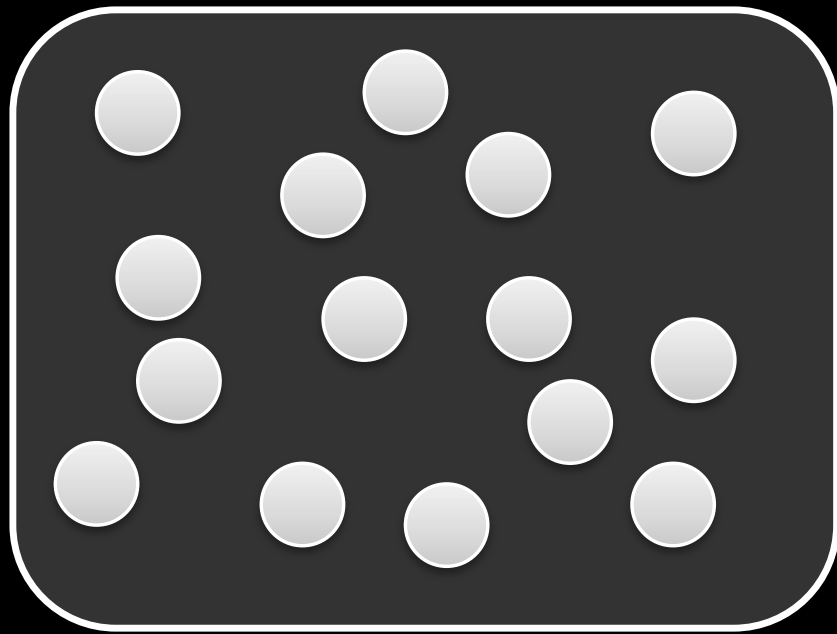


Mutants

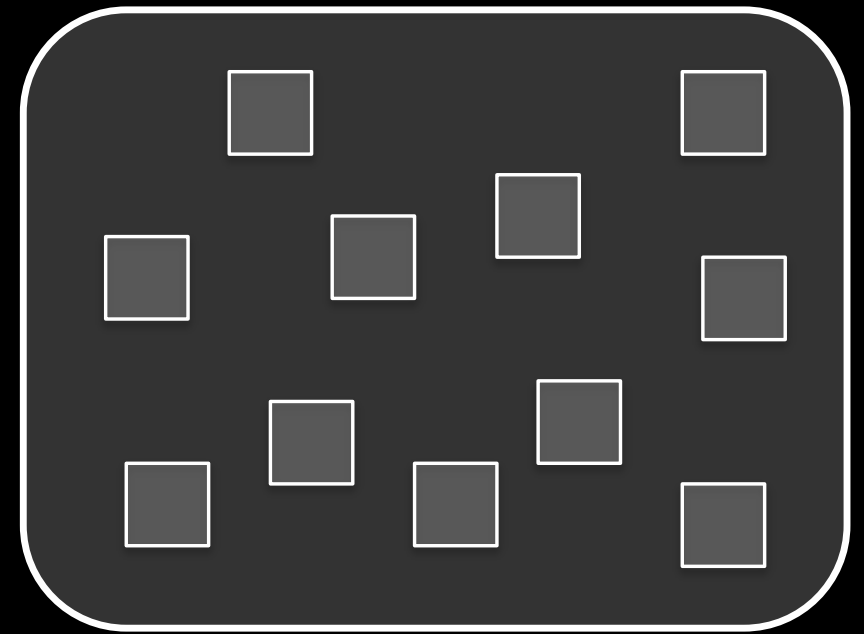


Test set

Fitness?

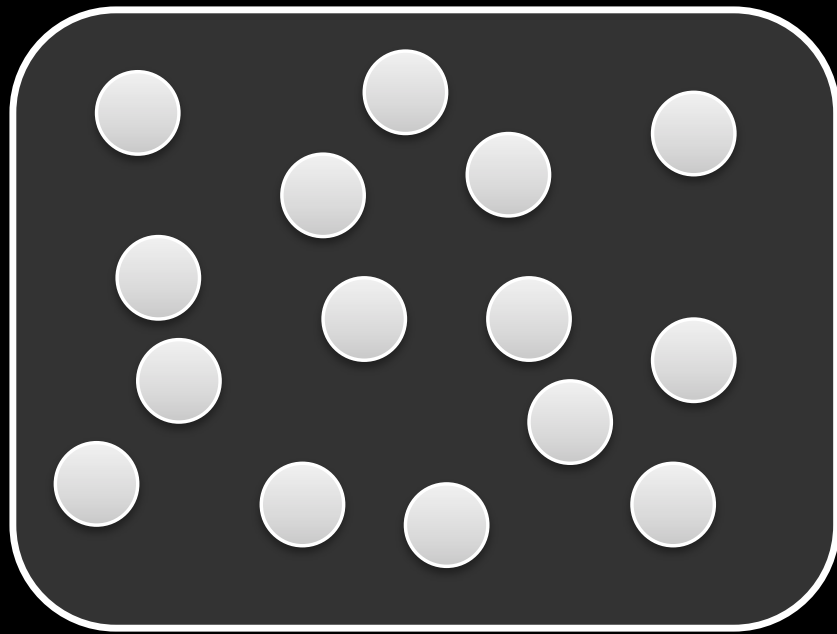


Mutants

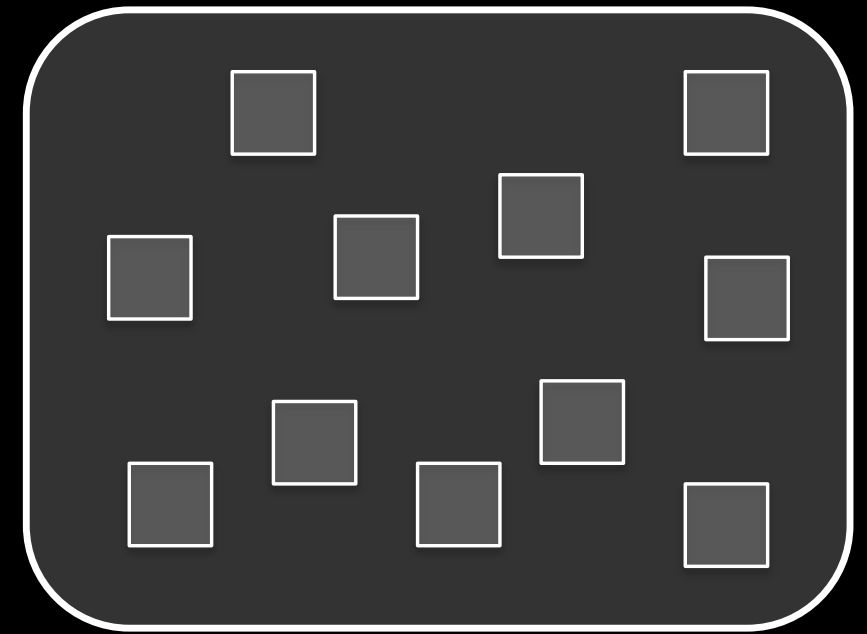


Test set

Fitness for test cases

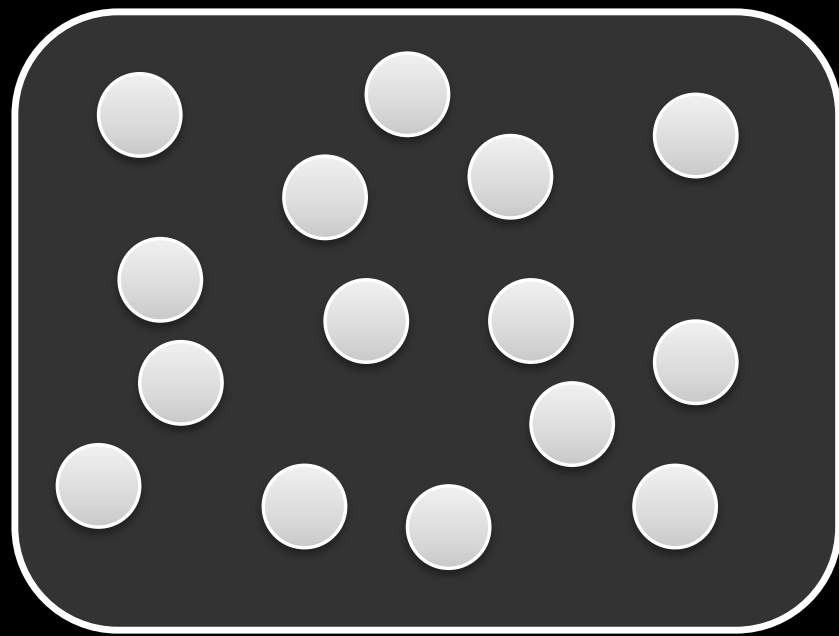


Mutants



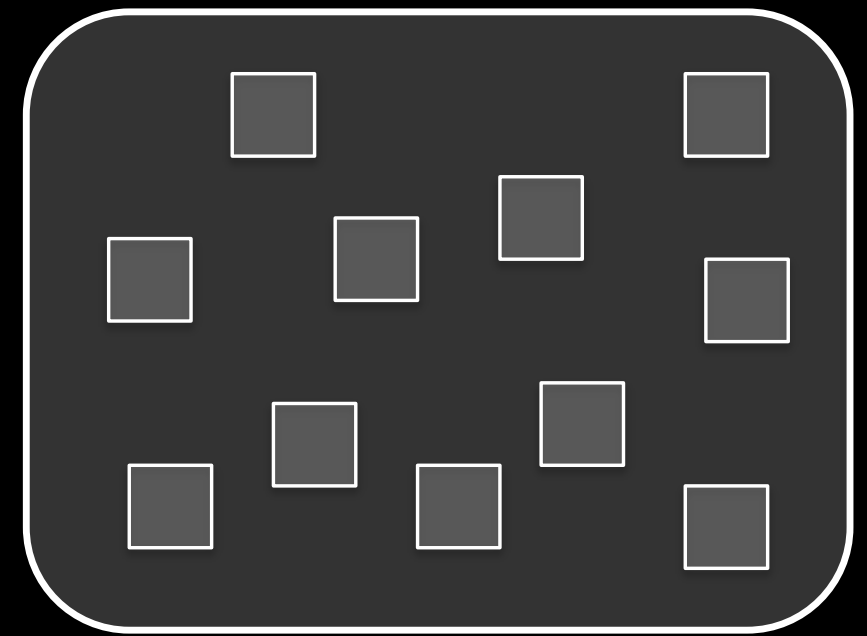
Test set

Fitness for test cases



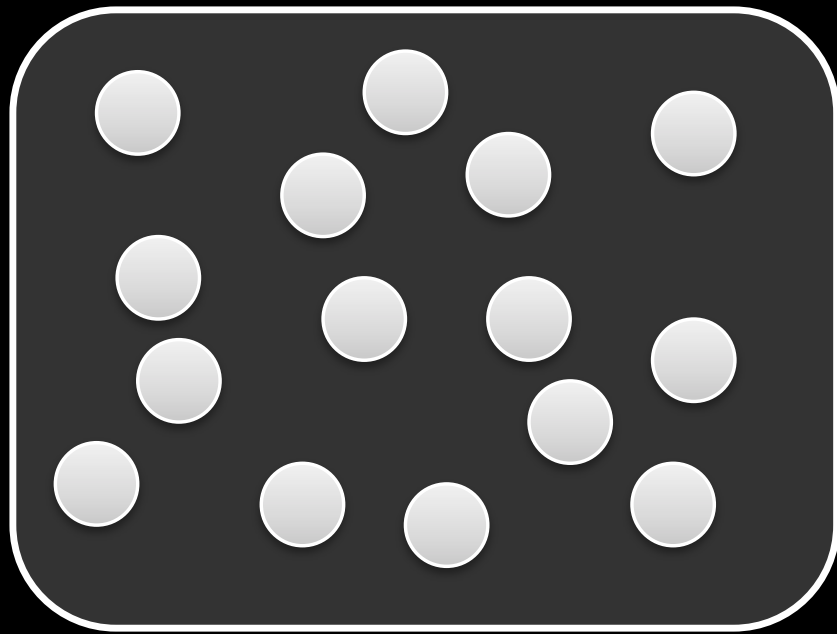
Mutants

How many mutants
do you kill?

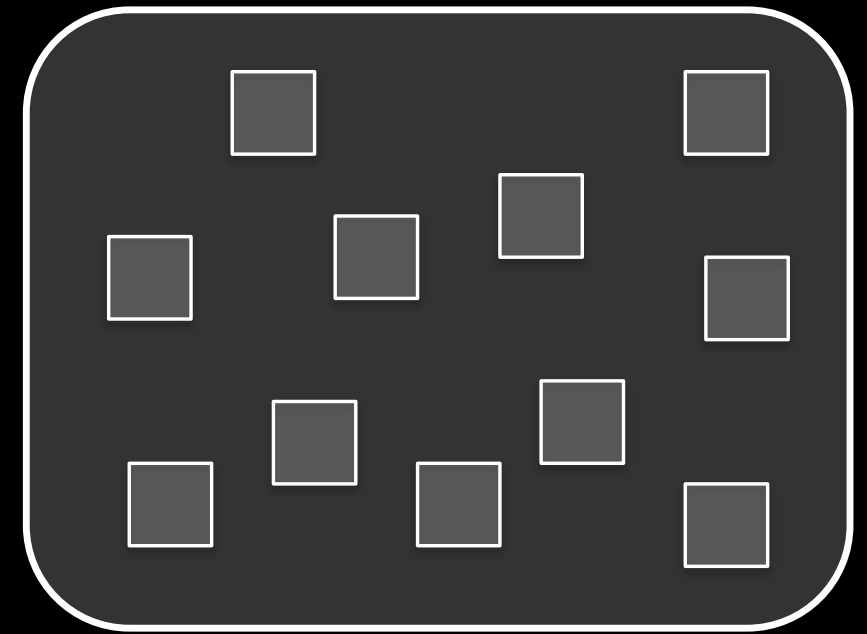


Test set

Fitness for mutants

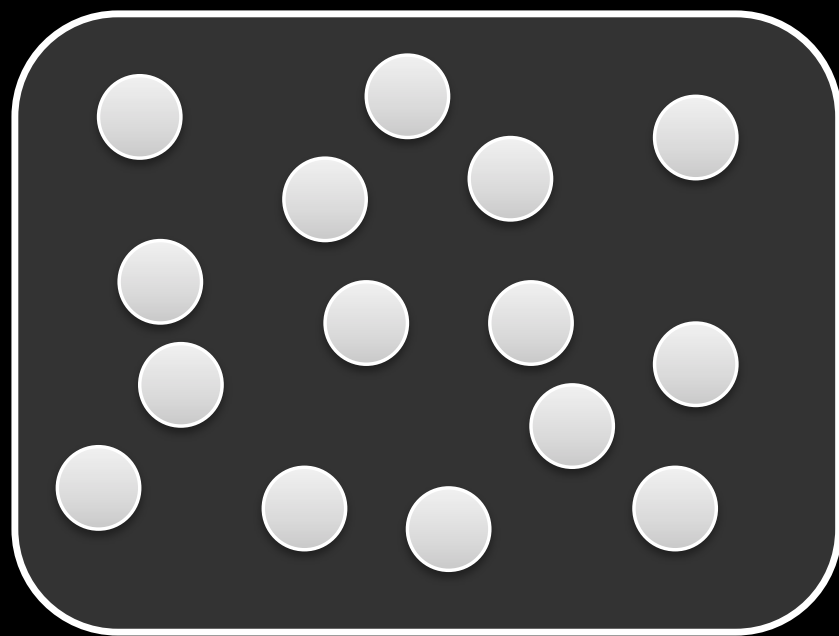


Mutants



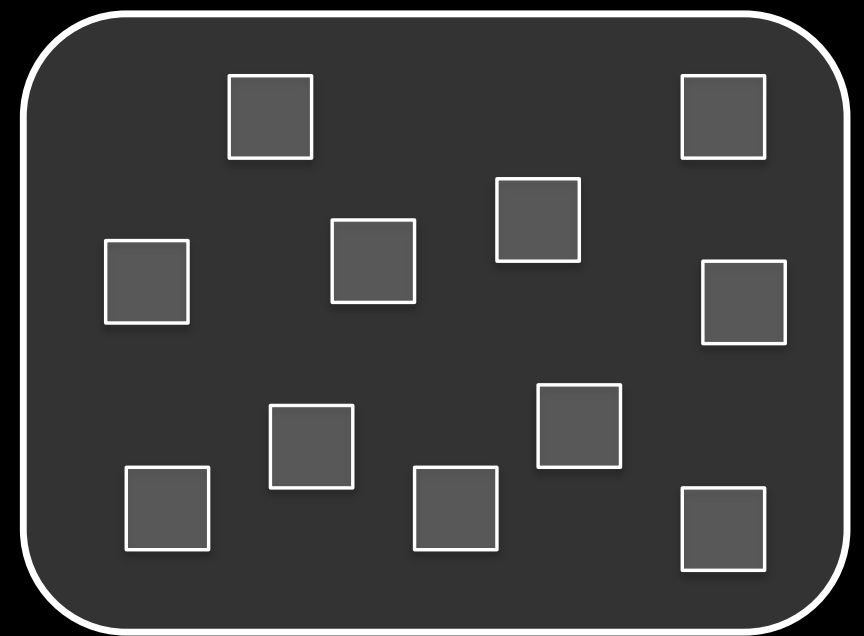
Test set

Fitness for mutants



Mutants

How many test cases
do you survive?



Test set

for HCI, comprehension,
psychologists

Possibilities

Let's allow ourselves to think wide and wild

With SBSE we are only bounded by imagination

Possibilities

Let's allow ourselves to think wide and wild

With SBSE we are only bounded by **imagination**

Co Evolution

Two populations; Two fitness functions

Collaboration, and competition

Could it be applied to cognitive modelling...

Cognitive Model



Cognitive Model



Performance
←
at finding information



Cognitive Model



Cognitive Model



Performance
at hiding information



SBSE for HCI?

Co Evolve cognitive models

Evolve architectures

Evolve interfaces

SBSE for HCI?

Co Evolve cognitive models

Evolve architectures

Evolve interfaces

Architecture



Which architecture is best?

Multiple developers = multiple objectives

Explore space of developer dissonance

Can apply to any shared endeavour

SBSE for HCI?

Co Evolve cognitive models

Evolve architectures

Evolve interfaces

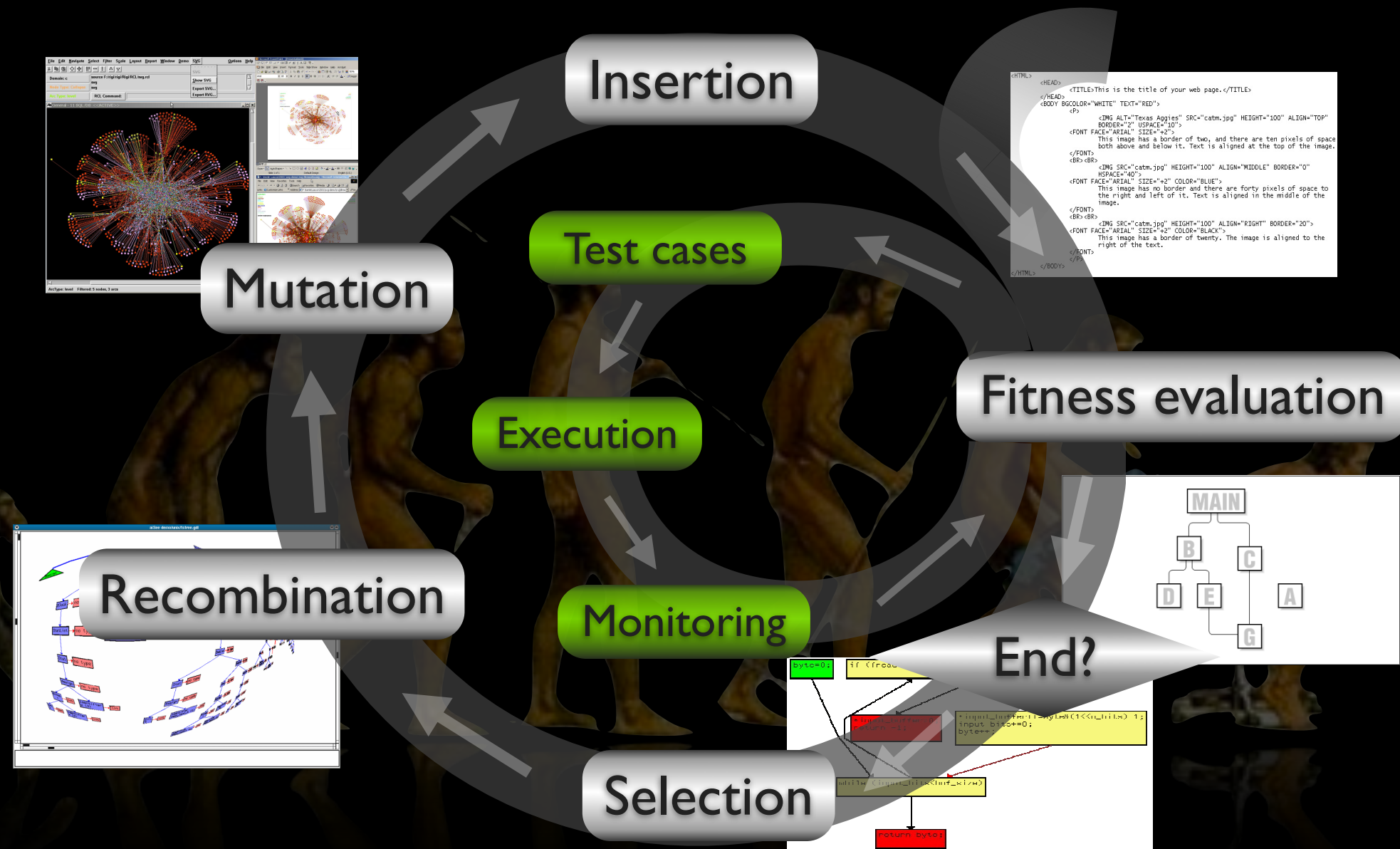
SBSE for HCI?

Co Evolve cognitive models

Evolve architectures

Evolve interfaces

Evolution of interfaces



for formalists and testers

Scientists' and Engineers' viewpoints

Scientists' and Engineers' viewpoints

Scientist:

Scientists' and Engineers' viewpoints

Scientist:

what is true

Scientists' and Engineers' viewpoints

Scientist:

what is true
correctness

Scientists' and Engineers' viewpoints

Scientist:

what is true

correctness

model the world

Scientists' and Engineers' viewpoints

Scientist:

what is true
correctness
model the world
to understand

Scientists' and Engineers' viewpoints

Scientist:

what is true
correctness
model the world
to understand

Engineer:

Scientists' and Engineers' viewpoints

Scientist:

what is true
correctness
model the world
to understand

Engineer:

what is possible

Scientists' and Engineers' viewpoints

Scientist:

what is **true**
correctness
model the world
to **understand**

Engineer:

what is **possible**
within **tolerance**

Scientists' and Engineers' viewpoints

Scientist:

what is **true**
correctness
model the world
to **understand**

Engineer:

what is **possible**
within **tolerance**
model the world

Scientists' and Engineers' viewpoints

Scientist:

what is **true**
correctness
model the world
to **understand**

Engineer:

what is **possible**
within **tolerance**
model the world
to **manipulate**

Scientists' and Engineers' viewpoints

Computer Scientist:

what is true
about computation

prove correctness
make it perfect

Software Engineer:

what is possible
with software

test for imperfection
find where to improve

Combining Science and Engineering

prove correctness
make it perfect

test for imperfection
find where to improve

Combining Science and Engineering

prove correctness
make it perfect

test for imperfection
find where to improve

Combining Science and Engineering

prove correctness
make it perfect

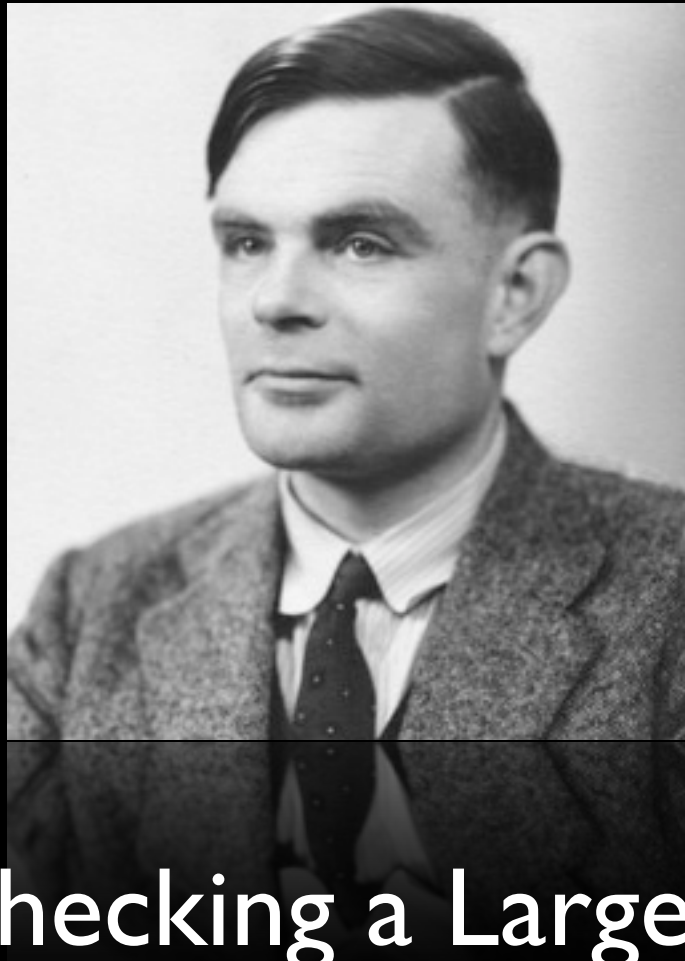
where possible ...
... and where impossible ...

test for imperfection
find where to improve

Alan Turing? First tester?

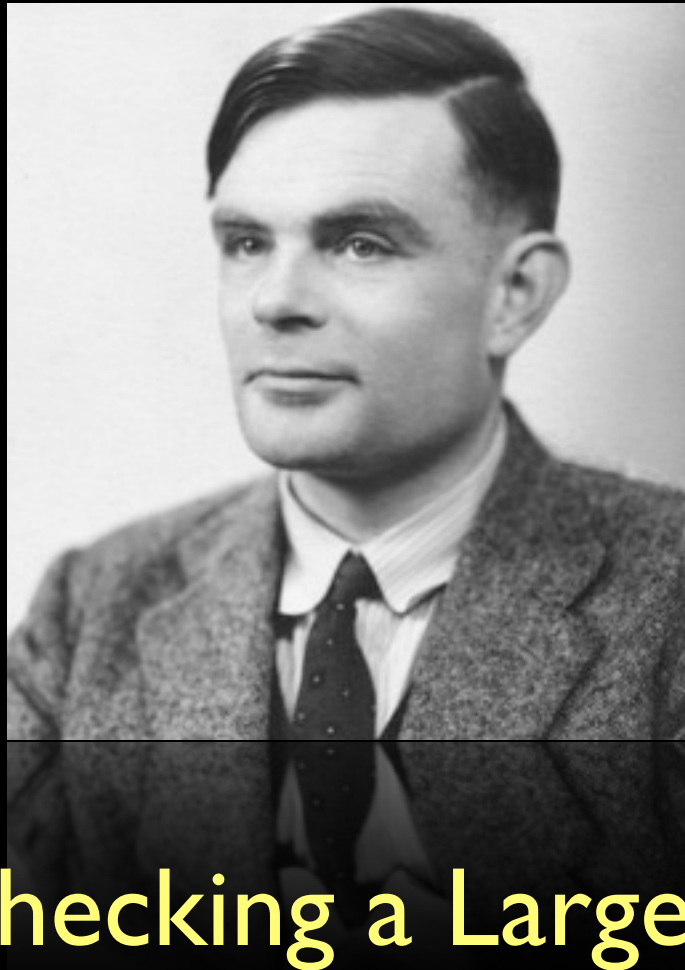


Alan Turing? First tester?



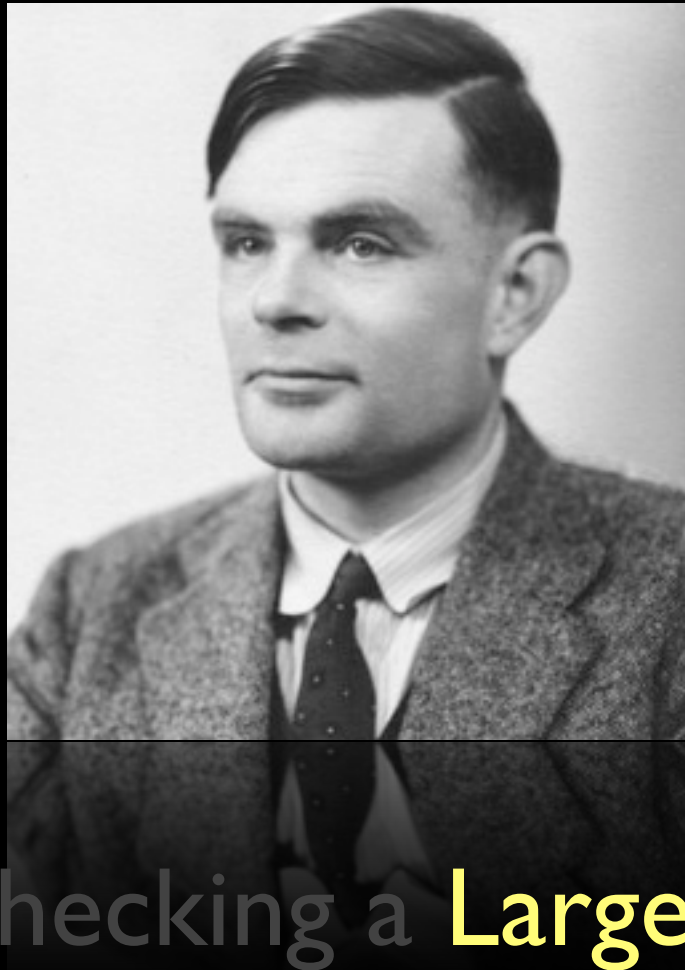
Alan M. Turing: Checking a Large Routine
Report of a Conference on High Speed Automatic
Calculation Machines pp67-69, 1949

Alan Turing? First tester?



Alan M. Turing: **Checking a Large Routine**
Report of a Conference on High Speed Automatic
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Alan Turing? First tester?



Alan M. Turing: Checking a **Large Routine ?**
Report of a Conference on High Speed Automatic
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Ugh was the world's first tester

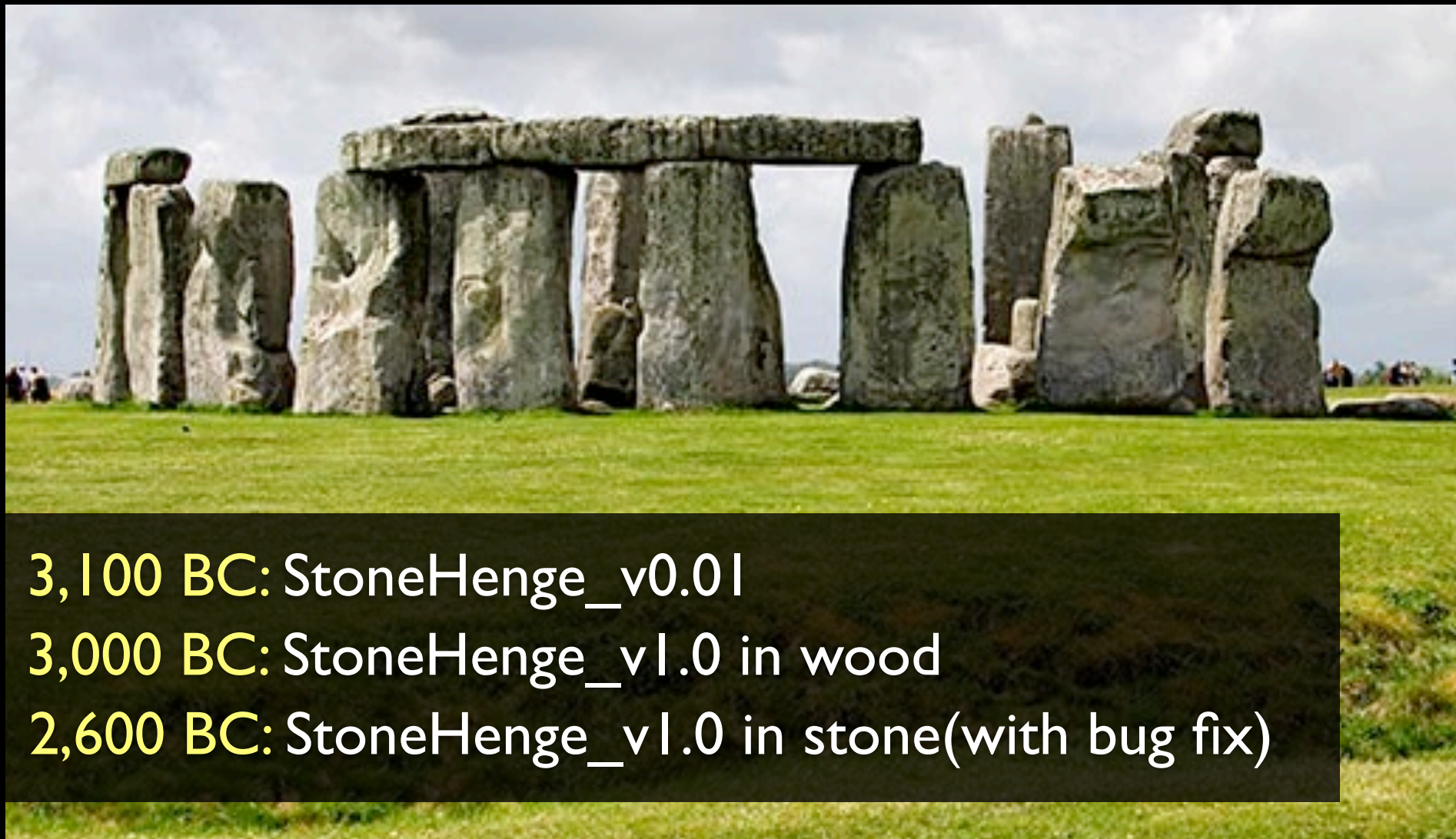


Ugh was the first system tester in 2,600 BC

Stonehenge: first computer?



Stonehenge: first computer?



3,100 BC: StoneHenge_v0.01

3,000 BC: StoneHenge_v1.0 in wood

2,600 BC: StoneHenge_v1.0 in stone(with bug fix)

Stonehenge: first computer?



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