

The "Terrapin" algorithm

Fully optimal scheduling, obeying constraints

Seminar 1 (of 2): Non-parallel scheduling





17th April 2020



Design context for the algorithm



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17° April 2020

Motivation







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The master timing system

- CERN's master timing system uses quantised time periods of 1.2 seconds
- This is to provide a common "beat" for synchronising accelerators
- Any beam will occupy a whole number of these "basic periods" in each accelerator.



Beams are made of "Tetris" style 2-D blocks



Lower-energy users



All users can only be furnished between injections to larger accelerators



The Supercycle

• The "Supercycle" is the beam schedule for the whole injector chain



- It is "cyclic":
 - Once finished, it immediately repeats
 - It has a finite length (defined the highest-priority users)
- You may be able to recognise some beams structures in there....!
 - But if not... it's not important for todays purposes.



Context Summary

The key points for understanding today's algorithm explanation are

- 1. The term "supercycle" is just the special name for the schedule we use
- 2. The supercycle is made of quantised time periods ("Basic periods")
- 3. The supercycle has a finite length
- 4. The supercycle repeats itself once it has completed



- There are many constraints on how beams can be follow each other.
- A supercycle which doesn't respect any constraints is simply not valid.
- Involved departments/users/operators have been polled extensively to collate the constraints required to satisfy our operations



Examples

Hardware constraints

- Magnet switching times
- Radiation limits of zones
- Power supply RMS currents

User constraints

- Stray-field avoidance between accelerators
- Always/never following certain beams (hysteresis avoidance)
- Experiment repetition rates (max, min or sometimes both!)
- Required number of instances of each beam (max or min)

This list of "real" constraints aren't exhaustive... ... but the following one of "abstracted constraints is thought to be



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• All reported constraints can be categorised into certain cause/effect types

Cause types

- <u>"Unary"</u>
 - Placing an instance of a beam has an effect on how another can be placed
 - E.g. Beam X must not be within 3 BPs of Beam Y
- <u>"Cumulative"</u>
 - The total number of instances of a beam violates a constraint (or not)
 - E.g. RMS magnet currents averaged over the supercycle
 - E.g. Required number of instances of beam X



- All reported constraints have the following characteristics:
 - 1. Either "Unary" or "Cumulative" in their cause.

Effect types

- Boolean
 - The placement of beam X allows (or disallows) the placement of beam Y
 - E.g: requesting to only immediately follow certain beams
- Offsetting
 - The placement of a beam X delays when beam Y can next start
 - E.g. Avoiding hysteresis left by earlier beams.
 - E.g. Waiting between subsequent shots to an experiment (Y=X)
- <u>Max-Offsetting</u>
 - The placement of beam X restricts when beam Y must start before
 - E.g. Constant-flux fixed target experiment: No more than 10s between shots



Multiple Constraints on beams

- Operations are not limited to having single constraints from/on individual beams
 - Numerous constraints can apply to a single beam
 - A single beam to cause constraints on multiple other beams
- This is no problem



Multiple Constraints on beams

Examples

- Offsetting & max offsetting, all at once
 - "Beam Y must be between 3 & 7 BPs after Beam X"
- Boolean/Offsetting/Max-offsetting from multiple beams
 - "Beam Z must be at least 4 BPs after Beam X and at least 7 BPs after beam Y"
 - "Beam Z can only follow Beam X or Beam Y"
- Boolean constraints combined with offsetting/max-offsetting
 - "Beam Z can only come immediately after beam Y & be >4 BPs after Beam X"
 - This is fine but causes a few extra complications (not discussed today)



Inputting constraints into the algorithm

- The algorithm **does** need to **obey** constraints
- It **doesn't** need to **understand** the reasons behind them
 - Indeed, an algorithm that could would virtually be an AI accelerator operator....
- A UI could be built to understand magnets, beamlines destinations etc.
 - But this is a huge task itself ...
 - ... on top of
 - designing this algorithm
 - coding this algorithm
 - making a rudimentary UI for demonstrations and testing
- The existing UI relies on operators to interpret algorithms from "real" constraints to their "abstracted" functions.
 - Operators already chiefly deal with abstracted constraint functions anyway.



Inputting constraints into the algorithm

Example of a real constraint

- A magnet called BHZ.377 takes about 1.5s to change from steering beams down a beamline to steering them down the "FTN" beamline (and vice versa)
- Suppose beam X goes down the FTN line, & beam Y goes down the TT10 line.

What does the algorithm need to know?

- If we place X, it is illegal to place Y without having an offset of 1 BP
- If we place Y, it is illegal to place X without having an offset of 1 BP



- Every "real" constraints translates to an "abstract" constraint
- The algorithm uses these abstracted constraints
- How the abstraction is done is a wider question for our whole team



Final word on constraints

• Recall: The supercycle is "cyclic"



- A unary constraint cause by a beam at the end of the supercycle... affects beams at the start of the supercycle
- However, the constructive search process is done from "start" to "finish"
- It is not possible to know the "looped back" constraints on beams when starting the search
- Ensuring "looped back" constraints are not violated requires a special extra step
 - It is called the "<u>loopback check</u>"



Summary of key points

- The key points for understanding today's algorithm explanation are
- 1. The term "supercycle" is just the special name for the schedule we use
- 2. The supercycle is made of quantised time periods ("Basic periods")
- 3. The supercycle has a finite length
- 4. The supercycle repeats itself once it has completed
 - Requires the constraints "loopback" check
- 5. The algorithm uses the "abstracted" function that underlies any "real" constraint

- 6. Categories of abstract constraints:
 - Causes:
 - Unary
 - Cumulative

- Effects:
 - Boolean
 - Offsetting
 - Max offsetting



Chapter 2

Scope of today's seminar



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Scope of today's seminar

- 1. Today, we <u>will</u> explore how the algorithm
 - comprehensively explores the schedule space for a <u>single</u>, <u>uncoupled</u> accelerator
 - i.e. "is as strong as a brute-force"
 - this is quite a unique feat...
 - ensure all constraints are obeyed
 - outputs a truly "optimal" schedule
- 2. Today, we will not explore how the algorithm
 - Performs this search for accelerators in parallel
 - Deals with "Spares"
 - Not as complex as it may appear
 - More detail on some constraints
 - Works even faster than shown
 - The "2.0" is orders of magnitude faster than demonstrated today
 - ... but 1.0 achieves exactly the same results





What is special about Terrapin?

- Many good scheduling algorithms exist already
 - ... many can work with convoluted sets of constraints
 - ... but they are invariably heuristic algorithms
 - Genetic, heuristic repair, particle-swarm, etc....
 - Machine learning

Why are they "invariably" heuristics?

- Because the set of all schedules (even for small scheduling problems) is HUGE
 - It is a permutation space
 - WRONG: it is even bigger than a permutation space....!
- Heuristics use educated guesswork to avoid looking at all the schedules
 - Keeps runtime practical
 - Speed at the expense of thoroughness
- Good heuristics are indeed powerful, useful algorithms, but....
 - you can never be sure if their solutions are indeed optimal
 - If they cannot find a solution, it doesn't necessarily mean that no solution exists



What is special about Terrapin?

<u>Answer</u>

- 1. It will find the truly optimal solution
 - It does not perform a brute-force...
 - ...but a stronger solution than it finds does not (and cannot) exist
- 2. If it finds no solution, then it is certain that no solution exists
- Terrapin keeps a practical runtime, while not suffering the weaknesses of rigour which heuristics heuristics have



Chapter 3

Foundational ideas



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Main idea

• A brute-force becomes so unmanageable because of the exponential growth seen within the search space



- This tree shows the number of 10-long permutations of two objects
 - The possible permutations to be compared are the $2^{10} = 1024$ "leaf nodes"
 - For schedules, not permutations, there would be even more than 1024 nodes



Main idea

- Terrapin would perform the same schedule-search by creating a much neater graph
 - The graph would contain 21 nodes, and would contain <u>1024 *paths*</u> through it

N.B. The word "graph" has two meanings:



1: A chart

2: A network

Analogy

- There is not a route between your work and your home that you wouldn't understand...
- ... but in your whole life you couldn't drive (or list) all of them....!



Trimming techniques

Topological simplicity

- It was mentioned earlier that a "schedule space" is larger than the space of permutations of the items it schedules.
- Even with constraints, at any point in building a supercycle there is always an earliest next place that any requested beam can go
- Nothing can be gained by placing anything later than this earliest place
 - This would give a different schedule, yes....
 - ... but not one you need to look at when looking for an optimal solution!
- Terrapin only considers the "topologically simple" placements.
 - It never adds any space that is not absolutely necessary

You <u>can</u> draw a supercycle that Terrapin would never find... ... but it <u>would be equivalent</u> to a "topologically simple" one which Terrapin did find

Completeness without exhaustivity



Trimming techniques

Constrained Construction

- Most constrained-scheduling algorithms obey constraints by
 - Building a schedule (or sub-schedule)
 - Checking if it obeys all the constraints
 - Discarding it/trying to repair it if not.
- Terrapin constructs it's graph one placement at a time
 - It doesn't ever look at 'potential' sub-schedules of multiple placements
 - No placement decision is ever made which violates constraints from other placements (/nodes)

The paths within the Terrapin graph <u>all</u> have <u>no violations of any constraints</u>

- A path within the Terrapin graph represent a topologically simple schedule
- This schedule is guaranteed to not violate any constraints.



What is Optimal...?

"One person's rubbish is another person's treasure"

- A supercycle is "valid" if
 - it violates no constraints
 - it satisfies all the minimum requests
- A supercycle is "optimal" if
 - it is valid
 - no preferable supercycle is possible
- Which users should be allocated any available "extra beams" above the minimum depends on *"preference"* of current operations
- Terrapin computes the set of allocations possible from all valid supercycles
 - The "optimal" is the highest member of this set...
 - ... according to your own particular priority ordering





- 1. The paths within the Terrapin graph contain no violations of any constraints
 - The are all completely valid solutions
- 2. The definition of the "optimal" solution depends on which users you prioritise



Chapter 4

The Terrapin Algorithm: Part 1





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- Two beams
- Supercycle is 4 basic periods long
- No constraints





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Two beams
Supercycle length = 4BP
No co

• No constraints

Phase 1: Building the graph





• Two beams • Supercycle length = 4BP • No constraints

Phase 1: Building the graph





• Two beams • Supercycle length = 4BP • No constraints

Phase 1: Building the graph



Next index is index 2...



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• Two beams • Supercycle length = 4BP • No constraints

Phase 1: Building the graph

Building on the options discovered to give index 2





• Two beams • Supercycle length = 4BP • No constraints



- Next is index 3....
- Notice <1,1> has appears twice for index 3...



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• Two beams • Supercycle length = 4BP • No constraints

Phase 1: Building the graph

Building on the options discovered to give index 3



- This goes out of the bounds of the supercycle....
- ...so we needn't consider it
- Indeed, next building index is index 4 the end of the supercycle
 - We have finished building



Example 1's completed graph





Example 1: Building a solution



- Let's say we want a solution who gives
 - at least 1 instance to each beam
 - Prioritises B over A for extra beams
- We want a schedule with <2,1>
 - This is optimal for us



Example 1: Building a solution



- We want the <2,1> allocation
 - We have 2 options for <1,1>: we can pick either
 - Chose <u>A @ 3</u>: <2,1> should decrement to <1,1>
 - We have 2 options for <1,1>: we can pick either
 - Choose <u>B @ 1</u>: <1,1> would decrement to <1,0>
 - Only one seed for <1,0>: -> <u>A @ 0</u>
 - We're now @ 0: Done!



Example 1: Building a solution



- Any other supercycle is a path back through the graph like we just did
- The only allocation arrays possible are the ones you see on the right



- Same setup, but let's say A can only come after B
- We started example 1 like this:



- However, we haven't placed anything at the start....
 - So the boolean constraint for allowing A is not triggered yet



Example 2's completed graph



- Similar logic to what we just saw would cause the graph to be built differently
- Many connections would not be made
- And many allocation calculations would not happen
- We see a different set of possible allocations
 - But every path is still a valid supercycle



Sandy Easton (CERN) ACMPA workshop, Santa Fe, NM

Time complexity

- Terrapin runs in quasi polynomial time
 - Not exponential time like a brute fore
- The maximum work done at each step does not increase as theschedule length increase
 - Unlike a brute force



Further applications

Non-scheduling problems

- Can be readily applied to other scheduling problems, of course...
- ...but it is foreseen that the process can be abstracted to work on many other sequential processes where the current state does not depend on the *order* of previous states
 - Many card games
 - Scanning the parameter space within sequential finite-element models
 - Chess....!?! Hmmm, still no....
- Exciting!
 - Expecting a second collaborative publication formalising types of further applications

As part of a hybrid optimiser

- For huge problems, Terrapin can be thought of as a sub-optimiser
 - Potential for creating a very powerful hybrid

Training-example generator for learning algorithms

- Terrapin's output is an orderable list of objective function values
- Each objective function value has a large list of concrete solutions behind it



Questions

And see you for part 2!





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