



DOCTORAL STUDENT SEMINAR ON FIRE SIMULATION

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CERN, SWITZERLAND

MATERIAL PARAMETER OPTIMISATION FOR CABLE FIRE SIMULATION

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Introduction

Introduction

- Member of the Doctoral Student Programme at CERN
- Work supported by the Wolfgang-Gentner-Programme of the German Federal Ministry of Education and Research (BMBF)
- Supervisor:
Saverio La Mendola
- Doctoral student at the Bergische Universität Wuppertal
- Department: Computer Simulation for Fire Safety and Pedestrian Traffic
- Supervisor:
Armin Seyfried
Lukas Arnold



Introduction

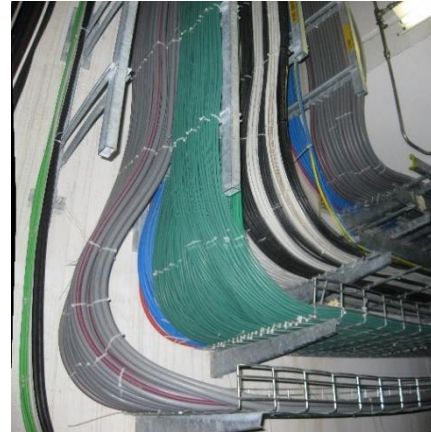
Overview

- Where are we?
 - Large amounts of cables at CERN
 - Special facilities (~ 50 km long tunnels, experimental caverns,...)
 - Expensive and unique equipment
- Poses challenges for (fire) safety engineering
 - Design fires
 - Risk assessment
 - ...

Introduction

Overview

- Impressions from CERN facilities



Introduction

Overview

- Desire to study (cable) fire development in detail
- Obtain parameter set, which allows to simulate fire propagation
 - Starting point are bench scale fire tests
 - relatively inexpensive
 - Utilising mathematical optimisation strategies
 - large number of simulations required
 - Very simplified simulation setup
 - attempt to reduce overall computational power and time demand

Introduction

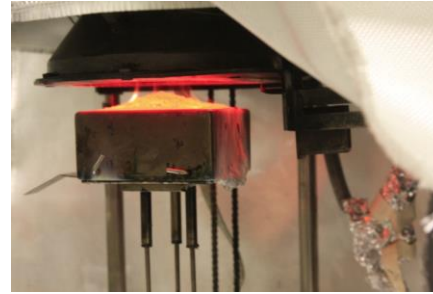
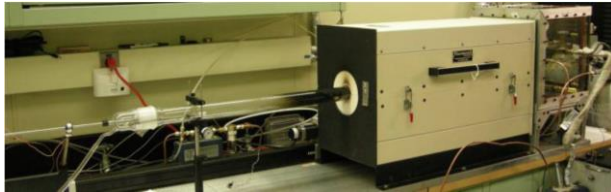
Overview

- Starting from ideas/work from Anna Matala, Chris Lautenberger, CHRISTIFIRE, FIPEC
- Using Python 2.7 to setup script environment for automated parameter optimization
- SPOTPY library used as “toolbox” for optimization algorithms
- Fire simulation using FDS 6.x from NIST
- State of the art approach

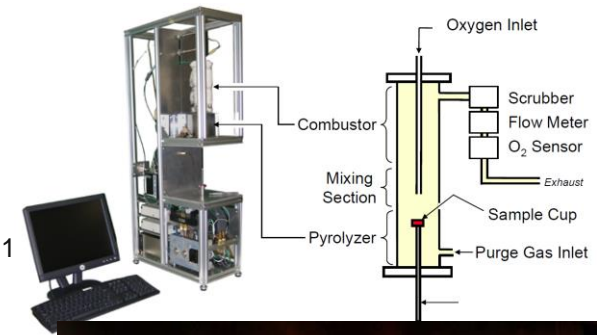
Introduction

Overview

- Cable Heat Release, Ignition, and Spread in Tray Installations During Fire (CHRISTIFIRE)
- Plenty of data recorded, able to be utilised in simulations



Pictures: CHRISTIFIRE, phase 1



Introduction

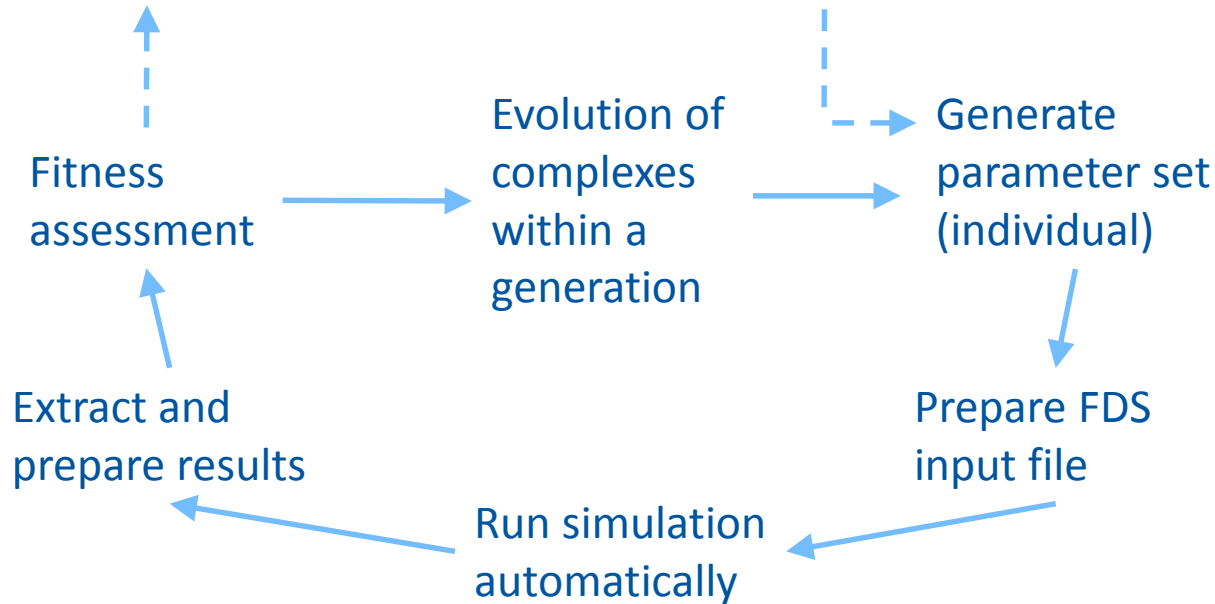
SCEUA

Termination, when convergence criterion is met

Initial population
(uniform distribution)

Simulation „cost“

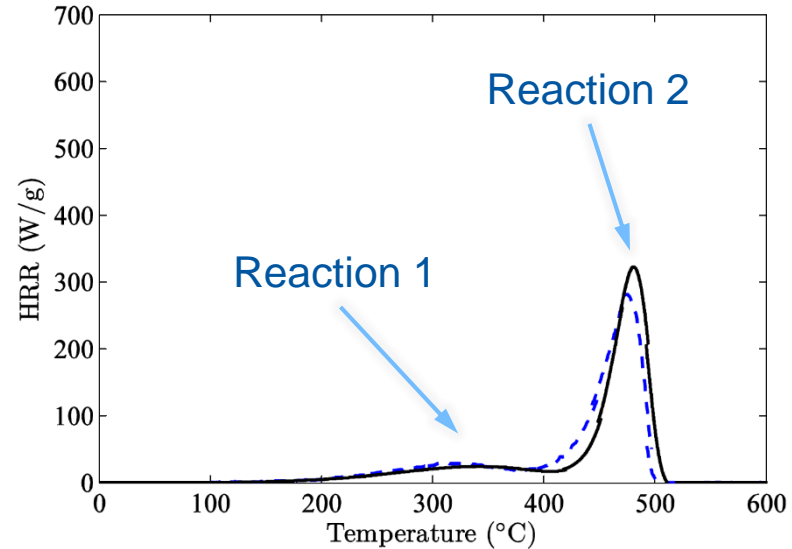
$$n_{Gen} \approx n_{Para}^2$$



Introduction

Material Model

- Idea:
 - Perform optimization for materials
 - Build layered cable model
 - Determine layer thickness by optimization
- Starting from small scale material tests
- Two reaction steps per material
 - Arrhenius reaction model in FDS
 - Three parameters: A, E, n



Introduction

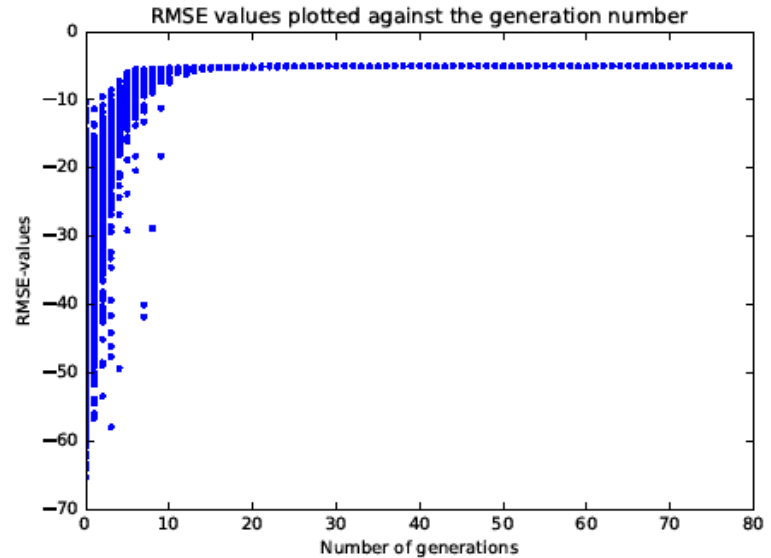
Material Model

- Thermo-physical parameters
 - Density, conductivity, specific heat, heat of combustion and reaction
- Thermo-physical parameters of the residue
 - Density, conductivity, specific heat
- Leading to 14 parameters in total, per material

MCC Simulation

MCC Simulation Generations

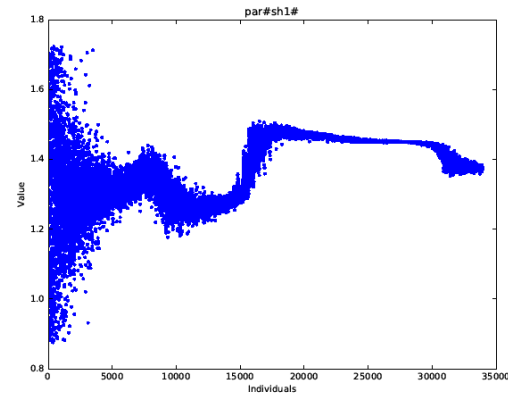
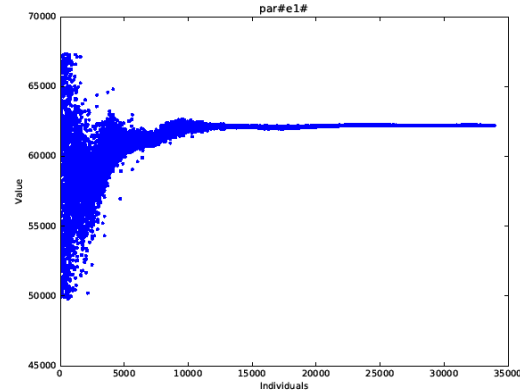
- Root Mean Square Error (RMSE) used as fitness criterion
- RMSE values plotted by generation
- Good parameter set found after 15 to 20 generations
- (For this case: 435 individuals per generation;
RMSE: 5.048)



MCC Simulation

Parameter Development

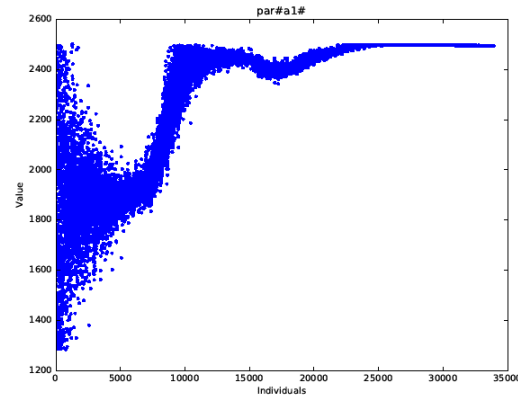
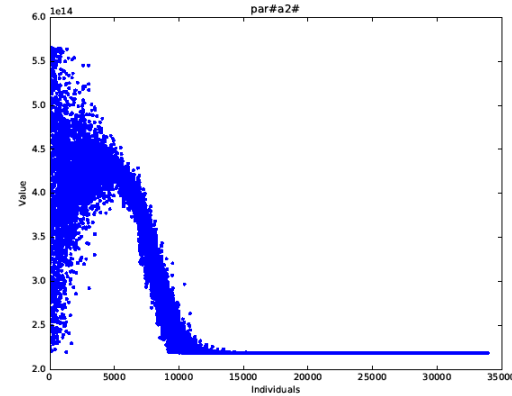
- Development of the parameter values over the optimisation run
- General behaviour: Parameters converge to a certain value
- This value may change during the optimisation run
 - Presumably due to other parameters approaching limits or local optima



MCC Simulation

Parameter Development

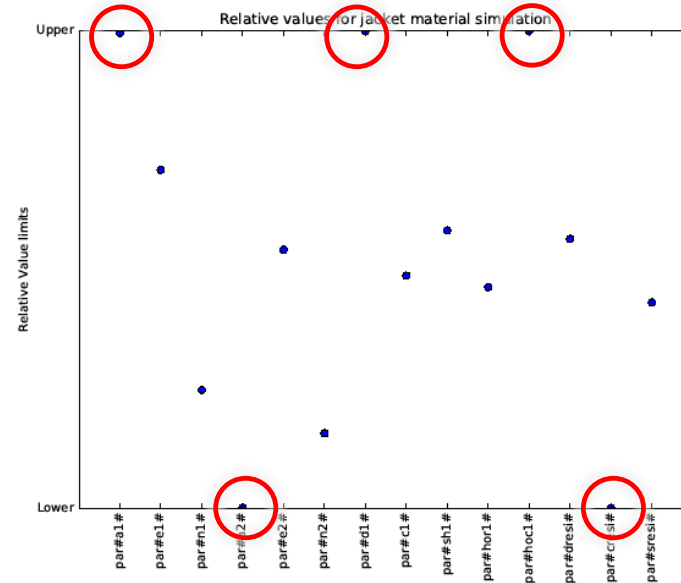
- Parameters which get stuck are converging, too
- Might be able to recover, due to changes in other parameters
- Despite the stuck parameters, a good fit could be achieved for both materials.



MCC Simulation

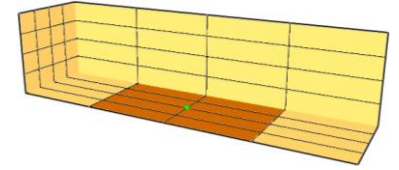
Parameter Development

- Relative parameter values due to different magnitudes (best parameter set)
- Some parameters are stuck at their limits
- Investigation of optimisation behaviour with changed parameter limits to be done in the future

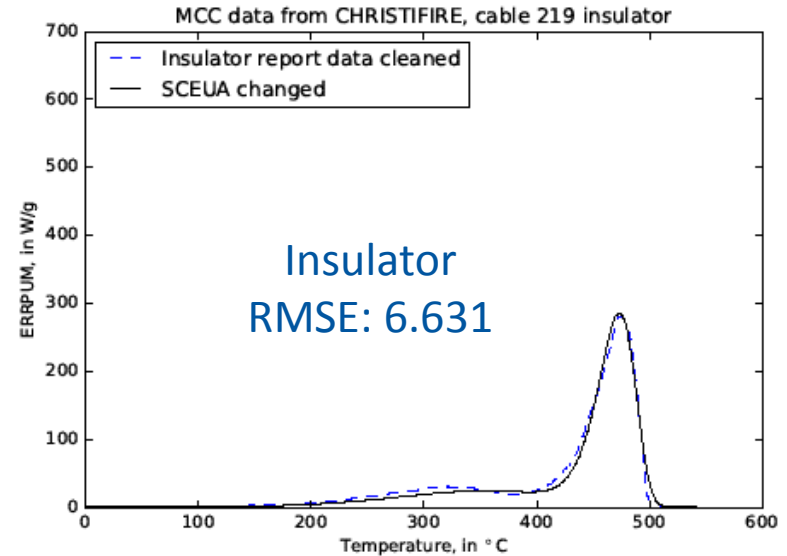
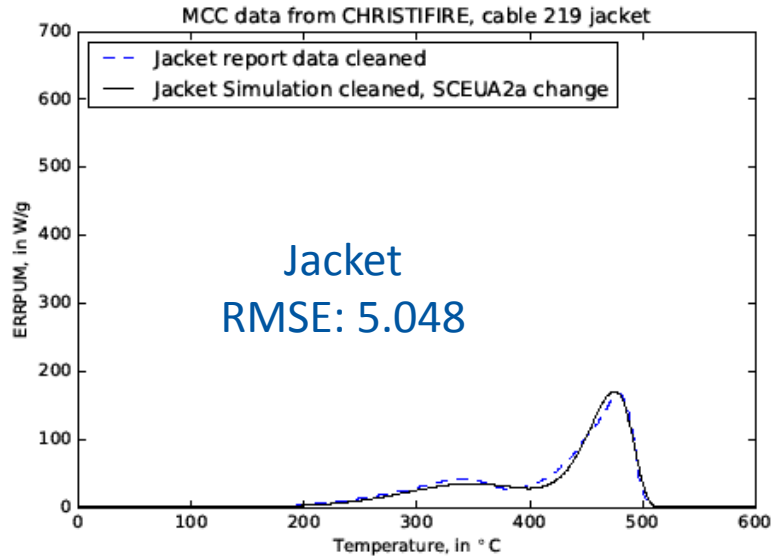


MCC Simulation

Best Parameter Sets



- Best parameter sets from optimisation

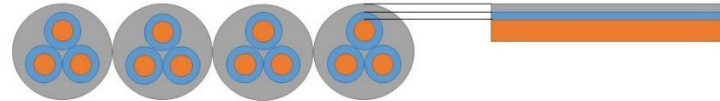
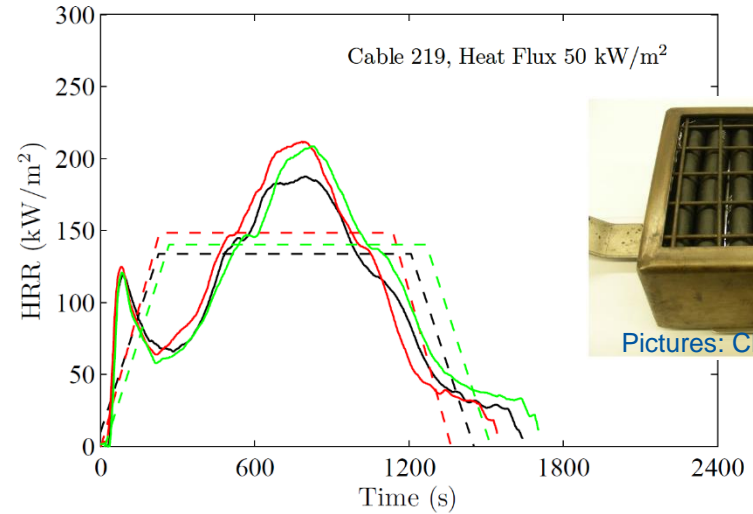


Simple Cone Simulation

Simple Cone Simulation

Cable Model

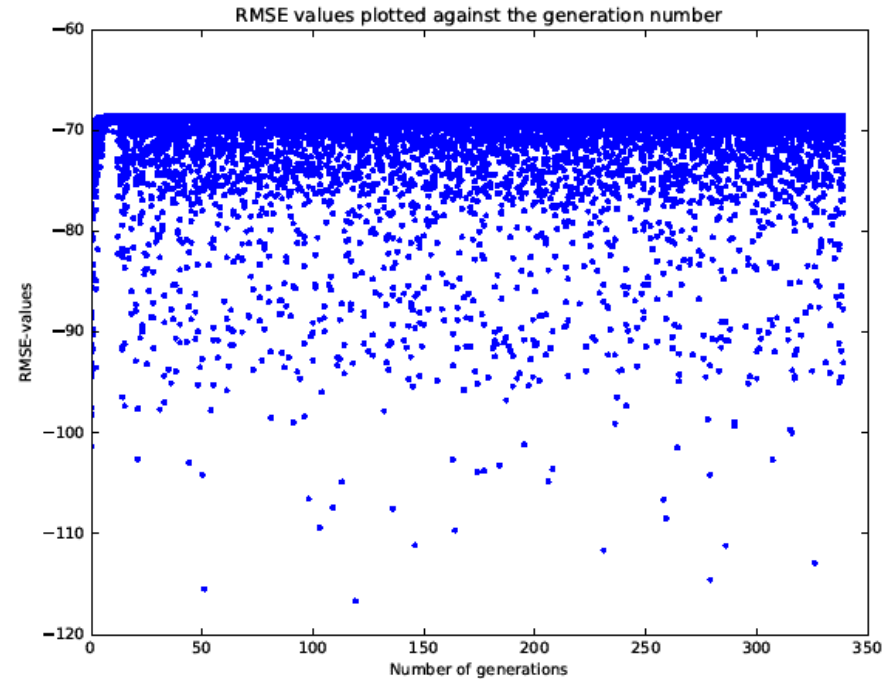
- Simplified Cone setup
- Cable model with layered structure
- Material parameters from MCC simulations
- Optimised parameters are layer thickness for each material: Jacket, insulator, conductor, backing



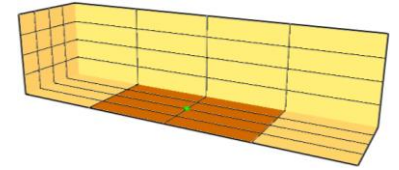
Simple Cone Simulation

Generations

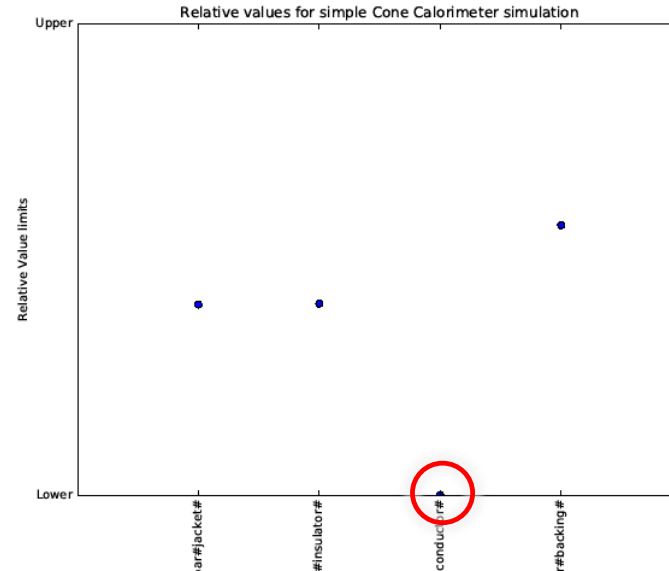
- RMSE values plotted by generation
- No useful fit achieved
- ($n_{\text{Para}} = 4$, $n_{\text{Gen}} = 45$;
RMSE: 72.405)



Simple Cone Simulation Parameter Development



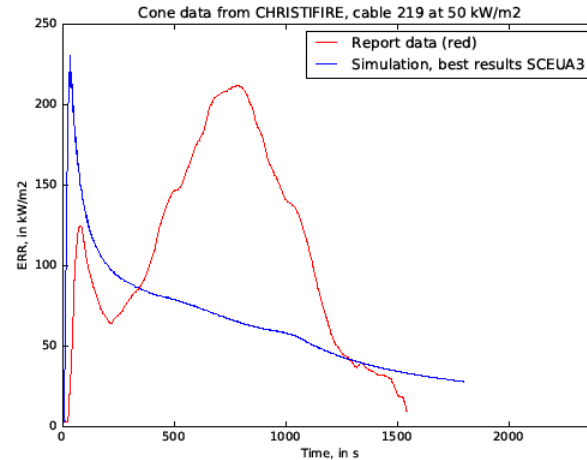
- Conductor thickness stuck at lower limit (best parameter set)



Simple Cone Simulation

Best Parameter Set

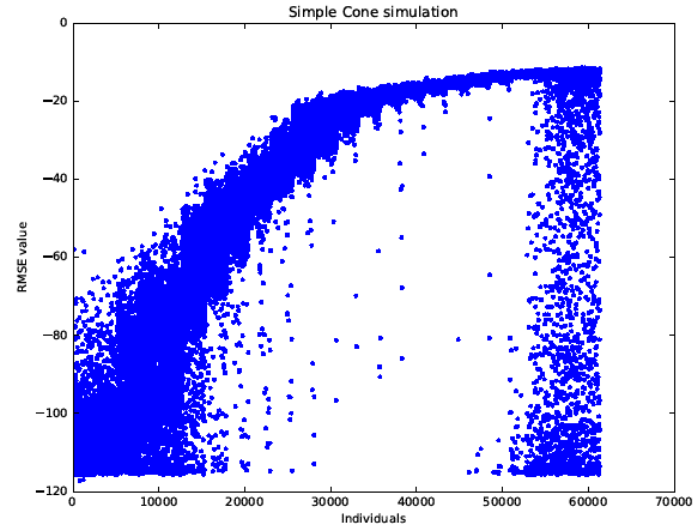
- Simulation results do not match experimental data
- Thickness optimisation alone, seems not to be sufficient
- RMSE: 72.405



Simple Cone Simulation

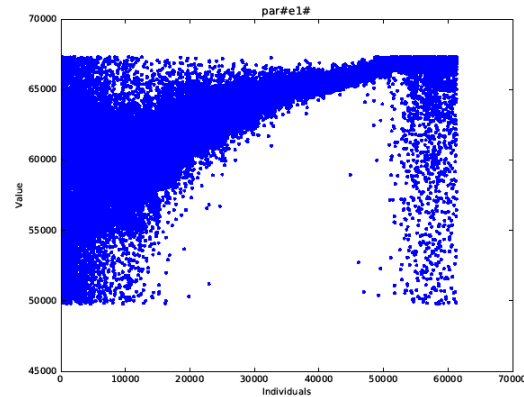
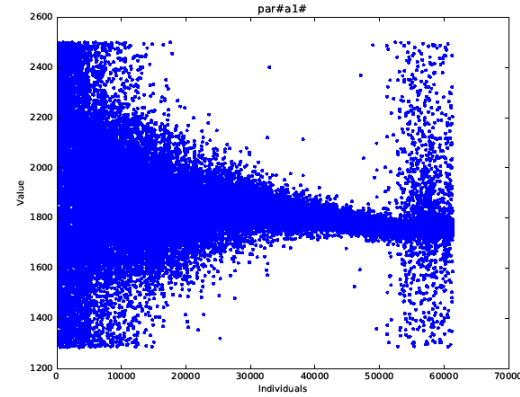
More Parameters

- New optimisation run using more parameters:
 - Material parameters of both components, layer thickness, emissivities (components, residues),
- ($n_{\text{Para}} = 35$, $n_{\text{Gen}} = 2556$;
RMSE: 11.285)



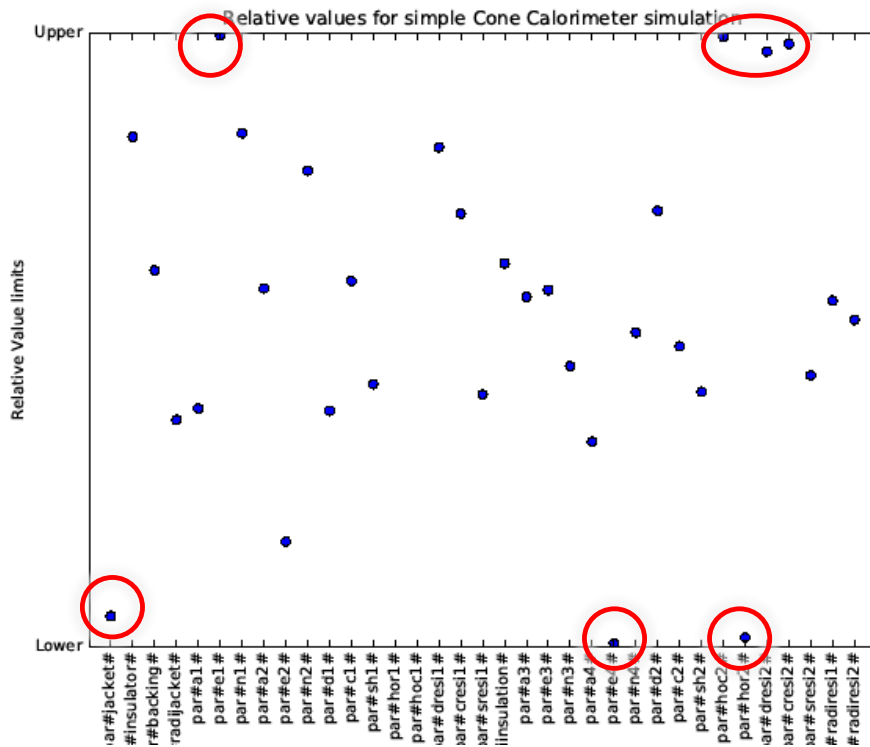
Simple Cone Simulation Parameter Development

- Similar behaviour is observed
 - Parameters converge
 - Some get stuck at their limits



Simple Cone Simulation Parameter Development

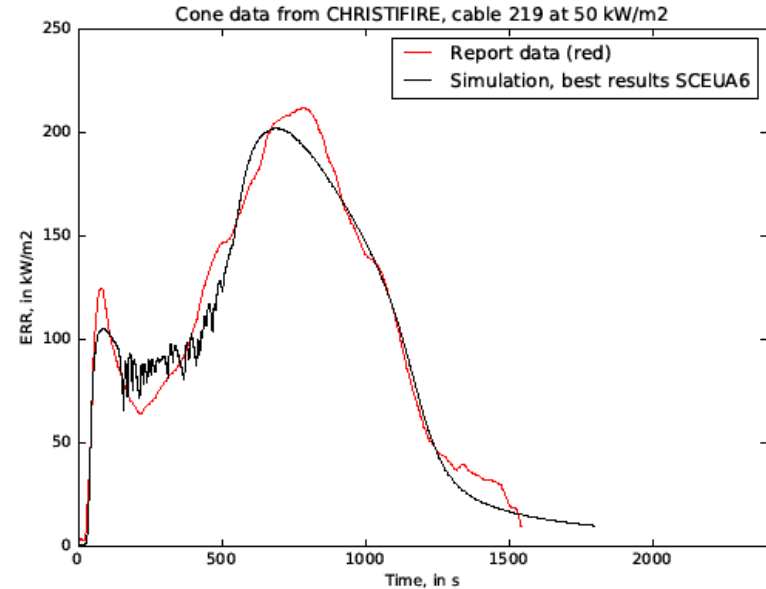
- Again, some parameters are stuck at their limits (best parameter set)



Simple Cone Simulation

Best Parameter Set

- Good fit could be achieved
- Optimisation stopped due to exceeding the simulation limit
- RMSE: 11.285

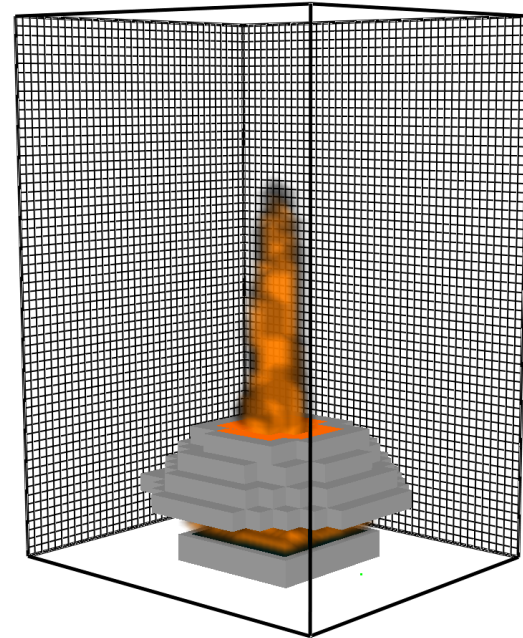


Coarse Cone Simulation

Coarse Cone Simulation

Transfer to higher fidelity

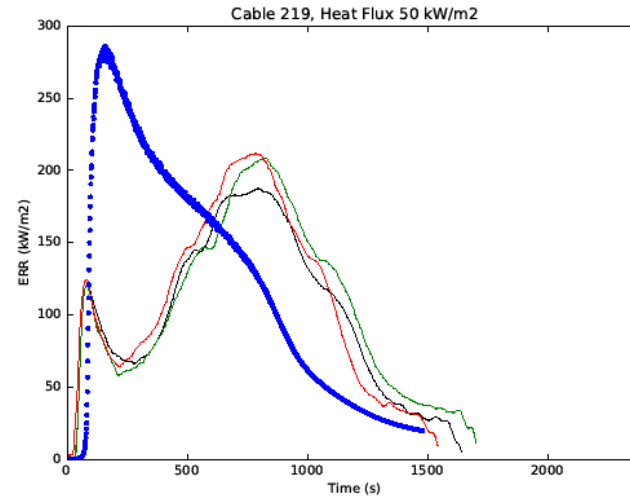
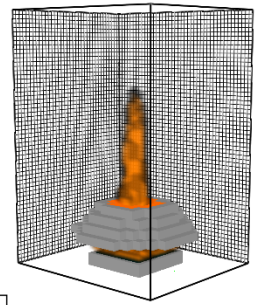
- Best parameter set from Simple Cone setup was tested in higher fidelity Cone simulation
- Again, no good fit was achieved
- Most possibly due to flame heat feed back
 - It was prescribed in the simple cone (&RAMP)



Simple Cone Simulation

Transfer to higher fidelity

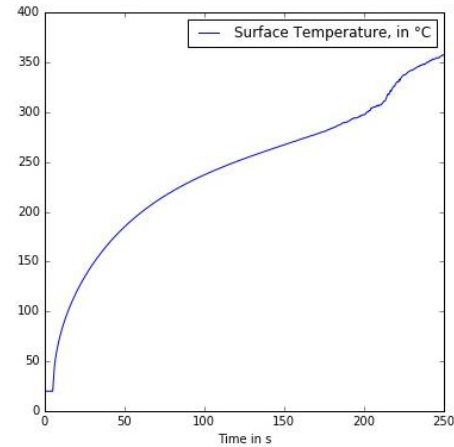
- Conclusion:
 - It seems there are too many simplifications in the simple setups
 - Parameter sets cannot be carried over easily to higher fidelity



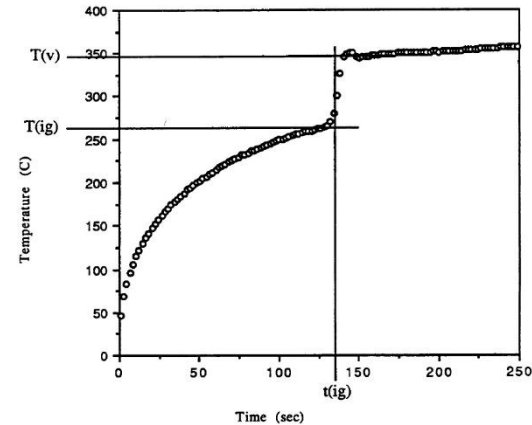
Simple Cone Simulation

Revising Strategy

- Flame heat flux difficult to prescribe
- Strong influence on the burning behaviour
- Picture taken from:
"Burning Rates and Flame Heat Flux for PMMA in the Cone Calorimeter", by Brain T. Rhodes, in May 1994 (NIST-GCR-95-664)



Simulation

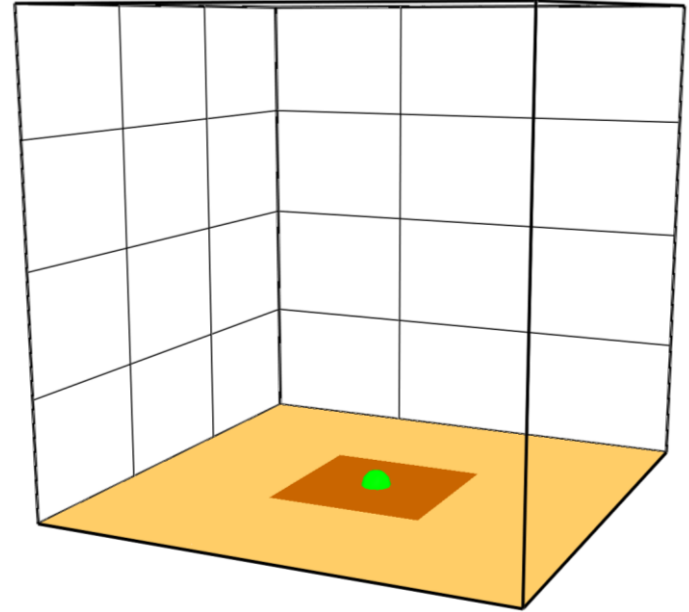


Experiment

Simple Cone Simulation

Revising Strategy

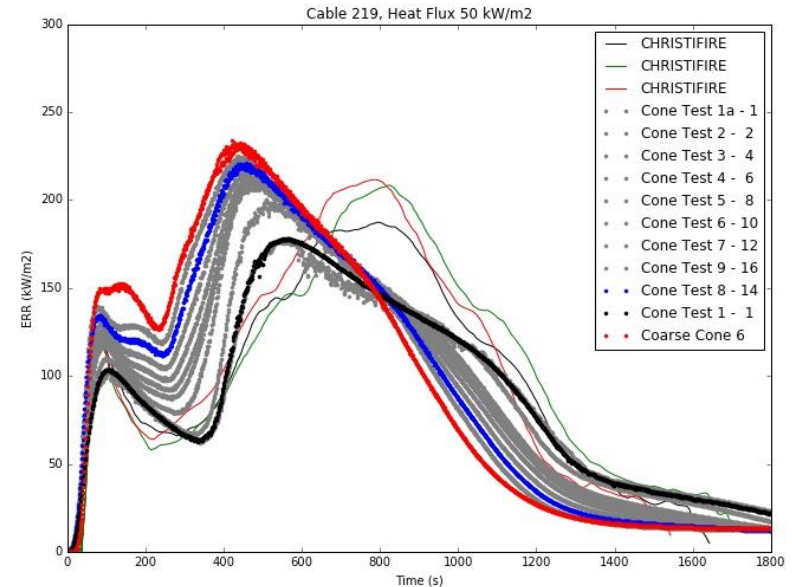
- Testing most simple setup with gas phase and flame
- Idea taken from Anna Matala's Dissertation
- Time for optimisation estimated: 4 to 6 weeks (35 parameters)



Simple Cone Simulation

Revising Strategy

- Simple setup seems promising
- But it's off in Coarse Cone
- Resolution change in simple setup
- For same resolution in simple and coarse setup, results fit better together
- Conclusion:
 - Flame simulation is very important
 - Simple setup is too simple



Thank you for your attention!

Do you have any questions?

Parameter Optimisation

SCEUA

- Population divided into groups, called complexes
 - Competitive evolution within the complexes
- Simulation results are compared with target values
 - Creates fitness value
- Complexes are shuffled
 - Population sorted and ranked by fitness value
 - New complexes are generated

Appendix

SCEUA

- Shuffled Complex Evolutionary method developed at the University of Arizona (SCEUA)
- Simulation regarded as individual
- Group of all individuals regarded as population
- Parameter set, describing the simulation, could be regarded as genes
- Genes can have different values (from genetics: allele)

Genes	Alleles
Density	1259.4 kg/m ³
...	...
Emissivity	0.68
...	...
...	...

Appendix

SCEUA

- Population divided into groups, called complexes
 - Competitive evolution within the complexes
- Simulation results are compared with target values
 - Creates fitness value
- Complexes are shuffled
 - Population sorted and ranked by fitness value
 - New complexes are generated