

Concurrent materials design

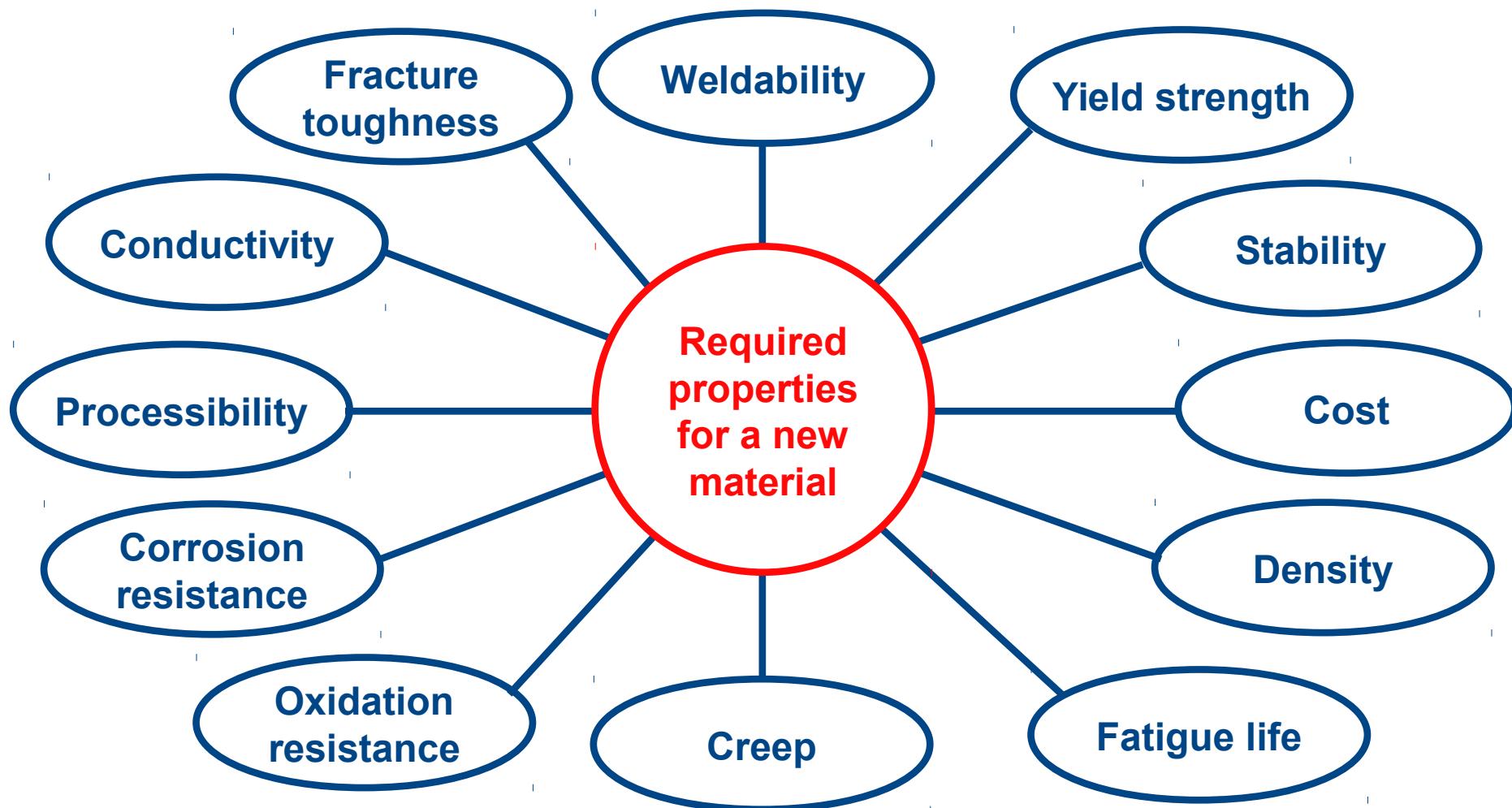
Gareth Conduit

TCM Group, Department of Physics

Concurrent materials design



Designing a new material – what is required ?



Properties: Yield stress

Collect data for yield stress from 2248 alloys

Properties: Yield stress

Collect data for yield stress from 2248 alloys



Generate neural network model

$$\text{YS [MPa]} = F(n_{\text{ni}}, n_{\text{Al}}, n_{\text{Cr}}, n_{\text{Co}}, n_{\text{Mo}}, n_{\text{Ti}}, T_{\text{HT}}, t_{\text{HT}})$$

Properties: Yield stress

Collect data for yield stress from 2248 alloys



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Calculate uncertainty in neural network model

Properties: Yield stress

Collect data for yield stress from 2248 alloys

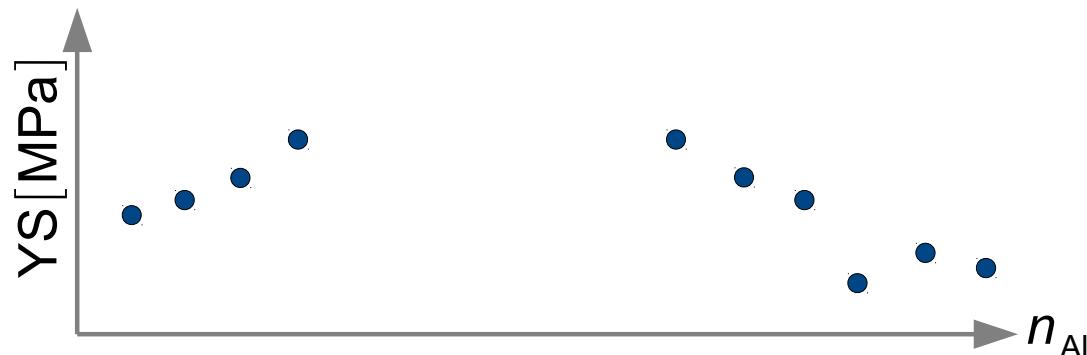


Generate neural network model

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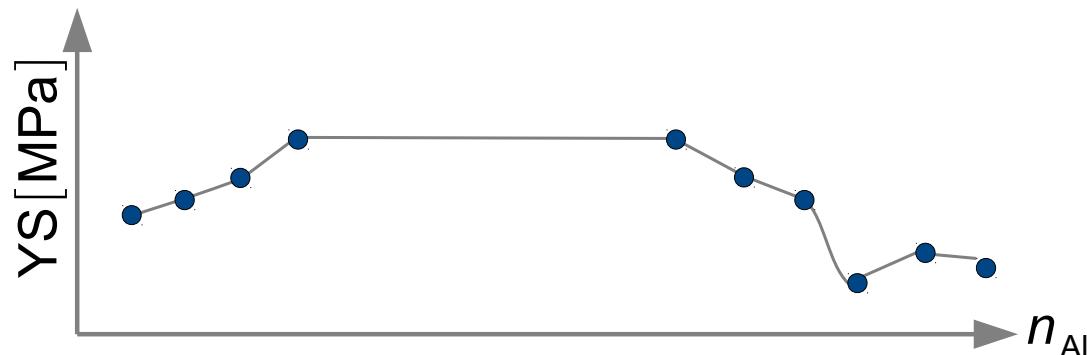


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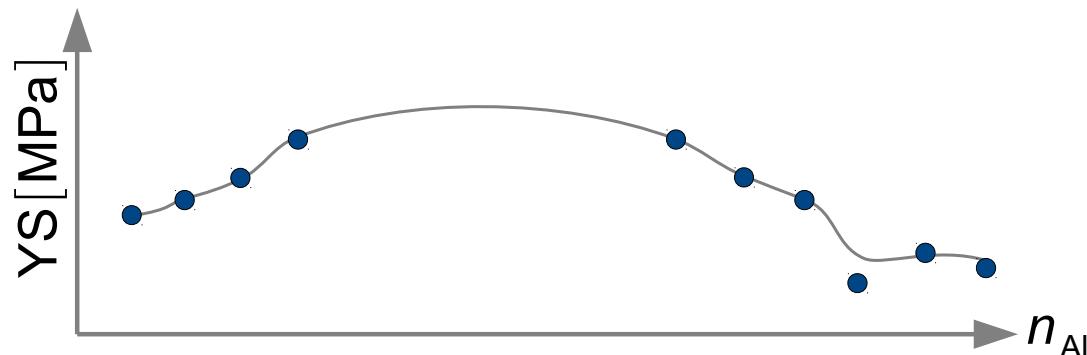


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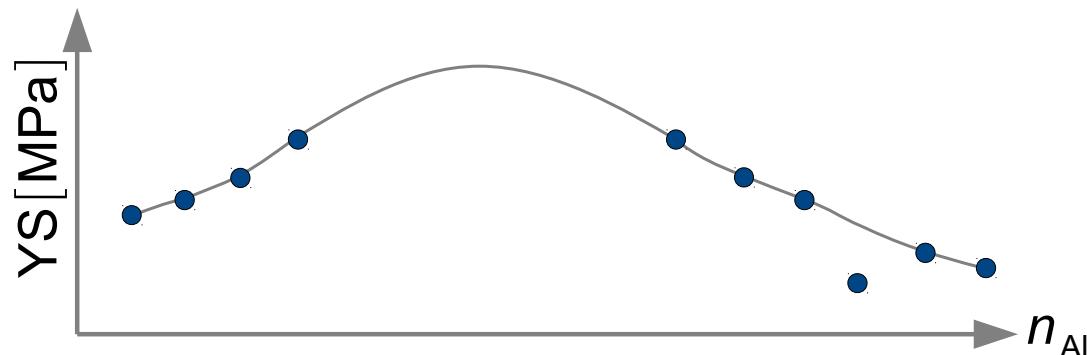


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Calculate uncertainty in neural network model



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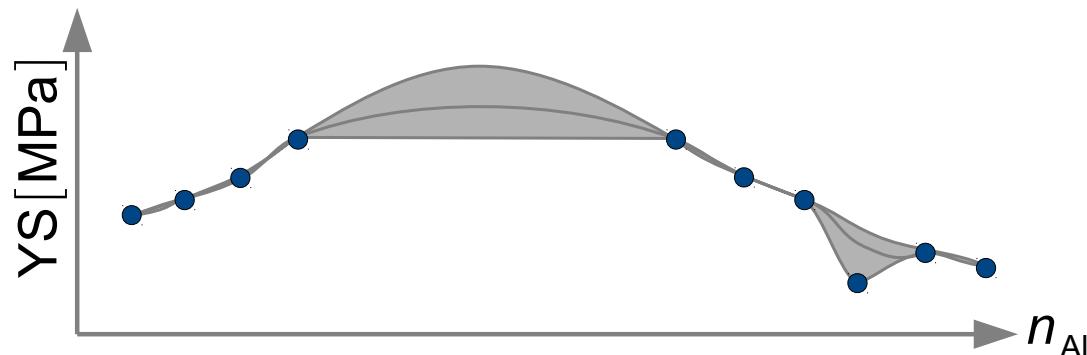


Generate neural network model

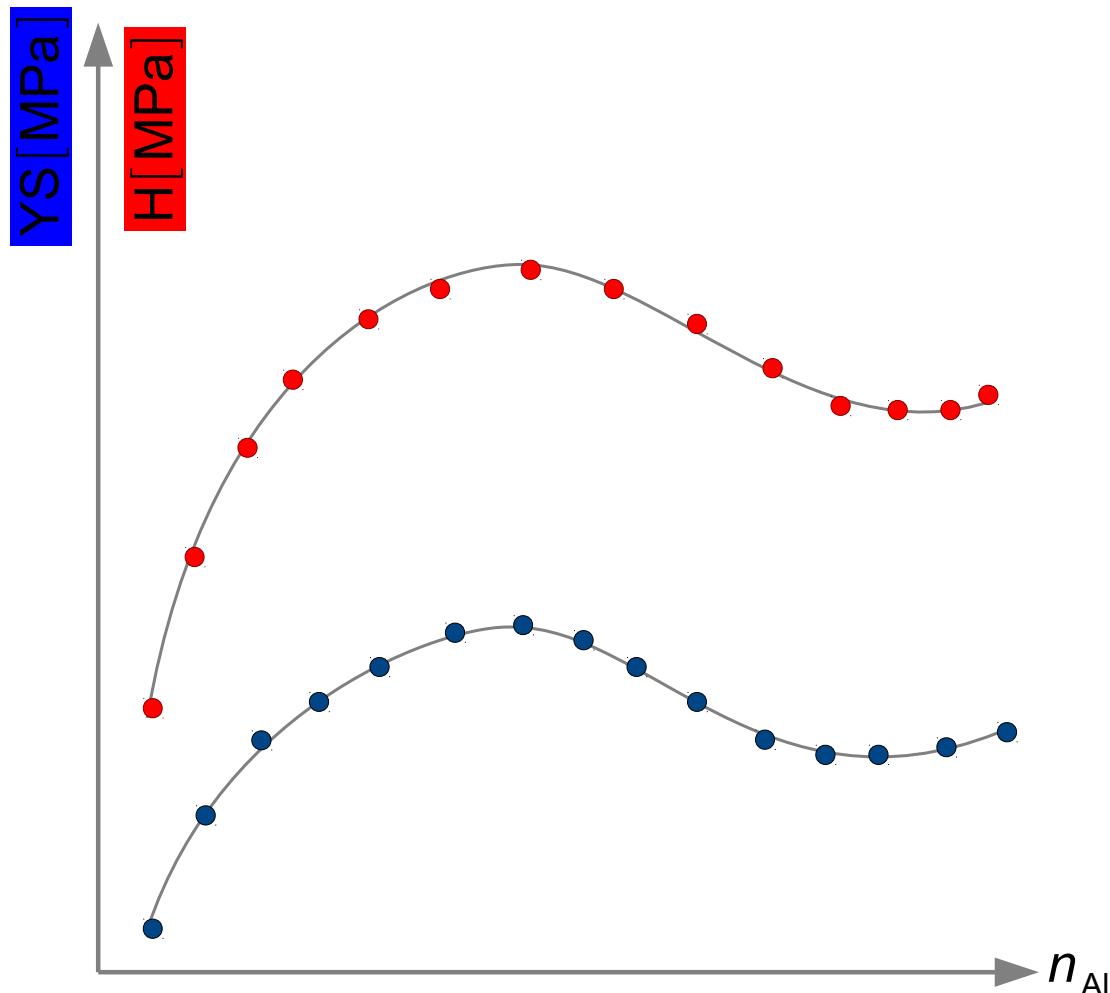
$$\text{YS}[\text{MPa}] = F(n_{\text{ni}}, n_{\text{Al}}, n_{\text{Cr}}, n_{\text{Co}}, n_{\text{Mo}}, n_{\text{Ti}}, T_{\text{HT}}, t_{\text{HT}})$$



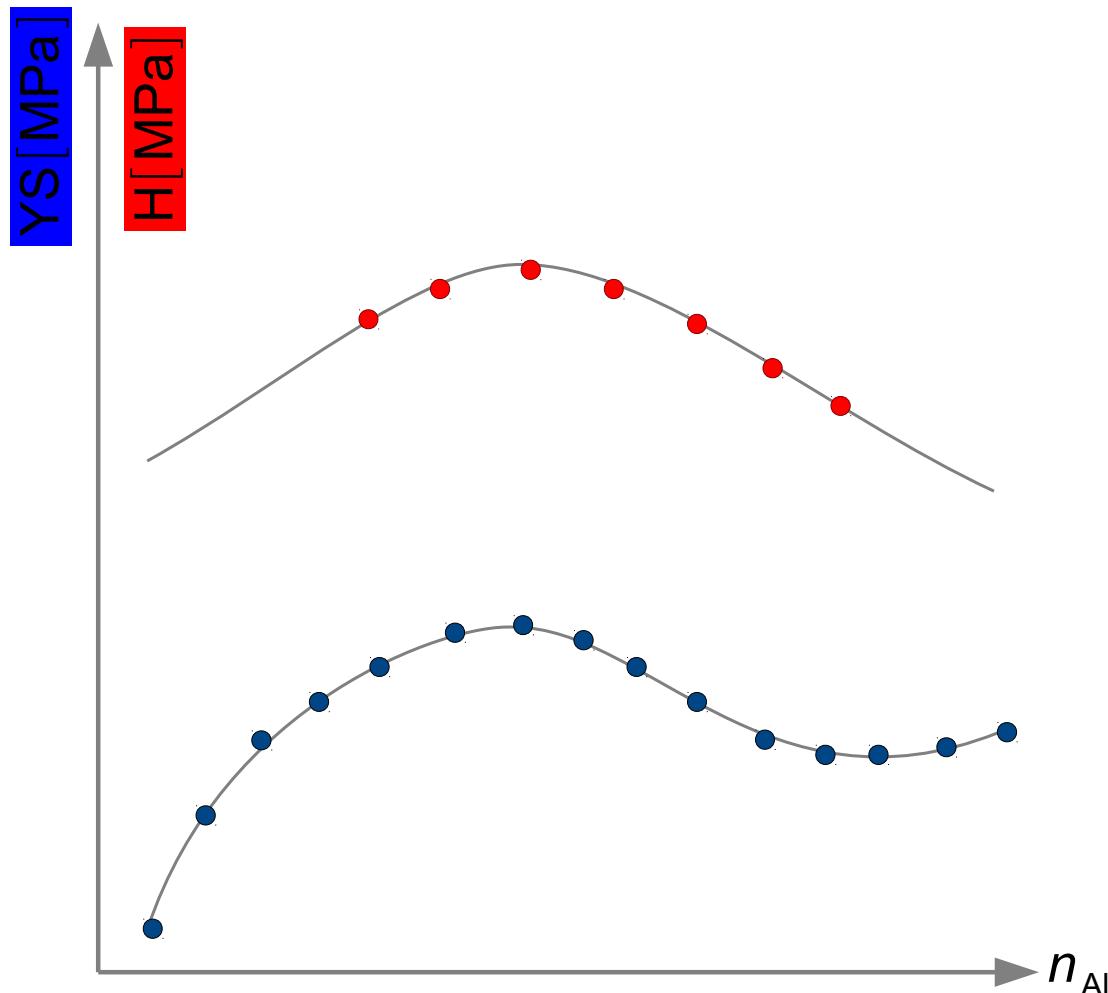
Calculate uncertainty in neural network model



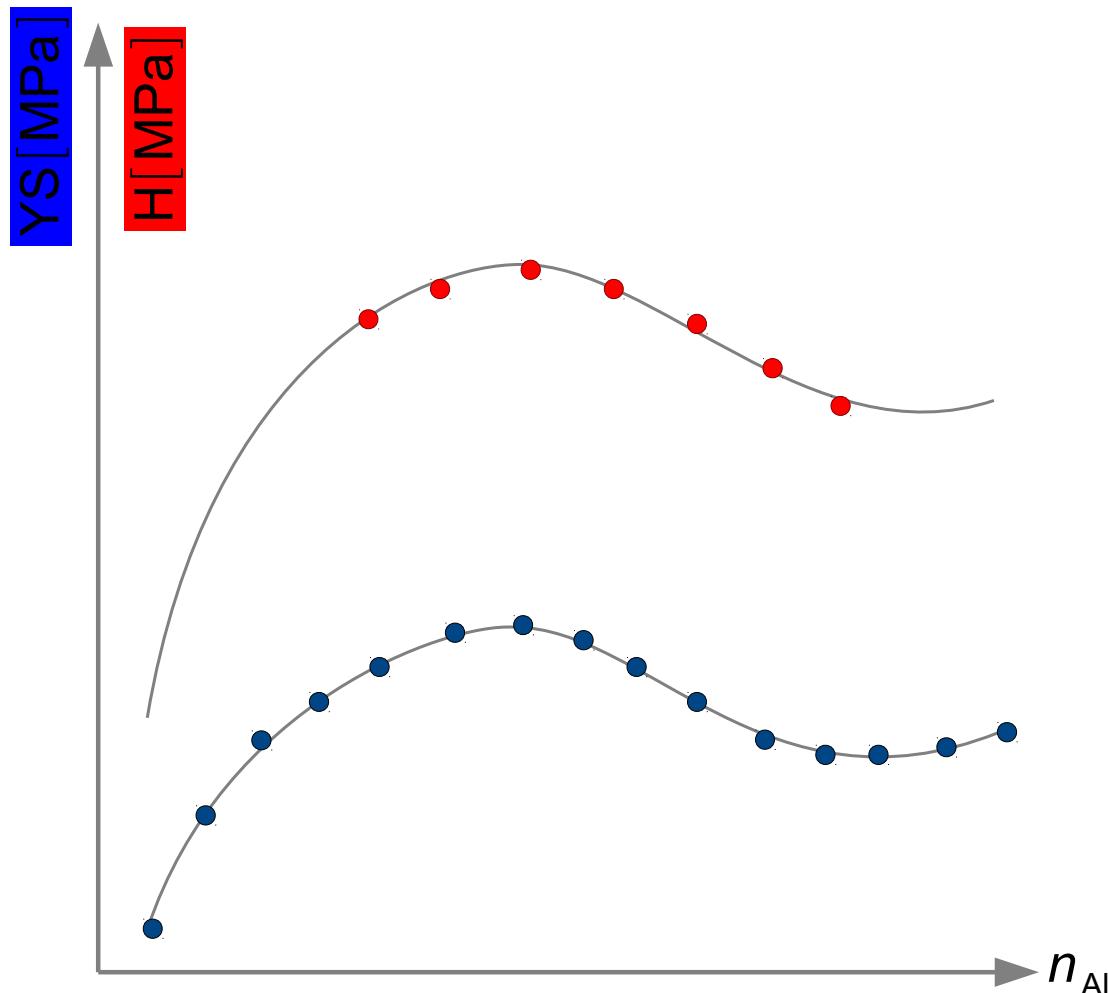
Properties: Yield stress and hardness



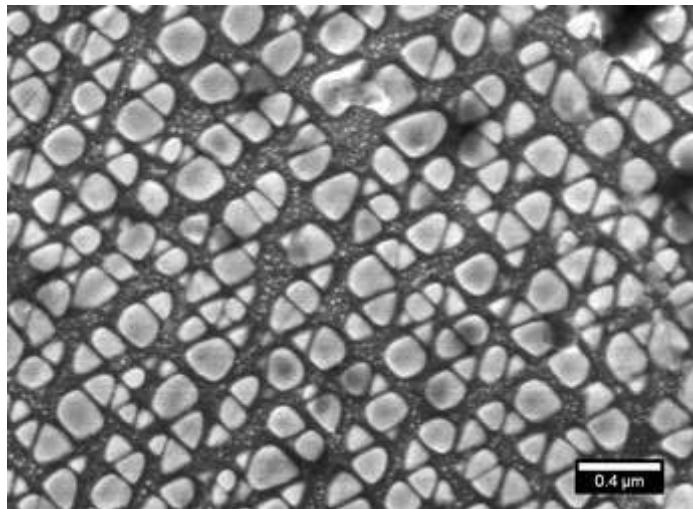
Properties: Yield stress and hardness



Properties: Yield stress and hardness



Phase equilibrium



Properties: γ' fraction

Calculate grid of

$$F_{(\gamma, \gamma')}(n_{\text{ni}}, n_{\text{Al}}, n_{\text{Cr}}, n_{\text{Co}}, n_{\text{Mo}}, n_{\text{Ti}})$$

Properties: γ' fraction

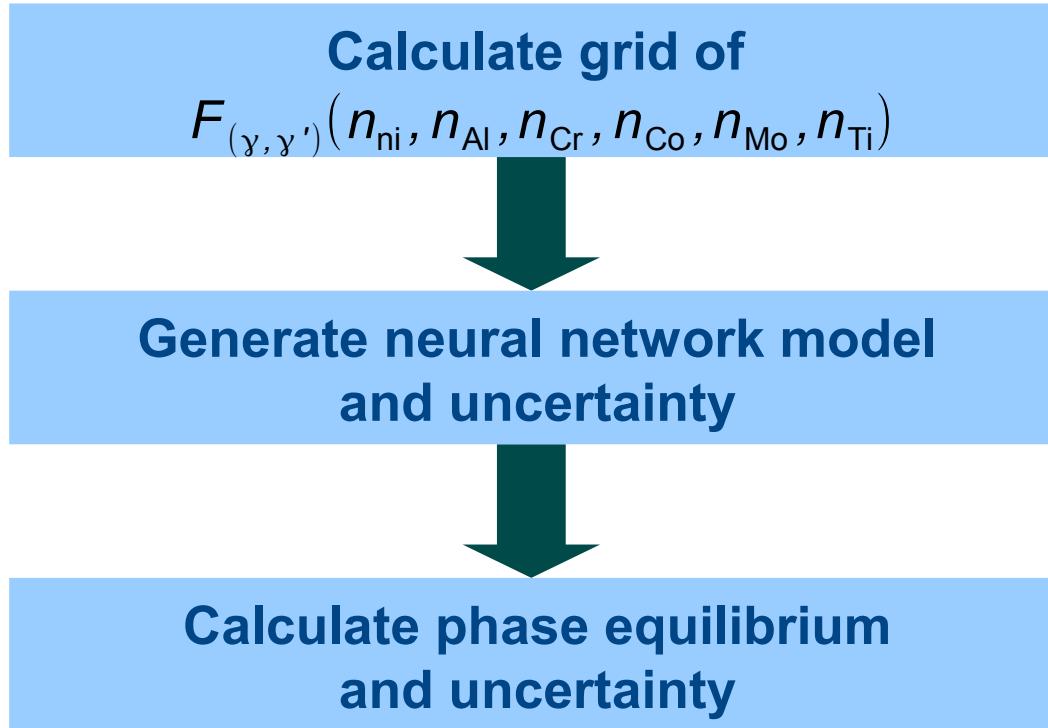
Calculate grid of

$$F_{(\gamma, \gamma')}(n_{\text{ni}}, n_{\text{Al}}, n_{\text{Cr}}, n_{\text{Co}}, n_{\text{Mo}}, n_{\text{Ti}})$$

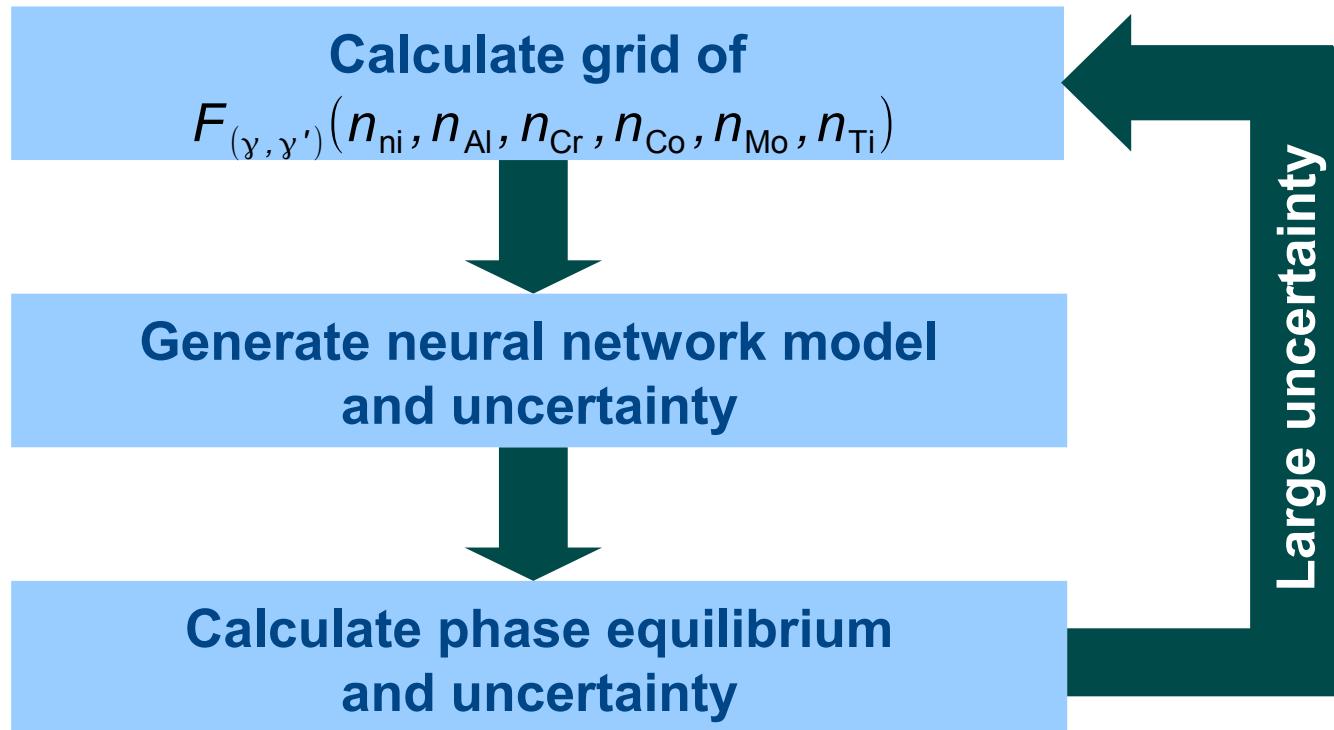


Generate neural network model
and uncertainty

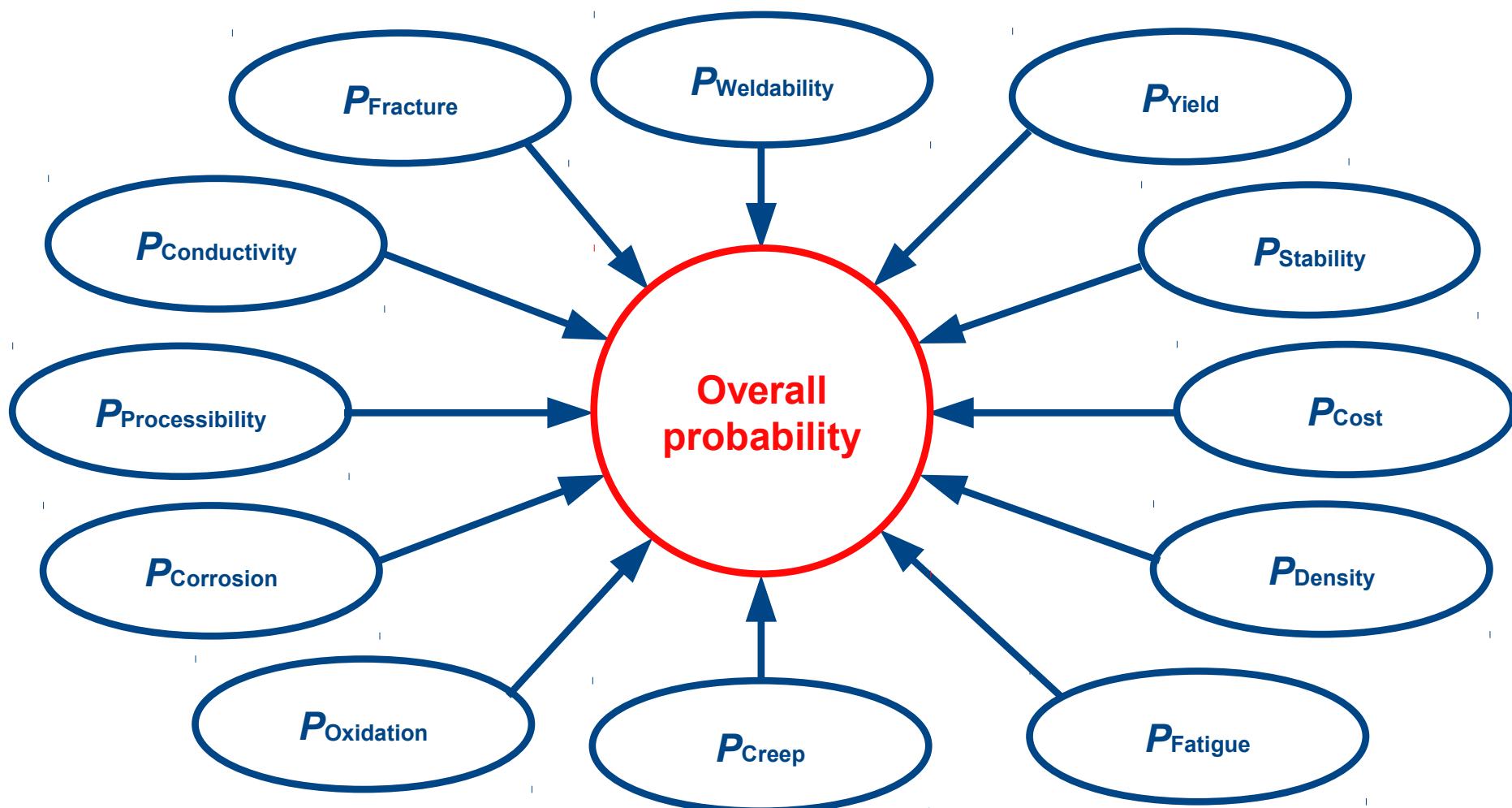
Properties: γ' fraction



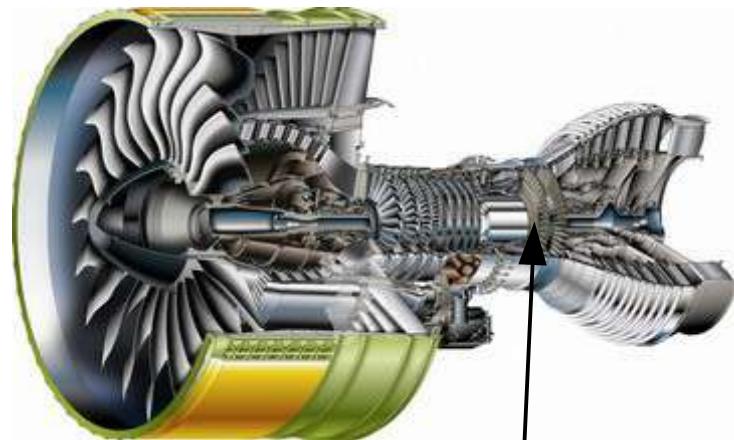
Properties: γ' fraction



Designing a new material – what is required ?



Concurrent materials design



Disc
alloy

Case study: RR1000

| | | | | | | | | | | |
|--|---|---|---|---|--|---|---|---|---|---|
|  |  |  |  |  |  |  |  |  |  |  |
| Ni | Cr | Co | Mo | Ti | Al | Ta | Hf | C | T | t |
| 52 | 15 | 19 | 5 | 3.6 | 3 | 2 | 0.5 | 0.1 | 800 | 8 |

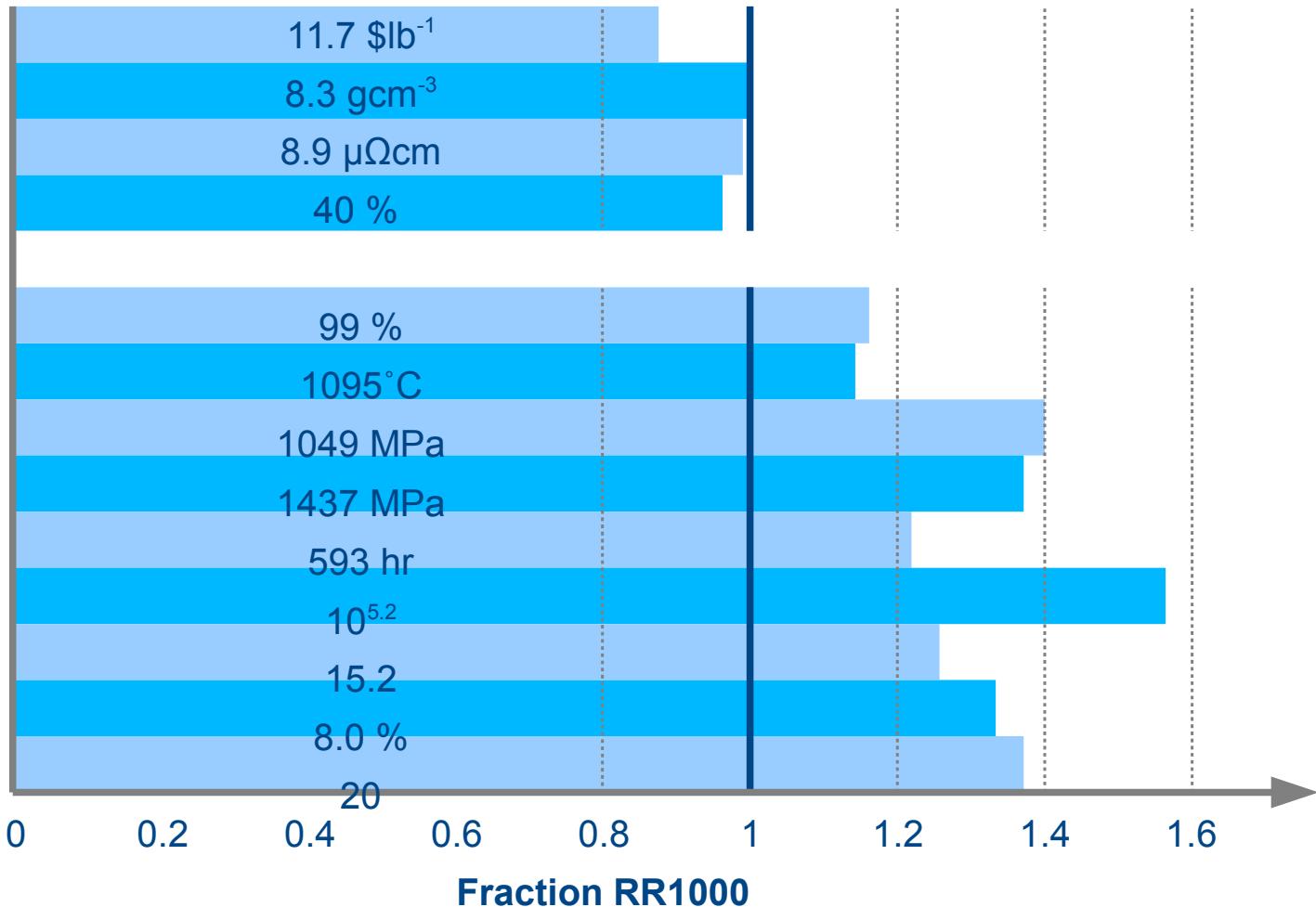
Case study: improved disc alloy

| | | | | | | | | | | | | | | | | | | | | | |
|--|---|---|---|---|--|---|---|---|---|---|-----------|-----------|-----------|-----------|-----------|-----------|-----------|-----------|----------|----------|----------|
|  |  |  |  |  |  |  |  |  |  |  | Ni | Cr | Co | Mo | Ti | Al | Ta | Hf | C | T | t |
| 56 | 17 | 1.0 | 4.0 | 1.5 | 4.3 | 0.2 | 0.1 | 0.2 | 980 | 61 | | | | | | | | | | | |

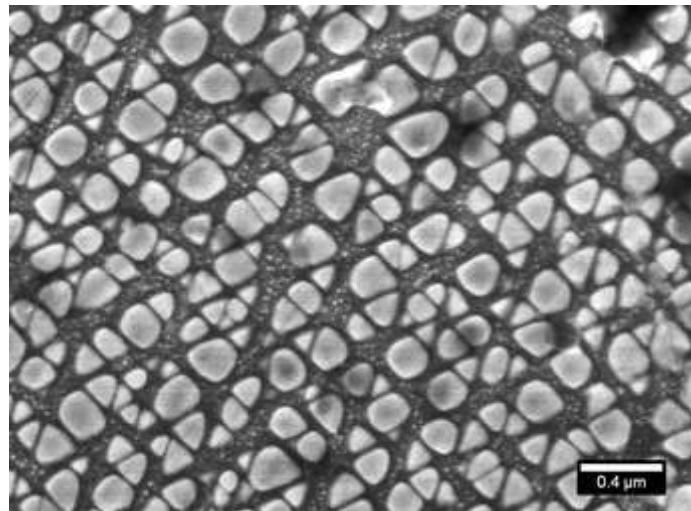
| | | | | | | | |
|--|--|--|--|---|--|--|--|
|  |  |  |  |  |  |  |  |
| W | Mn | B | V | Si | Zr | Nb | Fe |
| 6.0 | 0.1 | 0.1 | 0.1 | 0.1 | 0.2 | 5.6 | 3.4 |

Case study: improved disc alloy

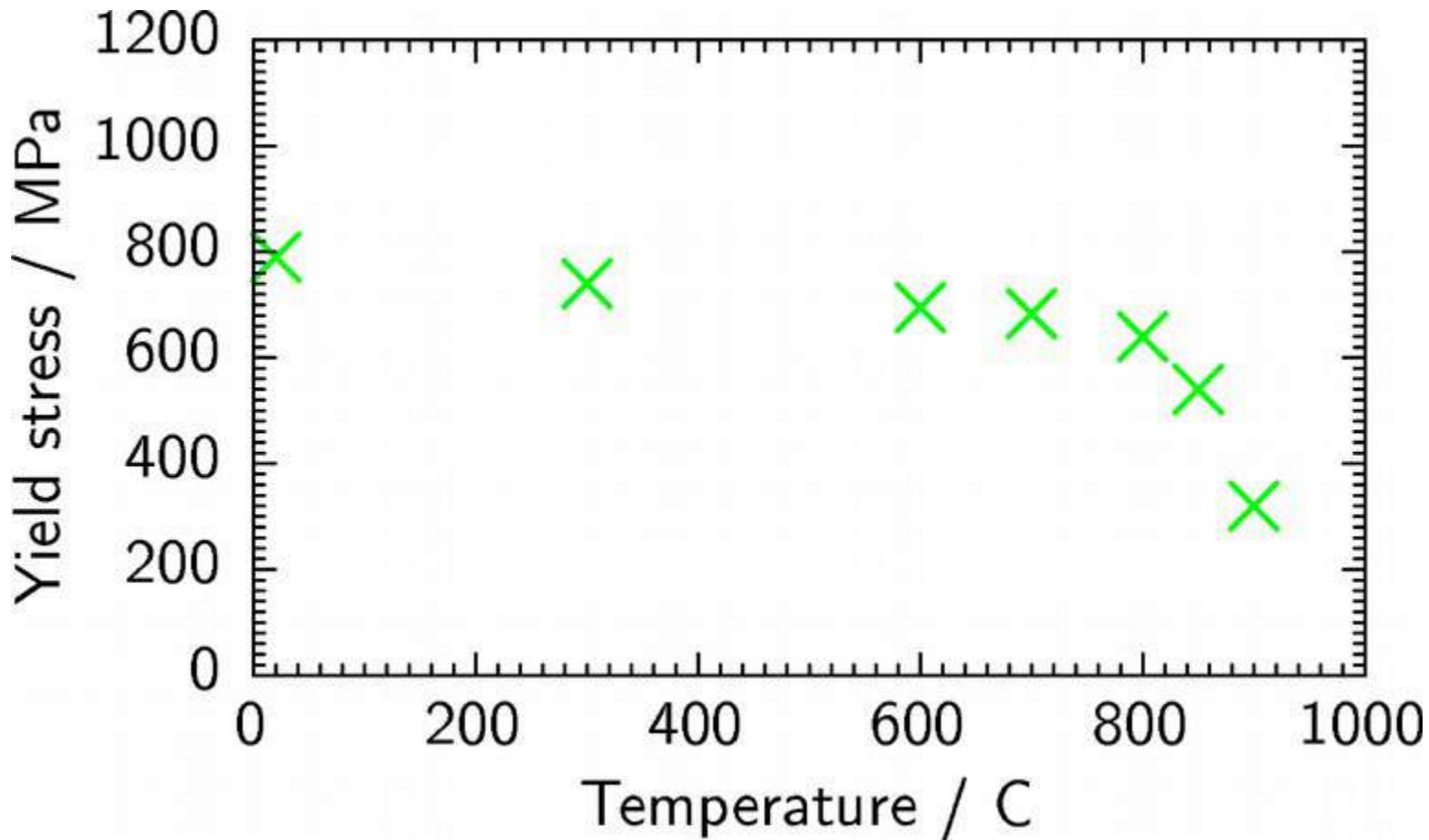
Cost
Density
Resistivity
 γ' precipitate



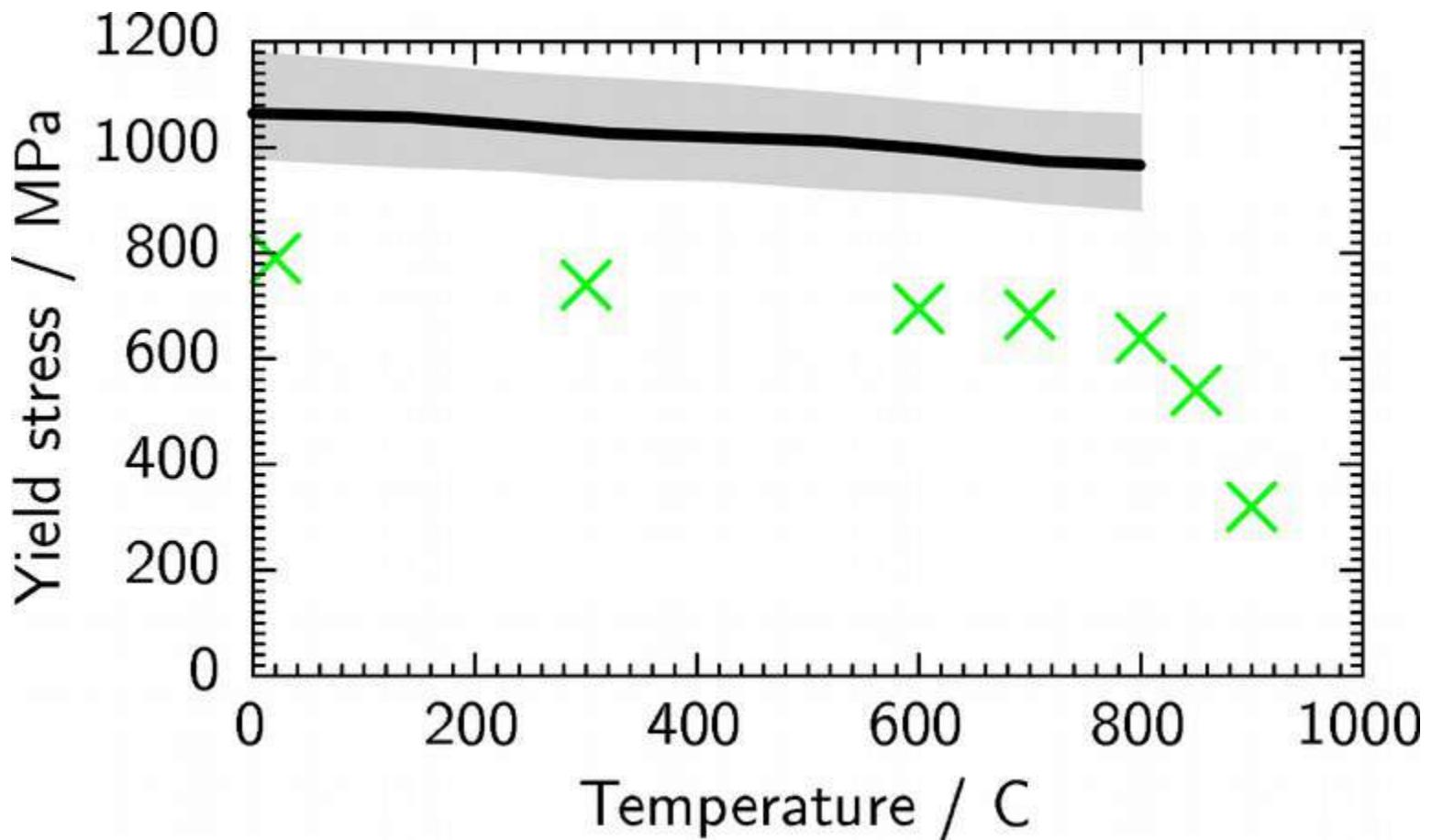
Electron micrograph



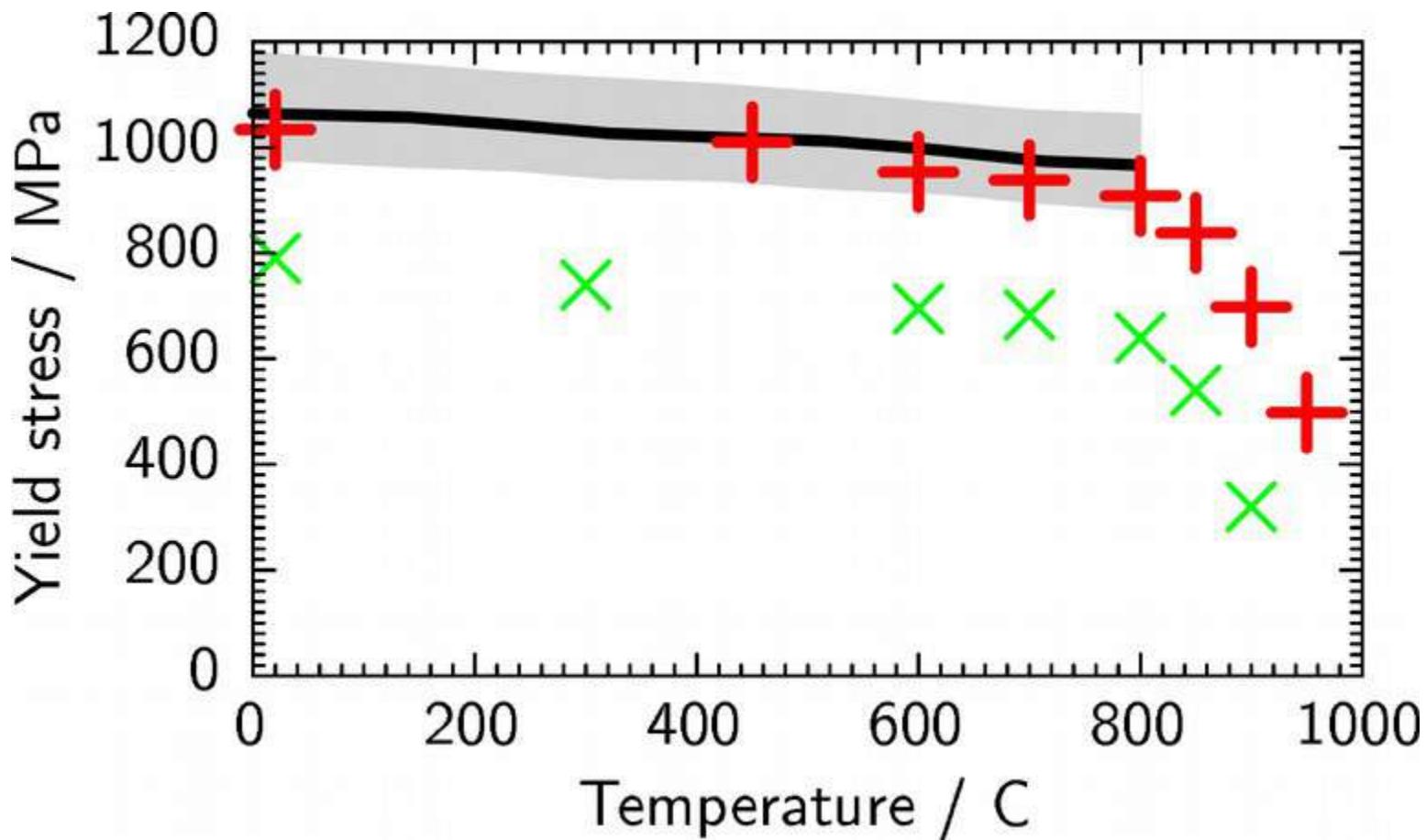
Yield stress



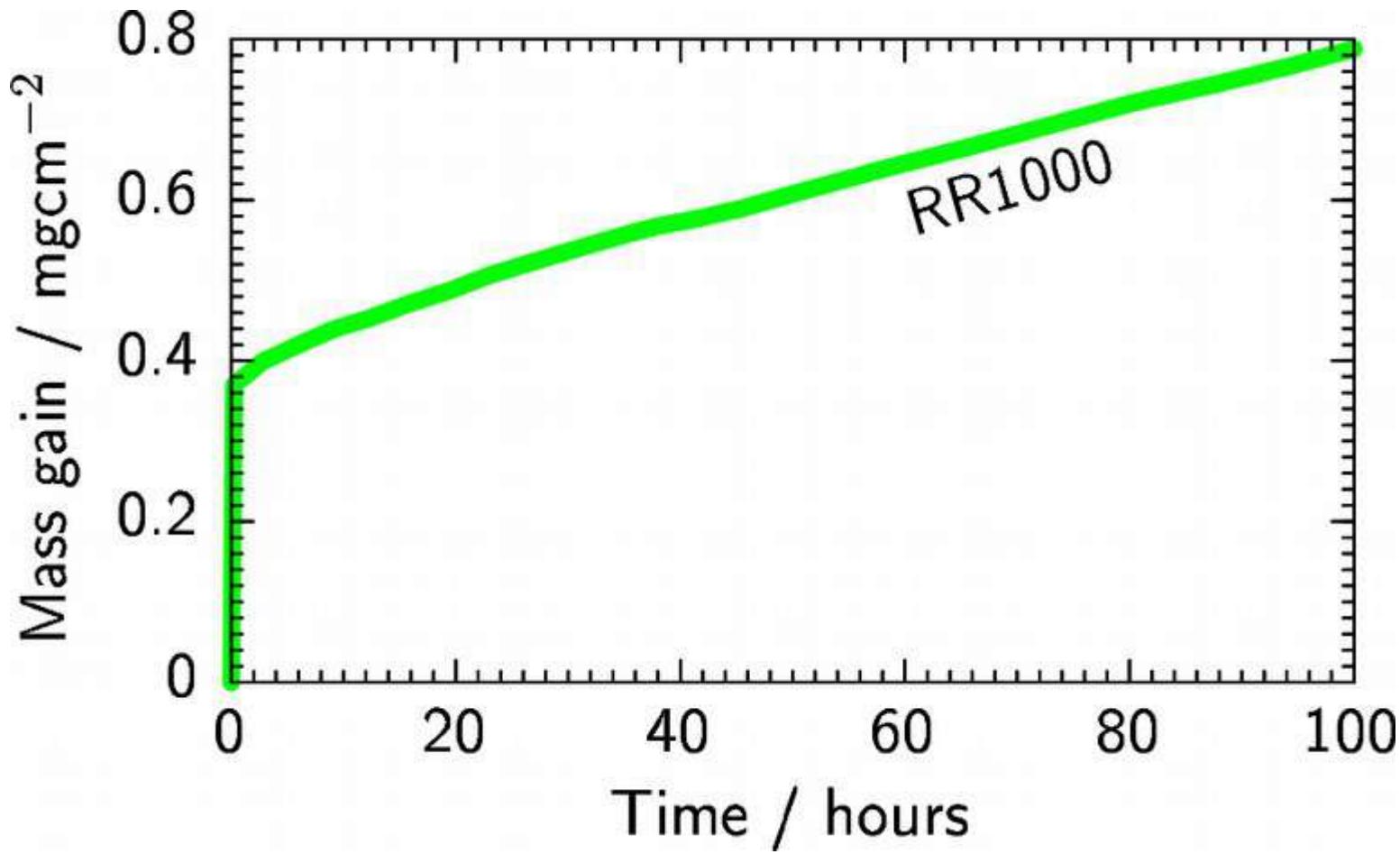
Yield stress



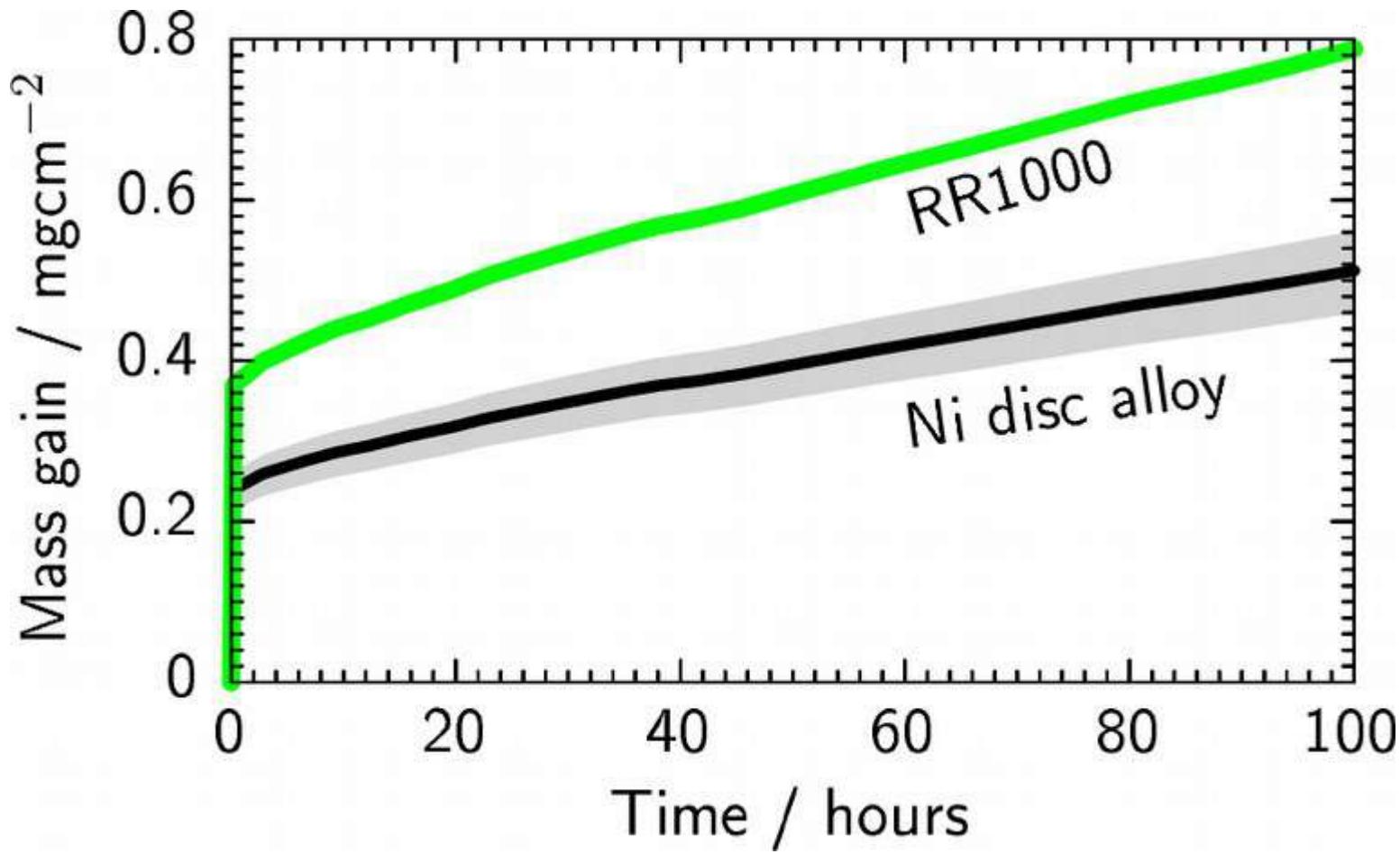
Yield stress



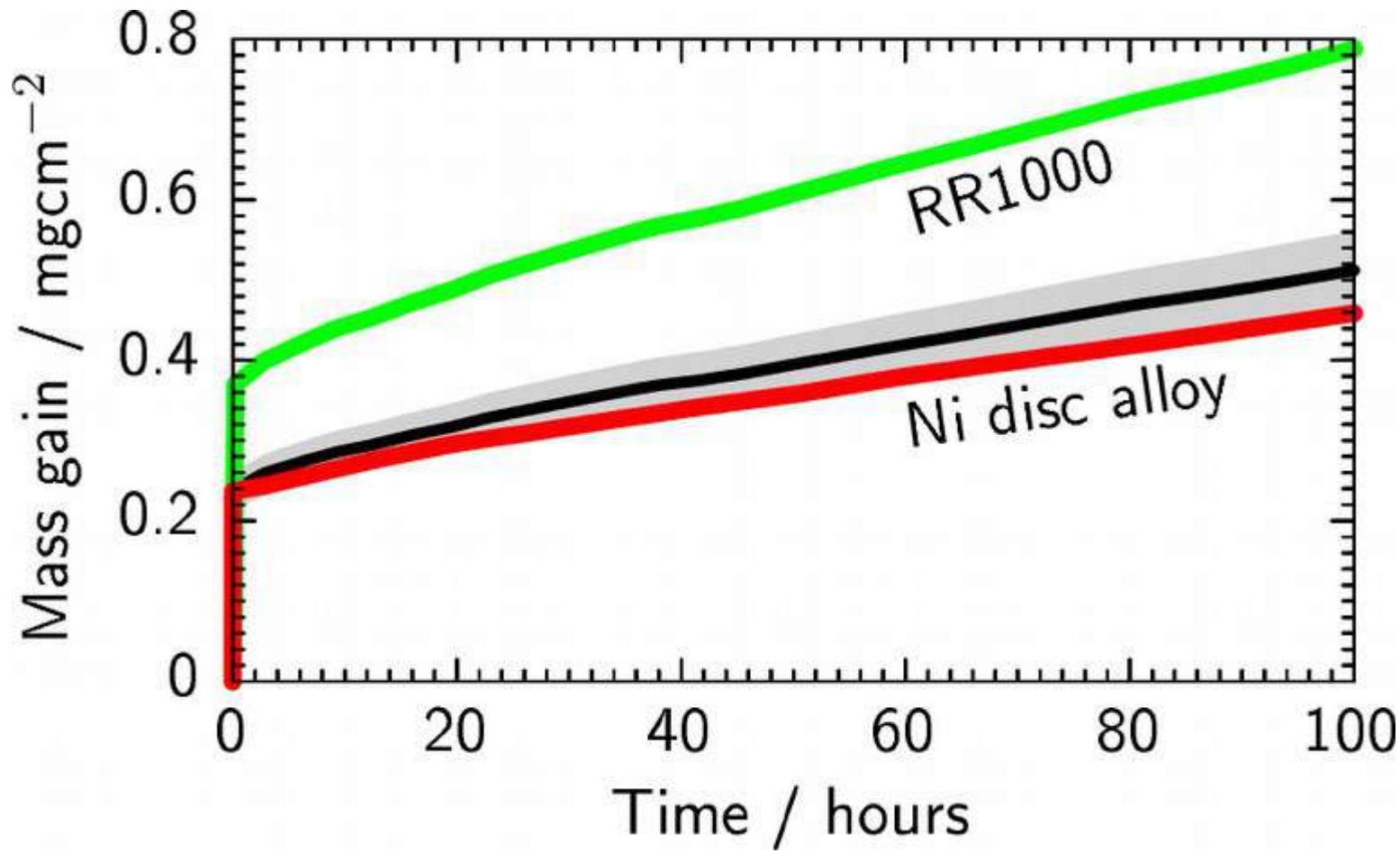
Oxidation



Oxidation

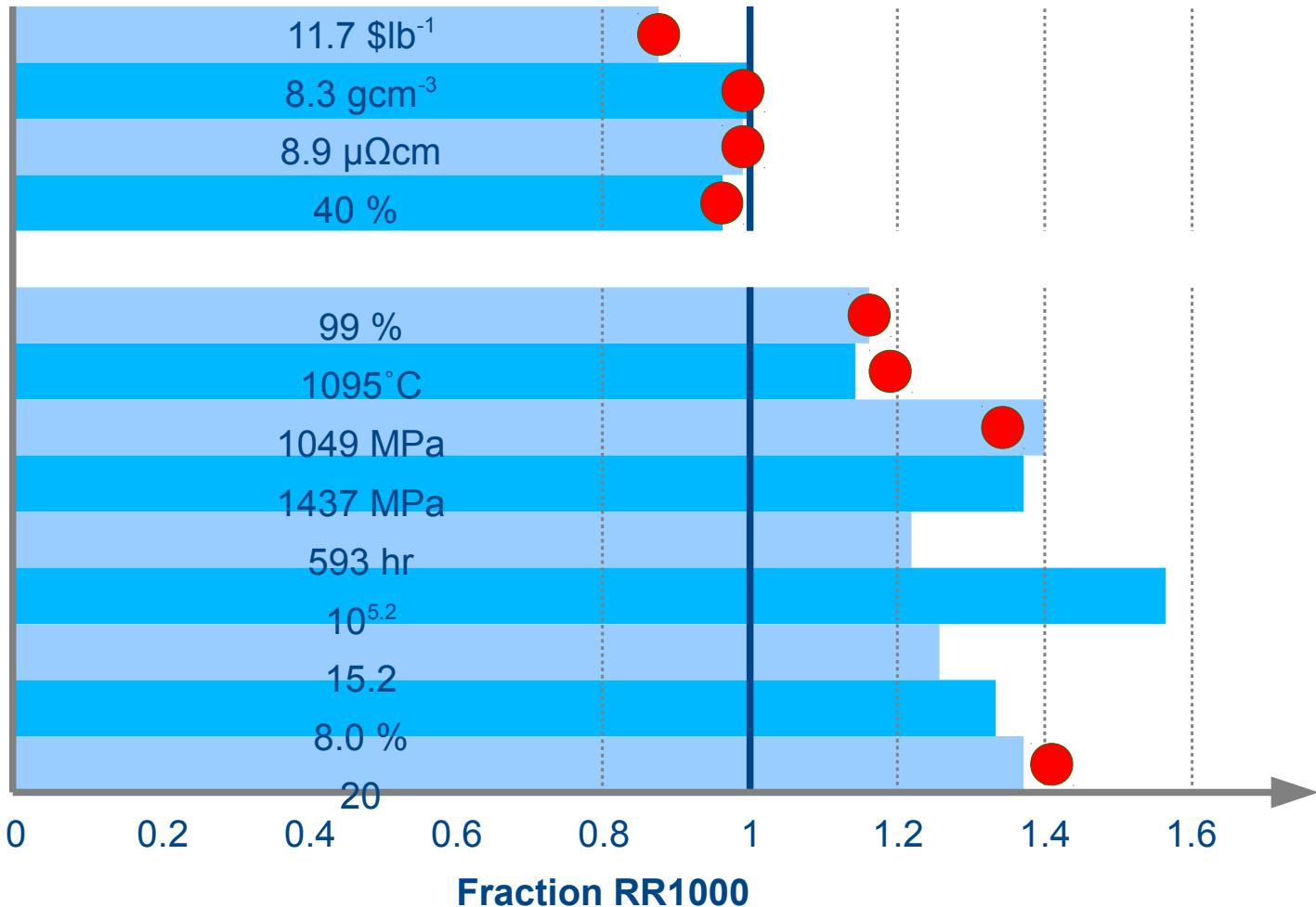


Oxidation

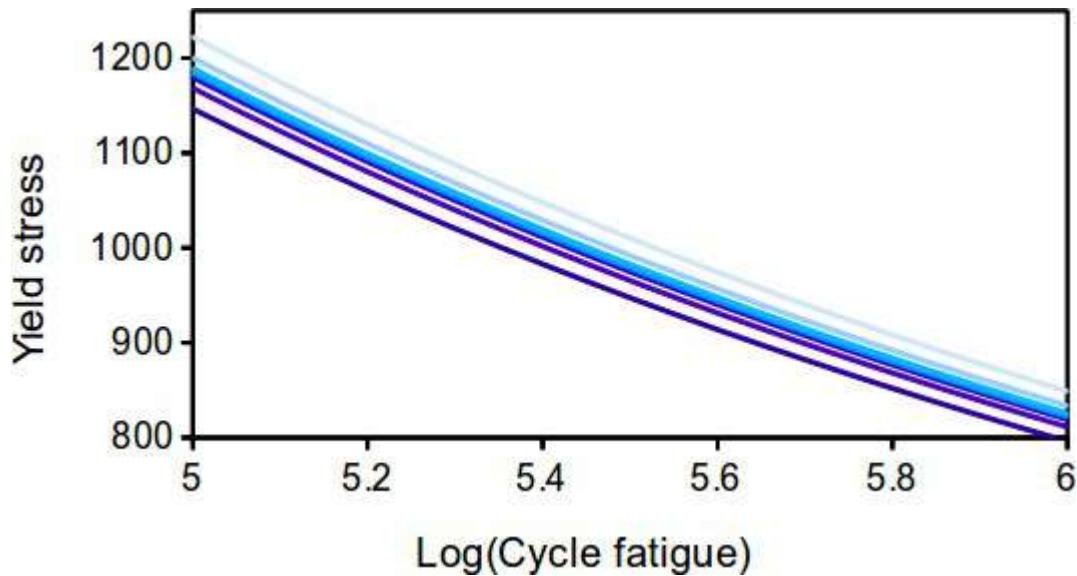


Case study: improved disc alloy

Cost
Density
Resistivity
 γ' precipitate



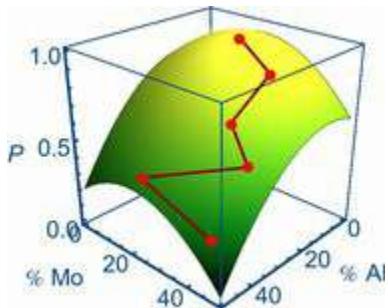
Concurrent materials design



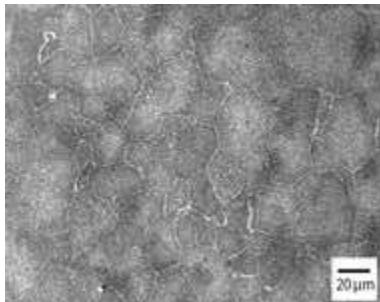
Concurrent materials design

Discovery algorithm

Patent GB1302743.8 (2013)

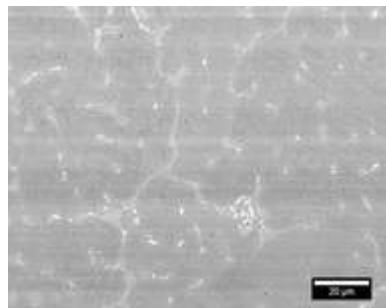


RR1000 grain growth
Acta Materialia, **61**,
3378 (2013)



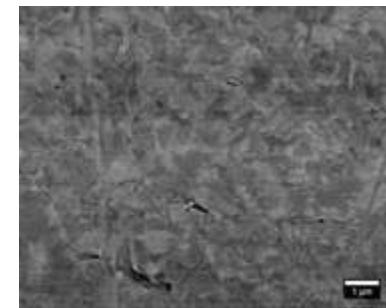
Mo-Hf forging alloy

Patent GB1307533.8 (2013)



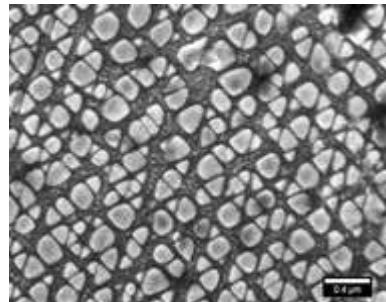
Mo-Nb forging alloy

Patent GB1307535.3 (2013)



Ni disc alloy

Rolls-Royce invention
NC12261 (2012)



Ni combustor liner

Rolls-Royce invention
NC13006 (2013)

