

Preparation, Multiscale Mechanical Characterisation and Simulation of Hybrid Foams and Metamaterials

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Cellular Materials – In General

Challenges in Materials Science

- Increased demand for materials and energy
- Increased requirements on material properties
- **Resource efficiency**
- Application-optimised and multifunctional materials

"When modern man builds large load-bearing structures, he uses dense solids, steel, concrete, glass. When nature builds large load-bearing structures, she generally uses cellular materials: wood, bone, coral. There must be a good reason for it." (Michael F. Ashby, 1984)

Metal foams

= solid foams; artificial porous structures





- (a) corc
- (b) bone
- (c) sea star
- (d) pine wood







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Cellular Materials – In General

- Bio-inspired lightweight materials
- Stochastic 3D network
- Usually made of polymers or Al cast alloys

"When modern man builds large load-bearing structures, he uses dense solids, steel, concrete, glass. When nature builds large load-bearing structures, she generally uses cellular materials: wood, bone, coral. There must be a good reason for it." (Michael F. Ashby, 1984)

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- nature engineering Soul Source: Anne Jung **AG Foams and Metamaterials** Universität des Saarlandes
- Disadvantages: low strength, no multifunctionality

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Cellular Materials – Hierarchical Scales



Global properties are determined by:

- Microstructure
- Properties of the strut material
- Strut geometry

experiments required on all scales







Cellular Materials – Applications

- Lightweight construction: High stiffness to weight ratio
- Energy absorption: Special stress-strain behaviour
- Functional:

Large inner surface, EM shielding ...



Metamaterials

Metamaterials

(Greek Meta = beyond/above):

Mostly artificially produced materials that have properties that do not occur in naturally occurring materials.

Mechanical or structural metamaterials:

- Artificial structures with non-intuitive, unusual mechanical properties
- Properties depend mainly on special geometry
- material with programmable behaviour by varying and optimising the microstructure.



Fig. 2. Basic classification of mechanical metamaterials.



X. Yu, J. Zhou, H. Liang, Z. Jiang, L. Wu

Mechanical metamaterials associated with stiffness, rigidity and compressibility: A brief review Prog. Mater. Sci. 94, 114-173 (2018)

Metamaterials

Metamaterials

(Greek Meta = beyond/above):

Mostly artificially produced materials that have properties that do not occur in naturally occurring materials.

Strong structure-property-relationship

	Young's modulus E Section 5
	 Stretch-dominated octet-truss Micro-/nanolattices — o Bend-dominated tetrakaidecahedron Trichirals
	Chiral/anti-chirals • Chiral systems • Tetrachirals • Chiral systems • Tetrachirals • Chiral systems • Hexachirals • Anti-chiral systems • Anti-trichiral • Anti-chiral systems • Anti-tetrachiral
	 Miura-ori tessellated pattern Origami metamaterials — O Non-periodic Ron Resch pattern Square twist Kirigami
	Cellular origami O Stacked Miura-ori o Interleaved Miura-ori
	Pattern transformation — o Holey sheets o Biholar sheets
Mechanical metamatorials	Shear/bulk moduli <i>G/K</i> Section 6
metamateriais	 Pentamode structure Construction <l< td=""></l<>
	 Negative linear compressibility (NLC) Negative area compressibility (NAC) Negative thermal expansion (NTE)
	Poisson's ratio v Section 7 • Re-entrant structure • Pattern transformation Auxetic • Pattern transformation
	metamaterials Origami

Fig. 2. Basic classification of mechanical metamaterials.





X. Yu, J. Zhou, H. Liang, Z. Jiang, L. Wu

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Cellular Materials – Auxetic Metamaterials

Auxetics

(greek: *auxetikos*

- = "that which tends to increase")
- When stretched, they become thicker perpendicular to the applied force.
- Negative Poisson's ratio

 $=-\frac{\varepsilon_2}{\varepsilon_1}$

• Application:

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- Lightweight construction
- Superior stiffness, energy absorption and toughness
- Ideal for ballistic application



www.applied-auxetics.de







Cellular Materials – Auxetic Metamaterials

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-9.

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AG Foams and Metamaterials

Investigated Materials – Cellular Hybrid Materials

Disadvantages of conventional Al or polymer **foams**: low strength, no multifunctionality \Rightarrow **Ni/PU hybrid foams**



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Hollistic Research Approach

- Synthesis
- **Experimental characterisation**
- Modelling
- Simulation

performed on all scales

Research topics

- Electrochemical synthesis of Ni/Al, Ni/PU hybrid foams, hybrid metamaterials, metal matrix composites
- **Dynamic and quasi-static** experimental and numerical characterisation of microheterogeneous on different scales
- Multiaxial and micromechanical characterisation
- Investigation of localisation and damage





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Ni/PU Hybrid Foams

- Electrodeposition of nickel on polyurethane (PU) foam
- PU foam made electrically conductive by graphite or copper lacquer
- Strong mass transport limitation during electrodeposition
 ⇒ Coating thickness inhomogeneities
- Metal/polymer composite foams



 $\bigcirc \rightarrow \bullet + \bullet$





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A. Jung, H. Natter, R. Hempelmann, E. Lach EP 2261398 Metal foams WO 2010/142436 Metal foams A. Jung & S. Diebels Adv. Eng. Mater. 4, 532-541 (2016)



Mass Transport Limitations Electrodeposition





Bouwhuis et al. *Acta materialia*, *57*(14), 4046-4053.

• Convection





Migration





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A. Jung, D. Klis, F. Goldschmidt J. Magn. Magn. Mater. 378, 178-185 (2015)



AG Foams and Metamaterials



Experimental Setup



Experimental Procedure



Types of Coating Homogeneity Classification



⇒ Investigation of the influences on the different distributions for different coating conditions



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Global Homogeneity: Coating Thickness Distribution in Plane

medium

←

anode distance

high

Density investigation of foam cuboids in plate
 > Volumetric coating distribution







F. Kunz, **A. Jung**

Adv. Eng. Mater., https://doi.org/10.1002/adem.202200262 (2022)



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Local Homogeneity: Coating Thickness Distribution

- Influence of coating parameters:
 - Flow velocity (convective mass transport)
 Overcoating or coating reduction
 - Anode distance (electric field distribution)
 - \Rightarrow lonic migration
- Coating thickness depends on
 - ⇒ Reactor position and foam thickness

(a)

40

35

0

0



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6 – central connection

flow velocity \uparrow

3

5 – minimal flow

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 \leftarrow

anode distance

Scanning Magnetometry Measurements

Portal Scanning Unit

- 650 mm x 650 mm surface measurements
- 210 mm cylindric specimen
- Scattering fields \rightarrow 3 x \varnothing specimen
- LabVIEW[®] Controlling System
 - Adaptive step size: Precision \uparrow + accuracy \uparrow
 - Scanning modes: Line-/ plane-/ volume-scan
 - Microscopic stitching: LabVIEW[®] + Fiji[®]
 - Magnetisation measurement T-compensated
 - Accuracy of the Hall probe: ± 0,01 mT
 - Temperature coefficient -0,04 %/°C
 - But: T-induced magnetisation shift of probe
 - ⇒ Compensation with parallel measurement



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Ferromagnetic Properties of Ni/PU Hybrid Foams

Saturating magnetic field strength?



Magnetisation Measurements in Hybrid Foams

- \varnothing 70 mm x 10 mm (120 μ m coating thickness)
- Produced in small scale reactor with known flow velocity distribution
- Magnetised through saturating magnetic field strength
- Magnetic field distribution shows spatial inhomogeneities
- \Rightarrow Overcoating is also represented in **gravimetry** (but error-prone at small scales)



⇒ Further correlation necessary: Magnetometry & gravimetry & CT with bigger foams (MA Laura Lindner)



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Structural and Experimental Characterisation



Macroscale

uni- and biaxiale material characterisation

- Compression/tensile tests + DIC
- Shear compression tests + DIC
- Pure torsion tests
- Compression-torsion/tension-torsion

Mesoscale

- Optical microscopy
- X-ray CT, time-lapse μCT
- Photogrammetry
- Microcompression/microtensile (pore)

Microscale

- XRD
- EBSD
- Nano-/microindentation
- Microcompression/microtensile (strut) in-situ/ex-situ + DIC



- Drop weight tests + DIC
- SHPB tests + DIC
- Ballistic tests

IR thermography







- Drop weight tests (pore)
- Gas gun tests (pore)
- DIC







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Macroscale



10 mm







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Ni/Al Hybrid Foams – Coating Effect



0.978

Ni coating \implies \uparrow stiffness, \uparrow strength, \uparrow energy absorption, \uparrow mass



per density $[kJ cm^3/kg]$

A. Jung, H. Natter, S. Diebels, E. Lach, R. Hempelmann Adv. Eng. Mater. 13, (1-2), 23-28 (2011)

0.435



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2.2



Ni/Al Hybrid Foams – Functionally Graded Foams

Euro NCAP crash test: 55 km/h

5%

partial

- No energy absorption below
- Not enough energy absorption for higher speeds
- Functionally graded foam as passively controllable energy absorber





gradual

A. Jung, L.A.A. Beex, S. Diebels, S.P.A. Bordas Mater. Des. 87, 36-41 (2015)

0%

5%

0%

uncoated

partial

-20%

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-50%

AI

Full-Field Thermomechanical Analysis of Cellular Materials – Setup

- Uniaxial compression tests Instron ElectroPuls 10000[®]
- Strain rates: 0.025 0.250 s⁻¹

Additional speckle pattern on struts



5 mm

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- CCD camera: Manta G235B, Ltd. AVT
- IR camera: ImageIR 9360, Infratec GmbH



A. Jung, S. Bronder, S. Diebels, M. Schmidt, S. Seelecke Mater. Des. 160, 363-370 (2018)

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Thermographic Analysis of Strain-rate Effects





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A. Jung, S. Bronder, S. Diebels, M. Schmidt, S. Seelecke Mater. Des. 160, 363-370 (2018)



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Thermographic Analysis of Strain-rate Effects

Increasing temperature change with:

- Increasing strain rates
- Increasing Ni coating thickness
- Al \rightarrow Ni

- Al \rightarrow 40 μm Ni: factor of 2.5
- Al \rightarrow 120 μ m Ni: factor of 4.0



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A. Jung, S. Bronder, S. Diebels, M. Schmidt, S. Seelecke Mater. Des. 160, 363-370 (2018)



Deformation Analysis by Thermography and DIC





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A. Jung, S. Bronder, S. Diebels, M. Schmidt, S. Seelecke Mater. Des. 160, 363-370 (2018)



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Automated Correlation of Thermography and UV-DIC





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S. Grednev, S. Bronder, F. Kunz, M. Reis, S.-M. Kirsch, F. Welsch, S. Seelecke, S. Diebels, A. Jung

GAMM-Mitteilungen 45 (3-4), e202200014 (2022)



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Automated Correlation of Thermography and UV-DIC



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Automated Correlation of Thermography and UV-DIC





S. Grednev, S. Bronder, F. Kunz, M. Reis, S.-M. Kirsch, F. Welsch, S. Seelecke, S. Diebels, **A. Jung**

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Uniaxial tension/compression

When does failure occur in the specimen?



Failure occurs

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- Stress larger than yield stress (yielding)
- Stress larger than ultimate tensile strenght (fracture)









Multiaxial loading

When does failure occur in the specimen?



Real components

- Usually form a multiaxial stress state under loading
- e.g. superposition of compression with torsion, multiaxial tensile or compressive stresses or bending with superimposed torsion



3D yield curve? 3D yield stress?





[Seibert2017]

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Russell C. Hibbeler – Technische Mechanik 2 – Festigkeitslehre – 8., aktualisierte Auflage © Pearson 2013



Iв





- Failure under multiaxial loading \Rightarrow yield surfaces needed
- **Yield surfaces**

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- Define elastic and plastic regimes
- Principal stress space (a) \Rightarrow $F(\sigma_1, \sigma_2 \sigma_3)$
- Deviatoric plane (b) \Rightarrow $F(I_1, J_2 J_3)$
- Hydrostatic plane (c) \Rightarrow $F(\theta, zr)$









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• Foams require:

- Closed yield surface ⇒ compressibility
- Difference in compression and tensile failure
 ⇒ shift or asymmetry
- Convexity of the yield surface
- Yield surface of Bier et al. [1]
 - Asymmetric single-surface yield criterion introduced for compacted powder
 - log-log-interpolation of ellipse and exponential function
 - [1] W. Bier, S. HartmannEur. J. Mech. A-Solids 25(6), 1009-1030 (2006)








Multiaxial Loading – Experimental Methodology

Realisation of different shear stress states [0] undeformed with different superimposed loads [0] Specimen preparation of PCS 0.5 stress [MPa] undeformed specimen 0.4 [1] preloading 75% PCS Uniaxial preloading of specimen [1] (% PCS) 50% PCS up to x % of failure stress 25% PCS 10% PCS **Torsional loading** of specimen [2] 0,02 0.06 0.08 up to failure under superimposed strain [-] M_T constant uniaxial loading M_T [2] superimposed torque [Nm] uniaxial load 90° torsion 20 rotation angle [°]







Multiaxial Loading – Experimental Setup

- Cuboid specimens of 10 ppi/20 ppi Al foams and 20 ppi Ni/PU hybrid foams cut from in-plane direction
- Infiltration of open porous foam structure by polymeric resin to guarantee for clamping → remaining height : width = 2:1
- Cuboid specimens
 - ⇒ problem of warping torsion
 - ⇒ Saint Venant torsion with correction factor

$$\tau = \frac{3 + 1.8 \left(depth / widh \right)}{width \cdot depth^2} M \qquad \text{and} \qquad$$

$$\gamma = \frac{depth\,\theta}{height} \left(1 - 0.378 \,\frac{depth^2}{width^2}\right)$$











M. Felten, S. Diebels, **A. Jung** Mater. Sci. Eng. A 791, 139762 (2020)

Multiaxial Loading – Al Foams

- Elliptic, symmetric yield surface for 10 ppi foams
- Equal failure stress for tensile and compression loading
- Highest failure stresses for torsion loading





A. Jung, S. Diebels Mater. Des. 131, 252-264 (2017)





Multiaxial Loading – Al Foams

- Yield surface depends on strut geometry
- 10 ppi: elliptic yield surface

12345

 $10\,\mathrm{ppi}$

 $20\,\mathrm{ppi}$

 $1\,\mathrm{mm}$

-40-

• 20 ppi: asymmetric yield surface

7.0

6.0 ·

5.0 ·

3.0

2.0 -

1.0·

0.0 -

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0.0

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0.1

0.2

0.3

area area

rel.



Multiaxial Loading – Ni/PU Hybrid Foams: Initial Yield Surface

- **Elliptic** yield surface
- ↑ hydrostatic stress component $\Rightarrow \downarrow$ deviatoric stress component
- Yield surface symmetrical to origin of the coordinate system
- Use of Green's yield surface [2]

$$F = \left(\frac{I_1}{a}\right)^2 + \left(\frac{\sqrt{J_2}}{b}\right)^2 - 1 = 0$$









AG Foams and Metamaterials apl. Prof. Dr.-Ing?tDr. Merchafti Anne Jung 215-224 (1972)

Multiaxial Loading – Ni/PU Hybrid Foams: Initial Yield Surface

 [2] R. Green
 Int. J. Mech. Sci. 14(4), 215-224 (1972)



Microscale

single struts



Mesoscale



single pores



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Micromaterial Properties

- Global properties depend on strut material and microstructure
- bulk properties significantly differ from those measured at single struts due to
 - different cooling rates
 - surface-to-volume ratio

SEM with

- imperfections

...



element mapping





 Micromechanical testing very challenging
 ⇒ Pionieering work in this field



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A. Jung, Z. Chen, J. Schmauch, Ch. Motz, S. Diebels Acta Mater. 102, 38-48 (2016)









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M. Reis, K. König, S. Diebels, **A. Jung** Materials 13 (17), 3746 (2020)



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Universal Microtesting Device



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M. Reis, K. König, S. Diebels, **A. Jung** Materials 13 (17), 3746 (2020)



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Photogrammetry for 3D Model Generation

- Alternative method to create 3D models
- Procedure:
 - Print calibration target (1.5 x specimen size)
 - Place specimen in the center
 - Pictures 360° around the specimen
 - Under two different angles to the horizontal
- Custom made chamber
 - Guarantee reproducibility
 - Fix mounting points
 - Automated rotation









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Photogrammetry for 3D Model Generation



Custom-build device

Images from all sides



Crop & enhance contrast



Create mask to separate background

Commercial software 3DSOM™



Creation of a 3D surface model (3DSOM[™])

Transformation in volume mesh (e.g. LSPrepost™)



FE simulation Inverse calculation



Geometry information (e.g. cross-section)



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Stochastic Analysis

- CT model of a 10 ppi metal foam
- Strut length for entire foam (grey)
- Strut length for microsphere categories (corresponding to microsphere colors)
- Struts length increases with category

2.0



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T. Bleistein, M. Reis, X. Cheng, C. Redenbach, S. Diebels, A. Jung Mech. Mater. 142, 103295 (2020)

20

15

10

5

0

0.0

relative frequency [%]

Ø 1.83 mm

1.0

Material Parameters From Struts

Tensile experiment

20

15

force [N]

5

0

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- Strain using DIC (**D**igital Image **C**orrelation)



strain

eng



Material Parameters From Struts

Compression experiment

- Strain using DIC (**D**igital Image **C**orrelation)
- Stress using slices through 3D geometry model

eng. strain [-] -0.26 -0.22 -0.18 -0.14 -0.10 -0.06 -0.02 0.02





Material Parameters From Individual Pores

- Bulk material properties differ significantly from strut properties bulk ≠ strut
- Development of universal microtesting device for individual pores and struts



Pore preparation





Universität des Saarlandes Lehrstuhl für Technische Mechanik A. Jung, M. Wocker, Z. Chen, H. Seibert Mater. Des. 88, 1021-1030 (2015)



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Material Parameters From Individual Pores









S. Heinze, T. Bleistein, A. Düster, S. Diebels, **A. Jung** Z. Angew. Math. Mech. 98, 682-695 (2018)





Material Parameters From Individual Pores

• Digitalisation of 6 pores









pore 1



FR

pore 3

pore 4

pore 6

- FE simulation of compression tests
- Parameter identification by inverse calculation

pore 5





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Parameter idenification by inverse calculation



Optimized material parameters



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S. Heinze, T. Bleistein, A. Düster, S. Diebels, A. Jung Z. Angew. Math. Mech. 98, 682-695 (2018)



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Simulation and

Topology Optimisation





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How does the Yield Surface of Chiral Auxetic Materials look like?



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Chiral Auxetic Structures – Multiaxial Loading (Simulation)

- Explicit solver in LS-DYNA®
- Elasto-plastic with hardening
- Material parameters calibrated from previous uniaxial tests
- BC similar to experiments
- Load application to top, bottom and side plates
 - Velocity-controlled (150 mm/s)
 - Force-controlled (torsion with superimposed uniaxial loading, hydrostatic, -250 N/s, 100 N/s)



Material	Density	Young's modulus	Poisson's ratio	fail	MAT-Model	Hard	ening curve
	$[t/mm^3]$	$[N/mm^2]$	[-]			$(arepsilon_{ m pl} \ { m ag} \ [-]$	${ m gainst} \; \sigma_{ m yield}) \ [m N/mm^2]$
Steel	7.850e-09	2.100e + 05	0.3	-	$MAT_{-}001$		-
Structure	2.670e-09	7.000e + 04	0.3	0.04	MAT_024	0	210
						0.05	520
						0.95	10

Chiral Auxetic Structures – Uniaxial Loading

Brittle failure under tensile and compression loading

 $\varepsilon_{ten.} \approx 0.06 < \varepsilon_{comp.} \approx 0.10$

 \Rightarrow earlier failure under tensile loading

- Yield point = Plastic collapse stress (PCS) $\sigma_{y,ten.} \approx 2.55 \text{ MPa} < \sigma_{y,comp.} \approx 2.05 \text{ MPa}$
- Higher stiffness and higher yield point for tensile loading
- 9 oscillations in compression curve \rightarrow 9 unit cells



ε[-] 3





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Chiral Auxetic Structures – Torsion with Superimposed Uniaxial Loading



- Max. shear angle and max. torque: torsion + tension > torsion + compression
- \uparrow superimposed uniaxial load (tens./comp.) $\Rightarrow \downarrow$ max. torque (much lower effect for tension)
- \Rightarrow Structure more stable under tensile loading







Chiral Auxetic Structures – Determination of Yield Surface

- Non-convex yield surface
- Shift along hydrostatic axis to tensile side for combinded torsion + uniaxial loading
 BUT: nearly symmetric for biaxial and triaxial loading to shear axis
- Torsion + tension provides better shear stability than torsion + comp.
- Splitting of yield points for biaxial and triaxial loading
- Larger stability under tensile loads and combined tensile loads









Chiral Auxetic Structures – Energy Absorption Capacity (EAC)



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Chiral Auxetic Structures – Poisson's Ratio



- Poisson's ratio for torsion + compression and torsion + tension \approx -0.2
- Strong increase in Poisson's ratio from start of torsional loading



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Naterial behavio, FEM Neural Network 6 Approximates Training Data calculate Energy Е parameterised mode Find minimum New **Parameters** Energy No stim/ 20 15 10 Stop? Geometry Yes **AG Foams and Metamaterials** Universität des Saarlandes -66apl. Prof. Dr.-Ing. Dr. rer. nat. Anne Jung Lehrstuhl für Technische Mechanik

Auxetics - Optimisation with Neural Networks

Neural Networks

- Supervised machine learning algorithm
- Consisting of layers of artificial neurons
- Artificial Neurons:
 - Take multiple input values
 - Calculate weighted sum plus bias
 - Apply activation function
 - Output single value
- For any function f(x), there exists a neural network that approximates it closely

Input Layer Hidden Layer **Output Layer** x_0 $o = f(\sum w_i x_i + b)$ x_1 $\sum w_i x_i + b$ activation function f







Modified Auxetic - Parameterised Model

- Re-entrant honeycomb based
- 5 geometry parameters:
 - pore size
 - Strut thickness
 - Strut waist
 - Re-entrant angle
 - Length of halfstrut
- Half strut provides additional stability after reaching contact

	waist [mm]	strut thickness [mm]	pore size [mm]
min (-1)	0.5	0.5	7
max (1)	1.5	1.5	20



- Varies 3 out of 5 geometry parameters
- Establishes:
 - Impact on energy absorption capacity + Poisson's ratio
 - Interaction between parameters





S. Bronder, F. Herter, A. Röhrig, D. Bähre, **A. Jung** Adv. Eng. Mater. 24 (1), 2100816(2022)



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Factorial Testing Plan

Small structure + thick struts \Rightarrow E + ν

///







777

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-1 -1 -1

-1 -1

1 -1

1 -1

-1 1

1

1

0.4

1 1

-1

1 -1

1 1

-1

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Factorial Testing Plan - Experimental Results

- Simulation overestimates results
- Overall tendencies intact
- small waisted structure best compromise

	parameter level	ν_{exp} [-]	ν_{sim} [-]	A _{exp} [mJ mm ⁻³]	A _{sim} [mJ mm ⁻³]	
small	-1-1-1	-0.4	-0.33	0.137	0.201	
	1-1-1	0.13	0.03	1.564	1.456	
	1 1-1	0.16	0.01	3.443	3.246 🙀	
	-1 1-1	-0.22	-0.45	0.313	0.529	
large	-1-1 1	-0.51	-0.64	0.002	0.007	
	1-1 1	-0.4	-0.67	0.009	0.022	
	111	-0.36	-0.44	0.141	0.249	
	-111	-0.34	-0.41	0.013	0.029	





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Specimen manufacturing

- Manufacturing with SLM
- Aluminium as base material
- Production process optimised
 - \Rightarrow Material parameter differ
 - ⇒ Material model needs recalibrating



SLM parameter [unit]	value
laser wave length [nm]	1064
laser Power [W]	250
scan speed [mm s ⁻¹]	2000
layer thickness [µm]	30
laser hatch distance [mm]	0.114
scanning strategy	"total fill"





S. Bronder, F. Herter, D. Bähre, **A. Jung** Materials Today Communications 32, 103931 (2022)





Prediction and Optimisation by Neural Network





S. Bronder, F. Herter, D. Bähre, **A. Jung** Materials Today Communications 32, 103931 (2022)



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Thanks to my Group



Michael Fries, M.Sc.

Optimierung einer additiv gefertigten porösen NiTi-Struktur für den Einsatz als Kühlelement unter kompressiver Belastung, since November 2022



Markus Felten, M.Sc.

Experimentelle Untersuchung der dynamischen und quasistatischen mechanischen Materialeigenschaften offenporiger Metallschäume, since February 2021



Dipl.-Ing. Farshad Daneshpazhoonejad

Thermomechanisch-gekoppelte Simulation selbstfortschreitender Reaktionen in Ni/Al-Multilagen, since June 2020

Francesco Kunz, M.Sc.

Hybridmetallschäume – Untersuchung und Optimierung des elektrochemischen Beschichtungsprozesses, since November 2019



Stefan Bronder, M.Sc.

Modellierung und Optimierung von mechanischen Metamaterialien mittels Neuronaler Netze, since June 2019



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AG Foams und Metamaterials



Thank you for your attention



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