

### SCHRIFTENREIHE DES LEHRSTUHLS FÜR SYSTEMDYNAMIK UND PROZESSFÜHRUNG

Band 4/2024

Jesús David Hernández Ortiz

# Energy optimization of the steelmaking process in an electric arc furnace









## Energy optimization of the steelmaking process in an electric arc furnace

## Zur Erlangung des akademischen Grades eines **Dr.-Ing.** von der Fakultat Bio- und Chemieingenieurwesen der Technischen Universität Dortmund genehmigte Dissertation

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Tag der mündlichen Prüfung: 27.09.2023

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#### Dortmund, 2023

Schriftenreihe des Lehrstuhls für Systemdynamik und Prozessführung herausgegeben von Prof. Dr.-Ing. Sebastian Engell

Band 4/2024

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D 290 (Diss. Technische Universität Dortmund)

Shaker Verlag Düren 2024

#### Bibliographic information published by the Deutsche Nationalbibliothek

The Deutsche Nationalbibliothek lists this publication in the Deutsche Nationalbibliografie; detailed bibliographic data are available in the Internet at http://dnb.d-nb.de.

Zugl.: Dortmund, Technische Univ., Diss., 2023

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Printed in Germany.

ISBN 978-3-8440-9509-8 ISSN 1867-9498

Shaker Verlag GmbH • Am Langen Graben 15a • 52353 Düren Phone: 0049/2421/99011-0 • Telefax: 0049/2421/99011-9 Internet: www.shaker.de • e-mail: info@shaker.de

#### Abstract

Steel production via electric arc furnaces (EAFs) is a very energy-intensive process that accounts for almost 25% of the total crude steel production worldwide. In modern steelmaking, finding an economically beneficial mode of operation that reduces the energy consumption and the environmental impact of the process is the priority. In practice, however, achieving this goal is a challenging endeavor as the process is still not well understood and industrial operations rely strongly on the experience of the operating crews.

To address this challenge, this thesis presents a model-based optimization strategy that can reduce the energy demand of the EAF process. First, mathematical models of an electric arc and of an electric arc furnace were developed and used to answer two fundamental questions: a) How do the electrical setpoints of the furnace affect the geometry of the arc and the heat exchange between the arc and the metal phases in the furnace?, and b) How do various operative setpoints affect the melting dynamics of the process?. The developed models were validated using experimental and process data of an industrial ultra-high-power EAF.

Second, a dynamic optimization framework (DO) with the goal to minimize the electrical losses of the process is proposed. Two important operational questions were addressed: a) What is the optimal operation strategy that reduces the energy demand of the process?, and b) How can dynamic optimization and scheduling be integrated to achieve an optimal operation of the steelmaking plant?. The DO problem is solved using a control vector parametrization strategy that computes an optimal input trajectory for a batch of steel that consists of several charges. The computed control policy was tested in an industrial EAF, and the energy consumption of the process was reduced by 4.5% for a family of steels.

#### Kurzfassung

Die Stahlerzeugung durch Elektrolichtbogenöfen (EAFs) ist ein sehr energieintensiver Prozess, der fast 25% der gesamten Rohstahlproduktion weltweit ausmacht. In der modernen Stahlerzeugung steht die Suche nach einer wirtschaftlich günstigen Betriebsweise im Vordergrund, die den Energieverbrauch der Anlage und die Umweltauswirkungen des Prozesses reduziert. In der Praxis ist das Erreichen dieses Zieles jedoch ein herausforderndes Unterfangen, da der Prozess immer noch nicht vollständig durchdrungen ist und der Betrieb in den Stahlwerken stark durch die Erfahrung der Anlagenfahrer bestimmt ist.

Um diese Herausforderung zu bewältigen, stellt diese Arbeit eine modellbasierte Optimierungsstrategie vor, die den Energiebedarf des EAF-Prozesses reduzieren kann. Zunächst wurden ein Lichtbogen-Modell und ein vollständiges EAF-Modell entwickelt. Die Modelle wurden verwendet, um vier grundlegende Fragen zu beantworten: a) Wie wirken sich die elektrischen Sollwerte des Ofens auf die Geometrie des Lichtbogens und den Wärmeaustauschaus?; b) Wie wirken sich verschiedene operative Sollwerte auf die Schmelzdynamik des Prozesses aus?; c) Was ist die optimale Betriebsstrategie, die den Energiebedarf des Prozesses reduziert?; und d) Wie können dynamische Optimierung und Planung integriert werden, um einen optimalen Betrieb zu erreichen? Die entwickelten Modelle wurden anhand von Versuchs- und Prozessdaten eines industriellen Ultrahochleistungs-EAF validiert.

Weiter wird ein dynamischer Optimierungsansatz mit dem Ziel, die elektrischen Verluste des Prozesses zu minimieren, vorgeschlagen. Die Lösung basiert auf der Steuerungsvektor-Parametrisierungsstrategie, und berechnet eine optimale Fahrweise für eine Reihe von Chargen, die in dem Ofen hintereinander bearbeitet werden. Die berechnete Fahrstrategie wurde in einem industriellen EAF getestet und der Energieverbrauch des Prozesses wurde für eine Gruppe von Stählen um 4,5% reduziert.

#### Acknowledgments

First, I would like to express my gratitude to my supervisor Prof. Dr-Ing. Sebastian Engell for his guidance, input, commitment, and support.

I am also very grateful to the management team of the meltshop at Acciai Speciali Terni for having facilitated my work at the plant and for having allowed me to test in the production EAF the results of this thesis. I would like to specially thank Dr. Luca Onofri for his support and confidence in my work, to Mauro Grifoni and Lucio Mancini for all the shared knowledge in steelmaking, and to all the operators of the EAF that helped me during the validation tests.

Financial support is gratefully acknowledged from the Marie Skłodowska Curie Horizon 2020 EID-ITN project "PROcess NeTwork Optimization for efficient and sustainable operation of Europe's process industries taking machinery condition and process performance into account – PRONTO", Grant agreement No 675215.

#### List of publications

The work carried out in this thesis led to the following publications:

#### Journal articles

- J. D. Hernández, L. Onofri, S. Engell, S., Numerical Estimation of the Geometry and Temperature of an Alternating Current Steelmaking Arc, Steel. Res. Int., Vol. 92, 3, pp. 202000386(1-17), 2020.
- T. Hay, J. D. Hernández, S. Roberts, T. Echterhof, Calculation of View Factors in Electric Arc Furnace Process Modeling, *Steel. Res. Int., Vol.* 92, 2, pp. 202000341(1-14), 2020.
- J. D. Hernández, L. Onofri, S. Engell, S., Modeling and energy efficiency analysis of the steelmaking process in an electric arc furnace, *Metall. Mater. Trans. B*, 53, pp. 3413–3441, 2022.

#### Conference papers

- 4. J. D. Hernández, L. Onofri, S. Engell, Detailed modelling of radiative heat transfer in Electric Arc Furnaces using Monte Carlo techniques, in Proc. of the 8th Int. Conf. on Modeling and Simulation of Metallurgical Processes in Steelmaking (STEELSIM 2019), Toronto, Canada, pp. 295–306, 2019.
- J. D. Hernández, L. Onofri, S. Engell, Model of an Electric Arc Furnace Oxy-Fuel Burner for dynamic simulations and optimization purposes, in Proc. of the 18th IFAC Symposium on Control, Optimization and Automation in Mining, Mineral and Metal Processing (IFACMMM2019), Stellenbosch, South Africa, Published in: *IFAC-PapersOnLine, Vol. 52*, 14, pp 30-35, 2019.
- J. D. Hernández, L. Onofri, S. Engell, Optimization of the electric efficiency of the electric steelmaking process, in Proc. of the 21st IFAC World Congress, Berlin, Germany, Published in: *IFAC-PapersOnLine*, *Vol. 53, 2, pp. 11895-11900*, 2020.
- J. D. Hernández, L. Onofri, S. Engell, Energy optimization of the electric arc furnace for operations at a fixed electrical power level, in Proc. of the 19th IFAC Symposium on Control, Optimization and Automation in Mining, Mineral and Metal Processing (IFAC MMM2022), Montreal,

Canada, Published in: IFAC-PapersOnLine, Vol. 55, 21, pp. 144-149, 2022.

#### **Book chapters**

 J. D. Hernández, L. Onofri, S. Engell, Ch.4 Integrated modeling and energetic optimization of the steelmaking process in electric arc furnaces: An industrial application, in *Simulation and Optimization in Process Engineering. The Benefit of Mathematical Methods in Applications of* the Chemical Industry, Edited by: Michael Bortz and Norbert Asprion, pp. 77–100, Elsevier, 2022

#### Oral presentations

- 9. J. D. Hernández, On the importance of the heat exchange modeling assumptions in electric arc furnace process models, in the 4th European academic symposium on EAF steelmaking, 16-18 June 2021, Aachen, Germany.
- J. D. Hernández, L. Onofri, S. Engell, Energy optimization of the electric arc furnace for operations at a fixed electrical power level, in the 12th European electric steelmaking conference, 13–15 September 2021, Sheffield, UK.

#### Co-authored publications not part of this thesis

 G.C. Dalle Ave, J. D. Hernández, I. Harjunkoski, L. Onofri, S. Engell, Demand Side Management Scheduling Formulation for a Steel Plant Considering Electrode Degradation, in Proc. 12th IFAC Symposium on Dynamics and Control of Process Systems, including Biosystems DY-COPS 2019: Florianópolis, Brazil, Published in: *IFAC-PapersOnLine*, *Vol. 52, 1, pp. 691-696*, 2019.

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#### XVIII

## List of Symbols

Symbol	Description
Latin	
$a_{\perp}$	Cross section area of the arc $(m^2)$
$c_{p_{sm}}$	Solid metal heat capacity $(kJ \ kg^{-1})$
$c_{p_{mm}}$	Molten metal heat capacity $(kJ \ kg^{-1})$
$c_{p_{(Fe_2O_3)}}$	Oxides heat capacity $(kJ \ kg^{-1})$
$c_{p_{(Fe_{2}or)}}$	Iron heat capacity $(kJ \ kg^{-1})$
$c_{p_{O_2}}$	Oxygen heat capacity $(kJ \ kg^{-1})$
$c_{p_{CO_2}}$	Carbon dioxide heat capacity $(kJ \ kg^{-1})$
$d_c$	Diameter of the cavity created by the arc in the molten
	metal $(m)$
$d_{sl}$	Depth of the slag layer $(cm)$
g	Gravity $(m \ s^{-2})$
h	Height of the hollowed cylinder $(m)$
Э	Axial component of the current density in the arc
	$(A \ m^{-2})$
$k_{m_{sm,1,2,3}}$	Estimated melting rate parameter for the charge num-
	ber 1, 2 and 3 $(-)$
$k_p$	Experimental constant: rate of formation of solid iron
	oxides $(g^2 cm^{-4} s^{-1})$
$k_{sm}$	Thermal conductivity of the solid metal
7	$\begin{pmatrix} kW \ m^{-1} \ K^{-1} \end{pmatrix}$
$l_a$	Length of the arc $(m)$
$l_{a,meas}$	Measured length in the experiments $(cm)$
$m_{sm}$	Mass of solid metal $(kg)$
$m_{mm}$	Mass of molten metal $(kg)$
$n_o$	Depth of the cavity created by the arc in the molten $(1, 1)$
	$ \begin{array}{c} \text{metal} (cm) \\ \text{Dedices of the area (m)} \end{array} $
$r_a$	Radius of the arc $(m)$

Symbol	Description
$r_k$	Radius of the cathode spot in the electrode $(m)$
u(x)	Standard uncertainty in x
$x_i$	Molar fraction of component <i>i</i> in the plasma $(mol_i \ mol_{nlm}^{-1})$
$A_i$	Area of the surface i $(m^2)$
$A_s c$	Total area of the solid metal in contact with the gaseous atmosphere $(m^2)$
E I	Axial component of the electric field in the arc $(V m^{-1})$ Electrical current $(A)$
$I_{Ba}$	Current of the resistive component of the AC arc $(A)$
$J_i$	Radiosity of the surface i
$N_B$	Blowing number (-)
$R_a^{\Sigma}$	Resistive component of the AC arc $(\Omega)$
$R_{eff}$	Internal radius of the hollowed cylinder $(m)$
$R_{fur}$	Radius of the furnace $(m)$
$T_a$	Temperature of the arc $(K)$
$T_f$	Temperature of fusion of the metal $(K)$
$T_i$	Temperature of the surface i in the radiative analysis $(K)$
$T_{mm}$	Temperature of the molten metal $(K)$
$T_{sm}$	Temperature of the solid metal $(K)$
$V_a$	Voltage of the AC arc $(V)$
$V_{R,a}$	Voltage of the resistive component of the AC arc $(V)$
$VF_{i-i}$	View factor from the surface i to the surface j (-)
Z	Zeta score (-)
$Z_{\alpha}$	Impedance of the AC arc $(\Omega)$

#### Greek

$\alpha$	Convexity constant of the NEC computation (-)
$\gamma$	Plasma thickness parameter $(W \ sr^{-1} \ m^{-3} \ S^{-1})$
$\varepsilon_i$	Surface emissivity of the surface i (-)
$\epsilon_N$	Net Emission Coefficient NEC ( $W \ sr^{-1} \ m^{-3}$ )
$\eta_{L_{O_2}}$	Efficiency of the oxygen lancing (-)
$\eta_x$	Efficiency of mechanism of heat exchange x (-)
$\mu_o$	Vacuum permeability ( $m kg s^{-2} m^{-2}$ )
$\Psi$	A-dimensional diameter over depth parameter of the
	arc (-)
$ ho_{sl}$	Density of the slag $(kg \ m^{-3})$

Symbol	Description
$\rho_{mm}$	Density of the molten metal $(kg \ m^{-3})$
$ ho_{sm}$	Density of the solid metal $(kg m^{-3})$
$\sigma_b$	Stefan-Boltzmann constant ( $W m^{-2} K^{-4}$ )
$\sigma(T)$	Electrical conductivity of the plasma $(S)$
$\zeta_{sm}$	Fraction of splashed liquid metal that lands on the solid metal (-)
$\zeta_{mm}$	Fraction of splashed liquid metal that lands in the molten metal (-)
$\zeta_{w/r}$	Fraction of splashed liquid metal that lands on the roof and walls (-)

#### Energy constants

Enthalpy of formation of iron (III) oxide at 25 Deg C.
(kJ)
Enthalpy of fusion of the solid metal $(kJ)$
Enthalpy of reaction from the oxidation of metals in
the liquid phase, due to lanced oxygen $(kJ)$
Enthalpy of reaction from the oxidation of carbon in
the liquid phase due to lanced oxygen $(kJ)$
Low Heating Value of the fuel x $(kJ \ kg^{-1})$

#### Flows of mater

$\dot{m}_{(Fe_{2ox})}$	Rate of generation of oxides in the solid metal $(kg \ s^{-1})$
$\dot{m}_{(O_{2ox})}$	Mass flow rate of oxygen available for the oxidation of
	solid metal from the burners $(kg \ s^{-1})$
$\dot{R}_B$	Total mass of splashed liquid metal due to the oxygen
	lancing $(kg \ s^{-1})$
$\dot{F}_{O_2}$	Oxygen flow rate during lancing $(m^3 s^{-1})$
$\Delta M$	Mass of oxidized material $(kg)$

#### Flows of energy

Energy flow from the arc to the molten metal $(kW)$
Energy flow from the arc to the solid metal for melting
purposes $(kW)$
Energy flow from the burner, convective contribution $\left(kW\right)$

Symbol	Description
$\dot{Q}_{bur\_rad}$	Energy flow from the burner, radiative contribution $(kW)$
$\dot{Q}_{coal}$	Energy flow released by the combustion of coal $(kW)$
$\dot{Q}_{loss}$	Energy flow from the bottom of the EAF to the environment $(kW)$
$\dot{Q}_{L_{O_2}}$	Net energy flow released by the oxidation of liquid metals and carbon dissolved in the bath due to oxygen lancing $(kW)$
$\dot{Q}_{L_M}$	Energy flow due to the oxidation of liquid metal in the liquid phase $(kW)$
$\dot{Q}_{L_C}$	Energy flow due to the oxidation of carbon in the liquid phase $(kW)$
$\dot{Q}_{L_{CO_2}}$	Energy flow to heating up the $CO_2$ gases generated in the bath to the temperature of the molten metal (kW)
$\dot{Q}_{mm\_cond_{sm\_h}}$	Energy flow from the molten metal to the bulk of solid metal via conduction mechanisms $(kW)$
$\dot{Q}_{net sm_m}$	Total energy flow for melting purposes $(kW)$
$\dot{Q}_{net\_sm_h}$	Total energy flow for heating of the solid metal $(kW)$
$\dot{Q}_{net\_mm_h}$	Total energy flow for heating of the liquid metal $(kW)$
$\dot{Q}_{ox_{sm}}$	Energy flow released by the oxidation of solid metals $(kW)$
$\dot{Q}_{smm\_cond_{sm\_h}}$	Energy flow from the solid metal in melting state to the bulk of solid metal via conduction mechanisms (kW)
$\dot{Q}_{sp_{sm}}$	Energy flow from the bath to the solid metal due to splashing $(kW)$
$\dot{Q}_{sp_{w/r}}$	Energy flow from the bath to the roof and the walls due to splashing $(kW)$

#### Other symbols

$cos\phi$	Power factor of the AC arc (-)
$\vec{E}$	Vectorial electric field $(V \ m^{-1})$
ĵ	Vectorial current density $(A \ m^{-2})$

Symbol	Description
Abbreviatio	ons
AC	Alternating electrical current
AOD	Argon oxygen decarburization converter
APC	Advanced process control
BF	Blast furnace
BOF	Blowing oxygen furnace
CAM	Chanel arc model
CFD	Computational fluid dynamics
CVP	Control vector parametrization
DAE	Differential algebraic equation
DC	Direct electrical current
DO	Dynamic optimization
EAF	Electric arc furnace
KPI	Key performance indicator
MHD	Magneto-hydro-dynamic
MINLP	Mixed integer non-linear programming
NEC	Net emission coefficient
NLP	Non-linear programming
OCP	Optimal control problem
ODE	Ordinary differential equation
RMSE	Root mean squared error
UHP	Ultra high power