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Development and Validation of the <u>A</u>dvanced Stage <u>H</u>odgkin Lymphoma (HL) <u>International Prognostication Index (A-HIPI)</u>: A Report from the Hodgkin Lymphoma International Study for Individual Care (HoLISTIC) Consortium

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Conflict of Interest Disclosure

- I hereby declare the following potential conflicts of interest concerning my presentation:
- Consultancy and Honoraria (research or educational): Epizyme; MorphoSys; Hutchmed; Daiichi Sankyo, OncLive; Abbvie; Seattle Genetics, Pharmacyclics; and Novartis
- Research Funding: LLS, ORIEN, and NCI/NIH
- Patents and Royalties: none
- Membership on an Entity's Board of Directors or Advisory Committees: none
- Discussion of off-label drug use: checkpoint inhibitor therapy in frontline

Background

- Prognostic models based on pre-treatment factors can help identify patients with advanced stage classic Hodgkin lymphoma (cHL) who are at increased risk of relapse or death
- The International Prognostic Score (IPS7) has been a standard index in cHL for 25 years
 (A) FFP by IPS-7
- Performance of IPS7 diminished when analyzed in patients treated in the contemporary era
- More sophistication available in prediction model development & validation



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(Hasenclever D, et al. NEJM 1998; Moccia AA et. JCO 2012; Diefenbach CS, et al. BJH 2015; Moons KGM, et al. AIM 2015)

HoLISTIC Consortium

- In 2018, Drs. Parsons and Evens formed an international consortium, HoLISTIC (<u>Ho</u>dgkin Lymphoma International <u>ST</u>udy for Individual <u>Care</u>)
 - <u>https://www.hodgkinconsortium.com/</u>
- 70+ members with expertise in pediatric & adult hematology, epidemiology, imaging, biology, statistics & prediction modeling, and patient advocates
- Individual patient data on >15,000 HL patients from 16 recent, international phase III clinical trials (untreated early and advanced stage HL) and 4 major cancer registries







www.hodgkinconsortium.com



Hodgkin Lymphoma International Study for Individual Care

Enhancing decision support to optimize care for individual patients.







Decision-Making amongst patients, caregivers and providers



Susan Parsons, MD, MRP Tufts Medical Center United States

Purpose of Decision Support?

genome

To help providers and patients assess alternative HL treatment options w/ objective & quantified data re: acute disease-related outcomes and to project incidence & risk of late effects (including quality adjusted long-term survival) nation-Acknowledging: existing long-term follow-up data offer insights, but are not directly relevant due to treatment changes & improvements over time Second, the benefits & risks of different therapies depend in part on individual characteristics (eg, age, sex, disease, etc) - "personalizing" aggregate data for individual patients

Data sources to study the continuum of care for Hodgkin lymphoma patients



Ideal information to study morbidity and mortality across the lifelong time horizon for patients with HL are not available from a single source of data.

Cumulative mortality: US population vs 20,007 individuals with cHL (SEER 17, 2000-2015)



Cumulative mortality as a result of all causes in the general population and classical Hodgkin lymphoma (cHL) population according to age group

Dores GM et al. JCO. 2020

HoLISTIC Timeline

- January 2015 (Boston): idea emerges
- 2015-2017: International stakeholder engagement
- 2018: HoLISTIC officially formed
- 2018-2022: Data sharing agreements and data procurement
- 2019-2022: Common data model created with data dictionary across all sources (standardized, harmonized, and normalized)
- 2021: NCI R01 grant funded \$4M
- 2022: Output: ISHL and ASH (and seminal publication)

HoLISTIC Multi-Source Data

- <u>16 Clinical Studies</u>: US NCI cooperative groups (i.e., SWOG, ECOG, COG), Canada (CCTG), United Kingdom (UK), the EORTC, LYSA (France), FIL (Italy): *N=11,579 pts*
- <u>4 Large HL Registries</u>: Princess Margaret, BC Cancer, Australia, lowa/Mayo SPORE, etc; *N=4,275 HL pts*
- Large community oncology practice (Kaiser, n=620 pts)
- <u>Validation cohorts</u>: St Jude LIFE, Dutch, GHSG (N=20,000+)
- Patient advocate groups: LLS, LRF, Lymphoma Coalition



Harnessing Multisource Data for Individualized Decision Support



Data sets in **BLUE** harness granular acute 3-5 year data, especially involving HL outcomes; data sets in **YELLOW** are enriched with later non-HL events >5-10 years post-therapy.

Abbreviations: HL, Hodgkin lymphoma; PET, positron emission tomography; GHSG, German Hodgkin Study Group.

Modeling Multi-Source Data: Specific Aims



NCI R01262265-01A1 (Parsons/Evens, MPI)



 Develop and validate a modern pre-treatment model to predict progression free survival (PFS) and overall survival (OS) at 5 years in adult patients with newly-diagnosed advanced stage cHL



A-HIPI Population & Data

- Population
 - Adults aged 18 to 65 years
 - Newly diagnosed with stage IIB, III, or IV cHL
- Model development: 4,022 patients from 8 advanced staged cHL trials conducted from 1996 to 2014
 - HD9601, HD2000, UK Stanford V, ECOG2496, SWOG0816, RATHL; HD0801, HD0607
- Model validation: 1,431 patients from 4 cHL cancer registries diagnosed from 1996-2019
 - BC Cancer, Princess Margaret Cancer Centre, Iowa/Mayo SPORE, Australia
 - Treated with curative intent & not treated on a trial above

Outcomes & Potential Predictors

- Outcomes
 - 5-year PFS defined as progression, relapse, or death from any cause
 - 5-year OS defined as death from any cause
- Potential pre-treatment predictors
 - Sex and age at diagnosis
 - Stage, B symptoms, histology, and bulk
 - White blood cell count, absolute lymphocyte count, hemoglobin, albumin, and erythrocyte sedimentation rate
 - Linearity of <u>continuous</u> predictors assessed
 - Multiple imputation used for missing data



Model Development & Validation

- Built separate Cox models for 5-year PFS and OS using backward elimination (p<0.05) to select predictors
- *Discrimination* assessed using Harrell's c-statistic
- *Calibration* assessed by comparing observed and predicted 5-year outcomes by decile of predicted probability
- Internal validation to obtain shrinkage factors to reduce overfitting
- Internal-external validation using leave-one-out cross-validation on trials in development cohort to assess heterogeneity in performance
- Discrimination & calibration of model in external validation cohort assessed (discrimination/calibration of IPS7 in external validation cohort)
- All vis-à-vis TRIPOD recommendations & checklist



Rigorous Predictive Modeling: TRIPOD

- Section/Topic____lter Checklist Item Page Title and abstract Identify the study as developing and/or validating a multivariable prediction model Title D:V 1 the target population, and the outcome to be predicted. Provide a summary of objectives, study design, setting, participants, sample size, 3 Abstract 2 D:V predictors, outcome, statistical analysis, results, and conclusions. Introduction Explain the medical context (including whether diagnostic or prognostic) and D:V rationale for developing or validating the multivariable prediction model, including 5 3a Background references to existing models and objectives Specify the objectives, including whether the study describes the development or 6 3b validation of the model or both. Methods Describe the study design or source of data (e.g., randomized trial, cohort, or D:V 6 4a registry data), separately for the development and validation data sets, if applicab Source of data Specify the key study dates, including start of accrual; end of accrual; and, i 4b D:V 6 applicable, end of follow-up. Specify key elements of the study setting (e.g., primary care, secondary care, 6 5a general population) including number and location of centre Participants 5b 6 ID•V Describe eligibility criteria for participants. 5c D:V Give details of treatments received, if relevant 6 Clearly define the outcome that is predicted by the prediction model, including how 6a 6-7 ln•v Outcome and when assessed. 6b Report any actions to blind assessment of the outcome to be predicted. Clearly define all predictors used in developing or validating the multivariable 7 7a D:V prediction model, including how and when they were measure Predictors Supplement. Report any actions to blind assessment of predictors for the outcome and other 7b predictors page 2 Sample size 8 D·V Explain how the study size was arrived at. 6 Describe how missing data were handled (e.g., complete-case analysis, single 7 and Missing data 9 D:V imputation, multiple imputation) with details of any imputation method. Supplement 7-8 and 10a l n Describe how predictors were handled in the analyses. Supplement Specify type of model, all model-building procedures (including any predictor 7-8 and 10b l D Statistical selection), and method for internal validation. Supplement analysis 8 and 10c For validation, describe how the predictions were calculated. methods Supplement Specify all measures used to assess model performance and, if relevant, to 8 and 10d D:V compare multiple models Supplement 10e Describe any model updating (e.g., recalibration) arising from the validation, if done. N/A N/A Risk groups 11 D:V Provide details on how risk groups were created, if done. Development For validation, identify any differences from the development data in setting 12 6 V vs. validation eligibility criteria, outcome, and predictors Results Describe the flow of participants through the study, including the number of 8-9 and 13a D;V participants with and without the outcome and, if applicable, a summary of the Figure S1 follow-up time. A diagram may be helpful. Describe the characteristics of the participants (basic demographics, clinical Participants 13b D:V Table 1 features, available predictors), including the number of participants with missing data for predictors and outcome. For validation, show a comparison with the development data of the distribution of 13c Table 1 mportant variables (demographics, predictors and outcome) 14a D Specify the number of participants and outcome events in each analysis Model Tables S4 If done, report the unadjusted association between each candidate predictor and development 14b D outcome and S5 Present the full prediction model to allow predictions for individuals (i.e., all Supplement Model 15a D regression coefficients, and model intercept or baseline survival at a given time page 5 specification point). 15b Explain how to the use the prediction model 10 Model 16 D:V 10 Report performance measures (with CIs) for the prediction model. performance 17 v If done, report the results from any model updating (i.e., model specification, model N/A Model-updating performance) Discussion Discuss any limitations of the study (such as nonrepresentative sample, few events Limitations 18 D:V 14 per predictor, missing data). For validation, discuss the results with reference to performance in the development 19a 13-14 data, and any other validation data. Interpretation Give an overall interpretation of the results, considering objectives, limitations, 14 19h results from similar studies, and other relevant evidence. Implications 20 D:V Discuss the potential clinical use of the model and implications for future research. 14 Other information Supplementary Provide information about the availability of supplementary resources, such as study 21 D;V 10.16 information protocol, Web calculator, and data sets. Funding Give the source of funding and the role of the funders for the present study
- TRIPOD Transparent reporting of a multivariable prediction model for individual prognosis or diagnosis
- **DISCRIMINATION:** how well a model differentiates those at higher risk of having an event from those at lower risk
- **CALIBRATION:** informs clinicians how similar the predicted outcome is to the *true/observed outcome* in external groups of patients (the accuracy of *absolute risk* estimates, or the ability of a model to accurately predict outcomes in other cohorts)

Moons KGM, et al. AIM 2015; Steyerberg EW, et al. EHJ 2014 Steyerberg EW, et al. JCE 2016; Alba AC, et al. JAMA. 2017; 318:1377-1384

Characteristics of A-HIPI cohorts

	Development
	(N=4022)
Age (years), mean (SD)	35 (12)
Female sex	45%
Stage	
Stage IIB	28%
Stage III	39%
Stage IV	34%
Bulk	35%
Hemoglobin (g/dL), mean (SD)	12 (2)
Albumin (g/dL), mean (SD)	3.7 (0.6)
Lymphocyte count (10^3/uL), mean (SD)	1.5 (0.7)
5-year PFS (KM)	77%
5-year OS (KM)	92%



Characteristics of A-HIPI cohorts

	Development	Validation
	(N=4022)	(N=1431)
Age (years), mean (SD)	35 (12)	36 (13)
Female sex	45%	44%
Stage		
Stage IIB	28%	38%
Stage III	39%	30%
Stage IV	34%	33%
Bulk	35%	30%
Hemoglobin (g/dL), mean (SD)	12 (2)	12 (2)
Albumin (g/dL), mean (SD)	3.7 (0.6)	3.7 (0.6)
Lymphocyte count (10 ³ /uL), mean (SD)	1.5 (0.7)	
5-year PFS (KM)	77%	78%
5-year OS (KM)	92%	91%



Non-linear relationship for age



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Non-linear relationship for lymphocyte count

PFS





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A-HIPI model parameters for 5-year PFS

	5-year PFS
	HR (95% CI)
Age (years)	
Linear effect in 18 to 30 years	0.97 (0.95, 1.00)
Linear effect in >30 years	1.02 (1.01, 1.02)
Female	
Stage	
Stage IIB	
Stage III	1.23 (1.03, 1.48)
Stage IV	1.53 (1.27, 1.83)
Bulk	
Hemoglobin (g/dL)	
Albumin (g/dL)	0.74 (0.66, 0.82)
Lymphocyte count (10^3/mm ³)	
Linear effect in .1 to 2	0.75 (0.65, 0.87)
Linear effect in 2 to 5	1.21 (0.96, 1.52)



A-HIPI model parameters for 5-year PFS & OS

	5-year PFS	5-year OS
	HR (95% CI)	HR (95% CI)
Age (years)		
Linear effect in 18 to 30 years	0.97 (0.95, 1.00)	0.98 (0.94, 1.02)
Linear effect in >30 years	1.02 (1.01, 1.02)	1.05 (1.04, 1.07)
Female		0.78 (0.61, 1.00)
Stage		
Stage IIB		
Stage III	1.23 (1.03, 1.48)	
Stage IV	1.53 (1.27, 1.83)	1.33 (1.04, 1.70)
Bulk		1.37 (1.05, 1.78)
Hemoglobin (g/dL)		0.88 (0.81, 0.96)
Albumin (g/dL)	0.74 (0.66, 0.82)	0.67 (0.53, 0.84)
Lymphocyte count (10^3/mm ³)		
Linear effect in .1 to 2	0.75 (0.65, 0.87)	0.61 (0.46, 0.80)
Linear effect in 2 to 5	1.21 (0.96, 1.52)	1.49 (0.99, 2.22)



A-HIPI model discrimination for 5-year PFS & OS

C-statistic	5-year PFS	5-year OS
Development cohort	0.605	0.732
Development cohort: optimism corrected	0.595	0.717
Validation cohort	0.590	0.730
IPS7, validation cohort	0.597	0.692
IPS3, validation cohort	0.579	0.657



Calibration of IPS7 in validation cohort





A-HIPI model calibration in validation cohort





(Van Calster B. et al., BMC Medicine 2019)

Online calculator for point-of-care use (QxMD)

	Calculate			All Calculators	Become a Contributor
≡,	Calculator	About	References		
	🖈 🗅 A-HIPI				
	Questions				
	1. Age?		18 years		
	2. Albumin?		3.8 g/dL		
	3. Bulk?		no bulk		
	4. Gender?		Female		
	5. Hemoglobin?		10.5 g/dL		
	6. Lymphocyte count?		1 10³/uL		
	7. Stage?		Stage III		

Conclusion & Next Steps

- We identified novel non-linear relationships between age and lymphocyte count and patient outcomes
- A-HIPI model discrimination was similar for PFS and better for OS than IPS7
- A-HIPI model calibration was superior for PFS and OS than IPS7
- Future studies will:
 - Incorporate post-baseline factors (e.g., interim imaging, variable treatment, etc) and biology to improve prediction of individualized outcomes
 - Estimate risk of post-acute & late effects (based on patient & treatment factors)
 - Conduct similar analyses in early stage cHL and relapsed/refractory disease
 - Examine HRQL, cost of care, and biology



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CONTEXT

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The Advanced-Stage Hodgkin Lymphoma International Prognostic Index: Development and Validation of a Clinical Prediction Model From the HoLISTIC Consortium

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PURPOSE The International Prognostic Score (IPS) has been used in classic Hodgkin lymphoma (cHL) for 25 years. However, analyses have documented suboptimal performance of the IPS among contemporarily treated patients. Hamessing multisource individual patient data from the Hodgkin Lymphoma International Study for Individual Care consortium, we developed and validated a modern clinical prediction model.

METHODS Model development via Transparent Reporting of a multivariable prediction model for Individual Prognosis Or Diagnosis guidelines was performed on 4,022 patients with newly diagnosed advanced-stage adult cHI from eight international phase III clinical trials, conducted from 1996 to 2014. External validation was performed on 1.431 contemporaneously treated patients from four real-world cHL registries. To consider association over a full range of continuous variables, we evaluated piecewise linear splines for potential ponlinear relationships. Five-year progression-free survival (PES) and overall survival (OS) were estimated using Cou proportional hazard models

RESULTS The median age in the development cohort was 33 (18-65) years; nodular sclerosis was the most common histology, Kaplan-Meier estimators were 0.77 for 5-year PFS and 0.92 for 5-year OS. Significant predictor variables included age, sex, stage, bulk, absolute lymphocyte count, hemoglobin, and albumin, with slight variation for PFS versus QS. Moreover, age and absolute lymphocyte count yielded nonlinear relationships with outcomes. Optimism-corrected c-statistics in the development model for 5-year PFS and OS were 0.590 and 0.720, respectively. There was good discrimination and calibration in external validation and consistent performance in internal-external validation. Compared with the IPS, there was superior discrimination for OS and enhanced calibration for PFS and OS.

CONCLUSION We risorously developed and externally validated a clinical prediction model in > 5.000 patients with advanced-stage cHL. Furthermore, we identified several novel nonlinear relationships and improved the prediction of patient outcomes. An online calculator was created for individualized point-of-care use

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INTRODUCTION

CONTENT

Data Suppleme

Author affiliation

November 11 2022

and published at

ce on XX XX, 2022:

25 years, this score requires updating for several re-Classic Hodgkin lymphoma (cHL) is a B-cell malig- sons. First, management strategies and outcomes nancy that occurs predominantly in younger adults and for CHL have improved over the past 10-20 years. is generally associated with favorable clisease out- Recent studies suggested poor calibration of the IPS7 comes.¹ However, there is no single consensus-based among contemporarily treated patients.^{4,6} Second, or individualized treatment approach globally beyond clinical prediction modeling techniques have grown in sophistication since the IPS7 was developed. For ex use of multiagent chemotherapy with curative intent. ample, the IPS7 relied on dichotomous categorization of The most widely used prognostication tool in cHL has patient and disease factors with limited information

been the International Prognostic Score (IPS), pub- about model performance (discrimination and calilished in 1998 by the German Hodgkin Study Group.² bration). Furthermore, the IPS7 was developed based The IPS identified seven clinical factors (IPS7) prog- on complete case analyses, but missing data were nostic for survival at 5 years in newly diagnosed frequent, requiring the use of imputation strategies that advanced-stage disease. While used over the past were not externally validated.

201 https://doi.org/10. 1200/JC0.22.02473 ASCO

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The Advanced-Stage Hodgkin Lymphoma International **Prognostic Index (A-HIPI):** Development and Validation of a **Clinical Prediction Model from** the HoLISTIC Consortium

ascopubs.org/doi/full/10.1200/JCO.22.02473



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Modeling Multi-Source Data: Specific Aims



NCI R01262265-01A1 (Parsons/Evens, MPI)

Early-stage Hodgkin lymphoma (ESHL) in the modern era: simulation modeling to delineate long-term patient outcomes

- Considered contemporary (post-2000) randomized clinical trials comparing RT-based CMT vs chemotherapy alone for untreated ESHL with favorable features (Nachman 2002; Meyer 2005; Raemaekers 2014; Radford 2015; Andre 2017)
- Detailed computer simulation model to project disease natural history for pediatric & adult ESHL pts treated with chemotherapy alone or combined modality therapy
 - Model consisted of a series of health states: (i) at risk for relapse; (ii) relapse; (iii) cured without relapse; (iv) cured with relapse; (v) cured with late effects; and (vi) dead



Multistate models to estimate transition probabilities

- The Cox PH assumption of non-informative censoring is violated when there are competing events or risks that prevent the occurrence of an event of interest (e.g., death prevents the occurrence of relapse)
 - Intermediate, non-fatal events that influence the risk of a future event can also undermine this assumption (e.g., relapse changes the risk of death)
- <u>Multi-state models</u> make it possible to estimate transition rates from an initial state, to different transient states, and to a final, absorbing state (e.g., death), while also accounting for

Health State Transition Diagram



Circles represent individual health states; value within each circle is the <u>utility weight</u> (or health-related quality of life impact) of that health state; arrows represent *transition pathways* b/t states (*represents range of utility weight values categorized on severe or non-severe LEs)

Prototype of Simulated Disease Progression Model

- For each treatment, estimated quality-adjusted life expectancy (QALYs), survival in years, with each year scaled by a utility preference weight corresponding to that year's health state
 - health state utility preference weights range from 0 to 1, with a weight of zero for the 'Dead' state, and a weight of 10 for the (hypothetical) state of 'perfect health'
- Analyzed 35-year late effect probabilities following 10-year latency (w/ sensitivity analyses)

Simulation Modeling to Predict Long-Term Patient Outcomes: Early-Stage Hodgkin Lymphoma in the Modern Era

- Case examples
 - <u>Case #1</u>: 25 yo M favorable ESHL (stage IA right cervical and supraclavicular)
 - <u>Case #2</u>: 25 yo F unfavorable ESHL (stage IIA mediastinal, hilar, and b/l axillary disease)
 - 3-year PFS 91%-97% with LEs range from 30-45-90% (sex, use of CMT vs CA and relapse vs not)
- <u>Case #1</u>: CMT superior to CA in quality-adjusted discounted survival (0.074 QALYs) and unadjusted survival (0.016 life years)
- <u>Case #2</u>: CMT inferior to CA in quality-adjusted discounted survival (-1.161 QALYs) and unadjusted survival (-5.137 life years)

HoLISTIC Outputs

- Modern, granular, individualized prediction models (pre-treatment and post-treatment factors) with acute, post-acute & late effects (e.g., specific cardiovascular/arterial and cancer risks, etc)
 - Based on individual patient/disease factors and varied treatment options
 - Newly-diagnosed advanced stage, early stage, relapsed/refractory
- Future options
 - Cost of care
 - Incorporation of biology (e.g., tumor factors, genetic risk (e.g., SNPs) of late effects); and HRQL
 - Integration of patient preferences

Opportunities!

- Additional clinical trial and registry data integration
- Working Groups (advanced, early-stage, relapsed/refractory, elderly, imaging, late effects, etc)
- HoLISTIC Consortium governance/charter with finalized executive & voting committee (and policies and procedures)
 - Day-to-day management of consortium
- Conversion of consortium to "open membership"
 - Related data management (and cloud) & statistical support, etc
- Collaboration with industry?
- A resource for new extramural funding & other analyses



#LetsBeatHodgkinLymphomaTogether

ADDITIONAL MATERIAL



Range of lab values

- Plausible lab values were defined as:
 - 1-6 for albumin (g/dL)
 - − ≥1 for erythrocyte sedimentation rate (mm/hr)
 - 5 to 16.5 for hemoglobin (g/dL)
 - 0.1 to 5.0 for lymphocyte count (10³/µL)
 - 0.1 to 5.0 for white blood cell counts (10³/µL)

Study Sample - extra

	Development	Validation
	(N=4022)	(N=1431)
Categorical age (years), n (%)		
18 to 30	1618 (40.2%)	613 (42.8%)
>30	2404 (59.8%)	818 (57.2%)
Histology, n (%)		
Lymphocyte depleted	46 (1.1%)	7 (0.5%)
Lymphocyte rich	102 (2.5%)	22 (1.5%)
Mixed cellularity	521 (13.0%)	85 (5.9%)
Nodular sclerosis	2986 (74.2%)	1023 (71.5%)
NOS	367 (9.1%)	294 (20.6%)
B symptoms, n (%)	2938 (73.1%)	1104 (77.1%)
WBC count (10 ³ /uL), mean (SD)	10.7 (5.3)	10.8 (5.2)
Categorical lymphocyte count (10^3/uL), n (%)		
0.1 to 2	3183 (79.1%)	1160 (81.0%)
2 to 5	839 (20.9%)	271 (19.0%)
ESR (mm/hour), mean (SD)	59.0 (35.7)	52.8 (35.6)
Follow-up time (months), median (q1, q3)	60.0 (36.0, 60.0)	74 (31, 131.5)



Model parameters

		5-year PFS [*]		5-year OS [*]			
	Beta coefficient	HR (95% CI)	Optimism- corrected beta coefficient	Beta coefficient	HR (95% CI)	Optimism- corrected beta coefficient	
Age (years)							
Linear effect in 18 to 30 years	-0.026	0.97 (0.95, 1.00)	-0.024	-0.022	0.98 (0.94, 1.02)	-0.020	
Linear effect in >30 years ⁺	0.016	1.02 (1.01, 1.02)	0.014	0.049	1.05 (1.04, 1.07)	0.046	
Female				-0.251	0.78 (0.61, 1.00)	-0.234	
Stage [^]							
Stage IIB							
Stage III	0.207	1.23 (1.03, 1.48)	0.184				
Stage IV	0.423	1.53 (1.27, 1.83)	0.377	0.285	1.33 (1.04, 1.70)	0.266	
Any bulk				0.312	1.37 (1.05, 1.78)		
Lymphocyte count (/mm ³)							
Linear effect in .1 to 2	-0.287	0.75 (0.65, 0.87)	-0.255	-0.497	0.61 (0.46, 0.80)	-0.463	
Linear effect in 2 to 5^{\dagger}	0.188	1.21 (0.96, 1.52)	0.167	0.396	1.49 (0.99, 2.22)	0.369	
Hemoglobin (g/dL)				-0.124	0.88 (0.81, 0.96)	-0.116	
Albumin (g/dL)	-0.307	0.74 (0.66, 0.82)	-0.274	-0.406	0.67 (0.53, 0.84)	-0.379	



Distribution of predicted probability of outcomes



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KM estimators for PFS & OS by quartile



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Internal-External Validation

- Internal-external validation using leave-one-out cross-validation on development cohort to assess heterogeneity in performance
 - Each clinical trial was left out 'one at a time' to account for between-trial heterogeneity (e.g., use of baseline imaging & staging, definitions of bulk, treatment regimen)
- Results: C-statistics in the omitted trial ranged from 0.54 to 0.65 for PFS and 0.61 to 0.77 for OS

Internal-external validation of A-HIPI Model

- 5-year PFS
 - C-statistics in remaining trials: 0.59 to 0.61
 - C-statistics in the omitted trial: 0.54 to 0.65
- 5-year OS
 - C-statistics in remaining trials: 0.71 to 0.74
 - C-statistics in the omitted trial: 0.61 to 0.77

Internal-external validation of A-HIPI Model

	5-yea	ar PFS	5-year OS			
	C-Sta	ITISTIC	C-sta	ITISTIC		
Trial omitted	Remaining trials	Omitted trial	Remaining trials	Omitted trial		
ECOG2496	0.6055	0.584	0.7094	0.721		
SWOG0816	0.6064	0.571	0.7291	0.749		
HD2000	0.6103	0.547	0.7403	0.642		
HD9601	0.6019	0.610	0.7373	0.700		
HD0607	0.5949	0.647	0.7137	0.768		
HD0801	0.6076	0.577	0.7318	0.702		
Stanford V	0.6044	0.543	0.7378	0.613		
RATHL	0.6134	0.584	0.7268	0.728		



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Table II. Sensitivity analyses and model results.

Patient	Late effect probabilities*			Proportion of		Results				CMT advantage		
	C1: with relapse		C2: no relapse		late effects severe		IV	IV	OALV	OAIX	IV	OALV
	Chemo	CMT	Chemo	CMT	Chemo	CMT	Chemo	CMT	Chemo	CMT	Delta	Delta
1.0	0.45	0-45	0.30	0-45	0.20	0.20	50.37	50-58	19-10	19-21	0.21	0.11
1.1					0.10	0.10	50-61	50.97	19.12	19-26	0.35	0.14
1.2					0.05	0.05	50-73	51.16	19.14	19-29	0.43	0.15
2.0	0.45	0.90	0.30	0.90	0.20	0.20	50-40	49-48	19.11	18.73	-0.92	-0.37
2.1					0.20	0.40	50-37	47.65	19-10	18-49	-2.71	-0.61
2.2					0.20	0.60	50-37	45.78	19.10	18.24	-4.59	-0.86
2.3					0-20	0.80	50-37	43-82	19.07	17.97	-6.54	-1.10

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RAPID: PET Scan in Planning Treatment in Patients Undergoing Combination Chemotherapy for Stage IA or Stage IIA HL Trial

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