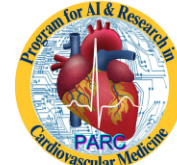


## Despite Machine Learning Models, QRS Duration Remains the Superior ECG Criterion for Predicting Left Ventricular Dilatation in Patients with Left Bundle Branch Block

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### Background

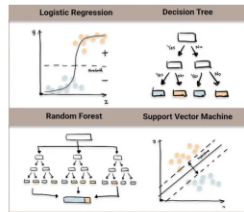
- The utility of ECG to diagnose left ventricular (LV) dilatation in patients with left bundle branch block (LBBB) is not known.
- We previously showed QRS duration is a modest classifier for LV dilatation in presence of LBBB.
- Machine learning methods have the potential to improve classification of LV dilatation by ECG.

### Research Questions

- We sought to compare the diagnostic yield of ECG using (i) QRS duration, (ii) published LV hypertrophy (LVH) criteria, and (iii) machine learning (ML) models to detect increased left ventricular end diastolic volume indexed (LVEDVI) in the setting of LBBB.

### Methods and Materials

- 12-lead ECGs were processed to reconstruct orthogonal X, Y, Z leads using Kors's matrix and obtain root-mean-squared (3D) ECG.
- R wave, S wave and overall amplitudes, voltage-time-integrals (VTIs), and other ECG features were extracted from all ECG leads.
- ML algorithms [logistic regression (LR), support vector classifier (SVC), decision trees (DT), random forest (RF), gradient boosted machine (GBM) and boosted trees (BT)] were trained to predict increased LVEDVI (women >6.1 mL/m<sup>2</sup>, men >7.4 mL/m<sup>2</sup>) from ECG features on a training set of 2668 ECGs with typical LBBB and echocardiogram within 45 days before or after ECG.
- LVEDVI was measured using ASE biplane method of discs.
- We obtained ROC AUCs for prediction of increased LVEDVI by (i) QRS duration, (ii) published LVH criteria, and (iii) ML models in a separate validation set of adults with typical LBBB.



Goag, D. (2022, July 12). Top 6 machine learning algorithms for classification. Medium.

Table 1. Validation set population characteristics

Variable	Women (N=219)	Men (N=194)
Age, years	74 (65-83)	72.5 (66-80)
BSA, m <sup>2</sup>	1.9 (1.7-2.1)	2.1 (2.0-2.3)
LV Mass, g	164 (133-197)	227 (187-275)
LVEDVI, ml	101 (76-138)	147 (113-199)
LVEDVI, ml	45 (31-71)	68 (48-105)
LVEF, %	54 (45-63)	53 (38-63)
QRS duration, ms	149 (140-158)	157 (150-168)
Amplitude <sub>QRS</sub> , mV	1.4 (1.2-1.7)	1.7 (1.3-1.9)
VTI <sub>QRS</sub> , mV	102 (85-123)	124 (99-150)

### Results

- Among the validation set of 413 adults (53% women, age 73±12 yr) with LBBB, **QRS duration alone had a higher AUC** (women 0.67, men 0.70) for diagnosing increased LVEDVI compared to standard LVH criteria (Table 2).
- The **best ML model** (RF; women 0.69, men 0.68) **did not outperform QRS duration** alone.

Table 2. Area under receiver operating characteristic curve (AUC), sensitivity, and specificity for prediction of increased LVEDVI (women <6.1 mL/m<sup>2</sup>, men >7.4 mL/m<sup>2</sup>) in validation set (N=413).

ECG criteria	AUC	Sensitivity	Specificity
<b>QRS duration</b>			
Men <160 ms	0.699	0.607	0.691
Women >150 ms	0.668	0.687	0.618
<b>Khiri (S<sub>12</sub> + S<sub>13</sub>)</b>	0.546	0.078	0.951
<b>Pegore-Lu Presti (max S + S<sub>14</sub>)</b>			
Men >2.8 mV	0.578	0.786	0.309
Women >2.8 mV	0.529	0.771	0.265
<b>Cornell voltage (R<sub>5c</sub> + S<sub>1c</sub>)</b>			
Men >2.8 mV	0.596	0.5	0.6
Women >2.0 mV	0.517	0.602	0.39
<b>Cornell VDP ((R<sub>5c</sub> + S<sub>1c</sub>) * QRS duration)</b>	0.58	0.832	0.228
S <sub>12</sub> + S <sub>13</sub> (>0.9 mV)	0.56	0.174	0.907
R aVL (>1.1 mV)	0.509	0.06	0.898
R aVL VDP (>10 mV * msec)	0.524	0.437	0.654
<b>Sokolow-Lyon (S<sub>1</sub> + max R (V5 or V6)) &gt;3.5 mV</b>	0.528	0.06	0.963
<b>Sokolow-Lyon VDP</b>			
Men >367.4 mV * msec	0.577	0.512	0.573
Women >322.4 mV * msec	0.543	0.446	0.618
<b>Goldberger Uprightside (R<sub>1</sub> + S<sub>5c</sub>) &gt;2.5 mV</b>	0.519	0.03	0.927
<b>Max R + max S in V1-V6 (&gt;4.5 mV)</b>	0.549	0.138	0.939
<b>RI + SII (&gt;5 mV)</b>	0.512	0	1
<b>Machine Learning Model</b>	<b>AUC</b>	<b>Sensitivity</b>	<b>Specificity</b>
Men	0.657	0.214	0.927
Women	0.669	0.169	0.897
<b>Support vector classifier</b>			
Men	0.638	0.524	0.627
Women	0.571	0.53	0.581
<b>Decision trees</b>			
Men	0.601	0.536	0.664
Women	0.555	0.313	0.728
<b>Random forest</b>			
Men	0.675	0.345	0.873
Women	0.692	0.446	0.779
<b>Gradient boosted machine</b>			
Men	0.65	0.357	0.864
Women	0.666	0.325	0.846
<b>Boosted trees</b>			
Men	0.609	0.345	0.781
Women	0.608	0.386	0.787

### Conclusion

- In patients with LBBB, QRS duration ≥150 ms in women and ≥160 ms in men is a superior predictor of LV dilatation than traditional ECG-based LVH criteria.
- ML methods performed similarly to QRS duration and did not provide any additional benefit for predicting LV dilatation.

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### References

- Tanasei CAM, et al. Usefulness of ECG criteria to rule out left ventricular hypertrophy in older individuals with true left bundle branch block: an observational study. BMC Cardiovasc Disord. 2021; 21(1): p. 547.
- DeBauge Ashley, et al. "The cross-radiographic prediction of left ventricular hypertrophy in women and men with left bundle branch block: Comparison of QRS duration, amplitude and voltage-time-integral." Journal of Electrocardiology 89 (2023): 34-39.

Conflicts of Interest - None

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