Model Selection Results

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library(tidyverse)
library(kableExtra)
source("aux_functions.R")

Model Selection

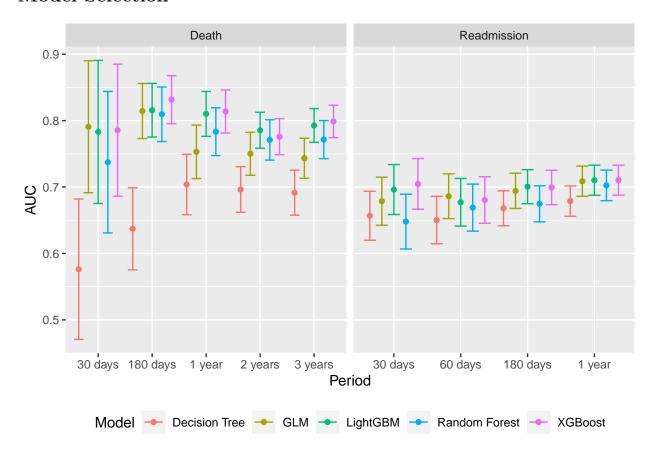


Table 1: Readmission models comparison

Period	Model	AUC	Lower Limit	Upper Limit
30 days	XGBoost	0.70	0.67	0.74
30 days	LightGBM	0.70	0.66	0.73
30 days	GLM	0.68	0.64	0.71
30 days	Decision Tree	0.66	0.62	0.69
30 days	Random Forest	0.65	0.61	0.69
60 days	GLM	0.69	0.65	0.72
60 days	XGBoost	0.68	0.65	0.72
60 days	LightGBM	0.68	0.64	0.71
60 days	Random Forest	0.67	0.63	0.70
60 days	Decision Tree	0.65	0.61	0.69
180 days	LightGBM	0.70	0.67	0.73

Table 1: Readmission models comparison (continued)

Period	Model	AUC	Lower Limit	Upper Limit
180 days	XGBoost	0.70	0.67	0.73
180 days	GLM	0.69	0.67	0.72
180 days	Random Forest	0.67	0.65	0.70
180 days	Decision Tree	0.67	0.64	0.69
1 year	XGBoost	0.71	0.69	0.73
1 year	LightGBM	0.71	0.69	0.73
1 year	GLM	0.71	0.69	0.73
1 year	Random Forest	0.70	0.68	0.73
1 year	Decision Tree	0.68	0.66	0.70

Table 2: Death models comparison

Period	Model	AUC	Lower Limit	Upper Limit
30 days	GLM	0.79	0.69	0.89
30 days	XGBoost	0.79	0.69	0.89
30 days	LightGBM	0.78	0.68	0.89
30 days	Random Forest	0.74	0.63	0.84
30 days	Decision Tree	0.58	0.47	0.68
180 days	XGBoost	0.83	0.80	0.87
180 days	LightGBM	0.82	0.78	0.86
180 days	GLM	0.81	0.77	0.86
180 days	Random Forest	0.81	0.77	0.85
180 days	Decision Tree	0.64	0.58	0.70
1 year	XGBoost	0.81	0.78	0.85
1 year	LightGBM	0.81	0.78	0.84
1 year	Random Forest	0.78	0.75	0.82
1 year	GLM	0.75	0.71	0.79
1 year	Decision Tree	0.70	0.66	0.75
2 years	LightGBM	0.79	0.76	0.81
2 years	XGBoost	0.78	0.75	0.80
2 years	Random Forest	0.77	0.74	0.80
2 years	GLM	0.75	0.72	0.78
2 years	Decision Tree	0.70	0.66	0.73
3 years	XGBoost	0.80	0.77	0.82
3 years	LightGBM	0.79	0.77	0.82
3 years	Random Forest	0.77	0.74	0.80
3 years	GLM	0.74	0.71	0.77
3 years	Decision Tree	0.69	0.66	0.73

Final Model

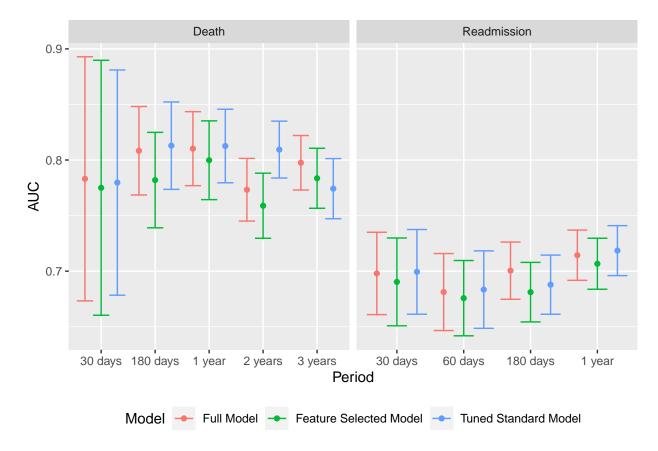


Table 3: Readmission models comparison

Period	Model	AUC	Lower Limit	Upper Limit
30 days	Tuned Standard Model	0.70	0.66	0.74
30 days	Full Model	0.70	0.66	0.73
30 days	Feature Selected Model	0.69	0.65	0.73
60 days	Tuned Standard Model	0.68	0.65	0.72
60 days	Full Model	0.68	0.65	0.72
60 days	Feature Selected Model	0.68	0.64	0.71
180 days	Full Model	0.70	0.67	0.73
180 days	Tuned Standard Model	0.69	0.66	0.71
180 days	Feature Selected Model	0.68	0.65	0.71
1 year	Tuned Standard Model	0.72	0.70	0.74
1 year	Full Model	0.71	0.69	0.74
1 year	Feature Selected Model	0.71	0.68	0.73

Table 4: Death models comparison

Period	Model	AUC	Lower Limit	Upper Limit
30 days	Full Model	0.78	0.67	0.89
30 days	Tuned Standard Model	0.78	0.68	0.88
30 days	Feature Selected Model	0.78	0.66	0.89
180 days	Tuned Standard Model	0.81	0.77	0.85
180 days	Full Model	0.81	0.77	0.85
180 days	Feature Selected Model	0.78	0.74	0.82
1 year	Tuned Standard Model	0.81	0.78	0.85
1 year	Full Model	0.81	0.78	0.84
1 year	Feature Selected Model	0.80	0.76	0.84

Table 4: Death models comparison (continued)

Period	Model	AUC	Lower Limit	Upper Limit
2 years	Tuned Standard Model	0.81	0.78	0.83
2 years	Full Model	0.77	0.75	0.80
2 years	Feature Selected Model	0.76	0.73	0.79
3 years	Full Model	0.80	0.77	0.82
3 years	Feature Selected Model	0.78	0.76	0.81
3 years	Tuned Standard Model	0.77	0.75	0.80

Selected Features

$death_180 days$

- 1. hospital_stay
- 2. age
- 3. laboratorio
- 4. vasodilatador
- 5. espironolactona
- $6. year_adm_t0$
- $7. ieca_bra$
- 8. analises_clinicas_qtde
- 9. admission_pre_t0_count
- 10. comorbidities_count
- 11. icu t0
- 12. equipe_multiprof
- 13. meds_cardiovasc_qtde
- 14. meds antimicrobianos
- 15. diuretico
- 16. classe_meds_qtde
- 17. antiarritmico
- 18. estatina
- 19. admission_pre_t0_180d
- 20. dva
- 21. insuf cardiaca
- 22. psicofarmacos
- $23.\ exames_imagem_qtde$
- 24. ecocardiograma
- 25. stroke
- 26. metodos_graficos_qtde
- $27. cied_final_group_1$
- 28. admission to emergency
- 29. cateterismo
- 30. citologia
- 31. interconsulta
- 32. proced_invasivos_qtde
- 33. cintilografia
- $34.\ {\rm renal_failure}$
- 35. ultrassom
- 36. af
- 37. sex
- 38. cancer
- 39. copd
- 40. tomografia
- 41. cultura
- 42. prior mi
- 43. ressonancia
- 44. insulina
- 45. heart failure
- 46. procedure_type_new

- 47. digoxina
- 48. antifungico
- 49. procedure_type_1
- 50. nyha_basal
- 51. endoscopia

$death_1year$

- 1. age
- 2. hospital_stay
- 3. year_adm_t0
- $4. \ comorbidities_count$
- 5. admission pre t0 count
- 6. vasodilatador
- 7. laboratorio
- 8. analises_clinicas_qtde
- 9. espironolactona
- 10. metodos_graficos_qtde
- $11. \text{ meds_cardiovasc_qtde}$
- 12. classe_meds_qtde
- 13. psicofarmacos
- $14. \text{ meds_antimicrobianos}$
- 15. ieca_bra
- 16. icu_t0
- 17. diuretico
- 18. estatina
- 19. equipe_multiprof
- 20. education_level
- 21. cied_final_group_1
- 22. admission_t0_emergency
- 23. citologia
- 24. diabetes
- 25. renal_failure
- 26. sex
- 27. procedure_type_new
- 28. copd
- 29. bic
- 30. insulina
- 31. cateter_venoso_central
- 32. antifungico
- 33. flebografia

death_2year

- $1. \, \text{sex}$
- 2. age
- 3. education_level
- 4. underlying_heart_disease
- $5.\ \, heart_disease$
- 6. hypertension
- 7. prior_mi
- 8. heart failure
- 9. af
- 10. valvopathy
- 11. diabetes
- 12. renal failure
- 13. hemodialysis
- 14. stroke
- 15. comorbidities_count
- 16. procedure_type_1
- $17. \ {\rm reop_type_1}$
- 18. $cied_final_1$

- 19. cied_final_group_1
- $20. \ admission_pre_t0_count$
- $21. admission_pre_t0_180d$
- 22. year_adm_t0
- 23. icu_t0
- 24. dialysis t0
- $25. admission_t0_emergency$
- 26. acc
- 27. antiarritmico
- $28. ieca_bra$
- 29. dva
- 30. digoxina
- 31. estatina
- 32. diuretico
- 33. vasodilatador
- 34. insuf_cardiaca
- 35. espironolactona
- 36. antiplaquetario_ev
- 37. psicofarmacos
- 38. antiviral
- 39. classe_meds_qtde
- 40. meds_cardiovasc_qtde
- 41. meds antimicrobianos
- 42. vni
- 43. ventilacao mecanica
- 44. transplante_cardiaco
- 45. icp
- 46. angioplastia
- 47. cateterismo
- 48. proced_invasivos_qtde
- 49. transfusao
- 50. interconsulta
- 51. equipe_multiprof
- 52. teste_esforco
- $53. \ tilt_teste$
- 54. metodos_graficos_qtde
- 55. laboratorio
- 56. cultura
- 57. analises_clinicas_qtde
- 58. citologia
- 59. histopatologia_qtde
- 60. cintilografia
- 61. ecocardiograma
- 62. pet ct
- 63. ultrassom
- 64. tomografia
- 65. exames imagem qtde
- 66. hospital_stay

death_30days

- 1. sex
- 2. age
- 3. education_level
- 4. underlying_heart_disease
- 5. heart_disease
- 6. nyha_basal
- 7. hypertension
- 8. prior mi
- 9. heart_failure
- 10. af

- 11. valvopathy
- 12. diabetes
- 13. renal_failure
- 14. hemodialysis
- 15. cancer
- 16. comorbidities count
- 17. procedure_type_1
- 18. reop_type_1
- $19.\ \, procedure_type_new$
- $20.~{\rm cied_final_1}$
- 21. cied final group 1
- $22. admission_pre_t0_count$
- $23.~admission_pre_t0_180d$
- $24. year_adm_t0$
- 25. icu_t0
- 26. antiarritmico
- 27. antihipertensivo
- 28. betabloqueador
- 29. dva
- 30. diuretico
- 31. vasodilatador
- 32. espironolactona
- 33. antiplaquetario ev
- 34. insulina
- 35. psicofarmacos
- 36. antifungico
- $37. classe_meds_qtde$
- $38. \text{ meds_cardiovasc_qtde}$
- 39. meds antimicrobianos
- 40. vni
- 41. ventilacao_mecanica
- 42. intervencao_cv
- $43.\ cateter_venoso_central$
- 44. proced_invasivos_qtde
- 45. transfusao
- 46. interconsulta
- 47. equipe_multiprof
- 48. holter
- 49. metodos_graficos_qtde
- 50. laboratorio
- 51. cultura
- 52. analises clinicas qtde
- 53. citologia
- 54. histopatologia_qtde
- $55. angio_tc$
- 56. angiografia
- 57. cintilografia
- 58. ecocardiograma
- 59. flebografia
- 60. ultrassom
- 61. tomografia
- 62. ressonancia
- 63. exames_imagem_qtde
- 64. bic
- 65. hospital_stay

death_3year

- 1. hospital stay
- 2. year_adm_t0
- 3. admission_pre_t0_count

- 4. age
- 5. espironolactona
- 6. education_level
- 7. comorbidities_count
- 8. nyha_basal

readmission_180d

- 1. hospital_stay
- 2. age
- 3. meds_cardiovasc_qtde
- $4. \ admission_pre_t0_count$
- 5. icu t0
- 6. laboratorio
- 7. ieca bra
- 8. classe_meds_qtde
- 9. meds antimicrobianos
- 10. vasodilatador
- 11. metodos_graficos_qtde
- 12. antiarritmico
- $13.\ exames_imagem_qtde$
- 14. diuretico
- 15. psicofarmacos
- 16. equipe_multiprof
- 17. estatina
- 18. cied_final_1
- 19. reop_type_1
- 20. espironolactona
- 21. patient_state
- 22. aco
- 23. interconsulta
- 24. diabetes
- 25. copd
- 26. insulina
- 27. prior_mi
- 28. icp
- 29. espiro_ergoespiro
- $30. heart_disease$
- 31. teste_esforco
- 32. dialysis_t0

readmission_1year

- 1. hospital stay
- 2. admission_pre_t0_count
- 3. meds_cardiovasc_qtde
- 4. vasodilatador
- $5. admission_pre_t0_180d$
- 6. icu_t0
- $7. classe_meds_qtde$
- 8. diuretico
- 9. year adm t0
- 10. antiarritmico
- 11. cied_final_1
- 12. equipe_multiprof
- 13. age
- $14.\ metodos_graficos_qtde$
- 15. reop_type_1
- 16. admission_t0_emergency
- 17. ieca_bra
- 18. insuf cardiaca
- 19. espironolactona

- 20. laboratorio
- 21. blog calcio
- 22. meds_antimicrobianos
- 23. cied_final_group_1
- 24. procedure_type_new
- 25. estatina
- 26. dva
- 27. education_level
- 28. psicofarmacos
- $29.\ analises_clinicas_qtde$
- 30. procedure type 1
- 31. exames_imagem_qtde
- 32. proced invasivos qtde
- 33. sex
- 34. patient_state
- 35. aco
- 36. cultura
- 37. comorbidities_count
- 38. holter
- 39. betabloqueador
- 40. ultrassom
- 41. nyha_basal
- 42. prior mi
- 43. valvopathy
- 44. bic
- 45. histopatologia_qtde
- 46. outros_proced_cirurgicos
- 47. ressonancia
- 48. cateter_venoso_central
- 49. ventilacao mecanica
- 50. anticonvulsivante
- 51. eletrofisiologia
- 52. heart_disease

readmission_30d

- 1. hospital stay
- 2. analises_clinicas_qtde
- 3. vasodilatador
- $4.\ classe_meds_qtde$
- 5. metodos_graficos_qtde
- 6. exames_imagem_qtde
- 7. icu t0
- 8. meds_cardiovasc_qtde
- 9. admission_pre_t0_count
- 10. dva
- 11. equipe_multiprof
- 12. anticonvulsivante
- 13. holter
- $14.\ comorbidities_count$
- 15. procedure_type_new
- 16. prior_mi
- 17. heart_failure
- 18. eletrofisiologia
- 19. biopsia
- 20. flebografia
- 21. nyha_basal

readmission_60d

- 1. age
- 2. underlying_heart_disease

- 3. heart_disease
- 4. heart failure
- 5. transplant
- 6. valvopathy
- 7. hemodialysis
- 8. comorbidities count
- 9. procedure_type_1
- 10. reop_type_1
- 11. procedure_type_new
- 12. cied_final_group_1
- 13. admission pre t0 count
- 14. $admission_pre_t0_180d$
- 15. icu t0
- 16. dialysis t0
- 17. admission_t0_emergency
- 18. aco
- 19. antiarritmico
- 20. ieca bra
- 21. dva
- 22. digoxina
- 23. estatina
- 24. diuretico
- 25. vasodilatador
- 26. insuf cardiaca
- 27. espironolactona
- 28. bloq_calcio
- 29. antiplaquetario_ev
- 30. insulina
- 31. anticonvulsivante
- 32. psicofarmacos
- 33. antifungico
- 34. antiviral
- $35.\ classe_meds_qtde$
- 36. meds_cardiovasc_qtde
- $37. \text{ meds_antimicrobianos}$
- 38. ventilacao_mecanica
- 39. transplante_cardiaco
- 40. cir_toracica
- 41. icp
- 42. angioplastia
- 43. eletrofisiologia
- 44. proced invasivos qtde
- $45.~{\rm cve_desf}$
- 46. interconsulta
- 47. equipe_multiprof
- 48. teste_esforco
- 49. espiro ergoespiro
- $50. \ tilt_teste$
- 51. metodos_graficos_qtde
- 52. laboratorio
- 53. analises_clinicas_qtde
- 54. biopsia
- 55. histopatologia_qtde
- 56. angio_rm
- 57. arteriografia
- 58. ecocardiograma
- 59. endoscopia
- $60. pet_ct$
- 61. ultrassom
- 62. tomografia
- 63. ressonancia

- 64. exames_imagem_qtde
- 65. hospital_stay

Union

- 1. hospital_stay
- 2. age
- 3. laboratorio
- 4. vasodilatador
- 5. espironolactona
- 6. year_adm_t0
- $7. ieca_bra$
- 8. analises_clinicas_qtde
- 9. admission_pre_t0_count
- 10. comorbidities_count
- 11. icu_t0
- 12. equipe_multiprof
- $13. \, \mathrm{meds}_{-}\mathrm{cardiovasc}_{-}\mathrm{qtde}$
- 14. meds_antimicrobianos
- 15. diuretico
- 16. classe_meds_qtde
- 17. antiarritmico
- 18. estatina
- 19. admission_pre_t0_180d
- 20. dva
- 21. insuf_cardiaca
- 22. psicofarmacos
- 23. exames_imagem_qtde
- 24. ecocardiograma
- 25. stroke
- $26.\ metodos_graficos_qtde$
- 27. $cied_final_group_1$
- 28. admission to emergency
- 29. cateterismo
- 30. citologia
- 31. interconsulta
- 32. proced_invasivos_qtde
- 33. cintilografia
- 34. renal failure
- 35. ultrassom
- 36. af
- 37. sex
- 38. cancer
- 39. copd
- 40. tomografia
- 41. cultura
- $42. prior_mi$
- 43. ressonancia
- 44. insulina
- 45. heart failure
- 46. procedure_type_new
- 47. digoxina
- 48. antifungico
- $49.\ \, procedure_type_1$
- 50. nyha_basal
- 51. endoscopia
- 52. education level
- 53. diabetes
- 54. bic
- 55. cateter_venoso_central
- 56. flebografia

- 57. underlying_heart_disease
- 58. heart_disease
- 59. hypertension
- 60. valvopathy
- 61. hemodialysis
- $62. \text{ reop_type_1}$
- 63. cied_final_1
- 64. dialysis_t0
- 65. aco
- $66.\ antiplaquetario_ev$
- 67. antiviral
- 68. vni
- 69. ventilacao_mecanica
- $70.\ transplante_cardiaco$
- 71. icp
- 72. angioplastia
- 73. transfusao
- 74. teste_esforco
- 75. tilt_teste
- 76. histopatologia_qtde
- 77. pet_ct
- 78. antihipertensivo
- 79. betabloqueador
- 80. intervenção_cv
- 81. holter
- 82. angio_tc
- 83. angiografia
- 84. patient_state
- 85. espiro_ergoespiro
- 86. bloq_calcio
- 87. $outros_proced_cirurgicos$
- 88. anticonvulsivante
- 89. eletrofisiologia
- 90. biopsia
- 91. transplant
- 92. cir_toracica
- $93. \text{ cve_desf}$
- 94. angio_rm
- 95. arteriografia