

# Simulations and manuscripts

Mark Blyth

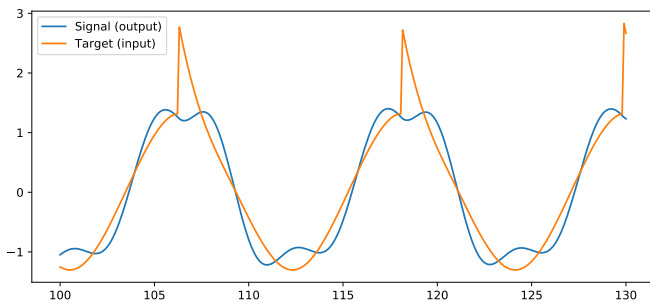
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## Week's activities

- ✶ Lead-TAing setup
- ✶ Digital teaching course
- ✶ NODYCON paper
- ✶ Splines experiments

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## Last time...



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## Splines problems

✖ Finite differences doesn't play nicely with splines

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  - ▶ Probable cause: data exists where knots don't, or knots exist where data don't
  - ▶ Can't understand why either would happen
  - ▶ Code errors aren't helpful

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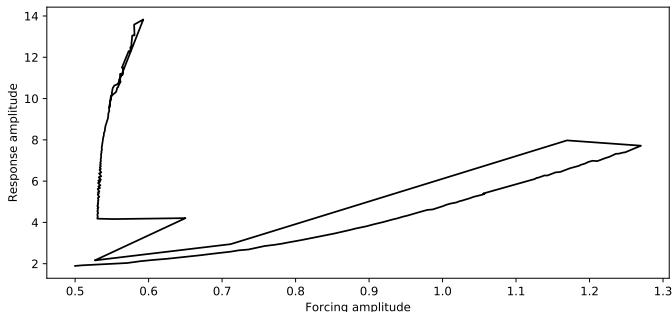
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  - ▶ Some success

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## Evenly spaced knots, small finite-differences

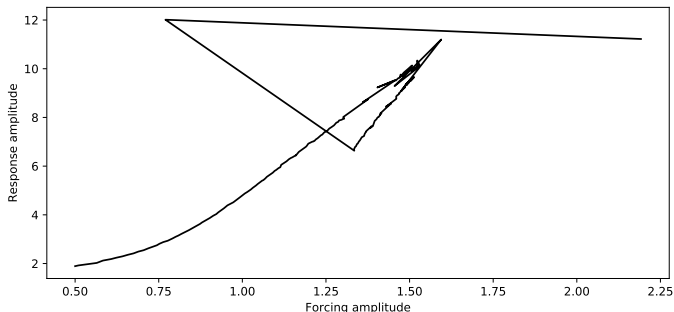


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## Evenly spaced knots, larger finite-differences



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✿ No understanding of why any given intervention has the effect it does

✿ Finicky hyperparameters make the method impractical even if it did work

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  - ▶ Should make finite differences more robust
  - ▶ Also easier to understand, more explainable: no mysterious choice of exterior knots; more intuition about how discretisation changes the model.....

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## Next steps

- ✿ Try interpolating splines discretisation
  - ▶ Start with simplest-possible (ie. non-Bayesian) approach, see what happens
- ✿ Edit continuation paper
- ✿ Write up extended conference paper
- ✿ Choose paper and make slides for lab group meeting